

# UC Berkeley

## UC Berkeley Electronic Theses and Dissertations

### Title

The Very Long Run Economic Growth

### Permalink

<https://escholarship.org/uc/item/1p3666xp>

### Author

Wu, Lemin

### Publication Date

2013

Peer reviewed|Thesis/dissertation

# The Very Long Run Economic Growth

By

Lemin Wu

A dissertation submitted in partial satisfaction of the  
requirements for the degree of

Doctor of Philosophy

in

Economics

in the  
Graduate Division  
of the

University of California, Berkeley

Committee in charge:

Professor Gerard Roland, Chair  
Professor James Bradford DeLong  
Professor Ronald Lee  
Professor Carlos F. Norena

Spring 2013



# Abstract

The Very Long Run Economic Growth

by

Lemin Wu

Doctor of Philosophy in Economics

University of California, Berkeley

Professor Gerard Roland, Chair

Living standards were constant for thousands of years before the industrial revolution. Malthus explained it this way: population grows faster when living standards rise; therefore, changes in technology alter the density of population but not the average welfare. This paper challenges Malthus's explanation and replaces it with the theory of group selection.

Malthusian theory is inadequate because it ignores that a dollar's worth of diamonds contributes less to survival and reproduction than a dollar's worth of grain. Grain is a subsistence commodity and a diamond is a surplus commodity. The Malthusian force anchors the average level of subsistence, but not that of surplus. If the surplus sector had grown faster than the subsistence sector, then living standards could have grown steadily before the industrial revolution, but they did not. The constancy of living standards thus implies that growth was balanced between subsistence and surplus, something Malthus did not explain.

To explain the balanced growth, I propose the theory of group selection. Selection of group characteristics---culture and technology---occurs by migration and conquests. Since living standards rise with the ratio of surplus to subsistence, migrants and invaders usually move from places relatively rich in subsistence to those relatively rich in surplus. They spread the culture and technology of the subsistence-rich origin to the surplus-rich destination; the bias of migration favors the spread of subsistence over that of surplus. Even if surplus cultures and technologies would develop faster than subsistence ones in a

local environment, the offsetting biased migration balances the sectors on a global scale. This explains the constancy of living standards.

The theory explains why living standards stagnated, how the Industrial Revolution occurred and where the prosperity of Roman Empire and Song Dynasty came from.

The theory is robust as it shows that a tiny bit of biased migration has a large impact on the evolution of living standards. Even if people are slow to move and reluctant to learn from the immigrants. The slow movement and reluctant learning expand the variation across the regions, which compensates the effect of selection. The compensating "variation effect" explains why selection is so strong a pressure on economic growth that the Malthusian trap lasted for so long. It also provides a new tipping-point mechanism for understanding revolutionary changes.

By challenging Malthus, the theory throws doubt on the conventional explanations of the escape of Malthusian trap and the onset of modern economic growth. The puzzle is why the modern growth-friendly institutions failed to be established and spread long before the modern era. To explain it, I propose the theory of infant institution. The fittest institution may fail to survive. An institution that raises the growth rate but lowers the level of fitness of a group will be suppressed for an extremely long time when group competition is intense. But in due course of time, the good institution will suddenly spread wide and fast, as one of the regions survives the level handicap long enough to have fully realized its growth potential. This tipping-point pattern explains why the growth-friendly institutions had been long suppressed in the ancient time before they suddenly burst into dominance in the modern era.

To Menglu Zhu

# Acknowledgement

I would like to thank George Akerlof, Gerard Roland, Bradford DeLong, Ronald Lee, Pranab Bardhan, Martha Olney and Yingyi Qian for exceptional guiding. I also would like to thank Menglu Zhu, Yang Xie, Barry Eichengreen, Gregory Clark, Peter Lindert, Dominick Bartelme, Maria Coelho, Jeremie Cohen-Setton, Carola Conces, Jan De Vries, Sigmund Ellingsrud, Fan Fei, Simon Galle, Yuriy Gorodnichenko, Joshua Hausman, Sandile Hlatshwayo, Ye Jin, Hashmat Khan, Xiaohuan Lan, Carlos Norena, Israel Romen, Changcheng Song, Stephen Sun, Michael Tang, Holly Wang, Johannes Wieland, Jianhuan Xu, Lei Xu and the attendants of Berkeley Economic History seminar and Berkeley Macroeconomics and International economic seminar for thoughtful suggestions and essential encouragement.

# Table of Contents

Chapter I	Millennia of Poverty, If Not Malthusian, Then Why?	1
Chapter II	The Strength of Weak Selections	47
Chapter III	Institutional Selection and the Burst of Growth	53
	Bibliography	61
	Appendix	67



# Chapter 1

## Millennia of Poverty: If Not Malthusian, Then Why?

### 1.1 Introduction

Life was miserable for most who lived before the industrial revolution. “The average person in the world of 1800 was no better off than the average person of 100,000 BC” (Gregory Clark, 2007). Malthus explains that men are trapped in poverty because economic progress only leads to faster population growth. The larger population depresses wage and brings men back to persistent poverty.

This paper breaks the norm by showing that, to keep living standards constant, the Malthusian mechanism is insufficient, and selection is another essential condition. Constancy arises out of a biased selection of culture and technology. The selection favors group prosperity at the expense of individual welfare. Hence I call the new explanation the theory of group selection.

Explaining the constancy is the core value of Malthusianism. Despite empirical weakness of the correlation between average income and population growth, most economists still believe in Malthusianism because it explains the long-run constancy and there has been no alternative theory competing with it. But this paper shows that Malthus’s success of predicting the long-run constancy is an illusion. The prediction is right but the mechanism is wrong, analogous to a detective figuring out the true murderer by a false reconstruction of the scene of the crime. The judge should not be satisfied with a mere lucky guess.

Malthusian theory is inadequate because it ignores that a dollar’s worth of grain contributes more to survival and reproduction than a dollar’s worth of diamonds. Grain is a subsistence commodity and diamonds a surplus commodity. While both bring satisfaction, the abundance of subsistence triggers larger population growth than that of surplus does. Malthusian theory applies to the subsistence sector but not to the surplus sector.

When surplus technology develops, the average person, in the long run, will gain more surplus goods with little loss of subsistence consumption.

The division of surplus and subsistence is universal. For any commodity, calculate its marginal effects, in per capita terms, on the growth rate of population and on an average person's utility. Define the ratio of the marginal population growth rate to the marginal utility as the "subsistence index". The index measures the demographic effect of the commodity relative to its hedonistic value.

Grain has a higher subsistence index than diamonds, therefore grain is a relative subsistence. In the same way, in pre-modern England, agricultural products are a subsistence commodity relative to manufacture products; arables relative to pastures; and barley and oats relative to wheat. We can order all the commodities by their subsistence indices. The order is complete and transitive so that we can divide the whole spectrum into two groups. One forms the surplus sector and the other the subsistence sector. My theory thus differs from the Malthusian model by having two sectors instead of one.

Changes of productivity in different sectors affect population growth differently. The use of a better fertilizer feeds more people, but a smarter diamond cut does not. Progress in surplus technology has little effect on population growth, so that the Malthusian force cannot hinder the growth of average surplus.

Neither can it hinder the growth of living standards. Living standards depend on average surplus as well as average subsistence. Since the latter is fixed by the Malthusian force, average surplus solely determines the equilibrium living standards. Arithmetically, average surplus is the ratio of surplus to subsistence multiplied by average subsistence:

$$\frac{\text{Surplus}}{\text{Population}} = \frac{\text{Surplus}}{\text{Subsistence}} \times \frac{\text{Subsistence}}{\text{Population}}.$$

Since the last term, the average subsistence, is fixed, the equilibrium living standards, which average surplus solely determines, depend on the ratio of surplus to subsistence only. The larger the ratio is, the higher the living standards will be.

So long as surplus grows faster than subsistence, the living standards will grow steadily; and the Malthusian force has no way to check it. The relative growth of surplus will even create a momentum for itself: the higher the living standards, the larger the demand for surplus is - surplus is a luxury and its demand rises with income; and the rise in surplus consumption will further increase the living standards. But nothing of this sort had happened by the industrial revolution. The lack of growth implies that surplus had grown at the same rate as subsistence. The puzzle of Malthusian constancy is therefore a puzzle of balanced growth, which Malthus did not explain.

To explain the puzzle, I propose the theory of group selection. Selection favors the spread of subsistence technologies. Subsistence technologies are those methods of production that raise subsistence productivity more than they raise surplus productivity. By

tilting the production structure, a subsistence technology lowers the ratio of surplus to subsistence. As a result, it causes the equilibrium living standards to decline and drives the people who adopt it to migrate abroad for a higher living standard.<sup>1</sup> In contrast, a surplus technology raises the living standards and attracts immigration. The natives who learn the surplus technology are reluctant to go to the “gentiles” to spread the “gospel”. Therefore, migration is biased from the subsistence-rich regions to the surplus-rich regions. It spreads subsistence technologies faster than it spreads surplus technologies. This spread advantage is dominant. A tiny bit of biased migration can suppress a large margin of the growth advantage of the surplus sector, that is, even if surplus intrinsically grows a lot faster than subsistence in local environments, the biased migration can still keep the sectors in balance and hold the world at poverty. Left alone, every place would have prospered; but globally, they are held in check by the interlock of selection. Selection picks the poverty-stricken and makes their lifestyle prevail.

The same logic extends from technology to culture. Culture is the social norm that sorts out winners and losers. Winners gain status, respect and the favor of the other sex. To be such a winner, people show off in galleries and theaters, on catwalks and boxing rings. These surplus cultures divert resources from supporting a larger population to promoting one’s status in society. In other words, surplus promotes individual fitness at the expense of group fitness.

The demand for surplus is the individuals’ Nash equilibrium strategy that is genetically programmed to have survived natural selection. Surplus defines humanity. No art or music would be possible without the demand for surplus; and none would demand surplus but for the conflict of interest between individual and group. By the measure of fitness, surplus consumption is a prisoner dilemma; yet by the measure of utility, it is a blessed curse.

In the long run, pursuing surplus culture makes people better off. Surplus culture requires one to spend more on surplus and less on subsistence. The contraction of subsistence lowers the level of population. In the long run, the average subsistence is hardly affected, but the average surplus becomes larger. Overall, surplus is “socially free”: when people desire more, they receive more in the end; and they do not have to pay for it by sacrificing average subsistence. The people who pay for the surplus are those who would have been born and those who would not have died.

However, surplus culture has a limit. Hedonism is checked by migration and conquests.

---

<sup>1</sup>Ironically, subsistence technologies get spread faster by making people worse off. The paradox arises because individuals do not take into account the effect of their behavior on group welfare. An 18th-century Irish peasant would not refrain from cultivating potato - a crop imported from America - by foreseeing the misery of a denser population. Even if he refrained, he could not stop the other peasants from tilling potato and bearing more children. Everyone seeks a better life; each pursues her own agenda; but collectively, they evoke the tragedy of the commons.

Licentious lifestyle makes a people vulnerable to greedy neighbors: the high surplus attracts the invaders; and the low subsistence means fewer people to defend it. This is why the “arms race” of conspicuous consumption does not spiral out of control. Locally, the arms race might escalate; globally, it is suppressed by group selection. I call the process group selection because culture is a group characteristic. Culture affects the fate of the group; and by doing so, it decides its own fate. By suppressing surplus culture, group selection traces out a path of balanced growth. Along the path, mankind were trapped for tens of thousands of years in the constancy of living standards.

In the rest of the paper, the theory is developed in two steps. First, I use a two-sector Malthusian model to raise the puzzle of balanced growth; second, to address the puzzle, I build up the theory of group selection.

Beyond explaining the balanced growth and the economic stagnation, the theory is rich with other implications. Consider the ancient market economies, such as Roman empire and Song dynasty. The classical theory portrays their prosperity as an ephemeral carnival, a temporary “disequilibrium” of the Malthusian model. In contrast, my theory attributes the prosperity to the persistent effect of long peace, wise governance, light tax and market economy. These “Smithian” factors boost surplus productivity more than subsistence productivity. They improve equilibrium living standards not only in Solow’s era but also in Malthus’s time. Roman and Song civilizations later collapsed not because their population exceeded the capacity of land but because the neighboring groups invaded and conquered them. In particular, Roman economy was exhausted by the wars with Sassanid Empire; and the city of Rome was sacked by the Visigoth and Vandal immigrants.

The theory also addresses the twin puzzles of the agriculture revolution - why living standards declined after men took up agriculture and why agriculture swept the world despite its negative effect on living standards. In light of my theory, agriculture is a subsistence technology. It lowers the equilibrium living standards and spreads fast by biased migration.

Last but not the least, the theory puts the industrial revolution into perspective. Explosive changes such as the appearance of agriculture, the rise of Islam, the march of Genghis Khan and the industrial revolution all share the same pattern: some surplus turns into subsistence - a local trait attempts global dominance by winning over group selection from a constraint into a boost. These phenomena are called surplus explosions, which I will explore in detail in the third chapter of my dissertation.

Stories without evidence are merely a fable. I need to demonstrate three things to establish the theory. First, I shall demonstrate the empirical distinction between surplus and subsistence. Second, I shall identify biased migration in history. Third, I shall present evidence that selection is strong enough to dominate counteractive forces. I demonstrate

the three parts in different ways: along with narrative evidence throughout, I conduct econometrics for the first, summary of data for the second, and computer simulation for the third.

## 1.2 Literature review

How sound is the Malthusian constancy as a fact? Figure 1.1 and figure 1.2 show the evolution of English real wage and population between 1200 and 1800. While population in 1800 was twice as high as in 1200, there was little trend in the real wage.

The lack of trend is in fact universal. Figure 1.3 shows Maddison's estimate of the world's GDP per capita for the last two millennia. Using Maddison's data, Ashraf and Galor (2011) confirmed that by year 1500, the level of technology of a country explains the density of population, but not the income per capita.

Though the Malthusian fact is established, the Malthusian theory is no less controversial than in the times of Malthus. In 2007, Gregory Clark published *A Farewell to Alms*, which ignited a heated debate on Malthusianism. Clark says the history of mankind by 1800 can be explained by a single model, the model of Malthusian theory. Some of the other best talents in our profession quickly responded. Most of the critics - Wrigley<sup>2</sup>, Allen (2008), De Vries<sup>3</sup>, among many others - point to the empirical weakness of the Malthusian theory. They cited the empirical work of Ronald Lee and his colleagues<sup>4</sup> who found that wage and population growth are poorly correlated in the English data. As Jan de Vries put it, "The Malthusian force is rather weak, that is, shifts of birth rate and death rate schedules are more important than movements along the schedules." Figure 1.4 illustrates the point by plotting the rates of birth and death against the real wage<sup>5</sup>.

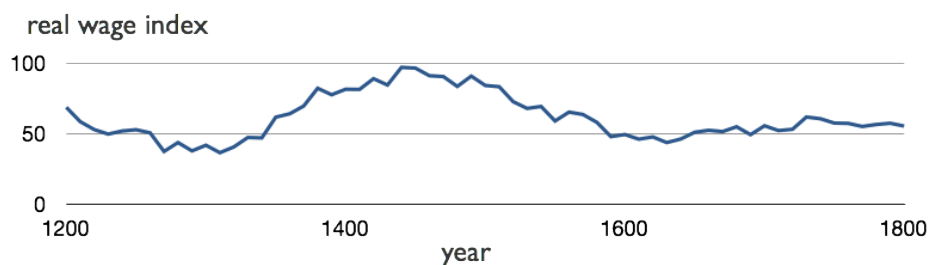


Figure 1.1: English real wage, 1200 - 1800 (1860=100)

---

<sup>2</sup>E. A. Wrigley, book review, *Population and Development Review*, Dec 2008

<sup>3</sup>Jan de Vries, book review, *Journal of Economic History*, Dec 2008

<sup>4</sup>Lee 1980, 1987 and Lee and Anderson 2002

<sup>5</sup>The plots are for the period 1539 - 1836. The horizontal axis is the real wage index compiled by Wrigley and Scholfield (1989).

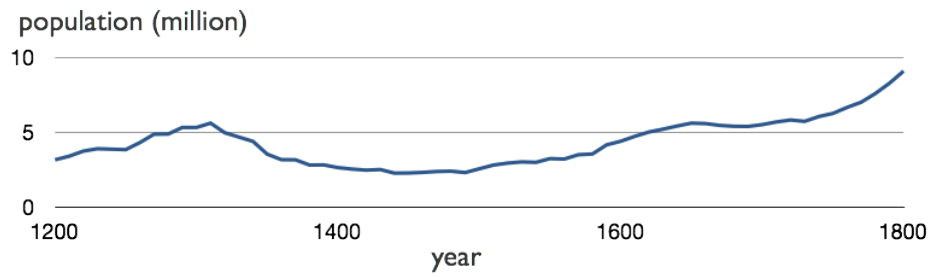


Figure 1.2: English population, 1200 - 1800 (million)

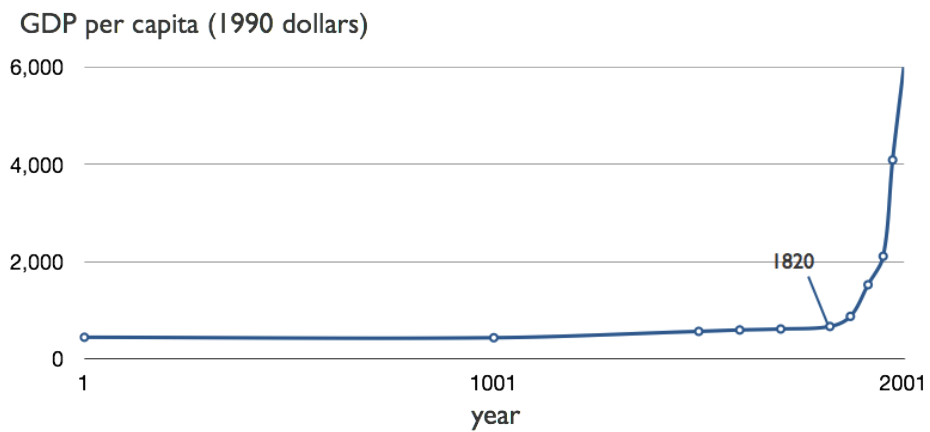


Figure 1.3: World per capita GDP 1-2001 AD, in 1990 dollars



Figure 1.4: Wrigley and Schofield's real wage explains the birth and death rates weakly.

Yet despite the weakness, most scholars still believe the Malthusian force to be the cause of the long-run constancy. In their view, while it takes centuries for an economy to move back to equilibrium, the Malthusian force dominates in the long run by its persistent tug. Allen (2008) was upset about the conjecture but did not mention any alternative explanation.

Besides the empirical attack, Malthusianism receives no less challenge to the theory. The critics are concerned with Malthus's failure to capture the modern growth. Scholars in the 19th century<sup>6</sup> had noticed the potential of technological improvement to outpace the population growth. They also foresaw the possibility of "moral restraint", that people might refrain from reproduction voluntarily.

Today's theorists have a different agenda. They attempt to reconcile the Malthusian constancy with modern growth by endogenizing the acceleration of productivity growth.<sup>7</sup> These models unanimously presumed the Malthusian mechanism to be the cause of Malthusian constancy. They described how the shackle of Malthusian forces was finally broken; but they never asked whether the binding shackle was truly Malthusian or not.

The question is inevitable in a two-sector Malthusian model. Rudimentary two-sector models did occasionally appear. Davies's (1994) paper on Giffen goods had beef and potato. Taylor's (1998) classic on Easter island had food and manufactures. Two-sector thinking also permeated empirical studies such as Broadberry and Gupta (2005), which used the ratio of silver-grain wages to proxy for the relative productivity of tradable goods. Unfortunately, the researchers never took a further step to explore the long-run implication, that a directional change in production structure could disturb the constancy of living standards.

Other researchers have also modeled Malthusian economies with an agricultural sector and a manufacturing sector.<sup>8</sup> But they divide the sectors production-wise: agriculture uses land, while manufacturing does not. I divide the sectors consumption-wise: agricultural products and manufacturing products have different demographic effects. This is why long-run steady growth is possible in my paper but not in theirs.

As I explore the long-run implication of the two-sector model, the puzzle of balanced growth arises. I explain the puzzle with the theory of group selection. In the past decade, Bowles and Gintis<sup>9</sup> revived the idea of group selection in economic literature, asking why the cooperative traits got rooted in human nature, though they seem to conflict with

---

<sup>6</sup>Malthus (5th ed., 1817/1963), Everett (1826), Carey (1840) and Engels.

<sup>7</sup>Simon and Steinmann (1991), Jones (2001), Hansen and Prescott (2002), Galor and Weil (2002) and Galor and Moav (2002), among many others.

<sup>8</sup>Voigtlander and Voth (2008), Restuccia, Yang and Zhu (2008), and Yang and Zhu (2013).

<sup>9</sup>Bowles and Gintis (2002) and Bowles (2006). Their work is summarized in the new book, *A Cooperative Species: Human Reciprocity and Its Evolution* (Bowles and Gintis 2011).

individual fitness. The old label of pseudo-science on group selection is gone. Now theorists have found many ways for group selection to have an impact. In my theory, selection happens among the multiple equilibria, so it is compatible with Nash criterion.

Another caveat is that the notion of group selection in this paper is not genetic. My theory is different from Clark's idea in *A Farewell to Alms*. While Clark attributes the Industrial Revolution to natural selection, I explain the Malthusian stagnation with selection of culture and technology.

Levine and Modica (2011) is the closest research to mine. They use the idea of group selection to challenge the Malthusian prediction of persistent poverty. Though we share the same solution to Malthusian economics, we approach the issue in different ways and reach different conclusions. They treat the constancy not as a solid fact to explain but as a false prediction to challenge. They do not distinguish surplus and subsistence, but instead focus on the allocation of resources between people and authority. Their equilibrium is the maximization of resources the authority controls to engage in wars; while mine is the balance of growth and constancy of living standards. My thesis is complementary to theirs. Together we show how the idea of group selection can change our view on the part of history which economists used to think is explained by a single model of Malthusian theory.

## 1.3 Models

### 1.3.1 The mathematical definition of surplus

Surplus is what contributes little to population, relative to its contribution to utility.

Suppose an isolated group of homogeneous people. The level of population is  $H$ . There are  $M$  kinds of commodities,  $j = 1, 2, \dots, M$ . The representative agent's consumption is  $E \in \mathbb{R}_+^M$ . Within the choice set, he maximizes a utility function that is differentiable and strictly increasing:

$$\max_{E \in C(N)} U(E)$$

The choice set  $C$  shrinks when population rises:  $\forall H_1 < H_2, C(H_1) \supset C(H_2)$ .

Let the growth rate of population depend on the average consumption  $E$ ,

$$\frac{\dot{H}}{H} = n(E)$$

Now assume the population growth rate  $n(E)$  is differentiable and strictly increasing. There exist a set  $S$  on which population does not change,  $n(S) = 0$ . Call it the constant population set. When population stabilizes, the economy returns to its equilibrium on the constant population set.



