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# Ribosome stalling during selenoprotein translation exposes a ferroptosis vulnerability

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## Abstract

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Z.L. and J.A.O. conceived of the project and designed the experiments. J.A.O. and Z.L. wrote the majority of the manuscript. All authors read, edited, and contributed to the manuscript. Z.L. performed the majority of the experiments. Z.L. and L.F. prepared samples for ribosome profiling, and L.F. and N.T.I. analyzed the sequencing data. Z.L. and K.K.D. performed and analyzed protein translation using AHA-labeling and proteomics. Z.L. performed and analyzed the CRISPR screen with assistance from M.A.R., J.H. and M.C.B. S.J.D. and L.M. performed the glutathione measurements. Z.L. and G.A.M performed the siZNF598 knockdown experiment. S.K., K.S., J.A.W and A.G. generated MCF10A cells stably expressing MYC, HRasG12V, KRasG12V, HER2.

COMPETING INTERESTS

S.J.D. is a co-founder of Prothegen Inc. and a member of the advisory board for Ferro Therapeutics and Hillstream Biopharma. S.J.D. and J.A.O. have patent applications related to ferroptosis.

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The selenoprotein glutathione peroxidase 4 (GPX4) prevents ferroptosis by converting lipid peroxides into non-toxic lipid alcohols. GPX4 has emerged as a promising therapeutic target for cancer treatment, but some cancer cells are resistant to ferroptosis triggered by GPX4 inhibition. Employing a chemical-genetic screen, we identify LRP8 (also known as ApoER2) as a ferroptosis resistance factor that is upregulated in cancer. Loss of LRP8 decreases cellular selenium levels and the expression of a subset of selenoproteins. Counter to the canonical hierarchical selenoprotein regulatory program, GPX4 levels are strongly reduced due to impaired translation. Mechanistically, low selenium levels result in ribosome stalling at the inefficiently decoded GPX4 selenocysteine UGA codon, leading to ribosome collisions, early translation termination, and proteasomal clearance of the N-terminal GPX4 fragment. These findings reveal rewiring of the selenoprotein hierarchy in cancer cells and identify ribosome stalling and collisions during GPX4 translation as ferroptosis vulnerabilities in cancer.

### INTRODUCTION

Ferroptosis is a regulated form of necrotic cell death that is characterized by the irondependent accumulation of phospholipid hydroperoxides (i.e., lipid peroxides), which leads to plasma membrane rupture and cell death<sup>1,2</sup>. Several metabolic pathways influence cellular sensitivity to ferroptosis, including pathways that regulate redox homeostasis, mitochondrial activity, iron handling, and the metabolism of lipids and amino acids<sup>1,2</sup>. The two primary cellular mechanisms that prevent ferroptosis are the conversion of lipid peroxides into nontoxic lipid alcohols by the glutathione-dependent peroxidase GPX4<sup>3</sup> and the generation of radical trapping antioxidants to block the propagation of lipid peroxidation by enzymes such as ferroptosis suppressor protein 1 (FSP1)<sup>4,5</sup>, dihydroorotate dehydrogenase (DHODH)<sup>6</sup>, and GTP cyclohydrolase-1 (GCH1)<sup>7,8</sup>.

GPX4 contains an active site selenocysteine (SEC) residue (U46)<sup>9</sup>. As a selenoprotein, GPX4 is subject to a unique form of translation that involves the re-coding of an opal (UGA) stop codon by transactivating factors bound to a selenocysteine insertion sequence (SECIS) present in the 3' untranslated region of the transcript. The transactivators mediate the recruitment of the Sec-tRNA<sup>Sec</sup> and the co-translational insertion of SEC<sup>10</sup>. A selenoprotein regulatory hierarchy ensures that the expression of essential selenoproteins such as GPX4 is maintained by downregulating non-essential selenoproteins (e.g., GPX1) during periods of limiting selenium<sup>11</sup>.

Growing evidence implicates ferroptosis in numerous pathological conditions, including ischemia-reperfusion tissue injuries, liver and lung fibrosis, and autoimmune and neurodegenerative diseases<sup>2,12</sup>. The discovery that ferroptosis can be chemically induced in cancer cells by the direct inhibition of the GPX4<sup>3,13</sup> or by the inhibition of cystine-glutamate exchanger system  $x_c^{-14,15}$ , which results in the depletion of glutathione, has also led to the pursuit of ferroptosis-based cancer therapeutic strategies. Indeed, many cancer cells are sensitive to ferroptosis induced by GPX4 inhibition, including therapy resistant persister cells<sup>16–18</sup>. However, cancer cells differ widely in their sensitivity to ferroptosis inducers. Understanding the mechanisms that cancer cells employ to prevent ferroptosis is paramount to the development of effective therapeutics. Moreover, despite the importance of GPX4 and

its central role in ferroptosis, our understanding of the mechanisms that regulate GPX4 in cancer remains incomplete.

In this study, we discover that the lipoprotein receptor LRP8 (also known as ApoER2) promotes ferroptosis resistance in cancer. Mechanistically, LRP8 impacts ferroptosis by regulating selenium levels in cancer cells, thereby influencing the levels of a subset of selenoproteins. Surprisingly, our data indicate that the levels of GPX4 rapidly decrease in response to limiting selenium in cancer cells due to ribosome stalling, ribosome collisions, and early translation termination, resulting in ferroptosis sensitization. These findings reveal an altered selenoprotein regulatory hierarchy in cancer cells and identify a therapeutic vulnerability that can be targeted to sensitize cancer cells to ferroptosis.

#### RESULTS

#### LRP8 is a candidate ferroptosis regulator in cancer

To identify additional ferroptosis resistance mechanisms, we searched for cell lines displaying FSP1-independent resistance. Analysis of cancer cell line sensitivities to ferroptosis inducers reported in the Cancer Therapeutics Response Portal (CTRP)<sup>19,20</sup> identified a subset of cancer cell lines, including the MDA-MB-453 triple-negative breast cancer (TNBC) cell line, that are resistant to GPX4 inhibitors (RSL3, ML162, and ML210) despite low *FSP1* expression (Fig. 1a and Extended Data Fig. 1a,b). Consistent with these data and in contrast to U-2 OS cells, MDA-MB-453 cells lack detectable FSP1 protein (Fig. 1b) and treatment with the FSP1 inhibitor iFSP1 (Fig. 1c) or expression of FSP1 sgRNAs (Extended Data Fig. 1d) have no effect on RSL3-induced cell death. These findings indicate that MDA-MB-435 cells employ FSP1-independent mechanisms to prevent cell death triggered by RSL3.

To identify mechanisms of ferroptosis resistance, we performed parallel genome-wide synthetic lethal CRISPR-Cas9 screens with RSL3 in FSP1-expressing U-2 OS cells and FSP1-deficient MDA-MB-453 cells (Extended Data Fig. 1c). Consistent with our previous CRISPR-Cas9 screen with a sublibrary of sgRNAs<sup>4</sup>, FSP1 emerged as the top ferroptosis suppressor in U-2 OS cells (Extended Data Fig. 1e,f and Supplementary Dataset 1). As expected, FSP1 was not identified as a ferroptosis regulator in MDA-MB-453 cells (Fig. 1d,e and Supplementary Dataset 2). However, several other regulators of ferroptosis resistance were observed, including GPX4 and factors involved in iron regulation, such as enzymes that mediate heme synthesis and iron-sulfur cluster formation (e.g., MFRN2, UROS, NARFL) (Fig. 1d,e and Supplementary Dataset 2). Interestingly, sgRNAs targeting *LRP8*, which belongs to the lipoprotein receptor superfamily, were substantially disenriched in MDA-MB-453 cells treated with RSL3 (Fig. 1d,e and Supplementary Dataset 2). Treatment of co-cultured wildtype (WT) cells (mCherry-) and cells expressing three different LRP8 sgRNAs (mCherry+) with the GPX4 inhibitors RSL3 and ML162 consistently showed a reduced mCherry+/mCherry- ratio in a ratiometric competitive growth assay (Extended Data Fig. 1g-j). This growth disadvantage was reversed by culturing the cells in the presence of the ferroptosis inhibitor ferrostatin-1 (Fer1) (Extended Data Fig. 1h-j), suggesting that the loss of LRP8 sensitizes cells to ferroptosis.