When  $U(E)$  is not a transformation of  $n(E)$ , there must exist some bundle of consumption  $E$ , at which one commodity is more of subsistence than another, i.e.,  $\exists j_1, j_2 \in \{1, 2, \dots, M\}$  such that

$$\frac{\frac{\partial n(E)}{\partial E_{j_1}}}{\frac{\partial U(E)}{\partial E_{j_1}}} > \frac{\frac{\partial n(E)}{\partial E_{j_2}}}{\frac{\partial U(E)}{\partial E_{j_2}}}$$

Compared with  $j_2$ , commodity  $j_1$  marginally contributes more to population growth than to individual utility. It makes  $j_1$  a subsistence commodity relative to  $j_2$ . In fact, we can define a subsistence index for each commodity.  $\forall E \in \mathbb{R}_+^M, \forall j \leq M$ , commodity  $j$ 's subsistence index at  $E$  is

$$\frac{\frac{\partial n(E)}{\partial E_j}}{\frac{\partial U(E)}{\partial E_j}}$$

Order the indices of all commodities from small to large. Then we get a spectrum of commodities from surplus to subsistence. I then divide the spectrum into two groups, the surplus sector and the subsistence sector.

The bottom line is, we can always distinguish surplus and subsistence as long as  $U(E)$  is not a transformation of  $n(E)$ . Later I shall discuss why the condition is important.

### 1.3.2 The two-sector Malthusian model

Figure 1.5 illustrates the above algebra. It features the representative agent's consumption space. In addition to the conventional indifference curve and production possibility frontier, the diagram has a "constant population curve" (figure 1.5B): population stays constant if consumption bundle is on the curve. If consumption lies to the left of the curve - people consume less than what reproduction requires - population declines; if to the right, population rises.

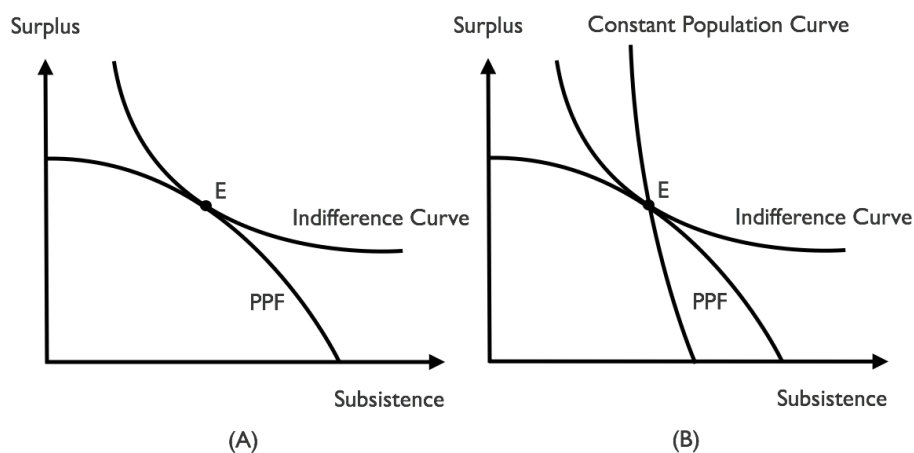


Figure 1.5: Adding the constant population curve

The change of population is reflected in the shift of production possibility frontier: when population declines, the frontier expands, for each person is endowed with a larger choice set; when population rises, the frontier contracts. The choice set decreases with population because Malthusian economies are characterized by diminishing returns to labor. There are diminishing returns to labor because land is an important factor of production and its supply is inelastic.

Without loss of generality, I assume the expansion and contraction of the production possibility frontier to be proportional between the sectors. In other words, the production structure is independent of the size of population.<sup>10</sup>

The constant population curve crosses the indifference curve from above because subsistence is more important to population growth than surplus.<sup>11</sup> The curve is not perfectly vertical because surplus can affect population growth as well, though the effect is smaller than that of subsistence.

The equilibrium must lie on the constant population curve. As figure 1.6 illustrates, if the economy deviates rightward, the temporary affluence raises the growth rate of population. As population grows, individuals' choice set contracts backward, until the economy returns to the constant population curve.

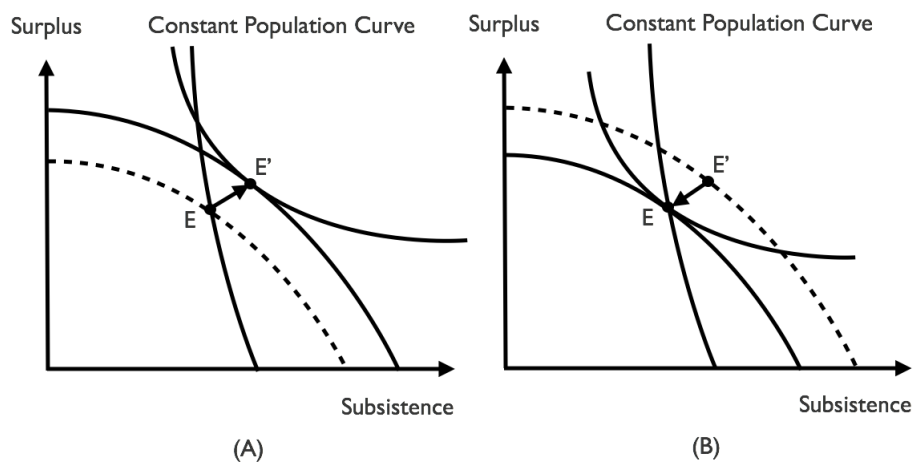


Figure 1.6: The equilibrium is on the constant population curve.

Now a surplus technology can improve the equilibrium living standards. The sur-

<sup>10</sup>It would be an interesting extension to assume subsistence is more labor-intensive than surplus. But I will stick to the simplifying assumption to highlight the effect of interest.

<sup>11</sup>The definition of surplus and subsistence dictates the way the constant population curve crosses the indifference curve. If we label subsistence as A and surplus as B,

$$\frac{\frac{\partial n(E)}{\partial E_A}}{\frac{\partial U(E)}{\partial E_A}} > \frac{\frac{\partial n(E)}{\partial E_B}}{\frac{\partial U(E)}{\partial E_B}} \implies \frac{\frac{\partial n(E)}{\partial E_A}}{\frac{\partial n(E)}{\partial E_B}} > \frac{\frac{\partial U(E)}{\partial E_A}}{\frac{\partial U(E)}{\partial E_B}} \quad \text{i.e., } MRS_n > MRS_U$$

so the constant population curve is steeper than the indifference curve.

plus technology expands the production possibility frontier vertically (figure 1.7A). After population adjusts, the economy returns to the constant population curve in the end (figure 1.7B). The new equilibrium ( $E''$ ) is above the old one ( $E$ ) because the production possibility frontier becomes steeper after the surplus technology shock.

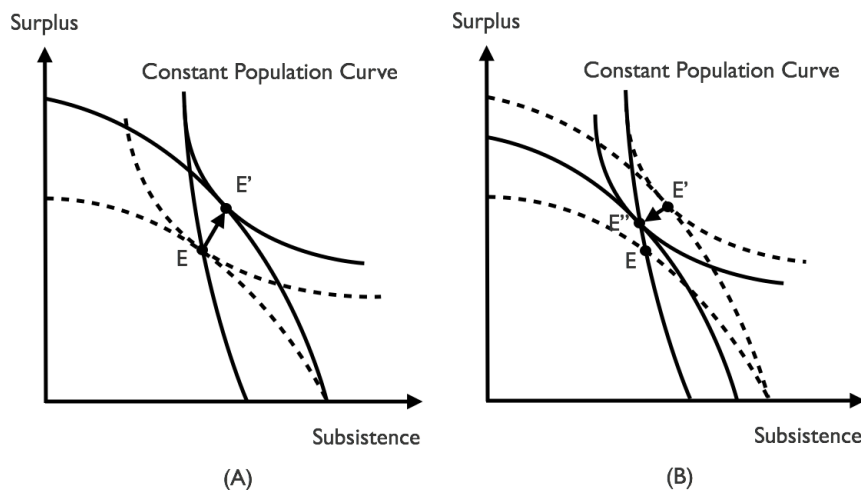


Figure 1.7: A surplus technology improves the equilibrium living standards.

In contrast, a subsistence technology causes living standards to decline. In figure 1.8A, the production possibility frontier expands horizontally as the subsistence sector expands. The abundance of subsistence triggers the rise of population. After the economy returns to the constant population curve, the new equilibrium stays below the old one, because the production possibility frontier becomes flatter by the influence of subsistence technology. In the long run, what matters for living standards is not the size but the shape of the production possibility frontier.

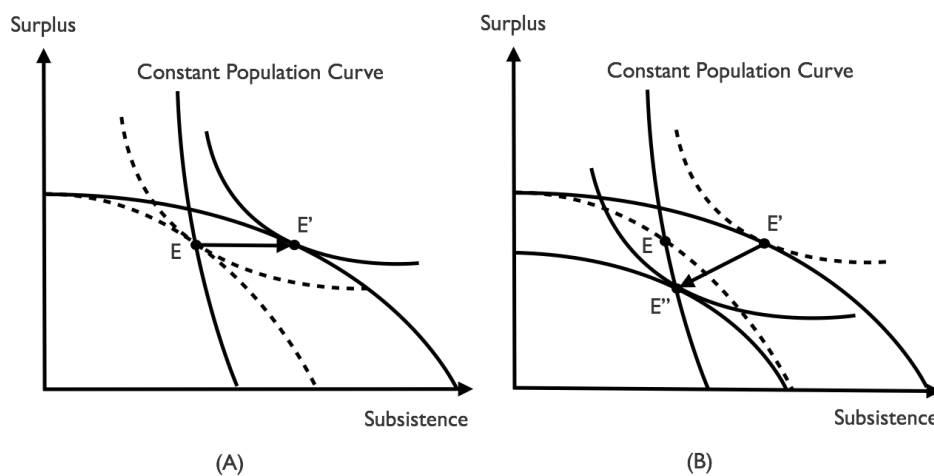


Figure 1.8: A subsistence technology lowers the equilibrium living standards.

Culture affects the equilibrium as well. Suppose there appears a surplus culture. It tilts the indifference curve into a flatter one (figure 1.9A). By trading subsistence for surplus, population undergoes a gradual decline. But when the adjustment is over, the remaining population enjoy a higher equilibrium living standard than in the old days (figure 1.9B).

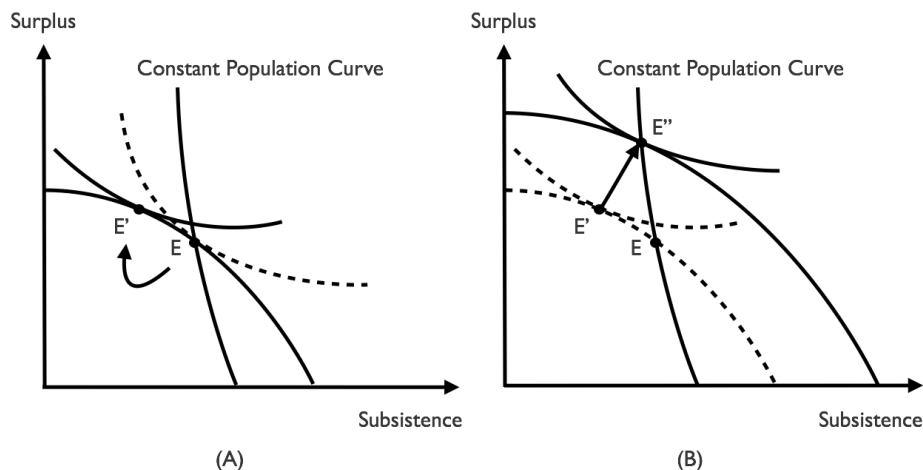


Figure 1.9: The surplus culture improves the equilibrium living standards.

The above results seem to suggest that a more surplus-oriented production structure is always associated with a higher living standard; and so is social preference. Unfortunately, exception exists: figure 1.10 shows the scenario where a surplus economy turns out to have a lower living standard.

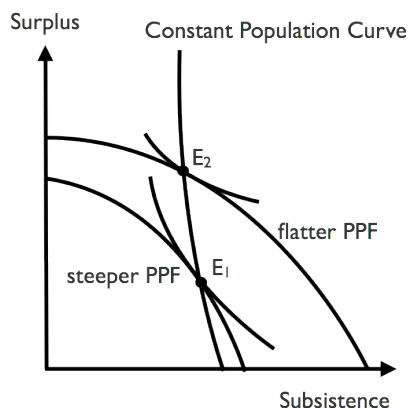


Figure 1.10: Counterexample:  $E_1$  has a steeper PPF but a lower living standard.

The exceptions are caused by multiple equilibria. In appendix 4.1.3, I prove the following theorems by a theoretical detour that avoids the ambiguity of multiple equilibria<sup>12</sup>:

<sup>12</sup>Appendix 4.1.2 lists the assumptions I make.

**Theorem 1 (First Production Structure Theorem)** *For an economy on a stable equilibrium, a positive surplus technology shock always improves equilibrium living standards.*

**Theorem 2 (Second Production Structure Theorem)** *If the subsistence is not a Giffen good, an economy of a more surplus-oriented production structure always has higher equilibrium living standards, other things being equal.*

**Theorem 3 (First Free Surplus Theorem)** *For an economy on a stable equilibrium, a surplus culture always improves equilibrium living standards.*

**Theorem 4 (Second Free Surplus Theorem)** *If the subsistence is not a Giffen good, an economy of a more surplus-oriented social preference always has higher equilibrium living standards, other things being equal.*

Thus, we establish two comparative statics - culture and technology, which are missing in Malthusian theory. Moreover, the framework works equally well with the old comparative statics that the classical model has covered. When disease environment worsens, or war becomes more frequent, or people marry later or give birth to fewer, the constant population curve will shift rightward: each bundle of consumption is now related to a lower rate of population growth (figure 1.11A). The decline of population expands the choice set of an average person, so that the new equilibrium provides a higher living standard than the old one (figure 1.11B) - the framework preserves the merit of the classical theory.

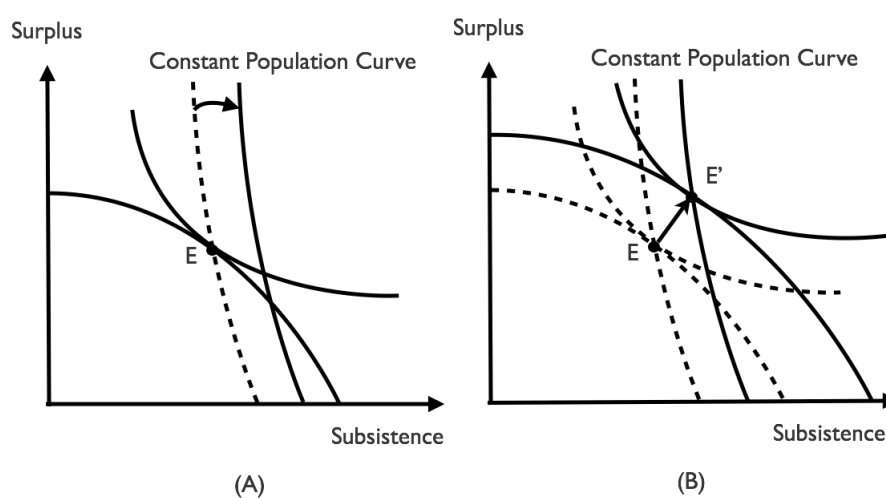


Figure 1.11: The comparative statics of disease, war and fertility strategy

### 1.3.3 The key different assumption

Malthus made a lot of simplifying assumptions. I differ by relaxing only one of them. It turns out the assumption I relax is a crucial one. Relaxing it, Malthus would have predicted a different pattern of living standards growth.

Malthus's prediction of constancy depends on his implicit assumption that the utility function  $U$  is an increasing transformation of the population growth rate  $n$ . In the diagram, it means that the constant population curve coincides with the indifference curve.

If so, a surplus technology cannot affect the equilibrium living standards (figure 1.12). After a surplus shock, when the economy comes back to the constant population curve (figure 1.12C), the new equilibrium has the same level of utility as the old one. This is because the indifference curve coincides with the constant population curve. As the new equilibrium falls on the constant population curve, it falls on the same indifference curve as well (figure 1.12C).

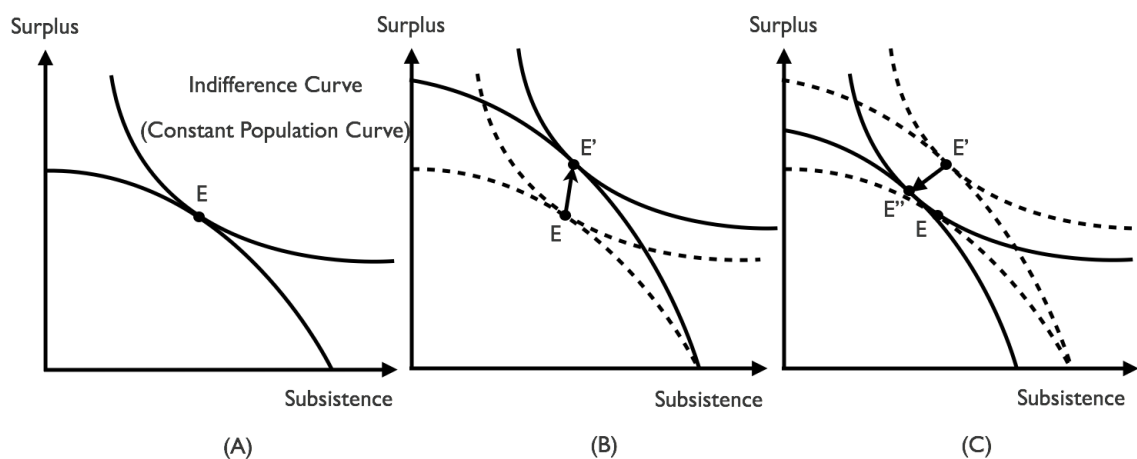


Figure 1.12: The Malthusian model as a special case

This is why the classical model predicts the constancy of living standards. If the constant population curve does not cross the indifference curve, the two sectors can be reduced into one sector. Malthusian theory is the special case that assumes away the difference of demographic effect between commodities, assumes away the crossing of curves, and assumes away the conflict of reproductive interest between individual and group.

The reproductive conflict between individual and group is the fundamental reason why the curves cross. In essence, the constant population curve is a curve of iso-group fitness, along which the group achieves a certain rate of population growth. In parallel, the indifference curve is a curve of iso-individual fitness: millions of years' natural selection

programs the preference system to maximize the personal chance of reproduction. What pleases is usually what benefits - it benefits the individual but not necessarily the group. So the indifference curve is a close approximation of an iso-individual-fitness curve.

The conflict between group fitness and individual utility - which is manifest in the crossing - is driven by the conflict of fitness between group and individual. Such a conflict prevails in biology as well as in culture. As sure as the fitness conflict persists, the curves always cross each other; and the division of surplus and subsistence is a perpetual human condition.

### 1.3.4 The baseline model

The geometric model has presented three comparative statics. All of them can be captured by a single formula in the following algebraic model.

Let the representative agent maximize a Cobb-Douglas utility function that has constant returns to scale on her subsistence consumption  $x$  and surplus consumption  $y$ .

$$U(x, y) = x^{1-\beta}y^\beta \quad (1.1)$$

Constant returns to scale makes it meaningful to calculate the growth rate of utility. Utility doubles when consumption doubles.

Specify the subsistence production function as  $X = AL_A^{1-\gamma_A}H_A^{\gamma_A}$  and the surplus production function as  $Y = BL_B^{1-\gamma_B}H_B^{\gamma_B}$ .  $L_A$  and  $L_B$  are the land used in subsistence and surplus production. Their sum equals to total endowment of land,  $L_A + L_B = L$ .  $H_A$  and  $H_B$  are the labor employed in subsistence and surplus production. Their sum equals the total population,  $H_A + H_B = H$ .

To ensure the independence of production structure from the level of population, I impose the following assumption.

**Assumption 1**  $\gamma_A = \gamma_B \equiv \gamma < 1$ .

I assume  $\gamma_A = \gamma_B$  so that population growth affects surplus and subsistence production in proportion.  $\gamma_A$  and  $\gamma_B$  are smaller than one because diminishing returns to labor is a central feature of Malthusian economies.

Since the population is homogeneous, assume that

**Assumption 2** *Each person gets an equal share of social output.*

Under assumption 2, by maximizing utility under the land and labor constraint, we can derive the average surplus and average subsistence:

$$x = A(1 - \beta) \left( \frac{H}{L} \right)^{\gamma-1} \quad (1.2)$$

$$y = B\beta \left( \frac{H}{L} \right)^{\gamma-1} \quad (1.3)$$

Substitute equation 1.2 and equation 1.3 into  $U = x^{1-\beta}y^\beta$ . The level of utility is

$$U = A \left( \frac{H}{L} \right)^{\gamma-1} \left( \frac{B}{A} \right)^\beta (1-\beta)^{1-\beta} \beta^\beta \quad (1.4)$$

Since  $A(H/L)^{\gamma-1}(1-\beta) = x$  (equation 1.2), we can alternatively express  $U$  as a function of  $x$ ,  $A$  and  $B$ .

$$U = x \left( \frac{B}{A} \right)^\beta \left( \frac{\beta}{1-\beta} \right)^\beta \quad (1.5)$$

The economy converges to equilibrium by the adjustment of population level. Since there is no migration for the isolated economy, the *net* growth rate of population  $g_H$  must be equal to the *natural* growth rate of population  $n$ . For simplicity, assume  $n$  depends on the average subsistence only.

**Assumption 3**  $g_H \equiv \dot{H}/H = n = \delta(\ln x - \ln \bar{x})$  and  $\delta > 0$ .

where  $\bar{x}$  is the level of average subsistence at which population keeps constant. The assumption implies a vertical constant population curve - population growth is independent of average surplus. The equilibrium of the isolated economy satisfies the condition  $x = \bar{x}$ . Therefore, in the equilibrium

**Proposition 1**

$$U^E = \bar{x} \left( \frac{B}{A} \right)^\beta \left( \frac{\beta}{1-\beta} \right)^\beta \quad (1.6)$$

*The equilibrium level of utility increases with  $B/A$ ,  $\beta$  and  $\bar{x}$ .*

The formula captures three comparative statics. The equilibrium utility can rise for three reasons:

1. A rise in the ratio of surplus to subsistence, i.e.  $B/A$  rises.
2. A rise in the social preference for surplus, i.e.  $\beta$  rises.
3. A rise in the required consumption for population balance, i.e.  $\bar{x}$  rises.

### 1.3.5 The puzzle of balanced growth and its explanations

The equilibrium utility increases with the ratio of surplus to subsistence. It implies that living standards would have grown steadily if the growth rate of surplus had exceeded that of subsistence. To see this, let  $A$  grow at the rate of  $g_A$  and  $B$  grow at  $g_B$ . If  $g_B > g_A$ , what will happen to the growth rate of utility,  $g_U$ ?

First we need a utility formula that relates  $U$  to  $A$  and  $B$ . We cannot use the formula of equilibrium utility (equation 1.6) because the continuous progress of technology pulls the economy slightly away from the equilibrium state,  $x = \bar{x}$ . Therefore we turn to equation 1.4, which applies to all scenarios.