LRP8 stood out as an interesting hit in our screen due to its functional connections with cancer. *LRP8* is upregulated in tumors from multiple primary sites, including breast tissue (Extended Data Fig. 2a) and types of therapy resistant forms of breast cancer (e.g., TNBC) (Extended Data Fig. 2b), increased expression of *LRP8* is associated with poorly differentiated grade III tumors (Extended Data Fig 2c), patients with high expression of *LRP8* exhibit poorer survival rates (Extended Data Fig 2d), and *LRP8* expression positively correlates with resistance to three GPX4 inhibitors (RSL3, ML162, and ML210) in cancer cell lines (Fig. 2a and Supplementary Dataset 3). These data suggest that LRP8 promotes tumor progression in patients and mediates ferroptosis resistance across a broad range of cancer cells.

#### LRP8 promotes ferroptosis resistance in cancer cells

To experimentally evaluate the relationship between LRP8 and ferroptosis, we generated LRP8 knockout (KO) cell lines in MDA-MB-453, HCC1143, and HCC1937 TNBC cell lines (Fig. 2b and Extended Data Fig. 3a,b). Quantification of cell viability revealed a substantial increase in the sensitivity of LRP8KO cells to RSL3 (Fig. 2c and Extended Data Fig. 3c–e). Similarly, depletion of LRP8 sensitized a panel of cancer cell lines to RSL3, including the glioblastoma cell line U87-MG and the melanoma cell lines A375 and SK-MEL28 (Extended Data Fig. 4a-d), indicating a generalizable role as a ferroptosis resistance factor. LRP8KO cells were also sensitized to ferroptosis induced by glutathione depletion with the system  $x_c^{-}$  inhibitors erastin2 and imidazole ketone erastin (IKE), inhibition of GPX4 with ML162 and ML210, or treatment with sulfasalazine (SAS) and auranofin (Fig. 2d,e and Extended Data Fig. 3f-h). The LRP8KO sensitivity to RSL3 and IKE was reversed by re-expression of LRP8-GFP (Extended Data Fig. 3i–1), indicating that the phenotype is due to the loss of LRP8. RSL3-induced cell death in LRP8KO cells was blocked by several known ferroptosis inhibitors, including radical trapping/scavenging antioxidants, such as Fer1, idebenone, and tocopherol, and the iron chelator deferoxamine (DFO) (Fig. 2f and Extended Data Fig. 3m), but not by inhibitors of apoptosis (ZVAD), autophagy (chloroquine), or necroptosis (Nec-1) (Fig. 2f). LRP8 depletion sensitized cells to hydrogen peroxide (Extended Data Fig. 3n), but not to cell death triggered by the apoptosis-inducer etoposide (Extended Data Fig. 3n, Supplementary Fig. 1a). Consistent with an increased sensitivity to ferroptosis, LRP8KO cells exhibited a significant increase in lipid peroxidation following RSL3 treatment (Fig. 2g,h, Supplementary Fig. 1b).

Ferroptosis can be suppressed by high cell densities and intercellular interactions<sup>21,22</sup>. Thus, it is crucial to examine whether the effects in 2-dimensional (2-D) cell cultures translate into 3-dimensional (3-D) tumor models, which recapitulate important aspects of *in vivo* tumor biology<sup>23,24</sup>. The loss of LRP8 had no effect on spheroid growth but dramatically sensitized spheroids to ferroptosis triggered by IKE relative to control cells (Fig. 2i–k). The IKE-treated LRP8KO spheroids shrank over time and were surrounded by dead cells labeled by SYTOX Green (Fig. 2i–k). The addition of Fer1 blocked cell death and spheroid shrinkage (Fig. 2i–k). Together, these findings demonstrate that LRP8 plays a broad role in suppressing ferroptosis in both 2-D and 3-D models of cancer cell growth and survival.

#### LRP8 regulation of cellular selenium impacts ferroptosis

LRP8 has multiple functions that are mediated by its interactions with different ligands, including roles as an ApoE lipoprotein receptor<sup>25</sup>, as a reelin receptor in the central nervous system<sup>26–28</sup>, and as a receptor for the binding and endocytic uptake of the SEC-rich protein selenoprotein P (SEPP1)<sup>10,29,30</sup>. SEPP1 is subsequently broken down in the lysosome and selenium released from SEC by SEC lyase to provide cells with a pool of selenium<sup>10,29,30</sup>.

To determine how LRP8 might be connected with cancer cell death, we exploited coessentiality tools that take advantage of data from hundreds of CRISPR viability screens to cluster genes with similar profiles of essentiality, enabling functional prediction $^{31,32}$ . These unbiased bioinformatic analyses indicate a strong connection between LRP8 with glutathione metabolism and selenium-related factors (Fig. 3a,b and Extended Data Fig. 5a and Supplemental Table 1). Indeed, LRP8 exhibited associations with SEC synthesis and degradation enzymes, such as SEPSECS, PSTK, EEFSEC, SEPHS2, SECISBP2, and SCLY, and with selenoproteins, such as GPX4 and TXNRD1 (Fig. 3a,b and Extended Data Fig. 5a,b). CRISPR-mediated depletion of key SEC translation factors (e.g. SEPSECS, SEPHS2, and PSTK) (Extended Data Fig. 5b) phenocopied the LRP8KO ferroptosis sensitivity (Fig. 3c and Extended Data Fig. 5c). Importantly, double KO of SEPSECS or SEPHS2 with LRP8 had no additive effect on the sensitivity to RSL3 (Fig. 3c) or erastin2 (Extended Data Fig. 5d), suggesting that these genes act within the same pathway. Depletion of other members of the lipoprotein receptor superfamily, such as the well-characterized lipoprotein receptors VLDR and LDLR, had no impact on ferroptosis resistance (Fig. 3d and Extended Data Fig. 5e) and no additional effect was observed when VLDR or LDLR were knocked out together with LRP8 (Fig. 3d and Extended Data Fig. 5f). LRP1 and LRP2 have also been implicated in SEPP1 binding and selenium uptake in certain tissues such as the muscle<sup>33</sup> and kidney<sup>34</sup>, respectively. However, neither gene was detected in our screen (Fig. 1d,e and Supplementary Dataset 2). Depletion of LRP2 had no effect and depletion of LRP1 had a very modest effect on ferroptosis sensitivity (Fig. 3e and Extended Data Fig. 5e and 6a–e), suggesting that ferroptosis resistance is predominantly mediates by LRP8 in these cells. Although SEPP1 is primarily secreted by hepatocytes, other cell types can also secrete SEPP1 and contribute to a SEPP1 uptake cycle<sup>35</sup>. SEPP1 expression is very low in HCC1143 cancer cells (Supplementary Dataset 4) and depletion of SEPP1 had no effect on ferroptosis sensitivity (Extended Data Fig. 6f-h), arguing that LRP8 primarily scavenges selenium from SEPP1 present in serum. The low expression of SEPP1 may be an advantage in cancer cells to promote selenium retention.