Suppose land is fixed. By the log-linearization of equation 1.4, we derive

$$g_U = \beta(g_B - g_A) + g_A - (1 - \gamma)g_H \quad (1.7)$$

I prove that  $[g_A - (1 - \gamma)g_H]$  converges to 0 (appendix 4.1.1), therefore

**Proposition 2**

$$g_U = \beta(g_B - g_A) \quad (1.8)$$

*The growth rate of utility is proportional to the gap of growth rates between the surplus and subsistence sectors.*

In Malthusian theory,  $\beta = 0$ : there is only one sector. Hence  $g_U = 0$ : the living standards remain constant. In the two-sector model,  $\beta$  is positive, therefore the living standards grow steadily unless surplus and subsistence evolve in a balanced way,  $g_B = g_A$ .

The implied balanced growth is an intriguing phenomenon. The world population had grown from several million at the dawn of the agricultural revolution, to three hundred million at the birth of Christ, and to almost one billion on the eve of the industrial revolution. So had subsistence production grown in proportion. Now if the living standards had indeed been constant, the surplus sector must have grown in proportion to the subsistence sector. But why is so?

I propose four explanations for the balanced growth. Except the theory of group selection, all of them are rejected.

**1. Evolutionary adaption**

Long exposure to a commodity causes genetic adaption for people to better use the commodity as subsistence. For example, lactose intolerance is relatively rare among North and Western Europeans because milk was an important nutrition to their ancestors. People who were better at digesting lactose got more nutrition, and thus were more reproductively successful. Natural selection raises the demographic value of milk in these areas.

**Doubts:** It takes too long for genetic adaption to have a significant effect.

**2. A thing is valued in proportion to its rarity.**

Diamonds are precious because they are rare. Some surpluses become worthless when they are too many. Moreover, lots of surpluses are positional goods: people value how much they own compared with others instead of what they own *per se*. Therefore a rise in surplus productivity causes cultural changes that drive people away from surplus.

**Doubts:** This might explain why being rich does not make one much happier, but it does not explain why physical deprivation lasts.

### 3. Constant returns to scale

In a dynamic system such as

$$\begin{aligned}A_{t+1} &= F_A(A_t, B_t) \\ B_{t+1} &= F_B(A_t, B_t)\end{aligned}$$

if functions  $F_A$  and  $F_B$  have constant returns to scale,  $A$  and  $B$  will grow in balance on a stable path (Samuelson and Solow, 1953).

**Doubts:** Growth is about the generation of ideas. The theorem Samuelson and Solow proved is not directly applicable to idea generation. There is no obvious reason why there should be constant returns to scale in the context of surplus and subsistence growth.

### 4. Group selection

I cannot reject this hypothesis. The rest of the paper will elaborate how group selection works, why it causes constancy and what the evidence is for its relevance.

#### 1.3.6 The model of source-sink migration

How does group selection work? As previously, before using algebra, I will first provide a geometric model to highlight the intuition.

Suppose there is a sea of identical villages. All start at the equilibrium state in the beginning (figure 1.13A). Assume that people migrate freely but never trade across borders.

I assume there is no trade because trade substitutes migration. If people of different regions face the same relative price of surplus to subsistence, the Malthusian force will make them choose the same bundle of consumption. Then there would be no need to migrate. But when trade has a cost, the relative price will differ and migration will emerge. In the ancient world, trade was never big enough to wipe out the difference of lifestyle between the nomadic zones and the arable zones. The nomadic invasion and immigration to the arable zones were a response to the difference of living standards. So I can relax the assumption of no trade and introduce trade cost without affecting the qualitative results. I assume the extreme case of no trade only to simplify the analysis. The assumption is not crucial.

Suppose one of the villages discovers a new way to mine for diamonds. Thanks to the surplus technology, its production possibility frontier expands vertically (figure 1.13B). If migration were forbidden, the diamond village would end up with a higher living standard.

However, free migration equalizes the level of utility between the diamond village and the others (figure 1.13C). With a steeper production possibility frontier tangent with the

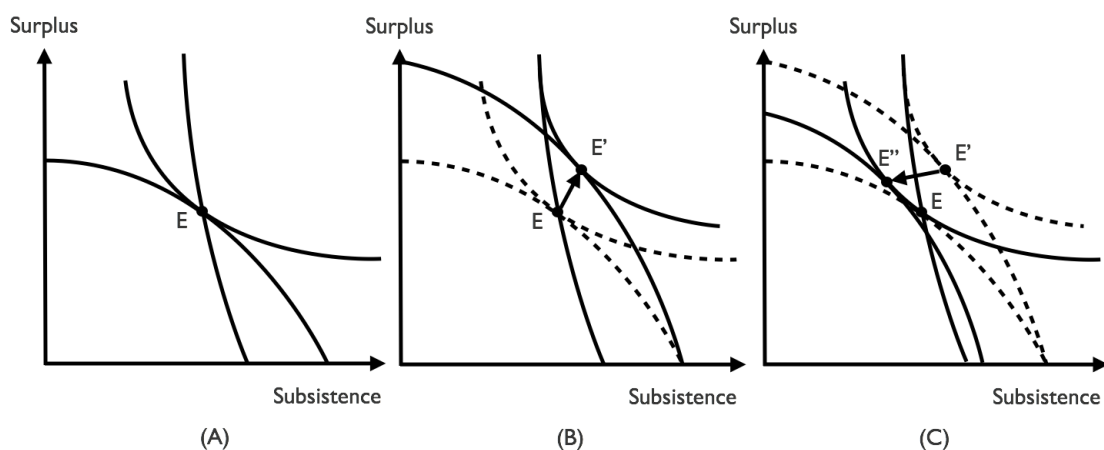


Figure 1.13: Difference of production structure causes source-sink migration.

same indifference curve, the diamond village stays to the left of the constant population curve - its death rate is higher than the birth rate. But the natural decrease of population does not expand the production possibility frontier because the under-reproduction is filled up by the continuous immigration from the other villages. The pattern lasts as long as the relative price of surplus to subsistence differs between the villages. The diamond village becomes a demographic *sink* and the surrounding villages serve as a demographic *source*.

A similar pattern holds for regions that share the same production structure but differ in social preference. Again, start with the identical villages at the equilibrium state (figure 1.14A). Suppose somehow in one of the villages, girls begin to ask for more diamonds from their suitors. As a result, the indifference curve becomes flatter (figure 1.14B): people trade grain for diamonds. If the diamond village were isolated from the rest of world, the girls would earn what they demand for free: in the long run, the average consumption of grain would barely change.

But when migration is costless, the difference of social preference causes a similar pattern of source-sink migration. The outsiders will not migrate in the beginning. They will wait for the population of the diamond village to decline, from  $E'$  to  $E''$  (figure 1.14C). At  $E''$ , utility equalizes across the border, which triggers a continuous flow of immigration. From then on, the diamond village stays to the left of the constant population curve - the death rate is higher than the birth rate and the gap is met by the immigrants.<sup>13</sup>

The craze for diamonds will not last forever in the diamond village. The constant flood of immigrants will dilute the diamond culture. This is the fate of most fads and fashion. The arms race of conspicuous consumption is constrained not by the Malthusian

<sup>13</sup>The migrants are assumed to keep their old preference. If instead they convert to new culture, the diagram will be slightly different but the source-sink pattern still remains.

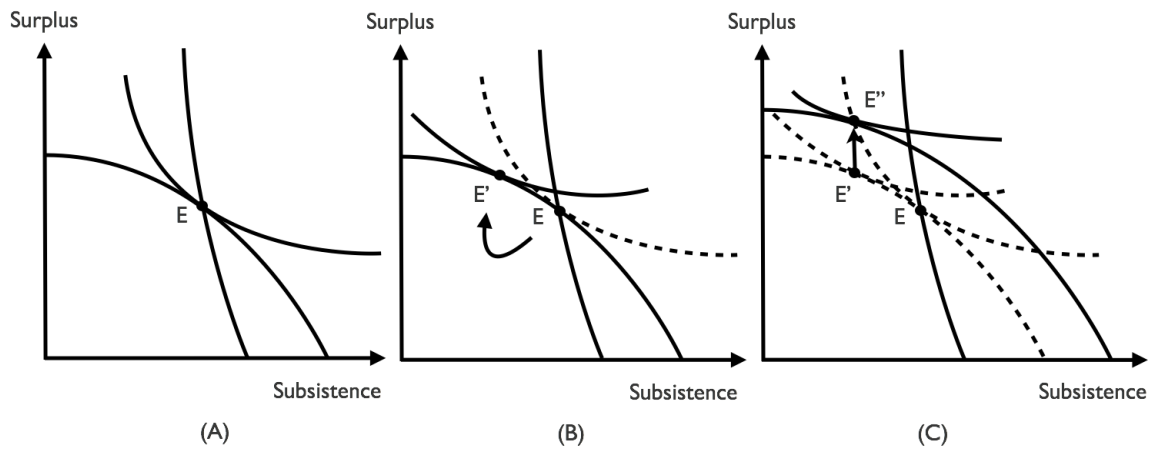


Figure 1.14: Difference of culture causes source-sink migration.

force, but by group selection, in the form of source-sink migration.

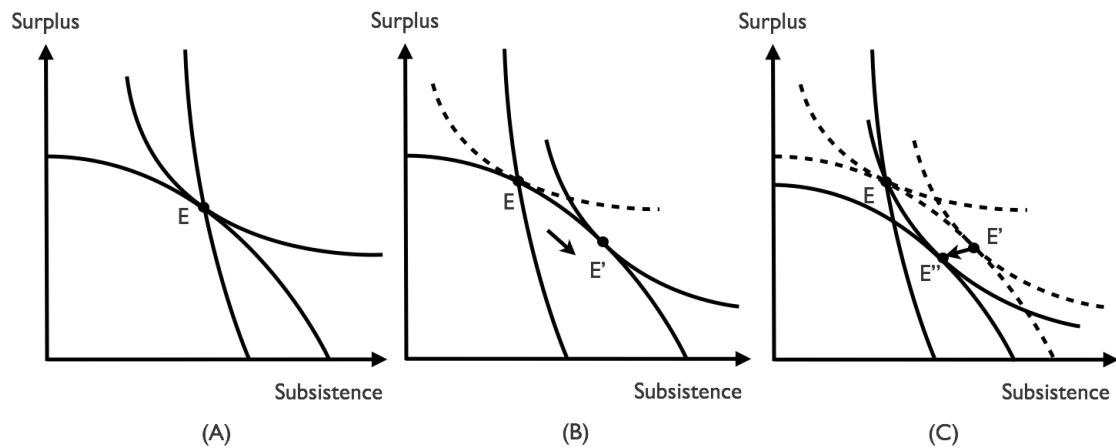


Figure 1.15: The source-sink migration after a subsistence cultural shock

On the contrary, a subsistence culture can rise to global dominance by sending out emigration (figure 1.15). Take monogamy as an example. Biologically speaking, the elites would do better under polygamy, and they have the strength as well as the incentive to bolster it. Yet most of us live in a monogamous society because monogamy is a subsistence culture: by imposing equality of sexual opportunity, it shifts importance from attracting the mates to feeding the children, from a surplus activity to a subsistence activity. The local elites' incentive and ability pale in the comparison with the power of group selection.

### 1.3.7 Selection against surplus growth

The above model geometrically describes how migration is biased to favor the spread of subsistence culture and technology. Following the same intuition and setup, this section provides two algebraic models. The first one shows how a single region's surplus growth is constrained when it is set against a sea of subsistence regions. The second model derives the path of global average utility in the case of two regions. Assuming the same  $\beta$  across regions, the models deal with the selection of technology but not the selection of culture; the results could be easily extended to the cultural selection.

#### A sea-of-villages model

Suppose there is a sea of identical villages in the beginning. For each of them, the baseline model specifies the utility and production functions as well as the population dynamics.

Suppose one of the villages differs from the others by having a different path of surplus growth. In particular, all the other villages have a constant level of subsistence technology  $A'$  and a constant level of surplus technology  $B'$ , while that single village - though having the same constant level of subsistence technology  $A^* = A'$  - has a variable level of surplus technology  $B^*$  that tends to grow at a constant rate  $g$  if unconstrained by immigration. We call that village the surplus village and the others the subsistence villages.

When  $B^*$  exceeds  $B'$ , the difference of production structure will trigger source-sink migration. If the immigrants influence the technology of the surplus village, how will  $B^*$  evolve? Can biased migration dominate the growth tendency of  $B^*$ ?

First, we need the assumption of no trade and free migration to determine the migrational equilibrium.<sup>14</sup>

**Assumption 4** *Trade is forbidden across the villages but migration is costless. Free migration equalizes the level of utility between the surplus village and the subsistence villages,  $U^* = U'$ .*

By equation 1.5, the equality  $U^* = U'$  means

$$x^* \left( \frac{B^*}{A^*} \right)^\beta \left( \frac{\beta}{1-\beta} \right)^\beta = x' \left( \frac{B'}{A'} \right)^\beta \left( \frac{\beta}{1-\beta} \right)^\beta$$

where  $x^*$  and  $x'$  are the average consumption of subsistence in the surplus village and the subsistence villages.

The equation can be rearranged into the following:

$$\ln x^* - \ln x' = -\beta \left[ \ln \left( \frac{B^*}{A^*} \right) - \ln \left( \frac{B'}{A'} \right) \right] \quad (1.9)$$

---

<sup>14</sup>Trade cost can be introduced without affecting the qualitative results. In the beginning of section 1.3.6, I have discussed the reasons for the assumption.

With free migration, the net emigration rate  $m$  is equal to the *natural* growth rate of population  $n$ , which in turn depends on the average subsistence  $x$ ,  $n = \delta(\ln x^* - \ln \bar{x})$  (assumption 3). In particular, for the surplus village,

$$m = n = \delta(\ln x^* - \ln \bar{x}) \quad (1.10)$$

Here  $\bar{x}$  is the level of average subsistence that keeps the population in natural balance. Since  $\delta > 0$  and  $x^* < \bar{x}$ ,  $m$  is negative: migrants move *into* the surplus region. As the effect of emigration is negligible on each of the subsistence villages, the subsistence villages have the equilibrium level of average subsistence, i.e.  $x' = \bar{x}$ .

Denote  $s^* \equiv \ln(B^*/A^*)$  and  $s' \equiv \ln(B'/A')$ . Substituting  $x' = \bar{x}$  and equation 1.9 into equation 1.10, we arrive at

**Proposition 3**

$$m = -\beta\delta(s^* - s') \quad (1.11)$$

*The emigration rate is proportional to the difference of production structures.  $s$  measures a region's ratio of surplus to subsistence. Having a higher ratio of surplus to subsistence than the neighboring regions causes net immigration.*

Immigration affects the evolution of  $B^*$  by technological replacement. Assume the replacement effect is proportional to how many immigrate. In particular, assume  $B^*$  evolves in the following way.

**Assumption 5** *From time  $t$  to  $t + \Delta t$ ,  $B^*$  updates by taking the weighted geometric average of  $B^*$  and  $B'$  and picking up the intrinsic growth rate  $g$ .*

$$B^*(t + \Delta t) = B^*(t)^{1-m\Delta t}(B')^{m\Delta t}(1 + g\Delta t) \quad (1.12)$$

Divide both sides of equation 1.12 by  $A'$ , take logarithms, and calculate the limit as  $\Delta t \rightarrow 0$ . Thus we rewrite the equation into the motion of the ratio of surplus to subsistence,  $s^*$ .

$$\dot{s}^* = m(s^* - s') + g \quad (1.13)$$

Substitute equation 1.11 into equation 1.13:

$$\dot{s}^* = -\delta\beta(s^* - s')^2 + g \quad (1.14)$$

As the phase diagram of figure 1.16 shows, in the equilibrium, the negative quadratic term  $-\delta\beta(s^* - s')^2$  balances the growth rate  $g$ . Therefore,

**Proposition 4** *In the long run, even if  $B^*$  has an intrinsic tendency to grow at the constant rate  $g$ , the surplus village's ratio of surplus to subsistence,  $s^* = \ln(B^*/A^*)$  will stabilize at*

$$s' + \sqrt{\frac{g}{\delta\beta}}$$

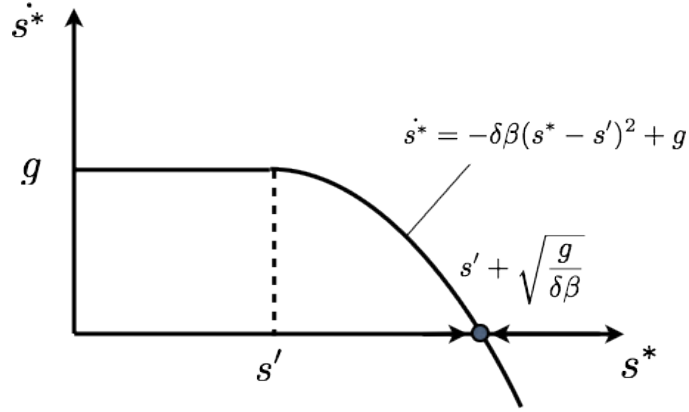


Figure 1.16: The phase diagram of  $s^*$ , the surplus-subsistence ratio of the sink area

Proposition 4 establishes the dominance of group selection over the growth advantage of surplus. The growth advantage of surplus  $g$  contributes to the level but not the growth rate of utility. The equilibrium utility of the surplus village increases with  $g$  but decreases with  $\delta$ : selection will be stronger when migration is more responsive.

### A two-region model

The sea-of-village model solves the “partial equilibrium”: it describes the dynamics of a single region but we are also curious about the “general equilibrium”. This section shows how the global average surplus evolves in a two-region world.

The following two-region model inherits all the previous assumptions except the number of regions. Suppose region 1 and region 2 start identical; the baseline model specifies everything inside each. Assume that their subsistence technologies,  $A_1$  and  $A_2$ , grow at the same constant rate  $g_A$  and their surplus technologies,  $B_1$  and  $B_2$ , grow at a variable rate. In particular, if unconstrained by selection,  $B_1$  and  $B_2$  have an intrinsic tendency to evolve as follows:

$$d \ln B_i = (g_A + g)dt + \sigma dz_i \quad (1.15)$$

Here,  $g$  measures the growth advantage of surplus over subsistence. When  $g > 0$ , surplus tends to grow faster than subsistence. The error terms  $z_i$ 's ( $i = 1, 2$ ) are independent Brownian motions,  $\text{Var}(\sigma dz) = \sigma^2 dt$  and  $z_1$  and  $z_2$  are independent with each other. I introduce the stochastic growth of technology as the source of inter-regional variation in the ratio of surplus to subsistence. The variation is the basis of group selection.

In the real world, both surplus and subsistence technologies,  $B$  and  $A$ , are subject to drifts with random errors. But I fix the growth paths of  $A_1$  and  $A_2$  to keep the levels of population equal between the regions. The equality of population simplifies the calculation of the number of migrants and makes the model tractable. Now the inter-regional variation comes from the randomness of the surplus growth only. The source of

the variation is not crucial to my result, for selection works on the difference of production structures and the Brownian motion in the surplus growth has fully captured the variation in the surplus-subsistence ratio.

Denote  $s_i \equiv \ln(B_i/A_i)$ , which measures the ratio of surplus to subsistence. Equation 1.15 implies the motion of  $s_i$ ,

$$ds_i = gdt + \sigma dz_i \quad (1.16)$$

Now assume that

### Assumption 6

$$g > 0$$

*If there were no migration, surplus sector would grow faster than subsistence sector.*

The assumption allows both regions, if isolated, to grow steadily in living standards. The question is under what condition group selection will suppress the trend of growth when migration is allowed.

Group selection offsets the trend of growth by adding a “drag” term to the motion of  $s_i$ . The drag arises when  $s_1 \neq s_2$ . Following a similar derivation as we did for equation 1.14, we can calculate the drag term as a quadratic of the difference between  $s_1$  and  $s_2$ :

$$ds_i = [g - I_{\{s_i > s_j\}} \beta \delta (s_i - s_j)^2] dt + \sigma dz_i$$

Here  $I_{\{s_i > s_j\}}$  is the indicator function that equals 1 if  $s_i > s_j$  and 0 if otherwise. The selection drag is conditional on the comparison of  $s_1$  and  $s_2$ : if  $s_1 > s_2$ , region 1 is relatively the surplus region. It attracts immigration from region 2, which drags  $s_1$  closer to  $s_2$ ; if  $s_1 < s_2$ , region 1 is relatively the subsistence region. It receives no migration and  $s_1$  will not be affected.

Since utility depends on the ratio of surplus to subsistence and we are interested in the global average utility, the most interesting variables are the global average of  $s_i$ 's,  $\mu = \frac{1}{2}(s_1 + s_2)$  and the inter-regional variation  $\nu = \frac{1}{2}(s_1 - s_2)^2$ .<sup>15</sup> The way  $\mu$  evolves describes the dynamics of the global living standards.

Applying Itô's lemma, we can solve for the motion of  $\mu$  and  $\nu$ .

$$d\mu = (g - \beta\delta\nu)dt + \frac{\sqrt{2}}{2}\sigma dz \quad (1.17)$$

$$d\nu = (\sigma^2 - 2\sqrt{2}\beta\delta\nu^{\frac{3}{2}})dt + 2\sqrt{\nu}\sigma dz \quad (1.18)$$

where  $z$  is a Brownian motion.

---

<sup>15</sup> $\nu$  is equivalent to the sample variance:  $\nu = \frac{1}{2}(s_1 - s_2)^2 = [s_1 - \frac{1}{2}(s_1 + s_2)]^2 + [s_2 - \frac{1}{2}(s_1 + s_2)]^2$



Ignoring the stochastic part, figure 1.17 graphs the phase diagrams of  $\mu$  and  $\nu$ . There are two different scenarios. Which scenario arises depends on the relative positions of the two nullclines, i.e. the curves of  $\dot{\mu} = 0$  or  $\dot{\nu} = 0$ .

$$\dot{\mu} = 0 : \quad \nu = \frac{g}{\beta\delta} \tag{1.19}$$

$$\dot{\nu} = 0 : \quad \nu = \frac{1}{2} \left( \frac{\sigma^2}{\beta\delta} \right)^{\frac{2}{3}} \tag{1.20}$$

Comparing the relative positions of the nullclines solves the threshold condition for the dominance of selection.