Measurement of selenium levels revealed a ~60% decrease in selenium levels in LRP8KO cells (Fig. 3f). In contrast, there was no change in other elements such as iron, copper, manganese, and zinc (Extended Data Fig. 7a–d) nor any change in glutathione levels (Extended Data Fig. 7e). The addition of selenite (Se), a form of selenium taken up by cells independent of LRP8, was sufficient to correct selenium levels (Fig. 3f) and rescue LRP8KO ferroptosis resistance in 3-D spheroids (Fig. 3g–i) and 2-D cultures (Fig. 3j). As expected, Se treatment did not impact RSL3- or erastin2- induced ferroptosis in the cells lacking key enzymes in the synthesis of SEC, SEPSECS or SEPHS2 deficient cells (Fig. 3k and Extended Data Fig. 7f). These data indicate that the protective activity of Se requires

selenoprotein synthesis and is downstream of LRP8. Expression of GFP-tagged full-length LRP8 and LRP8 LDLα, which is unable to bind lipoproteins<sup>36</sup>, rescued LRP8KO cells from ferroptosis (Fig. 3l,m and Extended Data 7g,h). In contrast, LRP8 LDLβ, which is unable to bind SEPP1<sup>37</sup>, did not rescue ferroptosis resistance (Fig. 3l,m and Extended Data 7g,h). These data demonstrate that LRP8 promotes ferroptosis resistance by maintaining cellular pools of selenium through SEPP1 binding and uptake.

#### LRP8 selenium regulation promotes GPX4 expression

To test the hypothesis that selenium pools become limiting for the biosynthesis of selenoproteins in the LRP8KO cells, we examined the protein levels of 18 selenoproteins expressed in HCC1143 cells. 10 of the 18 selenoproteins were reduced in LRP8KO cells (Fig. 4a,b and Supplementary Fig. 2), including the well-known selenium responsive protein GPX1<sup>10,11</sup>, which is often reduced to provide selenium for the biosynthesis of essential selenoproteins. Unexpectedly, GPX4 levels were severely reduced in the LRP8KO cells (Fig. 4a,b and Supplementary Fig. 2). The levels of GPX4, and other reduced selenoproteins, were rescued by the addition of Se (Fig. 4a,b and Supplementary Fig. 2) but not by ferroptosis inhibitors (Extended Data Fig. 8a). We observed a similar reduction in GPX4 levels in MDA-MB-453, HCC1937, U87-MG, and SK-MEL-28 LRP8KO cells (Extended Data Fig. 8b-f). Importantly, the loss of GPX4 was reversed by re-expressing full-length LRP8 and LRP8 LDLa, but not LRP8 LDLB or LRP8ICD (LRP8 intracellular domain) which are unable to bind SEPP1 (Extended Data Fig. 8g,h). LRP8KO did not affect the levels of other known ferroptosis regulators that do not contain a SEC, such as ACSL3, ACSL4, FSP1, and SLC7A11 (Fig. 4c). LRP8KO in the normal breast epithelial cell line MCF10a had no effect on GPX4 levels (Extended Data Fig. 8i), suggesting that LRP8 is selectively required by cancer cells to scavenge selenium and maintain GPX4 levels. This is consistent with findings in mouse models in which LRP8KO has no effect on selenium and GPX4 levels in most tissues (e.g., liver, kidney, and muscle)<sup>10,11,29,30,35,38,39</sup>. To further explore the role of LRP8 in ferroptosis suppression in cancer cells, we transformed MCF10a cells by overexpressing several oncogenes (MYC, HRASG12V, KRASG12V)<sup>40,41</sup>. Remarkably, the expression of these oncogenes resulted an increase in GPX4 levels as well as a requirement of LRP8 to maintain GPX4 and suppress ferroptosis (Extended Data Fig. 8j-q).