**Proposition 5** *If the growth advantage of surplus,  $g$  is larger than a threshold, e.g.*

$$g > \frac{1}{2}(\beta\delta)^{\frac{1}{3}}(\sigma^2)^{\frac{2}{3}} \tag{1.21}$$

*$\mu$  will be rising: the growth advantage of surplus outpaces the force of selection. If  $g$  is smaller than the threshold,  $\mu$  will be declining: selection dominates the growth advantage of surplus.*

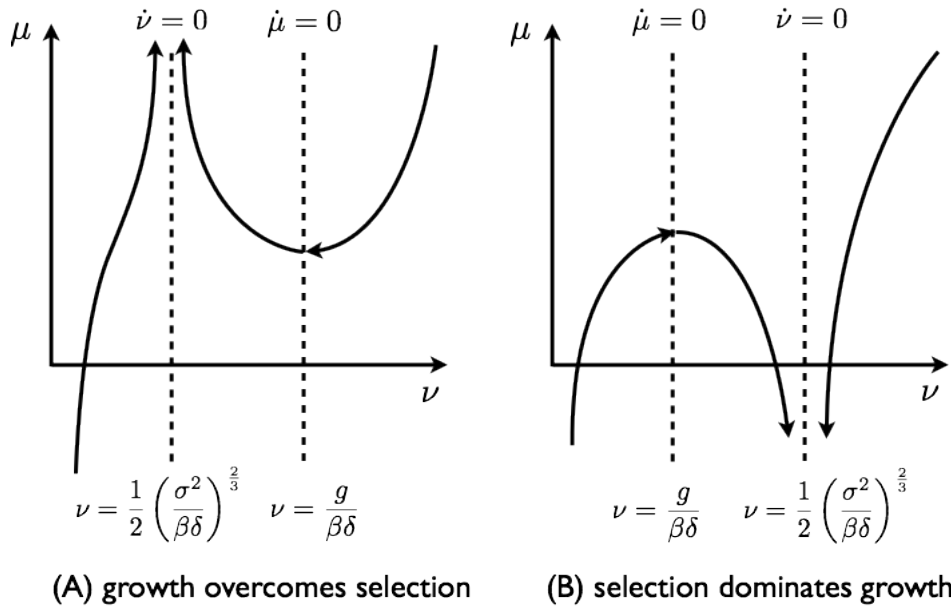


Figure 1.17: The phase diagrams of  $\mu$  and  $\nu$

The possible decline of  $\mu$  seems to contradict the constancy of living standards. To address the problem, we can either set a lower bound of average surplus or specify that the surplus growth rate increases with the relative rarity of surplus. Such modifications appear *ad hoc*, but the *ad hocery* does not hurt my theory. First, these modifications are reasonable features of reality; second, the theory is never meant to explain why living

standards had not been declining. The only thing that I need to show is the possibility that selection can dominate the growth advantage of surplus. My model has derived the condition when that happens.

The threshold in proposition 5 depends on  $\sigma^2$  because selection works on variation. If surplus growth did not vary around the trend, surplus technology would grow at the same rate in both regions and group selection would not take place between them. Increasing  $\sigma^2$  strengthens selection: it then requires a larger growth advantage of surplus to overcome group selection.

At a first look, selection appears weak. If  $\beta = 0.5$ ,  $\delta = 0.1$  and  $\sigma = 0.02$ , the threshold  $g$  is merely 0.1%, that is, living standards will be growing as long as surplus intrinsically grows faster than subsistence by more than 0.1% per year. In the ancient times, global population increased at about 0.1% per year. Therefore subsistence must have grown at about 0.1%. It suggests, when  $g_B < g_A + g = 0.1\% + 0.1\% = 0.2\%$ , living standards cannot grow. In other words, group selection dominates the trend of growth even if the intrinsic growth rate of surplus is twice as large as that of subsistence. Selection is stronger than it appears.

However there is a serious limitation to the model. The model assumes a strong form of selection: the immigrants' technologies replace the natives' technologies, no matter whose methods of production are more efficient. The assumption is reasonable in the context of wars but not in the other contexts. If people can choose what kind of technology to adopt and if they always take up the more advanced technology when faced with a choice, will group selection still dominate the growth advantage of surplus? The answer is yes. The following simulations address the concern.

## 1.4 Simulation

### 1.4.1 Simulating group selection

The above models show how selection suppresses the growth of surplus. There are two limitations. First, the sea-of-village model abstracts from the geographical feature of the real world. Second, the models assume the immigrants' technologies to replace the natives' technologies even if the latter might be more advanced. To address the two concerns, I turn to computer simulation to study how strong and robust group selection is indeed.

The strength of selection is of central interest because for my theory to be established, selection must overcome a number of noises. Trade, cross-border learning, seasonal migration and distribution of books provide alternative ways for an idea to spread, ways that are neutral to the surplus character of the idea. Group selection must overcome these noises to suppress the growth of surplus. Empirically estimating these factors is difficult.

But if I can demonstrate the strength of group selection, that selection can dominate a large advantage of surplus growth - hence the noises are relatively minor compared with selection - then my theory should deserve more confidence.

To conduct the simulation, imagine a chess-board-like world divided into  $l \times w$  grids (figure 1.18). Each grid has the same production and utility functions and the same population dynamics, as the baseline model specifies. Time is discrete. At period  $t$ , the state of a grid economy  $(i, j)$  is  $\{A_{ijt}, B_{ijt}, H_{ijt}\}$ , i.e. the subsistence technology, the surplus technology and the level of population.

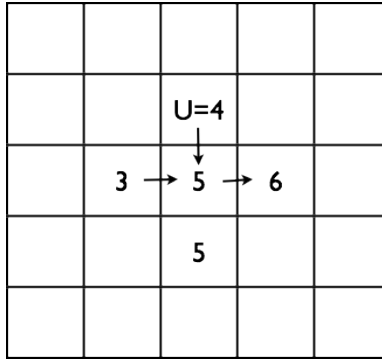


Figure 1.18: The chess-board world of  $5 \times 5$  grids

For grid  $(i, j)$ , assume its levels of technology,  $A_{ij}$  and  $B_{ij}$ , evolve this way:

$$A_{ij}(t+1) = A_{ij}(t)(1 + g_{Aij} + \sigma_A \epsilon_{Aij}) + \text{selection effect} \quad (1.22)$$

$$B_{ij}(t+1) = B_{ij}(t)(1 + g_{Bij} + \sigma_B \epsilon_{Bij}) + \text{selection effect} \quad (1.23)$$

The error terms  $\epsilon_A$  and  $\epsilon_B$  both follow a normal distribution,  $\epsilon_A, \epsilon_B \sim N(0, 1)$ , i.i.d. To prevent a downward trend of living standards when group selection dominates, assume that  $g_B$  rises with the relative rarity of surplus. In particular,

$$g_{Bij} = g_B \left[ 1 + \left( \frac{B_{ij}}{A_{ij}} \right)^\alpha \right] \quad (1.24)$$

To minimize the effect of the endogeneity of  $g_{Bij}$ , I set the parameter  $\alpha = -10$  so that the adjustment term is negligible when  $B_{ij}/A_{ij} > 1$ . The endogeneity of  $g_{Bij}$  does not weaken the robustness of my simulation because the adjustment raises the growth advantage of surplus and thus is unfavorable to my hypothesis of surplus suppression.

I fix  $g_{Aij}$  across all grids:  $g_{Aij} = g_A$ . The parameters  $g_A, g_B, \sigma_A, \sigma_B$  are set exogenously. In the baseline simulation, I set  $g_B > g_A$ : surplus intrinsically grows faster than subsistence. I also assume  $\sigma \equiv \sigma_A = \sigma_B$ . I will show how the strength of selection increases with  $\sigma$ .

In each period, people decide whether they should move to one of the neighboring grids for higher living standards. For any pair of bordered grids, if grid 1 has a higher

utility than grid 2, some of the residents of grid 2 will move to grid 1. Assume the migration rate to be equal to

$$\frac{\text{Migrants}}{\text{Population of grid 2}} = \theta(\ln U_1 - \ln U_2) \quad (1.25)$$

Equation 1.25 sets a different rule for migration than the theoretical model does. The theoretical model rules out the difference of utility across regions by assuming instant free migration. But equation 1.25 introduces  $\theta$ , the measure of how responsive migration is to the difference of utility. When  $\theta \rightarrow \infty$ , the simulated migration works in the same way as in the theoretical model. Setting a finite  $\theta$  makes the simulation closer to reality. It also allows me to evaluate the variance of utility levels across different regions.

Migrants spread knowledge from hometowns to destinations. I simulate two different scenarios, each assuming a different way of knowledge spread.

The first scenario is called “pure replacement”. It is the same mechanism the theoretical model has adopted: the immigrants’ technologies replace the natives’ technologies.

The second scenario is called “combining the best”. People are allowed to choose what technologies to adopt. If the immigrants bring a more advanced technology, the natives will update their own in the same way as “pure replacement”; but if the immigrants’ technologies are inferior to the natives’, the natives will keep their old technologies, and the immigrants will convert to the natives’ technologies as well.

Combining the best favors the spread of subsistence as pure replacement does. For two regions that start identical, if one of them improves subsistence productivity, population growth will lower its living standards, and people will emigrate to spread the improved subsistence technology. However, if it is surplus productivity that improves, no emigration will occur and the surplus technology has to remain local.

Overall, selection is weaker under combining the best than under pure replacement. Pure replacement not only spreads subsistence but also degrades surplus. In contrast, combining the best only spreads subsistence but never degrades surplus. The reality is somewhere in between.

I simulate both scenarios. In my baseline simulation, I parameterize  $g_A = 1\%$ ,  $g_B = 0.5\%$  and  $\sigma_A = \sigma_B = 5\%$ . The other parameters are set to make a period roughly equivalent to a decade.<sup>16</sup>

Including pure replacement and combining the best, I compare four different scenarios in total (figure 1.19). The other two scenarios are purely Malthusian - they rule out group selection. The first one forbids migration and the second one forbids the natives to learn from the immigrants. After 1,000 decades, the global average utility grows from 1.5 to 12 under both Malthusian scenarios: solely the Malthusian force fails to check the growth. In contrast, group selection preserves the constancy of living standards: under either pure

---

<sup>16</sup>Appendix 4.2 table 4.5 lists the parameterizations for the baseline simulation.

replacement or combining the best, the average utility never exceeds twice the original level throughout the simulated history that spans 10,000 years.

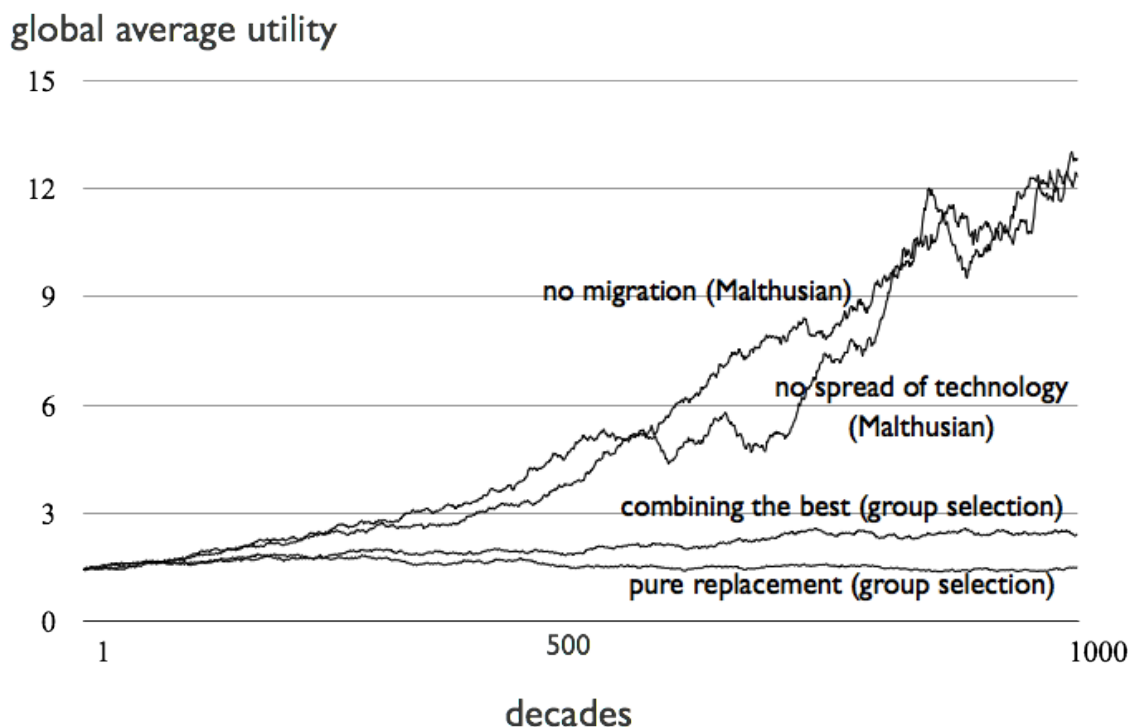


Figure 1.19: The evolution of utility under different assumptions

The stability of living standards does not mean technology is stagnant. In fact, group selection accelerates technological progress. Population grows faster under the selection scenarios than under the Malthusian scenarios (figure 1.20).

Within each grid, the dynamics of utility are more volatile than the global average. Figure 1.21 illustrates three particular regions: one in the corner, another on the side and the other in the center. Despite the wild fluctuations of utility - with cycles that span thousands of years - there is no trend of growth in any of the three regions.

## 1.4.2 Robustness

To check the robustness, I vary parameterization and observe when the constancy breaks. There are two sets of parameters playing the key role: the growth advantage of surplus ( $g_B - g_A$ ) and the variation of the error terms ( $\sigma_A$  and  $\sigma_B$ ).

I fix  $g_A$  at 0.5%. Then I vary  $g_B$  from 0% to 2%, and  $\sigma \equiv \sigma_A = \sigma_B$  from 0% to 15%. For each pair of parameters  $g_B$  and  $\sigma$ , I run a simulation that spans 600 decades on a  $10 \times 10$  grid world. If the global average utility rises more than 25% between the 300<sup>th</sup> decade and the 600<sup>th</sup> decade, I mark a triangle on figure 1.22; otherwise, I mark a circle.

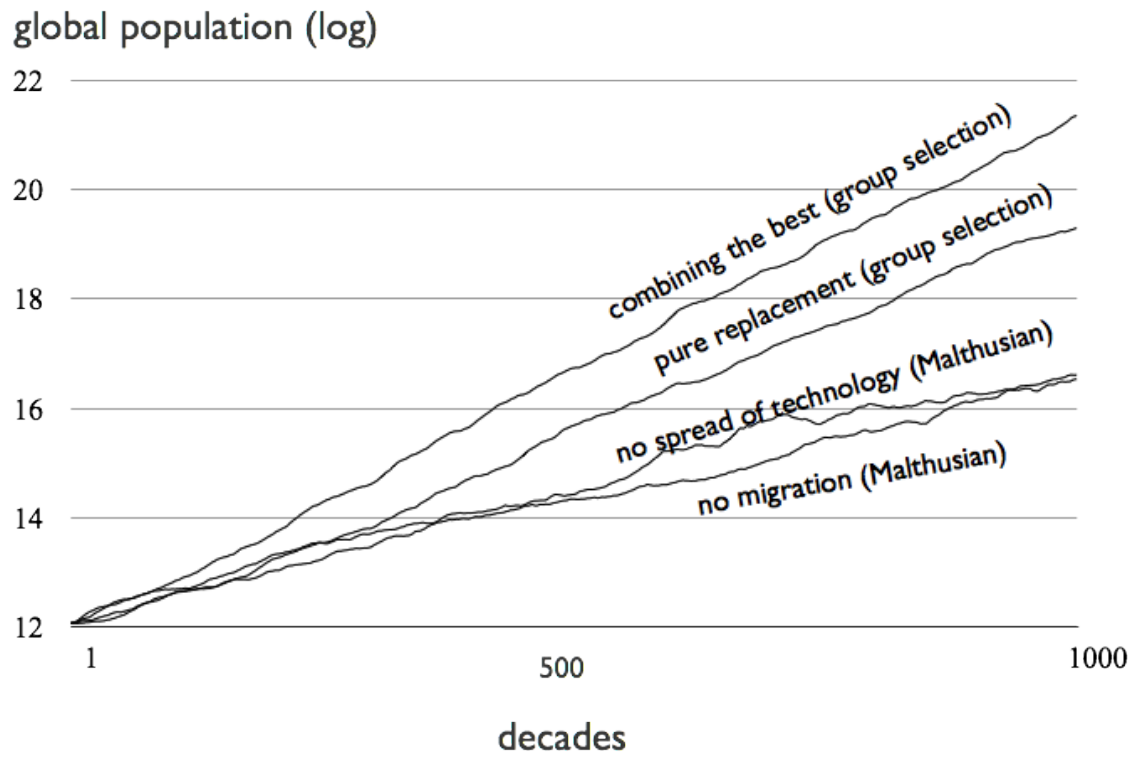


Figure 1.20: The population growth under different assumptions (log)

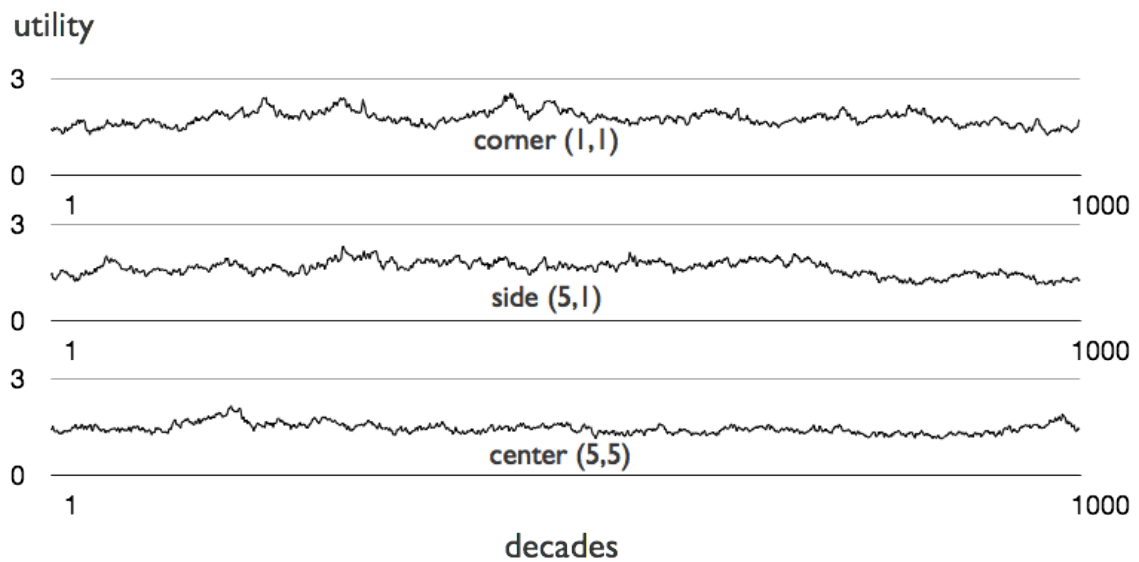


Figure 1.21: The evolution of regional utility

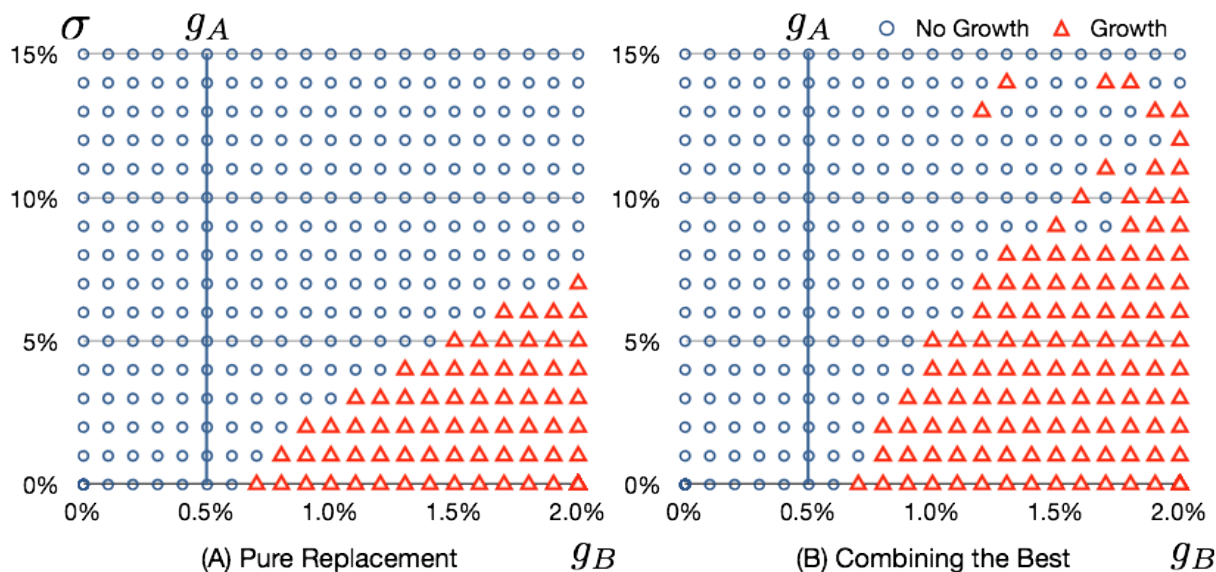


Figure 1.22: Robustness check

Figure 1.22 shows the results. Growth is less likely to appear with a larger standard deviation of the error terms. It confirms the finding in the theoretical model: the strength of selection increases with variation. With enough variation, group selection can dominate a significant growth advantage of surplus. For example, under pure replacement, when  $\sigma = 5\%$ , utility grows less than 25% over 3,000 years when  $g_B = 1.4\%$  and  $g_A = 0.5\%$ . Group selection is indeed a strong force.

As figure 1.22 shows, the area of growth (triangle) is larger under combining the best than under pure replacement: selection is weaker under combining the best. But the simulation has underestimated the strength of selection in this scenario. Here growth is more likely to appear because sooner or later, some grids will emerge strong in both surplus and subsistence; their neighbors are left so far behind that the immigration can no longer affect the technologies of these grids. The living standards of these grids will then grow steadily by the growth advantage of surplus.

In the real world, such groups do not last long. First, they trigger wars and invasions, i.e. pure replacement. Second, even if there is no invasion from the outside, population growth will split such a group into more groups, which border each other, share similar technologies and thus compete with each other on an equal level. Selection among the split groups will constrain the growth of living standards.

### 1.4.3 A duet dance between surplus and subsistence

The constancy of living standards requires surplus to grow at the same rate as subsistence in the long run. But the mere equality of long-run average growth rates is not enough.

World population growth had accelerated for several times, which implies that subsistence growth also occasionally accelerated (figure 1.23). Can surplus growth catch up at each time when subsistence growth accelerates?

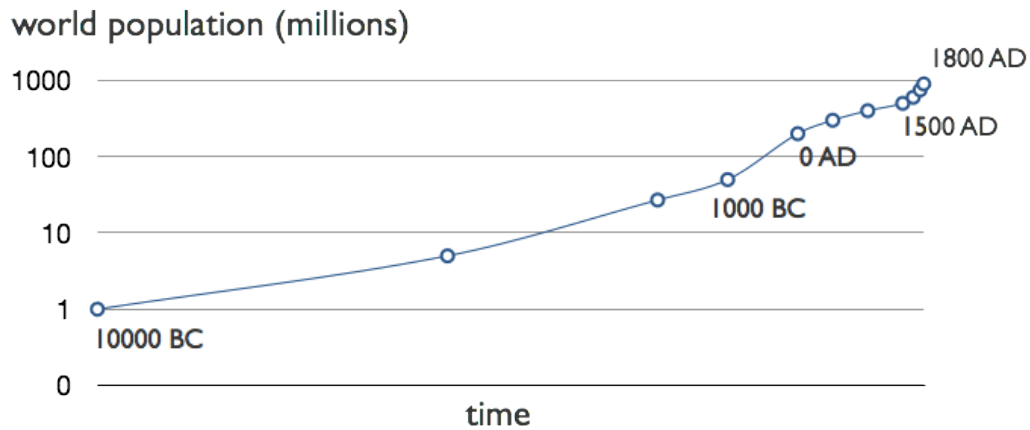


Figure 1.23: The historical world population, from 10000 BC to 1800 AD

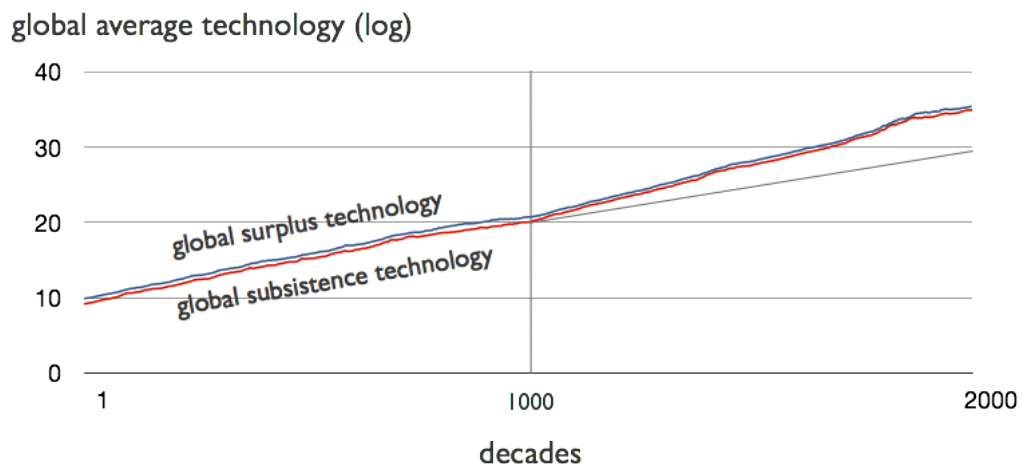


Figure 1.24: The duet dance between surplus and subsistence

The answer is yes. Surplus growth closely matches subsistence growth like a duet dance. I simulate a history of 2,000 decades for a world of 10 by 10 grids. I fix  $g_B$  at 1% throughout; but I make  $g_A$  jump from 0.25% to 0.75% in the middle at the 1001<sup>st</sup> decade. So there appears a kink in the middle of the path of global average subsistence technology (figure 1.24).

Now I conduct a Chow test to check whether the path of surplus growth shows a kink at the same date:

$$\Delta \log(\text{Surplus}) = \underset{(1e^{-3})}{5e^{-3}} + \underset{(0.6e^{-3})}{10e^{-3}} \times \text{break dummy} + \epsilon$$



The test yields a p-value as low as  $10^{-6}$ , rejecting the null hypothesis of no kink. Notice that the estimated coefficient of the break dummy,  $10e^{-3}$  is exactly twice as large as the constant term,  $5e^{-3}$ . It means that when the growth rate of subsistence triples, the growth rate of surplus triples too. Though  $g_B$  is fixed, surplus growth catches up with subsistence growth fast and fully.

## 1.5 Evidence

Empirically, it takes three historical facts to establish my theory. I shall show that the division of surplus and subsistence was a salient feature in the real world, that source-sink migration existed in history and that migration and wars had hindered surplus growth.

### 1.5.1 The empirical division of surplus and subsistence

To establish the first fact, I turn to the English price series collected by Gregory Clark (2004). I use the “affordability” of different goods to explain the birth and death rates between 1539 and 1800.<sup>17</sup>

I calculate the indices of “arable wage” and “pasture wage” for the measure of affordability. The arable wage, for example, is the logarithm of the ratio of the nominal average income to the price index of arable goods.<sup>18</sup> It measures the maximum amount of arable goods that an average person could buy with all her income.

I regress the annual birth and death rates on the wage indices and other controls.<sup>19</sup> In case an ordinary least square regression give biased estimates of the standard errors, I use the Newey-West method for the consistent estimation of the standard errors.

With the guide of the Akaike information criterion, I choose to run the regressions up to four years’ lags. But I only report the cumulative dynamic multipliers up to two years’ lags. The coefficients sum up the effects of the impact year and the last two years ahead.

I cannot reject the hypothesis that both the birth and death rates and the wage indices have unit roots; but I can reject the hypothesis that their first-order differences have unit roots. Therefore, I regress the difference of the birth and death rates on the difference of the wage indices. If there are  $K$  wage indices up to lag  $l$ , I estimate an equation adapted

---

<sup>17</sup>Wrigley and Schofield (1981) estimated the annual numbers of baptisms and burials in England. The series is the most commonly used in the modern literature on English demography.

<sup>18</sup>Arables include wheat, rye, barley, oats, peas, beans, potatoes, hops, straw, mustard seed and saffron. Pastures include meat, dairy, wool and hay, of which meat includes beef, mutton, pork, bacon, tallow and eggs. Clark (2004) compiled the annual price series for most of the products. He also derived aggregate price indices of arables and pastures.

<sup>19</sup>I control for the climate with data from Booty Meteorological Information.

from the following one:

$$\Delta Y_t = \beta_0 + \sum_{i=1}^K \sum_{s=1}^{l+1} \beta_{is} \Delta X_{t-s+1}^i + \text{Controls} + \mu_t \quad (1.26)$$

I adapt the above equation into equation 1.27 to estimate the cumulative dynamic multipliers and their standard errors.

$$\Delta Y_t = \delta_0 + \sum_{i=1}^K \left( \sum_{s=1}^l \delta_{is} \Delta^2 X_{t-s+1}^i + \delta_{i,l+1} \Delta X_{t-l}^i \right) + \text{Controls} + \mu_t \quad (1.27)$$

Here the coefficients  $\delta$ 's are the cumulative dynamic multipliers:  $\delta_{is} = \sum_{j=1}^s \beta_{ij}$ .

I conduct three experiments with six pairs of regressions (table 1.1 and table 1.2).

In the first experiment, I compare the effects of the arable wage and the pasture wage (columns  $B(1)$  and  $D(1)$ ). The arable wage has significant effects on both the birth rate and the death rate. Doubling the arable wage would raise the birth rate by 1.14 percentage points and lower the death rate by 1.11 percentage points within three years. In contrast, the pasture wage has no significant effect on either rate. The difference of effects is not caused by the difference of sectoral size - the size of the pastures as a share of economy was about 3/4 that of the arables. Rather, it is evidence that the arables are a relative subsistence to the pastures.

The second experiment (columns  $B(2)$  and  $D(2)$ ) shows that within the category of arable goods, barley and oats are a relative subsistence to wheat. In pre-modern England, wheat had been a more expensive source of calorie than barley and oats. The rich had wheat bread while the poor ate porridges. Though barley and oats combined were smaller than wheat as a share of economy, the barley and oats wage has a much larger impact on the birth rate and the death rate.

In fact, as the third experiment shows, the barley and oats wage explains most of the demographic effect of the average income. Compare  $B(3)$  with  $B(4)$  and  $D(3)$  with  $D(4)$ . Adding the barley and oats wage as a regressor takes away the explanatory power of the real income. But adding the pasture wage has no effect at all - columns  $B(6)$  and  $D(6)$  report the placebo test. Accounting for merely a 10% share of the English economy, barley and oats exerted a demographic impact far beyond proportion. The pattern is robust if I replace Clark's series of real earning with Wrigley's series of real wage (columns  $B(5)$  and  $D(5)$ ).

In Appendix 4.2, table 4.1 and table 4.2 report the seemingly unrelated regressions (SUR) that take into account the correlation of the error terms. Table 4.3 and table 4.4 report the "level regressions" that do not take differences. I compare the different methods using the regression of birth rate on arable wage and pasture wage as an example (table 1.3). OLS, SUR and NW yield similar estimates under the regression of difference on difference. In comparison, regressing level on level underestimates the difference of

Table 1.1: What affects the birth rate?

Dependent Variables	$\Delta$ Birth rate (%) (the mean birth rate=3.31%)					
	B(1)	B(2)	B(3)	B(4)	B(5)	B(6)
$\Delta$ Arable wage	1.14*** (0.23)					
$\Delta$ Wheat wage		0.07 (0.20)				
$\Delta$ Barley and Oats wage		1.03*** (0.32)		0.83*** (0.29)	0.72** (0.28)	
$\Delta$ Pasture wage	0.84 (0.86)	0.76 (0.80)				0.70 (0.77)
$\Delta$ Clark real earning			2.17*** (0.53)	0.65 (0.59)		2.08*** (0.47)
$\Delta$ Wrigley real wage					0.07 (0.41)	
$R^2$	0.24	0.25	0.20	0.23	0.33	0.25
Observations	262	262	262	262	257	262

Notes: All the coefficients are the sum of the first three years' effects. The models control for the linear, quadratic and cubic trends and include the climate and plague dummies up to two years' lags. Merely regressing the birth rate on the controls has  $R^2 = 0.06$ , and regressing the death rate on the controls has  $R^2 = 0.23$ . \*,\*\* and \*\*\* denote significance at the 90%, 95% and 99% levels respectively.

Table 1.2: What affects the death rate?

Dependent Variables	$\Delta$ Death rate (%) (the mean death rate=2.75%)					
	D(1)	D(2)	D(3)	D(4)	D(5)	D(6)
$\Delta$ Arable wage	-1.11** (0.43)					
$\Delta$ Wheat wage		-0.11 (0.33)				
$\Delta$ Barley and Oats wage		-0.96 (0.60)		-0.93 (0.62)	-0.91 (0.63)	
$\Delta$ Pasture wage	1.06 (1.06)	1.32 (1.09)				0.99 (1.01)
$\Delta$ Clark real earning			-1.65** (0.73)	-0.10 (1.01)		-1.81** (0.85)
$\Delta$ Wrigley real wage					-0.33 (0.85)	
$R^2$	0.31	0.32	0.26	0.29	0.35	0.29
Observations	262	262	262	262	257	262

Table 1.3: The comparison of different methods of regression

Dependent variable: birth rate	Difference			Level
	OLS	SUR	NW	NW
	Arable wage	1.15*** (0.3)	1.15*** (0.28)	1.15*** (0.23)
Pasture wage	0.84 (0.57)	0.84 (0.53)	0.84 (0.86)	-0.09 (0.3)
$R^2$	0.24	0.24	0.24	0.66

Notes: “Difference” means regressing the difference of the birth rate on the differences of the explanatory variables. “Level” means regressing the level of the birth rate on the levels of the explanatory variables. OLS, SUR and NW are abbreviations for ordinary least square, seemingly unrelated regression and Newey-West.

demographic effect between surplus and subsistence. What is common among all these regressions is the significance pattern: the arable wage significantly contributes to the birth rate but the pasture wage does not.

### 1.5.2 The magnitude of source-sink migration

The empirical division of surplus and subsistence provides basis for the source-sink migration. Across different areas, equilibrium living standards vary as production structures differ. Therefore the source-sink migration emerges.

The source-sink pattern is best documented in the context of rural-urban migration.<sup>20</sup> Since John Graunt's (1662) pioneering work, researchers have been fascinated by the phenomenon of urban natural decrease. The death rate was higher than the birth rate in the urban areas in pre-modern Europe; and the urban natural decrease often coincided with the rural natural increase. Thus the rural area played the role of demographic source and the urban area played the role of demographic sink.

Jan de Vries (1984) summarized the previous studies and decomposed the net change of urban population into net immigration and the natural change.<sup>21</sup> As figure 1.25 shows, during most of the time between 1500 and 1800, urban population had been growing in both Northern and Mediterranean Europe. However, despite the net increase, the urban population had been declining "naturally" - the death rate was higher than the birth rate in the cities. Take the period 1600–1650 for example. During that half century, Northern Europe witnessed an annual growth of 0.32% in its urban population; but meanwhile, the urban death rate exceeded the birth rate by 0.33%. So it took a flow of annual rural migrants that amounted to 0.65% of the size of the urban population to achieve the observed urban growth.

The pattern of migration exposes another weakness of Malthusianism. Between 1800 and 1850, there was a spike in the growth of urban population in Northern Europe. The spike suggests a rise in the urban living standards. According to the classical theory, improvement in living standards would cause a faster natural growth of the urban population. But in fact, the half century of 1800-1850 witnessed a widened gap between urban death rate and urban birth rate.

Malthusian theory cannot account for the contradiction, but my theory can explain it easily. In the years after 1800, manufacturing and commerce grew fast in the urban areas; and agriculture grew fast in the rural areas. The rural-urban difference of production structure was widened, so that the urban lifestyle attracted more immigrants than in the

---

<sup>20</sup>Certainly, source-sink migration is not limited to the rural-urban context, neither is rural-urban migration the most important channel for group selection to take effect. I use the rural-urban migration as evidence that difference of production structures causes source-sink migration.

<sup>21</sup>"The European Urbanization, 1500-1700", p. 203 and p.208.

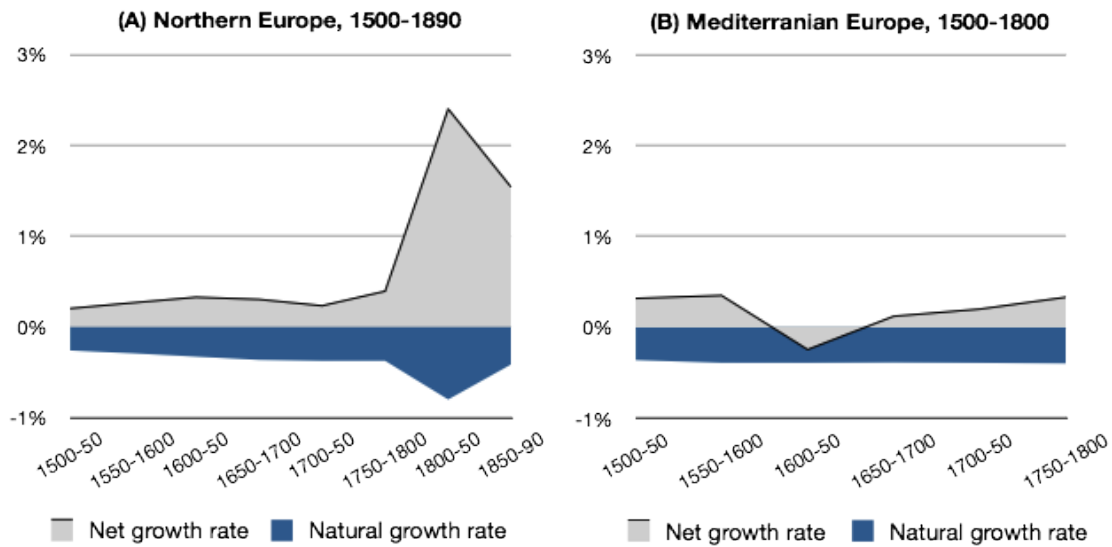


Figure 1.25: The source-sink migration in pre-modern Europe (De Vries, 1984)

centuries before. The flood of immigrants lowered the average subsistence by so much that the natural growth rate of the urban population decreased further. As proposition 3 states, the depth of the demographic sink increases with the difference of production structures.

### 1.5.3 Selection against surplus boom

The previous section establishes the historical relevance of source-sink migration. The source-sink pattern makes it possible for group selection to suppress surplus growth. Since surplus promotes individual fitness at the expense of group fitness, it is tautological to say that group selection hinders surplus growth. What matters is the strength of selection, i.e. the frequency and intensity of group competition.

Fatal clashes between groups are a perpetual human condition. Of the fourteen groups studied in Mae Enga - a modern hunter-gatherer society in Papua New Guinea, five went extinct in tribal clashes over a 50-year period (table 1.4).<sup>22</sup> The extinction rate suggests a harsh selection against surplus cultures and technologies.

Heralding the end of the hunter-gatherer epoch, the agricultural revolution demonstrated the strength of group selection. Despite its negative effect on living standards, agriculture encroached on the hunter-gatherer territory as a subsistence technology.

After the agricultural revolution, the world was divided into the nomadic zones and the arable zones. Clashes between them disrupted economic growth over and over again. Around 1000 BC, the nomads from the hinterland of Europe destroyed a number of highly

<sup>22</sup>In place of the extinct groups, new groups form out of the old groups that survive and expand.

Table 1.4: Group extinctions in Papua New Guinea and Irian Jaya

Region	Groups	Extinctions	Year	Extinction rate per century
Mae Enga	14	5	50	59%
Maring	32	1 – 3	50	6 – 18%
Mendi	9	3	50	56%
Fore/Usufura	8 – 24	1	10	35 – 74%
Tor	26	4	40	34%

Source: Soltis et al. (1995), table 1.

developed kingdoms in Levant and Anatolia. The Hittites, the Minoans, the Mycenaeans lost the complex social order they had built. Urban centers, artistic representation, elaborate writing system, large-scale trading, shipping and construction vanished; civilizations were reduced to impoverished, illiterate, technically backward and more violent small communities. Underlying the economic decline is the pattern of source-sink migration - “the invasions were not merely military operations, but involved the movements of large populations, by land and sea, seeking new lands to settle” (Bryce, 1998).

Similar catastrophes came upon humanity frequently. The fall of western Rome under the Visigoth and Hunnish intrusion, the overwhelming victory of the barbarian Jin over the civilized Liao empire, the Mongol destruction of Baghdad - the “center of learning” and then the largest city of the world - all exemplify the intense group selection that suppresses surplus economies.

Moreover, people respond to selection by intentionally cutting down surplus for group survival. For example, the warring period of China (476 BC - 221 BC) witnessed a series of reforms in different kingdoms.<sup>23</sup> In response to the constant nomadic harassment, King WuLing of Zhao (340 BC - 295 BC) commanded his subordinates to take off the conspicuous dress of wide sleeves and long robes and switch to the nomadic uniform - pants, belts and boots - so that they could fight as cavalry. Acclaimed as China’s Peter the Great, King Wuling transformed Zhao into a serious rival against Qin, then the strongest kingdom.

Half a century before Zhao’s reform, Qin rose to dominance by *Shang Yang*’s reforms in 356 BC and 350 BC. The reformer punished merchants, rewarded peasants, forbid migration, restricted entertainment and adopted censorship - in a word, he cut down surplus and promoted subsistence. The living standards declined so much that the ordinary people would flee the kingdom whenever they could evade the severe punishment of law. But the kingdom stood out to be the strongest. It defeated all the rivals and united

<sup>23</sup>To name a few, Li Hui conducted a reform in Wei, Wu Qi in Chu, Shen Buhai in Han, Shang Yang in Qin and King Wuling in Zhao.

China in the following one and a half centuries.

A contemporary philosopher, Xun Zi (313 BC - 238 BC) compared the military system of Qin with that of the other kingdoms, saying, “Qin is different from all the others. The people are poor and the government is cruel. Whoever hopes for a better life can do nothing but combat hard. This makes Qin army the strongest of all.”<sup>24</sup>

Qin’s ideas of governance had a lasting impact on the later Chinese dynasties. They were in sharp contradiction with Adam Smith’s economic views. The predecessors of Adam Smith valued agriculture more than commerce, and restricted trade and private property, not because they failed to appreciate market economy, light tax and division of labor, but because their goal was not the individual’s welfare but the group’s survival and expansion.

Adam Smith is unique not because he had a new theory that no one had raised before, but because he lived on the eve of the modern era, when individual welfare is reconciled with group survival and expansion. He prophesied the day at dawn.

## 1.6 Discussions

### 1.6.1 Smithian policies in Malthusian era

Published in 1776, *The Wealth of Nations* heralded the breaking of the humdrum Malthusian constancy. Some believe Adam Smith to be slightly ahead of his time. They doubt the Smithian policies could ever affect the equilibrium living standards before 1800. In *A Farewell to Alms*, Gregory Clark said “[I]n 1776, when the Malthusian economy still governed human welfare in England, the calls of Adam Smith for restraint in government taxation and unproductive expenditure were largely pointless. ... [while] those scourges of failed modern states - war, violence, disorder, harvest failures, collapsed public infrastructures, bad sanitation - were the friends of mankind before 1800.”

But my thesis is that Smithian policies can improve living standards, not only in the short run but also in the long run, not only in Solow’s time but also in Smith’s time. Adam Smith advocated laissez-faire, light tax and division of labor. Applying these ideas to economic policies will raise productivity of all sectors, but manufacturing and commerce benefit more from them than agriculture does. As the ratio of surplus to subsistence increases, the economy enjoys a higher equilibrium living standard. This explains the prosperity of ancient market economies, such as Roman empire and Song dynasty.

As of the “friends of mankind” - wars, violence, disorder and collapsed public infrastructures, if they destroy more surplus than subsistence, they may cause the living

---

<sup>24</sup>An excerpt from *Xun Zi*, chapter *Yi Bing* (On Wars).



standards to decline to a lower equilibrium in the long run. This might be the reason why it took more than a thousand years for Europe to economically recover from the collapse of Western Roman Empire.

### 1.6.2 Why farm?

The two-sector model also explains why peasants were worse off than their hunter-gatherer ancestors after the agricultural revolution. People had less leisure, worse nutrition and larger inequality after they took up agriculture. In light of my theory, agriculture plays the role of a subsistence technology. By tilting the production structure towards subsistence, it caused the living standards to decline. But here follows another puzzle:

“Why [should people ever] farm? Why [did they] give up the 20-hour-work week and the fun of hunting in order to toil in the sun? Why work harder, for food less nutritious and a supply more capricious? Why invite famine, plague, pestilence and crowded living conditions?” (Harlan, 1992)

Group selection addresses the second puzzle. Although hunter-gatherers enjoyed a better life, they achieved their welfare by living a relatively surplus-rich lifestyle at the expense of group fitness. When agriculture appears, the surplus-rich hunter-gatherer societies cannot compete with the groups that have switched to agriculture. The biased migration from the agricultural areas to the hunter-gatherer areas completed the transition.

### 1.6.3 Surplus explosion and the industrial revolution

How did the mankind finally break the shackle of group selection? How did the industrial revolution happen? My theory provides a new perspective. In the other chapters of my dissertation, I will work out a theory of surplus explosion as a natural extension of the paper.<sup>25</sup> Here let me sketch the idea briefly.

Group selection constrains surplus and spreads subsistence. A commodity or behavior can burst into wide adoption when it switches from surplus into subsistence. I call such transitions a surplus explosion. For example, agriculture first arose for the production of status goods (Mithen, 2007) - the tribal elites cultivated “crops” for festivals and ceremonies. Such agricultural practice was less efficient than hunting and gathering in producing calorie - it was a local surplus activity. Over time, domestication raised the calorie productivity of the “status crops”, which finally exceeded that of hunting and

---

<sup>25</sup>The other two chapters are “Institutional Selection: A New Unified Growth Theory of Malthusian Stagnation, Industrial Revolution and Modern Economic Growth” and “Horse, Agriculture, Islam and Science: Surplus Explosions in Human History.”

gathering. Thus agriculture switched into subsistence. It won over the force of group selection to spread to the rest of the world.

Around 3500 BC, another surplus explosion took place on the Caucasian steppe where horses were domesticated into a tool of war. The people that first domesticated horses spread fast by military conquests. Caucasia became the origin of Indo-European language family.

Likewise, Alexander the great spread hellenism by march and conquest. His army inherited military techniques from the constant wars between Greek city states in the older generations. The war skills turned from surplus into subsistence as Macedon united Greece.