To further assess the dynamic changes in selenoprotein levels under selenium limiting conditions, we pre-treated LRP8KO cells with Se for seven days to restore the selenoprotein levels and then quantified selenoprotein levels following Se removal (Fig 4d,e and Supplementary Fig. 3). Analysis of selenoprotein levels under steady-state conditions and their rate of change following Se washout revealed that the 18 selenoproteins could be generally grouped into distinct classes (Fig. 4f). Class I selenoproteins, which included GPX4, GPX1, and SELENOH, exhibited the largest reduction in levels under basal conditions and were rapidly lost following Se washout, decreasing to 50% within ~1.3, 2.3, and 2.3 days of selenium withdrawal, respectively (Fig. 4f). Contrary to the current dogma of the selenoprotein hierarchy<sup>10,11</sup>, our data reveal that GPX4 is one of the first proteins to be reduced following selenium depletion in cancer cells.

To address whether the decrease in GPX4 is responsible for the ferroptosis sensitivity in LRP8KO cells, we measured the effect of overexpressing GPX4. Expression of the cytosolic short isoform of GPX4 (cytoGPX4) (Extended Data Fig. 9a,b), but not the mitochondrial long isoform of GPX4 (mitoGPX4) (Extended Data Fig. 9a,b), rescued ferroptosis resistance in LRP8KO cells (Fig. 4g,h). Expression of a mutant cytoGPX4 in which the SEC was replaced by cysteine (cytoGPX4U46C), but not a mutant in which the SEC was replaced by serine (cytoGPX4U46S), also restored ferroptosis resistance of LRP8KO cells in the presence of RSL3 or erastin2 (Fig. 4g,h and Extended Data Fig. 9a). These data are consistent with previous findings that cytoGPX4U46C retains partial activity<sup>9</sup>. As expected, GPX4 constructs lacking the selenocysteine insertion sequence (SECIS) (mitoGPX4 SECIS and cytoGPX4 SECIS) were not expressed and failed to rescue ferroptosis resistance (Fig. 4g,h and Extended Data Fig. 9a). In contrast to GPX4, overexpression of GPX1 in LRP8KO cells had no effect on RSL3- or erastin2-induced ferroptosis (Fig. 4g,h). The overexpression of cytoGPX4, mitoGPX4, and GPX1 resulted in small additional decreases in the seleniumresponsive selenoproteins, but had no effect on the levels of the well maintained Class IV selenoproteins (Fig. 4i, j and Supplementary Fig. 4). These data are consistent with a limiting pool of available selenium that influences selenoprotein levels in the LRP8KO cells. Together, these findings demonstrate that LRP8 promotes ferroptosis by supporting the selenium-dependent expression of GPX4. In addition, in contrast to many tissues<sup>10,11,38</sup> and MCF10a cells where GPX4 levels are maintained, GPX4 levels decrease when selenium is limiting in cancer cells, indicating a cancer-specific ferroptosis vulnerability.

#### Loss of selenium disrupts GPX4 translation

Selenoproteins are subject to complex regulation, including hierarchical transcriptional and posttranscriptional mechanisms that adapt selenoprotein expression to fluctuations in selenium levels<sup>10</sup>. Given the critical function of GPX4 and its generally accepted position at the top of the selenoprotein hierarchy<sup>10,11</sup>, we were surprised by the reduction in GPX4 levels in the selenium-deficient LRP8KO cells and thus sought to understand the underlying mechanism of GPX4 regulation. Both RNAseq and qRT-PCR data indicated that GPX4 transcript levels were unaltered in LRP8KO cell lines and were unaffected by Se treatment (Extended Data Fig. 9c–e and Supplementary Dataset 4). We also examined whether GPX4 is targeted for degradation, but inhibiting the proteasome with MG132 or lysosome with chloroquine had no effect on GPX4 levels (Extended Data Fig. 9f).