The industrial revolution follows the same pattern but with a different kind of surplus. Following the spirit of Becker in a series of his work on the quality and quantity of children, the literature of Unified Growth Theory has identified the quality of children - human capital - as the pivot of transition.<sup>26</sup> Either by genetic drift or population growth, what used to be surplus - human capital - turned into subsistence. Human capital helped a state develop science, defend territory and send out colonists.

Surplus explosions have happened many times before, in various forms. Among them, the industrial revolution is unique by its content of surplus. The usual surpluses, diamonds and yachts cannot switch into subsistence; weapons switch but it does not improve living standards. Human capital in scientific knowledge is different. With a persistent effect on economic growth, it strengthens the countries rich in it and brings about universal welfare and steady progress.

#### **1.6.4 The Evolutionary Biology of Economic Welfare**

My theory implies that economic welfare is an evolutionary biological phenomenon. Welfare improvement relies on surplus growth. Surplus growth is rooted in the conflict of reproductive interest between individual and group. The same conflict gives rise to surplus traits in plants and animals, the traits that help the individuals compete with the others, but divert resources from supporting a denser population.

For example, peacocks bear the extravagant tails to signal their physical health to peahens. The tail makes a credible signal because it is a handicap that exposes the owner to a higher risk from predators. The density of peacocks would be larger if they collectively refrained from the signaling game.

The animals' conspicuous traits are constrained by group selection too. Guppy is a popular aquarium fish species. Wild-type male guppies have colorful splashes, spots and stripes on their bodies to attract females. Researchers moving the fish from a high-

---

<sup>26</sup>Galor and Moav (2002), Galor (2002), Clark (2007) and Galor (2011)

predator environment to a low-predator one found that the male guppies become brighter in color - the pressure on surplus is loosened when group competition is less intense.<sup>27</sup>

Personally, I realized the biological analogy at a trip to Muir Woods, a forest 19 kilometers north of San Francisco that features coastal redwoods. The redwoods can grow up to 100 meters high, as they compete intensely with each other for sunshine. The height serves the need of the individual trees but it diverts nutrition which could support a denser forest. Pursuing the individual fitness hurts the group fitness.

The height of redwoods, the tails of peacocks, the colors of male guppy and the surplus of human society all are governed by the same principle of evolutionary biology: conflict is universal between group and individual, hence surplus is prevalent in nature. Surplus tends to escalate under the force of individual competition, but group selection harshly suppresses it.

Economists have understood “conspicuous consumption” for a long time. Thorstein Veblen coined the phrase to describe how unproductive retinue and long skirts are used to show off one’s wealth, to the effect of attracting mates. Spence (1973) gave the idea a signaling model. Biologists use the same model to study conspicuous traits in the context of sexual competition - in biology, surplus is mostly about sex. But in the real world, we rarely associate our passion for art and status with sexual purposes; we do not intend to impress the others as often as we consume surpluses. How can sex explain most of the surplus?

In fact, sexual competition has a larger scope than signaling games. Complementary to signaling, there is another mechanism of sexual competition that magnifies the conspicuous traits far beyond the level a signaling model would predict. That mechanism is called “Fisherian runaway”, first proposed by biologist Ronald Fisher (1915). Under runaway mechanism, a conspicuous trait that is first caused by signaling can run out of control by a positive feedback “runaway” mechanism.

For example, suppose signaling produces a costly male trait - music playing - and a female preference for the trait. At the signaling stage, females value music talents because they reveal one’s sense of pitch, which makes a man more effective at hunting. But now, the fact that the other females like the trait gives a female an extra reason to choose a musically talented man: he can pass on his genes of music talents to her son, who in turn will be attractive to the females of the next generation. So the male trait and the female preference coevolve to be strengthened; men become showier and showier and women choosier and choosier. Since the mating choice is two-way between male and female, females develop no less music talents than males; and males are as choosy as females about the music talents in their partners. At last, runaway mechanism produces talents as great as Lloyd Webber and Sarah Brightman.

---

<sup>27</sup>The Guppy Project of University of California, Riverside.

Altogether, the positive feedback magnifies the conspicuous traits. Our talents of music are far beyond the explanation of mere signaling. Yet the origin of the traits is still within the domain of sexual competition - Fisherian runaway is a type of sexual competition. The existence of the mechanism suggests, the conflict between group and individual is much more intense than we might think with the signaling view. The distinction of surplus and subsistence is deeply rooted in evolutionary biology.

### 1.6.5 Methodology

A believer in Milton Friedman's methodology (Friedman 1953) might reject my theory. Why challenge a theory that has made the right prediction? Why does it matter that Malthus assumed away the conflict of interest between individual and group? Didn't Friedman say, the more unrealistic the assumption is, the better the theory?

Friedman was wrong. We accept unrealistic assumptions, except if the theory would predict awry when we make the assumptions realistic. In other words, the unrealistic assumptions cannot be crucial ones on which the prediction relies. Friedman himself was using this extra condition to attack the traditional view of Phillips curve. When he introduced inflation expectation, stagflation had not happened, yet Friedman figured out the mistake in the conventional wisdom because he found the traditional theory sensitive to the introduction of expectation, which was merely a more realistic assumption.

As Solow (1956) put it, "All theory depends on assumptions which are not quite true. That is what makes it theory. The art of successful theorizing is to make the inevitable simplifying assumptions in such a way that the final results are not very sensitive. A 'crucial' assumption is one on which the conclusions do depend sensitively, and it is important that crucial assumptions be reasonably realistic. When the results of a theory seem to flow specifically from a special crucial assumption, then if the assumption is dubious, the results are suspect."

This paper shows how crucial the one-sector assumption is to Malthusian theory. Since the assumption is dubious, the classical theory is suspect.

## 1.7 Conclusion and Limitations

For more than two hundred years, scholars have taken for granted Malthus's explanation for the constancy of living standards. The conventional wisdom is wrong.

Different from the Malthusian version of history, this paper suggests the following basic story. Imagine a world where people live on two things: grain and diamonds. Population rises with grain production, therefore the average consumption of grain is fixed in the long run. But population hardly responds to changes in diamond productivity. If diamond productivity grows faster than grain productivity, people will live a better and

better life by having more and more diamonds each. Such had never happened until 1800. Throughout the thousands of years before that time, the diamond productivity had grown at the same rate as the grain productivity.

The cause of the balanced growth is group selection. People organize themselves into competing groups. When a group is relatively more productive in grain production, each of its members will have fewer diamonds than their neighbors do. Greed drives them to move abroad. As they move, they bring along the technology of their hometown and spread it to the other places. The consequence is, grain technology spreads easily by migration, but diamond technology is hard to disseminate. When the spread advantage of grain offsets the growth advantage of diamonds, the growth of grain and diamonds are balanced and the living standards are constant all over the world.

There are five major contributions the paper is meant to make.

- First and foremost, it shows that Malthusian theory cannot explain the constancy of living standards. The paper provides a new explanation to replace it.
- Second, the two-sector framework explains why Malthusian theory is weak empirically. The classical theory fails to capture the variation of birth and death rates because it has missed two of the three factors that affect the long-run equilibrium.
- Third, the theory explains the puzzle of the agricultural revolution - why living standards declined after the mankind took up agriculture and why agriculture dominated the world despite its negative effect on living standards.
- Fourth, the paper shows how economic policies can improve long-run living standards even in the Malthusian epoch. What Adam Smith advocated - long-lasting peace, light tax burden, property rights protection and laissez faire - raise living standards by tilting the production structure. This explains the prosperity of the ancient market economies, including the Roman and Song empires.
- Fifth, the theory reveals the hidden law of evolutionary biology in economic growth. The Malthusian constancy, the industrial revolution and the burst of modern economic growth can all be understood in an evolutionary biological framework, with countless analogies in nature.

Altogether, this paper presents a multi-sector Malthusian framework, a source-sink migration model, a theory of group selection and a sketch of the idea of surplus explosion. These theories are not without limitations, but the limitations suggest future research direction.

For example, I highlight the importance of migration at spreading subsistence ideas. But there are many other ways for an idea to be spread - local learning, seasonal migration

and distribution of books. These channels do not favor either surplus or subsistence. It is an empirical question whether migration is strong enough to dominate these noises. In the paper, I turn to computer simulations to demonstrate the strength of selection; yet the theory would be much strengthened if there were direct evidence on the relative importance of migration.

Moreover, it is hard to categorize military strength to either surplus or subsistence. Military strength is the best example of surplus explosions: it frequently switches between surplus and subsistence. The flexibility makes it hard to interpret the early expansion of Roman Empire. Rome built its military success on advanced weapons and organization of troops, which resulted from its manufacturing advantage and sophistication of governance. This particular episode contradicts the law of surplus suppression. In another dissertation chapter, I will develop a framework to understand “the third sector” - the military sector of an economy.

Last but not the least, the theory is silent about internal disorder. Internal disorder is no less important than external threat in the decline of civilizations. It is closely related to social inequality, which I ruled out by assuming homogeneity of population. In my future research, I shall put inequality back into my theory and study its interaction with surplus growth. Surplus is meant for signaling one’s relative status - there would be no need for surplus in a perfectly egalitarian society. In this sense, inequality breeds surplus culture and thus contributes to long-run living standards. However, if inequality runs out of control, social disorder and foreign invasion will fall upon the economy. Therefore lasting economic progress cannot rely on the arms race of hedonism. This marks the difference between the Roman prosperity and the modern economic growth. While the Roman surplus were at the mercy of the political elites’ licentious spending, the modern growth is bolstered by trade, science and good institutions - a comparison in the same spirit as how the merchants’ cities outpaced the princes’ cities (DeLong and Shleifer, 1993), hence the theme of my next dissertation chapter, “Institutional Selection: A New Unified Growth Theory of Malthusian Stagnation, Industrial Revolution and Modern Economic Growth”.

# Chapter 2

## The Strength of Weak Selections

### 2.1 Introduction

The first chapter, “*Millennia of Poverty: If Not Malthusian, Then Why?*”, explains the Malthusian trap with biased migration. People migrate from regions relatively rich in fitness goods to regions relatively rich in utility goods. The migrants carry the pro-fitness culture and technology and spread them to the host countries. Even if pro-utility technology tends to grow faster than pro-fitness technology in a local environment, the offsetting biased migration keeps the utility goods sector and the fitness goods sector in balance and makes the average living standards constant.

Simulation shows the result is extremely robust: a tiny bit of biased migration can offset a big growth advantage of the pro-utility technology. The constancy of living standards holds even if people are reluctant and slow to move and to learn from the immigrants. I call such cases as weak selections. This paper will answer why weak selections have disproportionately great strength.

What gives strength to weak selections is what I call as variation effect. Regions are more different from each other if selection is weak than if selection is strong. A larger variation drives more people to migrate; and the migrants, then more different from the natives, exert a bigger effect on the host country.

A simple formula summarizes the mechanism:

$$S(\lambda) = \lambda\nu(|\lambda|) \tag{2.1}$$

The strength of group selection,  $S$ , is equal to the selection parameter,  $\lambda$ , times the variation,  $\nu$ . When selection is weak, the absolute value of  $\lambda$  is small. But as a compensation, the variation  $\nu$  rises as  $|\lambda|$  drops,  $\nu'(|\lambda|) < 0$ , so that a small  $|\lambda|$  can still have a large strength of selection. In fact,  $S(\lambda)$  is concave when  $\lambda$  is positive and convex when  $\lambda$  is negative.

The “S” shape of  $S(\lambda)$  explains why group selection appears so strong and robust in the simulation of the first chapter. A tiny bit of group selection, as represented by a small  $|\lambda|$ , can still have a large impact, because the loosened selection leaves the regions diverged, and the divergence compensates the strength of selection.

More importantly, the variation effect provides a new tipping-point model for understanding revolutionary changes. The theory predicts that the strength of selection,  $S$ , is most responsive to  $\lambda$  when  $\lambda$  is small in absolute value. When a slight change of environment makes  $\lambda$  drift past 0, either from negative to positive, or from positive to negative, the strength of selection will not only change its sign, but also change its value most dramatically—selection suddenly turns from strongly negative to strongly positive, or vice versa. Thus a long latent culture can quickly dominate a vast area; so may a prevalent culture mysteriously disappear within a short time. These can happen even though the environmental change is negligible. For reasons that I will make clear, I call these phenomena S-explosions. I hypothesize that the S-explosion is relevant in the Agricultural Revolution, the epic military success of Alexander the Great and Genghis Khan, the rise of Islam, and the spread of literacy before and during the Industrial Revolution.

## 2.2 Model

Suppose an island has two shires where  $X$  is the only trait that matters. The level of the trait can be represented by a positive number,  $X \in \mathbb{R}^+$ . Shire 1’s value is  $X_1$  and shire 2’s is  $X_2$ . Define  $x_1 \equiv \ln X_1$  and  $x_2 \equiv \ln X_2$ .  $x_1$  and  $x_2$  are moved by three forces:

$$dx_i = gdt + S(x_i, x_j)dt + \sigma dz_i \quad (2.2)$$

In the above equation,  $g$  is the intrinsic growth rate,  $S(x_i, x_j)dt$  is the effect of biased migration, and  $\sigma dz_i$  is a Brownian error (i.i.d.),  $\mathbb{E}(dz) = 0$ ,  $\mathbb{E}(dz^2) = dt$ .

Suppose  $X$  affects living standards:  $U'_i(x_i) > 0$ . People move to the richer shire at the rate of  $\delta|x_1 - x_2|$ .  $\delta$  measures how responsive the migrants are to the trait difference, and it can be either positive or negative. When  $\delta$  is positive, people move from the high- $x$  shire to the low- $x$  shire; migrants raise the host’s trait. I call it a positive selection. When  $\delta$  is negative, the immigrants from the low- $x$  shire drag down the high- $x$  shire’s trait. That makes a negative selection.

For now, I will focus on the negative selection, which describes how the Malthusian trap forms. The rate of migration shire  $i$  receives from shire  $j$  is:

$$m_{j \rightarrow i} dt = I_{\{x_i \geq x_j\}}(-\delta)|x_i - x_j| dt \quad (i=1,2; \delta < 0) \quad (2.3)$$

where  $I_{\{x_i \geq x_j\}}$  is an indicator function that equals 1 if  $x_i \geq x_j$  and equals 0 if otherwise.



Suppose each migrant exerts an effect on the host shire's trait proportional to  $|x_i - x_j|$ , and the effects of the migrants are addable. Therefore,

$$dx_i = (g - \eta|x_i - x_j|m_{j \rightarrow i})dt + \sigma dz_i \quad (i=1,2) \quad (2.4)$$

where  $\eta > 0$  measures how adaptable the host society is to the influence of immigration. Define  $\lambda \equiv \delta\eta$ .  $\lambda$  is negative because  $\delta$  is negative. To isolate the effect of group selection, let  $g = 0$  for now. Then we have

$$dx_i = I_{\{x_i \geq x_j\}} \lambda (x_i - x_j)^2 dt + \sigma dz_i \quad (i=1,2; \lambda < 0) \quad (2.5)$$

We are interested in how the global average of the traits,  $\mu = \frac{1}{2}(x_1 + x_2)$  and the inter-shiral variation  $\nu = \frac{1}{2}(x_1 - x_2)^2$  evolve.

Applying Itô's lemma, we can solve for the motion of  $\mu$  and  $\nu$ .

$$d\mu = \lambda\nu dt + \frac{\sqrt{2}}{2}\sigma dz \quad (2.6)$$

$$d\nu = (\sigma^2 - 2\sqrt{2}|\lambda|\nu^{\frac{3}{2}})dt + 2\sqrt{\nu}\sigma dz \quad (2.7)$$

Equation 2.7 suggests that  $\nu$  tends to converge to

$$\nu^* = \left( \frac{\sigma^2}{2\sqrt{2}|\lambda|} \right)^{\frac{2}{3}} \quad (2.8)$$

and fluctuate around it. Note that  $\nu^*$  decreases in  $|\lambda|$  with an elasticity of  $-\frac{2}{3}$ . The negative relationship between  $\nu^*$  and  $\lambda$  is the “variation effect”: regions differ more under a weaker selection.

Appendix 4.1.4 proves that  $\mathbb{E}(\nu_{t \rightarrow \infty}) = k\nu^*$ , in which  $k \approx 0.78$  is a constant. Therefore,

$$\mathbb{E} \left( \frac{d\mu}{dt} \right)_{t \rightarrow \infty} = \lambda \mathbb{E}(\nu_{t \rightarrow \infty}) \quad (2.9)$$

$$= \lambda k \nu^* \quad (2.10)$$

$$= k \left( \frac{\sigma^2}{2\sqrt{2}} \right)^{\frac{2}{3}} \lambda^{\frac{1}{3}} \quad (2.11)$$

Therefore the expected strength of selection is proportional to  $\lambda^{\frac{1}{3}}$ . Denote  $S \equiv \mathbb{E} \left( \frac{d\mu}{dt} \right)_{t \rightarrow \infty}$  and  $\Phi \equiv \left( \frac{\sigma^2}{2\sqrt{2}} \right)^{\frac{2}{3}}$ , then we have

$$S = \Phi \lambda^{\frac{1}{3}} \quad (2.12)$$

The formula holds no matter whether  $\lambda$  is positive or negative.

Equation (2.12) is the key result of the paper.  $S(\lambda)$  is convex when  $\lambda < 0$ , and is concave when  $\lambda > 0$ . Call this relationship the “selection curve” (figure 2.1).

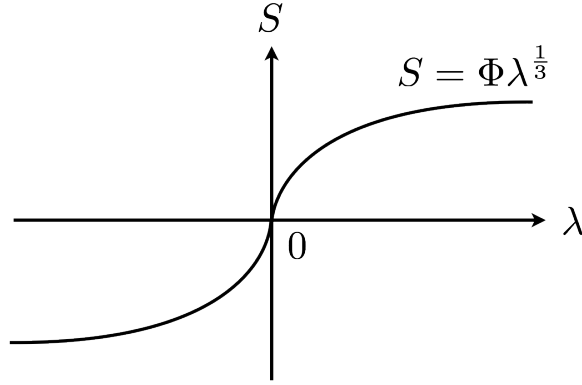


Figure 2.1: The selection curve

The selection curve is robust to generalization. A generalized model will have  $x_i$  move as follows:

$$dx_i = I_{\{x_i \geq x_j\}} \lambda (x_i - x_j)^\gamma dt + \sigma dz_i \quad (i=1,2; \lambda < 0) \quad (2.13)$$

The model we have solved is a special case that assumes  $\gamma = 2$ . The result extends to the general case with  $\gamma \in \mathbb{R}^+$  (Appendix 4.1.5).

## 2.3 Discussion

The “S” shape of the selection curve makes two interesting predictions.

### 2.3.1 The Malthusian trap

Suppose a trait  $x$  would grow steadily in an isolated environment. But with the migration from the low- $x$  regions to the high- $x$  regions (a negative selection), the selection can dominate the growth of  $x$ , even when the migration is weak ( $|\lambda|$  is small).

Weak selections are strong because  $S(\lambda)$  is convex when  $\lambda$  is negative. The strength of selection increases with the variation of traits across the regions,  $\nu$ , and  $\mathbb{E}(\nu)$  rises as  $\lambda$  approaches 0. As the formula of the long-run expected strength of selection,

$$\mathbb{E}(S) = \lambda \mathbb{E}[\nu(|\lambda|)] \quad (2.14)$$

illustrates,  $\lambda$  has two ways to affect the strength of selection. One is the linear multiplier,  $\lambda$ , the other is the variation effect,  $\mathbb{E}[\nu(|\lambda|)]$ . The variation effect compensates when the multiplier  $\lambda$  is small. This explains the great strength of weak selections.

In “*Millennia of Poverty: If Not Malthusian, Then Why?*”, the trait  $x$  is the ratio of productivity between the utility goods sector and the fitness goods sector:  $x = \ln\left(\frac{B}{A}\right)$ .

In an isolated environment, the utility goods sector tends to grow faster than the fitness goods sector:  $g_B > g_A$ . Thus  $x$  will be growing if there is not migration. But

if people do migrate, even if they move slowly and reluctantly, the trend of growth will be tightly suppressed and the relative ratio of sectors,  $x = \ln\left(\frac{B}{A}\right)$ , will remain roughly constant. Since the average welfare depend on  $x$ , the constancy of  $x$  guarantees the constancy of living standards, hence the millennia of constant poverty.

### 2.3.2 S-explosions

Along the selection curve,  $S$  is most responsive to  $\lambda$  when  $\lambda$  is near 0. Exogenous factors can affect  $\lambda$ , and as  $\lambda$  drifts, a tipping point emerges when  $\lambda$  passes 0, either from negative to positive, or from positive to negative.

In particular, suppose the trait of interest is agriculture, the cultivation of a crop. In the beginning, the calorie productivity of the time spent on agriculture was lower than that of the time spent on hunting and gathering. Crop was then cultivated for worship and entertainment—it was a utility good. The  $\lambda$  associated with the spread of agriculture was negative and small.

As domestication went, agriculture gradually caught up with and surpassed hunting and gathering in calorie productivity. When agriculture first came at par with hunting and gathering, the  $\lambda$ , if positive, would still be rather small. However, with the variation effect, the selection was already strong enough to give agriculture a big push. The strength of selection changed most dramatically, in both magnitude and the sign, exactly at the moment when agriculture turned from a utility good to a fitness good.

I call such a tipping-point change an S-explosion. The change is explosive because of the “S” shape of the selection curve. Commodities and cultures exploded when they turned from a utility good to a fitness good. History has witnessed various commodities and cultures switching from utility goods to fitness goods, and vice versa. By definition, utility goods are constrained and fitness goods spread wide. It sounds tautological to say that a commodity will begin to spread when it becomes a fitness good. But beyond the tautology, the selection curve indicates that the change will come dramatically when the switch happens. A tiny change in the environment, as long as it makes  $\lambda$  happen to pass 0, will trigger an explosion if  $\lambda$  turns positive, or an implosion if  $\lambda$  turns negative.

Military skill turned into a fitness good when Alexander the Great united the Greek city-states and Genghis Khan united the Mongolian tribes. The 7th-century arabs converted to Islam, which replaced the previous religious decentralization with a universal calling of union and fighting outward. In the scientific era, literacy changed from a means to read the Bible (a utility good) to a means to study the science (a fitness good). The explosive nature of the epic marches, the Islamic glory and the spread of literacy each has their own unique explanations. Nevertheless, a common mathematical law is working underneath.

## 2.4 Conclusion

This paper studies how the strength of group selection varies with the tendency to migrate. It highlights the variation effect: when people are reluctant to migrate, regions will differ more. The enlarged difference compensates the strength of selection. With this effect, selection can have a large impact even if people are reluctant and slow to move and to learn from the immigrants.

This explains why, in the Malthusian era, a tiny bit of selection is strong enough to dominate the tendency of living standards to grow. The model also predicts that a commodity or a culture will spread explosively when they turn from a utility good to a fitness good.

## Chapter 3

# Institutional Selection and the Burst of Growth

### 3.1 Introduction

Acemoglu and Robinson's book, *Why Nations Fail*, delivers the message that institution matters for economic growth, that extractive governments stifle and inclusive regimes stimulate economy, and that modern growth began with good institutions—constitutional democracy, property rights, and market economy—in the absence of which, the mankind had struggled in the Malthusian trap, and with these institutions, the creative destruction has been pushing the living standards ever forward.

However, if these institutions have always been friendly to economic growth, why did we not see them thrive and dominate, long before the modern era? Why did democracy not spread in Greco-Roman Era, if it had strengthened the regimes that had learnt its benefit? If institutions, like species, survive by being the fittest, then why is it the growth-killers such as feudalism and monarchy that had lingered for so long, while good regimes were so rare and brief?

Acemoglu and Robinson's answer is that the good institutions are unstable: the political elites hate the creative destruction that is unleashed, and the elites are able to reinstall the bad regimes, if temporarily overthrown, unless they are contained by a subtle design. But this argument merely pushes the question one step backward. Ultimately, if a superior equilibrium, however subtle it is, can be stable, then why did it not thrive, spread and dominate earlier than the recent centuries? Could the world have been waiting for the Renaissance writers to tell us what is good? Or, perhaps contrary to the conventional wisdom, what fit do not always survive?

This paper argues for the latter. "The survival of the fittest" is a misleading notion. There are two ways a trait—be it a culture, a technology or an institution—can affect the fitness of a group: the level effect and the growth effect. To be concrete, suppose the

fitness of a group at time  $t$  with a trait  $x \in \{0, 1\}$  is

$$F(x, t) = M(x)E(x, t) \tag{3.1}$$

where  $M$  is a multiplier that decreases in the trait,  $M(1) < M(0)$ ; and  $E(x, t)$  is the economic output that grows faster if with the trait than if without:  $E'_t(1, t) > E'_t(0, t)$ . Now that the trait,  $x$ , has both a negative effect on the level and a positive effect on the growth rate of the group fitness, it is hard to say whether the trait fits or not (it fits in the long run, but not in the short?), and it is even harder to predict whether the trait will survive or not.

When level effect conflicts with growth effect, growth effect easily dominates in most economic models. But level effect can dominate growth effect if competition is intense. The level handicap that a trait brings about will make a group ideologically less attractive, or more likely to lose a war. Before the growth advantage has been fully realized, the high-growth but low-level group, if not eliminated, may have already changed the trait under the pressure of neighbors.

Researchers take the dominance of growth effect for granted because some of them neglect the competition, and others have assumed infinity of groups. The infinity ensures there always be a positive measure of groups keeping the trait. As soon as the extra growth accumulates to meet up the level decrease, the trait will bounce back and dominate. But if there are only thousands instead of millions of groups, then the level effect can dominate the growth effect for a extremely long time.

Simulation shows that a level handicap that would have been bridged by a score periods of extra growth can contain the spread of a trait for tens of thousands of periods. This explains why the good institutions failed to spread in spite of their positive effect on economic growth. When a group innovates such an institution, the temporary weakness it suffers makes the group quickly abandon the new idea, or otherwise, it will be conquered and assimilated.

Fortunately, the suppression of the growth-friendly institutions is lasting but not permanent. In due course of time, one of the groups will survive the level handicap long enough for its growth advantage to be fully realized. Grown to have a high level of fitness, the group defends the institution, and as its fitness rises to the top, the institution it carries spreads to dominance. The intense selection, which has tightly suppressed the institution, now becomes a disseminating force—ironically, the tighter the suppression had been, the faster the dissemination will be, and the time it takes for the institution to spread is a fraction of the time the institution has been suppressed. A tipping point emerges.

I call the mechanism the infant-institution theory. The institution has the potential to grow but is temporarily weak. An infant institution tends to be suppressed for a long time before it dominates, and when it reaches for dominance, the transition is dramatic. I

hypothesize that the infant-institution theory explains both the length of the Malthusian stagnation and the onset of modern economic growth.

The theory explains the puzzle Acemoglu and Robinson leave unaddressed—why the institutional change did not prevail in the ancient times but accelerated in the last few centuries. The infant institution theory provides the tipping-point mechanism, without which we are unable to evaluate how crucial the institution is to the onset of modern growth.

## 3.2 The New Selection Model

Suppose a continent has  $l \times w$  regions aligned in a chessboard way. The continent is wrapped on the borders, so that each region has four neighbors. To begin with, all the regions have the same size of economy; a fraction of them,  $\Gamma_0 \in [0, 1]$ , are endowed with a good institution, denoted by  $G \in \{0, 1\}$ . Being “good” raises the growth rate of economy by  $\rho$  per period:

$$E_{t-1} = E_t(1 + G\rho) \quad (3.2)$$

The regions are characterized by three state variables: the size of economy,  $E$ , the institution,  $G$ , and the fitness level,  $F$ . Assume the level of fitness decreases with the good institution:

$$F(G) = (1 - G\tau)E \quad (3.3)$$

where  $\tau > 0$  measures the negative effect of the institution on the level of fitness. Hence,  $G = 1$  raises the growth rate but lowers the level of fitness.

Institutions evolves by mutation and selection. Mutation occurs to each region with probability  $\epsilon$  in each period.

$$\text{Prob}[G_t = G_{t-1}] = 1 - \epsilon \quad (3.4)$$

$$\text{Prob}[G_t = 1 - G_{t-1}] = \epsilon \quad (3.5)$$

Selection makes the regions adopt the institution of their neighbors. In each period, randomly draw a region  $\mu lw$  times (repeated draws are allowed)—each region is expected to be drawn  $\mu$  times per period. Let the drawn regions adopt the institution of a randomly picked neighbor with probability

$$P = \frac{F'}{F + F'} \quad (3.6)$$

where  $F$  is the drawn region’s level of fitness and  $F'$  is its neighbor’s level of fitness.

Simple as the setup is, patterns emerge. Using the parameterization of table 4.5, figure 3.1 shows how the number of “good” regions changes over time and how the economic growth stops and goes, in a simulation of  $30 \times 30$  regions that lasts 50,000 periods.

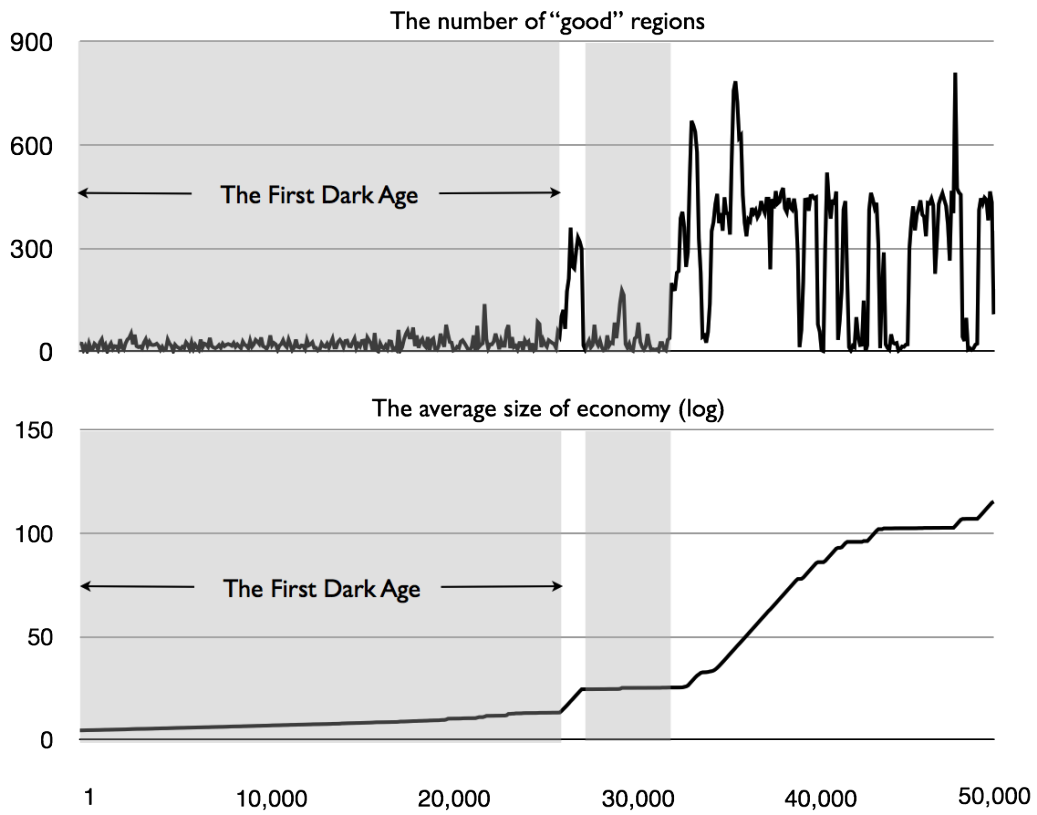


Figure 3.1: The simulated dynamics of institution and economy

Table 3.1: Parameterization of the baseline simulation

Parameter	Value	Interpretation
$\tau$	20%	the level handicap
$\rho$	1%	the growth advantage
$\epsilon$	0.1%	the mutation rate
$\mu$	100%	the intensity of selection
$\Gamma_0$	5%	the initial proportion of "good" countries
$E_0$	100	the initial size of economy



The simulation is characterized with a Dark Age—the long period in which the good institution is suppressed. Three patterns are common to simulations with varying parameters:

1. The Dark Age lasts long before the first transition.
2. The transitions occur dramatically: the time it takes for the good institution to spread is a tiny fraction of the length of the Dark Age.
3. After the Dark Age ends, the good institutions collapse and bounce back frequently.

Figure 3.2 plots the distributions of the time it takes for the proportion of good regions to first reach 25%. The hypothesized normality of the distribution stands the Kolmogorov-Smirnov test with a  $p$ -value of 0.82. And it takes longer time for the first transition to occur, when selection becomes more intense— $\mu$  is higher (figure 3.3).

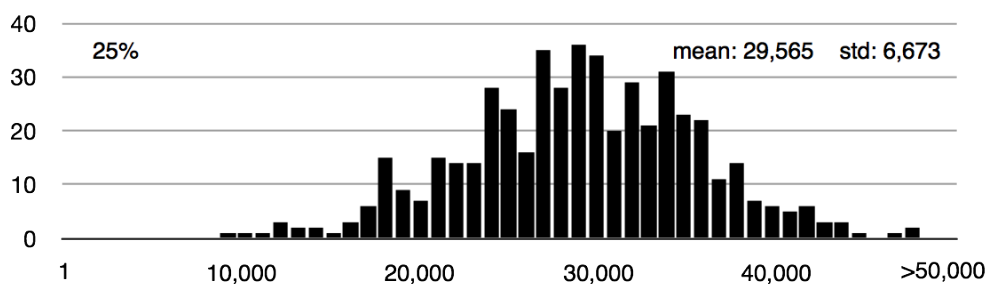


Figure 3.2: The time it takes to first have 25% “good” countries

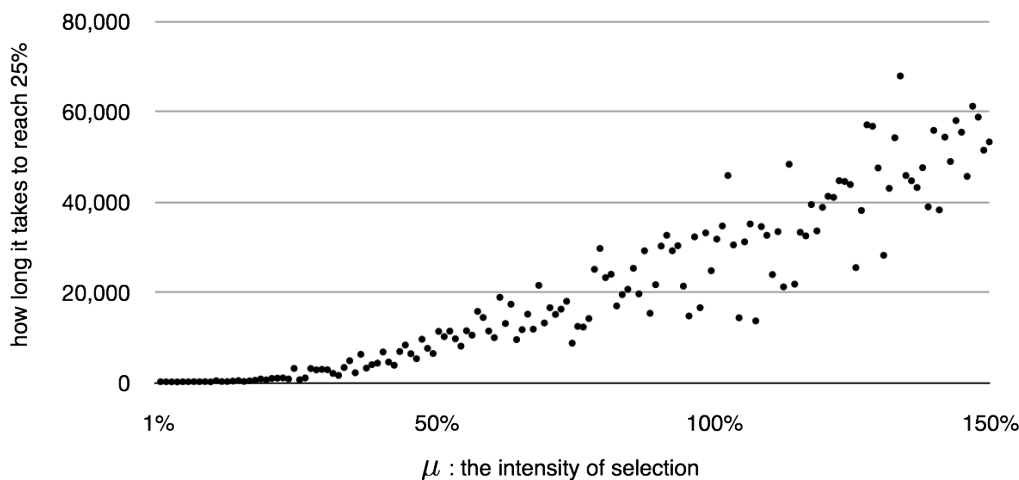


Figure 3.3: More intense selection suppresses the good institution for a longer time

The long Dark Age results from the dominance of the level handicap over the growth advantage. It contradicts the conventional belief that the growth effect always easily dominates the level effect.

In a conventional selection model, the proportion of a trait, denoted by  $P$ , evolves by the rule:

$$P_{t+1} = \frac{P_t F}{P_t F + (1 - P_t) F'} \quad (3.7)$$

where  $F$  is the fitness of the entities with the trait, and  $F'$  is that of those without the trait.

If the level of  $F$  decreases with the trait but its growth rate increases with the trait, the proportion of the trait will be in decline until  $F$  exceeds  $F'$ . After  $F$  exceeds  $F'$ , the trait will quickly grow to global dominance. Suppose the level handicap is 20% and the growth advantage is 1%. Then the time it takes for  $F$  to exceed  $F'$  is 19 periods, and the trait will “infect” 99% within a hundred periods at most.

The difference is that the old selection model assumes an infinite number of regions. With the infinity, there always exists a mass of regions that carries the trait on, unmodified. Hence the growth potential is soon realized for sure. Moreover, in the old selection model, the growth effect never spills over to the “bad” regions, for all regions of the same type share the same level of fitness. But in the new selection model, when a region converts from good to bad, the economic growth it has accumulated turns into a threat to the neighbors that remain “good”—an evil regime can grab the fruits of democracy to stifle democracy. Therefore, it is much harder to end the Dark Age in the new selection model.

The Dark Age finally ends with one region having survived the level handicap for more than 19 periods. From then on, as the fitness of the region keeps growing, the good institution quickly spreads. The model matches the real history that witnesses the transition beginning in England and later spreading to the other European countries.

## 3.3 Discussion

### 3.3.1 Malthus and Solow

The model provides a tipping-point mechanism for the institutional view of the Industrial Revolution, the transition from Malthusian stagnation to modern economic growth. It explains why the good institutions had been long suppressed before they suddenly burst into dominance.

The lack of a tipping-point mechanism has lead economists to explore answers beyond institution. For example, Oded Galor and his coauthors of the Unified Growth Theory assume that the return to education increases with both population and the growth rate

of economy. When population exceeds a threshold, a tipping point is triggered. The economy switches to a new equilibrium: the increased education raises the growth rate of economy by so much that education and growth begin to sustain each other at a positive level. These economists use multiple equilibria to model the observed tipping point. Having a tipping-point mechanism is the key advantage of these theories over the institutional view.

However, the multiple-equilibria theories heavily rely on Malthus's explanation of the pre-industrial stagnation. As the first chapter of the dissertation shows, the ultimate reason for the Malthusian trap is not Malthusian. This throws doubt on all theories that have turned to Malthus to model the pre-industrial stagnation. Furthermore, historical evidence has pointed to the significant role of institution in the transition, but the multiple-equilibria theories fail to appreciate it.

What we need is a theory with a tipping-point mechanism that is compatible with the institutional view as well as the new explanation of the Malthusian trap. The infant institution theory meets all three criteria. It is a tipping-point model; selection is intrinsic to the evolution of institutions; and selection is also shown to be the ultimate force that had kept living standards constant.

### **3.3.2 Hitler and Stalin**

Simulation shows that the proportion of good regions will oscillate wildly and frequently even after the escape of the Dark Age. A second Dark Age may fall upon the world (figure 3.1). The oscillation occurs because some strong regions mutate to be bad, and because of their strength, they reverse the trend of growth and drag the world back to the Dark Age.

In the real history, Germany, Japan and Russia used the institution and technology inherited from the English Industrial Revolution to develop their own countries. Afterwards, their conversion to Nazism, militarism and communism put growth on the verge of a complete stop. The world managed to avoid that fate not because the modern growth is unstoppable by nature but because the United States was then a strong country and had been firm on capitalism.

## **3.4 Conclusion**

This paper shows that when competition is intense, the level effect can dominate the growth effect for an extremely long time. A level handicap that could be bridged with a score periods of extra growth can suppress the growth-friendly trait for tens of thousands of periods.

The suppression will finally end with a dramatic transition when a single region, having survived the level handicap, fully realizes its growth potential. With a growing fitness, the region spreads the institution wide and fast. A tipping point emerges. This explains both the length of the Malthusian era and the dramatic nature of the Industrial Revolution.

# Bibliography

- [1] Acemoglu, Daron and James Robinson, 2012. “Why Nations Fail: The Origins of Power, Prosperity, and Poverty”. Crown Business.
- [2] Aiyar, Shekhar and Carl-Johan Dalgaard and Omer Moav. 2008. “Technological Progress And Regress in Pre-industrial Times.” *Journal of Economic Growth*.
- [3] Allen, Robert, Tommy Bengtsson and Martin Drive eds. 2005. “Living Standards in the Past: New Perspectives on Well Being in Asia and Europe.” Oxford University Press.
- [4] Allen, Robert. 2008. “A review of Gregory Clark’s *A Farewell to Alms: A brief economic history of the world*.” *Journal of Economic Literature*.
- [5] Allen, Robert. 2009. “The British Industrial Revolution in Global Perspective.” Cambridge University Press.
- [6] Allen, Robert, Bassino, Jean-Pascal, Ma De-bin, Moll-Murata, Christine, and van Zanden, Jan Luiten. 2011. “Wages, Prices, and Living Standards in China, Japan, and Europe, 1738-1925.” *Economic History Review*.
- [7] Ashraf, Quamrul and Oded Galor, 2011. “Dynamics and Stagnation in the Malthusian Epoch,” *American Economic Review*.
- [8] Bowles, Samuel and Herbert Gintis. 2002. “Behavioral science: Homo reciprocans.” *Nature*.
- [9] Bowles, Samuel. 2006. “Group Competition, Reproductive Leveling, and the Evolution of Human Altruism.” *Science*.
- [10] Bowles, Samuel and Herbert Gintis. 2011. “A Cooperative Species: Human Reciprocity and Its Evolution.” Princeton University Press.
- [11] Broadberry, Stephen and Bishnupriya Gupta, 2005. “The Early Modern Great Divergence: Wages, Prices and Economic Development in Europe and Asia, 1500-1800.” CEPR Discussion Papers 4947, C.E.P.R. Discussion Papers.

- [12] Broadberry, Stephen, 2011. "Recent developments in the theory of very long run growth: A historical appraisal," CAGE Online Working Paper Series 55, Competitive Advantage in the Global Economy (CAGE).
- [13] Bryce, Trevor. 1998. "The Kingdom of the Hittites." Oxford University Press.
- [14] Carey, Henry C. 1840. "Principles of Political Economy." Philadelphia: Lea and Blanchard.
- [15] Chen, Shuo and James K. Kung, 2012. "A Malthusian Quagmire? Maize, Population Growth, and Economic Development in China." Department of Economics, Fudan University Working paper.
- [16] Clark, Gregory, 2004. "The Price History of English Agriculture, 1209-1904". Research in Economic History.
- [17] Clark, Gregory, 2005. "The Condition of the Working Class in England, 1209-2004". Journal of Political Economy.
- [18] Clark, Gregory, 2007a. "A Farewell to Alms: A Brief Economic History of the World". Princeton University Press.
- [19] Clark, Gregory, 2007b. "The Long March of History: Farm Wages, Population and Economic Growth, England 1209-1869. Economic History Review.
- [20] Clark, Gregory, 2010. "The Macroeconomic Aggregates for England, 1209-2008". Research in Economic History.
- [21] Crafts, Nicholas and Terence Mills, 2007. "From Malthus to Solow: How Did the Malthusian Economy Really Evolve?" Working paper.
- [22] Davies, John. 1994. "Giffen Goods, the Survival Imperative, and the Irish Potato Culture." Journal of Political Economy.
- [23] De Vries, J. 1984. "European urbanization 1500-1800". Harvard University Press.
- [24] DeLong, Brad and Andrei Shleifer. 1993. "Princes and Merchants: European City Growth before the Industrial Revolution." Journal of Law and Economics.
- [25] Everett, Alexander. 1826/1970. "New Ideas on Population, With Remarks on the Theories of Malthus and Godwin. New York: Augustus M. Kelley.
- [26] Fisher, Ronald. 1915. "The Evolution of Sexual Preference." Eugenics Review 7: 184-192.

- [27] Friedman, Milton. 1953. "The Methodology of Positive Economics." in *Essays in Positive Economics*, edited by Milton Friedman. Chicago: University of Chicago Press.
- [28] Galor, Oded and Andrew Mountford, A. 2006. "Trade and the great divergence: the family connection." *American Economic Review*.
- [29] Galor, Oded and David Weil. 2000. "Population, technology, and growth: From Malthusian stagnation to the demographic transition and beyond". *American Economic Review*.
- [30] Galor, Oded and Omar Moav. 2002. "Natural selection and the origin of economic growth". *Quarterly Journal of Economics*.
- [31] Galor, Oded. 2011. "Unified Growth Theory." Princeton University Press.
- [32] Hansen, Gary D., and Edward C. Prescott. 2002. "Malthus to Solow." *American Economic Review*.
- [33] Harlan, J. R. 1992. "Crops and Man." Maddison, Wisconsin: American Society of Agronomy.
- [34] Heather, Peter. 2007. "The Fall of the Roman Empire: A New History of Rome and the Barbarians." Oxford University Press, USA.
- [35] Jones, Charles. 2001. "Was an Industrial Revolution Inevitable? Economic Growth Over the Very Long Run." *The B.E. Journal of Macroeconomics*.
- [36] Kremer, Michael. 1993. "Population Growth and Technological Change: One Million BC to 1990." *Quarterly Journal of Economics*.
- [37] Lee, Ronald. 1980. "A Historical Perspective on Economic Aspects of the Population Explosion: The Case of Preindustrial England. In *Population and Economic Change in Developing Countries*, ed. Richard A. Easterlin, 517-66. Chicago and London: University of Chicago Press.
- [38] Lee, Ronald. 1986. "Malthus and Boserup: A Dynamic Synthesis." in David Coleman and Roger Schofield, eds., *The State of Population Theory*. Basil Blackwell. pp. 96-130.
- [39] Lee, Ronald. 1988. "Induced Population Growth and Induced Technological Progress: Their Interaction in the Accelerating Phase." *Mathematical Population Studies*.
- [40] Lee, Ronald. 1987. "Population Dynamics of Humans and Other Animals." *Demography*.