To investigate whether the translation of GPX4 is disturbed in LRP8KO cells, we employed BioOrthogonal Non-Canonical Amino acid Tagging (BONCAT) together with proteomics and western blotting (Fig. 5a). Newly synthesized, L-azidohomoalanine (AHA) -labeled proteins were conjugated to a biotin moiety using click chemistry and then affinity purified for analysis by mass spectrometry (Fig. 5b,c and Supplementary Dataset 5) and western blotting (Extended Data Fig. 9g,h). We observed a substantially larger peak for the major GPX4 peptide detected (YGPMEEPLVIEK), which resides at the end of the protein (153–164), in control cells relative to LRP8KO cells (Fig. 5b,c). Se treatment drastically diminished the difference in GPX4 levels between control and LRP8KO cells (Fig. 5b,c). We confirmed these results by western blotting (Extended Data Fig. 9g,h), indicating that

#### Ribosome stalling and early translation termination for GPX4

To systematically examine protein translation in LRP8KO cells, we employed ribosome profiling, an approach that uses deep sequencing of ribosome-protected fragments (RPFs)<sup>42,43</sup>. Normalization of RPFs to mRNA abundance data from RNA-seq yields a measure of translation efficiency (TE). These analyses revealed a decrease in the TE for several of the selenoproteins in LRP8KO cell lines, including GPX4, GPX1, SELENOH, and SELENOW (Fig. 5d–f, and Supplementary Dataset 4 and 6). Within selenoprotein transcripts, the SEC UGA codon enables SEC incorporation. However, when SEC-charged tRNAs are limiting, the SEC UGA can potentially act as a stop codon and cause early translation termination. The pattern of RPFs across the selenoprotein transcripts demonstrated an altered distribution in the LRP8KO cells, with a general decrease in RPFs downstream, 3' of the SEC UGA relative to the upstream, 5' portion of the reading frame (Fig. 5g,h), indicatative of early translation termination. The reduction in downstream RPFs was particularly strong for a subset of selenoproteins, including GPX4 (Fig. 5g,h). Notably, the decrease in GPX4 TE (Fig. 5d–f) and downstream RPFs were both reversed by the addition of Se (Fig. 5h).

The density of ribosome footprints positioned at a specific codon indicates the average ribosome dwell time and thus reflects relative ribosome translation speed across that codon<sup>42,43</sup>. Several selenoprotein transcripts exhibited an accumulation of ribosomes (i.e. a ribosome pause or stall) just prior to the SEC UGA (Supplementary Fig. 5). GPX4 showed evidence of stalled ribosomes in control cells (Fig. 6a), consistent with slow decoding of the SEC UGA even under basal conditions. However, ribosomes stalling on GPX4 was severely exacerbated in the LRP8KO cells, with ~50% of the RPFs positioned just prior to the SEC UGA (Fig. 6b,c). The increase in stalled ribosomes in the LRP8KOs was rescued by Se addition (Fig. 6b,c). Together with the decrease in RPFs 3' of the SEC UGA (Fig.5g,h), these data suggest that the reduced GPX4 TE is due to ribosome stalling at the SEC UGA and subsequent ribosome dissociation (i.e. early termination). Indeed, we detected a higher amount of an N-terminal GPX4 fragment in the LRP8KO cells and this fragment accumulated to high levels following inhibition of the proteasome with MG132 (Fig. 6d), indicating proteasomal clearance of the aberrant N-terminal GPX4 frgament released during premature translation termination.

Amongst selenoproteins, GPX4 exhibited a strong decrease in protein levels and the highest amount of stalled ribosomes in the selenium-deficient LRP8KO cells, indicating a mechanism for selectivity. Although GPX4 had the highest transcript levels of all selenoproteins (Extended Data Fig. 9e), RNAi mediated reduction of the GPX4 transcript failed to rescue the decrease in expression between the control and LRP8KO lines (Extended Data Fig. 10a) and there was no change in the association of SECISBP2 association with the SEC elongation factor EEFSEC (Extended Data Fig. 10b). These results suggest that the high GPX4 transcript levels do not result in a key translation factor becoming limiting and indicate that there is not an overt alteration in the formation of the ribosome-associated