- [41] Lee, Ronald. 1993. "Accidental and Systematic Change in Population History: Homeostasis in a Stochastic Setting." *Explorations in Economic History*.
- [42] Lee, Ronald and Michael Anderson. 2002. "Malthus in State Space: Marco Economic-Demographic Relations in English History, 1540-1870." *Journal of Population Economics*.
- [43] Levine, David and Salvatore Modica. 2011. "Anti-Malthus: Evolution, Population, and the Maximization of Free Resources." working paper.
- [44] Maddison, Angus. 2006. "The World Economy: Historical Statistics". Organisation for Economic Co-operation and Development. Development Centre
- [45] Malthus, Thomas. 1798. "An Essay on the principle of population, as it affects the future improvements of society". London: J. Johnson.
- [46] Malthus, Thomas. 1817. "Principles of Population, fifth edition". Homewood: Irwin, 1817/1963.
- [47] Mithen, Steven. 2007. "Did farming arise from a misapplication of social intelligence?". *Philosophical Transactions of the Royal Society*.
- [48] Persson, Karl G. 1988. "Pre-industrial Economic Growth." Oxford: Basil Blackwell.
- [49] Putterman, Louis. 2008. "Agriculture, Diffusion and Development: Ripple Effects of the Neolithic Revolution." *Economica*.
- [50] Restuccia, Diego, Dennis Tao Yang, and Xiaodong Zhu. 2007. "Agriculture and Aggregate Productivity: A Quantitative Cross-country Analysis." *Journal of Monetary Economics*.
- [51] Samuelson, Paul and Robert Solow. 1953. "Balanced Growth under Constant Returns to Scale." *Econometrica*.
- [52] Simon, J.L. and Gunter Steinmann. 1991. "Population Growth, Farmland and the Long-run Standard of Living." *Journal of Population Economics*.
- [53] Solow, Rober. 1956. "A Contribution to the Theory of Economic Growth." *Quarterly Journal of Economics*.
- [54] Soltis, Joseph, Robert Boyd and Peter J. Richerson. 1995. "Can Group-functional Behavio Evolve by Cultural Group Selection: An Empirical Test," *Current Anthropology*.
- [55] Spence, Michael. 1973. "Job Market Signaling." *Quarterly Journal of Economics*.



- [56] Steckel, Richard and Joseph Prince. 2001. "Tallest in the World: Native Americans of the Great Plains in the Nineteenth Century." *American Economic Review*.
- [57] Talor, Scott and James Brander. 1998. "The Simple Economics of Easter Island: A Ricardo-Malthus Model of Renewable Resource Use". *The American Economic Review*.
- [58] Temin, Peter. 2001. "A market economy in the early Roman Empire." *The Journal of Roman Studies*.
- [59] Veblen, Thorstein. 1899. "The Theory of the Leisure Class."
- [60] Voigtlnder, Nico, and Hans-Joachim Voth. 2008. "The Three Horsemen of Growth: Plague, War and Urbanization in Early Modern Europe. Unpublished.
- [61] Wrigley, Edward and Roger Schofield. 1981, *The Population History of England, 1541-1871, A Reconstruction*. Edward Arnold.
- [62] Weisdof, Jacod. 2005. "From foraging to farming: Explaining the Neolithic revolution." *Journal of Economic Surveys*.
- [63] Yang, Dennis Tao, and Xiaodong Zhu. 2013. "Modernization of Agriculture and Long-Term Growth." Forthcoming. *Journal of Monetary Economics*.



# Chapter 4

## Appendix

### 4.1 Proofs

#### 4.1.1 Proportionality between $g_A$ and $g_H$

**Proposition 6** *If an isolated economy has constant growth rates of technology  $g_A$  and  $g_B$ , then  $g_A - (1 - \gamma)g_H$  converges to 0.*

Population evolves in the following way:

$$g_H = \delta(\ln x - \ln \bar{x})$$

Since  $x = A(1 - \beta)^\gamma H^{\gamma-1}$  (equation 1.2),

$$g_H = \delta[\ln A + \gamma \ln(1 - \beta) + (\gamma - 1) \ln H - \ln \bar{x}]$$

Denote  $M \equiv \ln A + (\gamma - 1) \ln H$ , then

$$g_H = \delta[M + \gamma \ln(1 - \beta) - \ln \bar{x}]$$

The motion of  $M$  follows

$$\begin{aligned} dM &= g_A + (\gamma - 1)g_H \\ &= g_A + (\gamma - 1)\delta[M + \gamma \ln(1 - \beta) - \ln \bar{x}] \end{aligned}$$

Since  $(\gamma - 1)\delta < 0$ ,  $M$  will stabilize at

$$M^* = \frac{g_A}{(1 - \gamma)\delta} - \gamma \ln(1 - \beta) + \ln \bar{x}$$

$dM = g_A - (1 - \gamma)g_H$  converges to 0.

### 4.1.2 Assumptions of the two-sector model

I make the following assumptions to prove the production structure theorems and “surplus is free” theorems.

1. **Conflict of interest:** The utility function  $U(E)$  is not a transformation of the growth rate of population  $n(E)$ .
2. **Homogeneity:** People have the same preference.
3. **Strict monotonicity:** The utility function  $U(E)$  and the growth rate of population  $n(E)$  are strictly increasing in consumption  $E$ .
4. **Endowment economy:** Assume an endowment economy where labor is not an input. When the group size is  $H$ , the individual choice set is a  $\frac{1}{H}$  fraction of the aggregate set of production possibility.
5. **Rank preservation:** If a good is a relative surplus to another at a bundle of consumption  $E$ , it is a relative surplus at all bundles of consumption.
6. **Concavity and Continuity:** The utility function is continuous, strictly concave and continuously differentiable. The production possibility frontier is continuous and strictly concave. The production function is the continuously differentiable.

### 4.1.3 Production structure theorem and surplus-is-free theorem

The production structure theorems state that:

1. For an economy on a stable equilibrium, a *positive* shock of surplus technology always improves equilibrium living standards.
2. If the subsistence is not a Giffen good, an economy of a more surplus-oriented production structure always has a higher equilibrium living standard, other things being equal.

The “surplus is free” theorems state that:

1. For an economy on a stable equilibrium, a surplus culture always improves equilibrium living standards.
2. If the subsistence is not a Giffen good, an economy of a more surplus-oriented social preference always has a higher equilibrium living standard, other things being equal.

**Proof:** As in figure 4.1A, draw a ray from the origin. Let the angle between the ray and the horizontal axis be  $k \in [0, \pi/2]$ . The ray crosses the constant population curve at  $E(k)$ . Since preference is complete, there exists an indifference curve that passes through  $E(k)$ . Define  $u(k)$  as the absolute value of the slope of that indifference curve at point  $E(k)$ .  $u(k)$  varies as  $k$  changes.

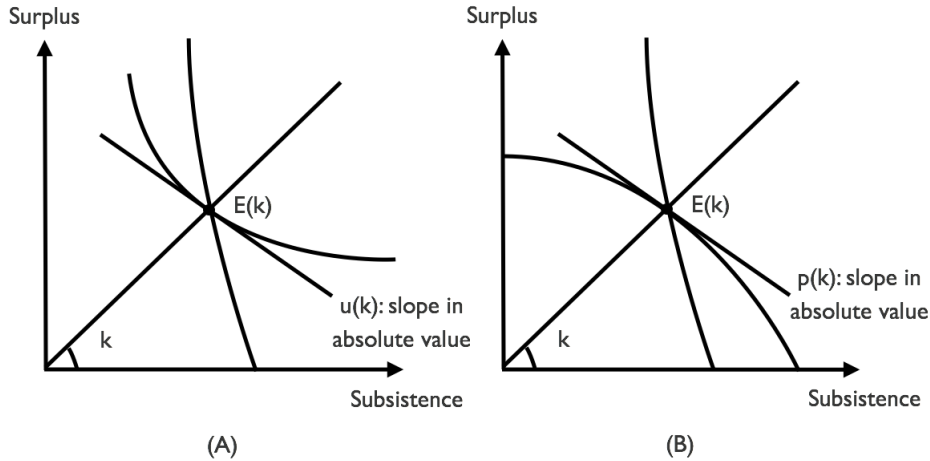


Figure 4.1: Slope functions:  $u(k)$  and  $p(k)$

Then shift the production possibility frontier in proportion to the place where it passes through  $E(k)$ . Define  $p(k)$  as the absolute value of the slope of the production possibility frontier at point  $E(k)$ . Since production possibility frontier is continuous and strictly concave,  $p'(k) < 0$ .

The economy reaches an equilibrium if and only if  $u(k) = p(k)$ . Put  $u(k)$  and  $p(k)$  on the same diagram as curves (figure 4.2A). At certain equilibria, such as the second crossing in figure 4.2A,  $u(k)$  crosses  $p(k)$  from above. These equilibria are unstable ones. As Figure 4.2B illustrates,  $E(k_1)$  is such an unstable equilibrium: the indifference curve is tangent with the production possibility frontier at that point,  $u(k_1) = p(k_1)$ . But  $u(k) < p(k)$  for  $k$ 's that are slightly larger than  $k_1$  - the  $u(k)$  curve crosses the  $p(k)$  curve from above. When a negative disturbance shocks the population, the bundle of consumption will move to the left of the constant population curve (figure 4.2B). Then it causes further decline of population and makes the economy diverge.

If there is only a stable equilibrium, it will be easy to show the theorems. When the production structure is more surplus-oriented, the  $p(k)$  curve will shift upward: the production possibility frontier becomes steeper. As figure 4.3A shows, the new equilibrium  $k_1$  will be larger than  $k_0$  and the equilibrium living standard improves. Similarly, when the social preference is more surplus-oriented, the  $u(k)$  curve will shift downward: the indifference curve becomes flatter. As figure 4.3B shows, the new equilibrium has a larger  $k$  as well. The equilibrium living standard improves.

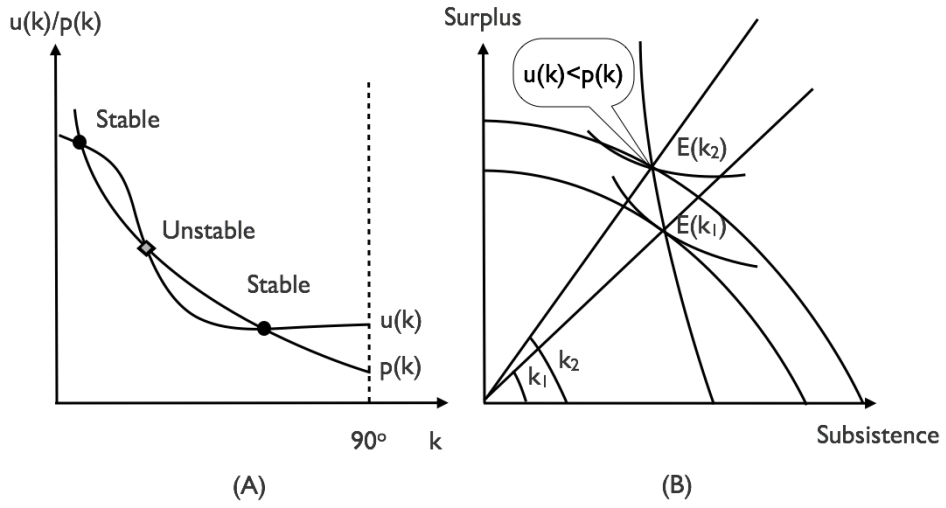


Figure 4.2: The unstable equilibrium

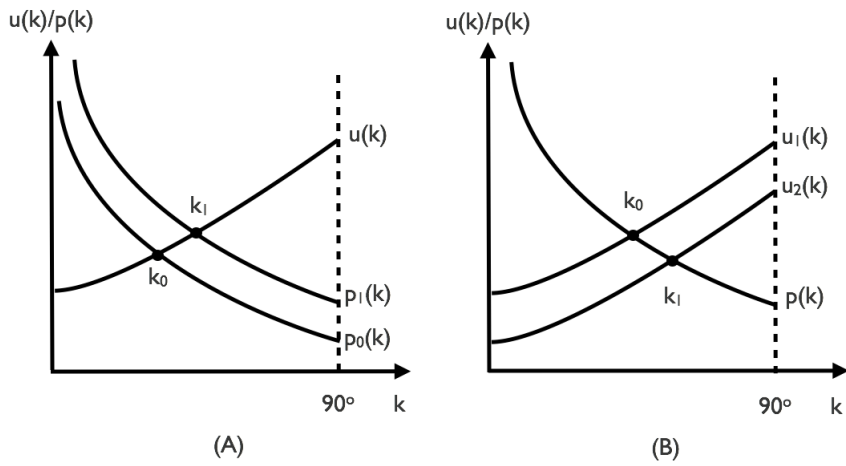


Figure 4.3: Proof of the theorems

We need a theoretical detour to avoid such “bad” scenarios (figure 4.4): when the surplus change comes together with a big drop of production, the economy can switch from a superior equilibrium to an inferior one, and the benefit from the surplus change is not enough to compensate the loss. This is why the first production possibility frontier emphasizes “progress”, that is, the new choice set contains the old one after the change. Now the equilibrium living standard will improve for sure.

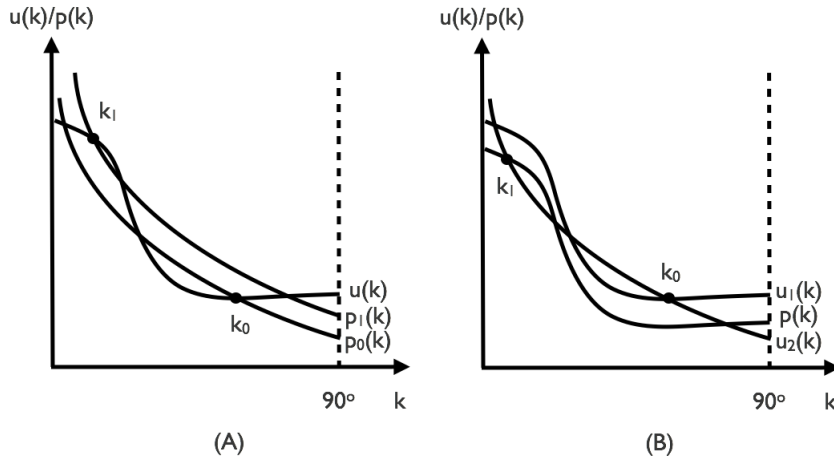


Figure 4.4: The trouble with multiple equilibria

The second production structure theorem deals with the same problem in a different way. In essence, the multiple equilibria arise partly because subsistence is a Giffen good. When people’s income decreases, they spend even more on subsistence. As a result, the level of population becomes even greater after the drop of income. When subsistence is not a Giffen good, the multiple equilibria can no longer arise.

For the second theorem, we need to prove that the Giffen character of subsistence is a necessary condition. Here is the reasoning. When there exists multiple (stable) equilibria, the economy can always switch from a superior equilibrium to an inferior one. When it does so,  $p(k)$  is higher since it is decreasing in  $k$ . Though the relative price of subsistence  $p(k)$  rises, the equilibrium average consumption of subsistence rises as well - the equilibrium moves downward along the constant population curve. So subsistence is a Giffen goods when there are multiple equilibria. If subsistence is not Giffen, there will not be multiple equilibria and the production structure theorem is proved. The “surplus is free” theorems are proved in the same way.

#### 4.1.4 Prove $\mathbb{E}(\nu_{t \rightarrow +\infty}) \propto \nu^*$

By Ito’s lemma,

$$d\nu^x = \left[ \sigma^2 x(2x - 1)\nu^{x-1} - 2\sqrt{2}|\lambda|x\nu^{x+\frac{1}{2}} \right] dt + 2\sigma x\nu^{x-\frac{1}{2}} dz \quad (4.1)$$

When  $t \rightarrow +\infty$ ,  $\mathbb{E}(d\nu_{t \rightarrow +\infty}^x) = 0$ . Therefore, the long-run expectation of the drift term

$$\sigma^2 x(2x - 1) \mathbb{E}(\nu_{t \rightarrow +\infty}^{x-1}) - 2\sqrt{2}|\lambda|x \mathbb{E}(\nu_{t \rightarrow +\infty}^{x+\frac{1}{2}}) = 0 \quad (4.2)$$

Let  $f(x) \equiv \mathbb{E}(\nu_{t \rightarrow +\infty}^x)$  and denote  $\frac{\sigma^2}{2\sqrt{2}|\lambda|}$  as  $a$ , then equation (4.2) can be rewritten as a general term formula:

$$f\left(x + \frac{3}{2}\right) = a(2x + 1)f(x) \quad (4.3)$$

with  $f(0) = \mathbb{E}(\nu_{t \rightarrow +\infty}^0) = 1$ .

Solve that

$$f(x) = \frac{1}{3}(3a)^{\frac{2}{3}x} \text{Pochhammer}\left(\frac{4}{3}, \frac{2}{3}x - 1\right) \quad (4.4)$$

and

$$f(1) = \frac{a^{\frac{2}{3}}}{3^{\frac{1}{3}} \text{Gamma}\left(\frac{4}{3}\right)} \quad (4.5)$$

$$\approx 0.78a^{\frac{2}{3}} \quad (4.6)$$

Therefore,

$$\mathbb{E}(\nu_{t \rightarrow +\infty}) \approx 0.78 \left[ \frac{\sigma^2}{2\sqrt{2}|\lambda|} \right]^{\frac{2}{3}} = 0.78\nu^* \quad (4.7)$$

As a confirmation, simulation fails to reject the hypothesis that  $\mathbb{E}(\nu_{t \rightarrow +\infty}) = 0.78\nu^*$ .

#### 4.1.5 The general case with $\gamma \in \mathbb{R}^+$

If  $x_i$ 's movement follows

$$dx_i = I_{\{x_i \geq x_j\}} \lambda(x_i - x_j)^\gamma dt + \sigma dz_i \quad (\gamma > 0 \text{ and } \lambda < 0) \quad (4.8)$$

Let  $\mu = \frac{1}{2}(x_1 + x_2)$  and  $\nu = \frac{1}{2}|x_1 - x_2|^\gamma$ . Then

$$d\mu = \lambda\nu dt + \frac{\sqrt{2}}{2}\sigma dz \quad (4.9)$$

$$d\nu = \left[ (\gamma - 1)\sigma^2 - |\lambda|(2\nu)^{\frac{\gamma+1}{\gamma}} \right] dt + \frac{\sqrt{2}}{2}\sigma\gamma(2\nu)^{\frac{\gamma-1}{\gamma}} dz \quad (4.10)$$

The convergence point

$$\nu^* = \frac{1}{2} \left[ \frac{(\gamma - 1)\sigma^2}{|\lambda|} \right]^{\frac{\gamma}{\gamma+1}} \quad (4.11)$$

Hence,

$$\lambda\nu^* \propto \lambda^{\frac{1}{\gamma+1}} \quad (4.12)$$



## 4.2 Tables

Below are the results of two sets of regressions. Table 4.1 and table 4.2 report the first set, the seemingly unrelated regression. By taking into account the correlation of the error terms across the equations, it makes more efficient estimates than the ordinary least square method. Table 4.3 and table 4.4 are the results of the second set which regresses the levels of birth and death rates on the levels of wage indices. Regressing levels on levels suffers the risk of spurious regression, among other problems.

All the reported estimators are dynamic multipliers that sum up the effects of the first three years after the impact.

Table 4.1: What affects the birth rate? (Seemingly Unrelated Regression)

Dependent Variables	$\Delta$ Birth rate (%) (the mean birth rate=3.31%)					
	B(1)	B(2)	B(3)	B(4)	B(5)	B(6)
$\Delta$ Arable wage	1.15*** (0.28)					
$\Delta$ Wheat wage		0.07 (0.31)				
$\Delta$ Barley and Oats wage		1.03*** (0.39)		0.83** (0.39)	0.72** (0.24)	
$\Delta$ Pasture wage	0.84 (0.53)	0.76 (0.54)				0.70 (0.54)
$\Delta$ Clark real earning			2.17*** (0.52)	0.65 (0.85)		2.08*** (0.57)
$\Delta$ Wrigley real wage					0.08 (0.44)	
$R^2$	0.24	0.25	0.20	0.23	0.33	0.25
Observations	262	262	262	262	257	262

Notes: All the coefficients are the sum of the first three years' effects. The models control for the linear, quadratic and cubic trends and include the climate and plague dummies up to two years' lags. \*,\*\* and \*\*\* denote significance at the 90%, 95% and 99% levels respectively.

Table 4.2: What affects the death rate? (Seemingly Unrelated Regression)

Dependent Variables	$\Delta$ Death rate (%) (the mean death rate=2.75%)					
	D(1)	D(2)	D(3)	D(4)	D(5)	D(6)
$\Delta$ Arable wage	-1.11*** (0.36)					
$\Delta$ Wheat wage		-0.11 (0.41)				
$\Delta$ Barley and Oats wage		-0.96* (0.5)		-0.94* (0.51)	-0.91* (0.47)	
$\Delta$ Pasture wage	1.06 (0.7)	1.33* (0.71)				0.99 (0.72)
$\Delta$ Clark real earning			-1.65** (0.68)	-0.1 (1.12)		-1.81** (0.76)
$\Delta$ Wrigley real wage					-0.33 (0.87)	
R squared	0.31	0.32	0.26	0.29	0.35	0.29
Observations	262	262	262	262	257	262

Table 4.3: What affects the birth rate? (Regressing levels on levels)

Dependent Variables	Birth rate (%) (mean=3.31)					
	B(1)	B(2)	B(3)	B(4)	B(5)	B(6)
Arable wage	0.54*** (0.12)					
Wheat wage		-0.03 (0.16)				
Barley and Oats wage		0.66*** (0.23)		0.59*** (0.22)	0.61** (0.25)	
Pasture wage	-0.09 (0.30)	-0.19 (0.24)				-0.10 (0.29)
Clark real earning			0.95*** (0.26)	-0.06 (0.44)		1.04*** (0.23)
Wrigley real wage					-0.32 (0.30)	
$R^2$	0.66	0.69	0.64	0.67	0.65	0.65
Observations	262	262	262	262	257	262

Table 4.4: What affects the death rate? (Regressing levels on levels)

Dependent Variables	Death rate (%) (mean=2.75)					
	D(1)	D(2)	D(3)	D(4)	D(5)	D(6)
Arable wage	-0.65** (0.30)					
Wheat wage		0.48 (0.35)				
Barley and Oats wage		-1.46** (0.60)		-1.55** (0.62)	-1.56** (0.69)	
Pasture wage	-0.53 (0.59)	-0.23 (0.52)				-0.66 (0.58)
Clark real earning			-1.57** (0.68)	1.06 (0.87)		-1.01 (0.62)
Wrigley real wage					1.03 (0.71)	
$R^2$	0.34	0.41	0.30	0.38	0.37	0.34
Observations	262	262	262	262	257	262

Table 4.5: Parameterization of the baseline simulation

Parameter	Value	Interpretation
$g_A$	0.5%	Subsistence growth rate
$g_B$	1%	Surplus growth rate
$\sigma_A$	5%	Std. of subsistence growth
$\sigma_B$	5%	Std. of surplus growth
$\delta$	0.2	$n = \delta(\ln x - \ln \bar{x})$
$\gamma$	0.5	$X = AL_A^{1-\gamma} H_A^\gamma, Y = BL_B^{1-\gamma} H_B^\gamma$
$\bar{x}$	1	$n = \delta(\ln x - \ln \bar{x})$
$\theta$	0.05	migrational rate
$\beta$	0.5	$U = x^{1-\beta} y^\beta$
$\alpha$	-10	$g_{Bij} = g_B[1 + (B_{ij}/A_{ij})^\alpha]$