SEC insertion complex. To examine a potential role for the unique SECIS from different selenoproteins, we generated a panel of 3'UTR SECIS swaps downstream of the GPX4 coding sequence (Fig. 6e,f). Remarkably, the GPX4 cognate SECIS promoted significantly higher GPX4 expression levels (Extended Fig. 10c) and restored ferroptosis resistance (Extended Fig. 10d) due to higher amounts of translation than all other SECIS tested (Fig. 6e), despite equivalent mRNA amounts for all constructs (Extended Fig. 16e). Thus, the translation efficiency is encoded, at least in part, by the GPX4 SECIS, and replacement of the GPX4 SECIS exacerbates early translation termination for GPX4.

Ribosome stalling can lead to collisions with trailing ribosomes and the accumulation of tightly apposed poly-ribosome clusters<sup>44,45</sup>. Some selenoprotein transcripts, such as SELENOH, showed footprints from single ribosome (i.e. monosomes) stalled while decoding the SEC UGA (Supplementary Fig. 6a). However, for other selenoprotein transcripts, the ribosomes were stalled further upstream of the SEC UGA (Supplementary Fig. 6). These upstream stalls were exacerbated in LRP8KO cells, suggesting that they result from slow SEC decoding that cause collisions with trailing ribosomes. The upstream position of the stalled ribosome and the distance from the SEC UGA is consistent with stacked ribosomes, with two collided ribosomes (i.e. a disome) for GPX1, SELENOT, and SELENOM (Supplementary Fig. 6b-d) and three collided ribosomes (i.e. a trisome) evident for GPX4 (Fig. 6g). The trisome peak upstream of the GPX4 SEC UGA was highly pronounced in the LRP8KO cells (Fig. 6g) and substantially reduced by Se treatment (Fig. 6g). Stalled ribosomes can be rescued by a multitude of pathways that monitor features of the transcript, nascent protein, ribosome, and associated factors<sup>46,47</sup>. The E3 ubiquitin ligase ZNF598 is recruited to collided ribosomes where it ubiquitinates ribosome subunits and initiates ribosome subunit dissociation<sup>48–50</sup>. Loss of ZNF598 reduces recycling of collided ribosomes and results in spontaneous ribosome basepair skipping and continued translation. Indeed, depletion of ZNF598 resulted in a significant increase in GPX4 levels (Fig. 6h,i). The increase in GPX4 levels is an underestimation of the effects of ZNF598 depletion because frameshifting often leads to premature termination. Together, these data implicate ribosome collisions and early translation termination due to ribosome stalling as the cause of the low GPX4 levels in the selenium-deficient LRP8KO cells.

#### DISCUSSION

Our findings identify LRP8 as a ferroptosis resistance factor in cancer cells and support a model in which LRP8-mediated uptake of SEPP1 provides sufficient amounts of selenium for GPX4 translation (Fig. 6j). Low selenium levels lead to ribosome stalling at the GPX4 SEC UGA codon, likely due to limited amounts of SEC-charged tRNAs, increasing the propensity for ribosome collisions and early translation termination of GPX4. This discovery is surprising because GPX4 is considered to be at the top of a selenoprotein hierarchy in which non-essential selenoproteins are downregulated in order to maintain the levels of essential selenoproteins. Indeed, previous ribosome profiling studies in mice fed selenium deficient diets indicate that GPX4 translation is mostly maintained in contrast to non-essential selenoproteins<sup>51</sup>. Our findings suggest that the selenoprotein hierarchy is altered in cancer cells, yielding a cancer-specific vulnerability that can be targeted to sensitize cancer cells to ferroptosis.

Stalled ribosomes can be resolved by a variety of ribosome-associated quality control mechanisms, depending on the defect (i.e., nascent chain interactions with exit tunnel, mRNA degradation, ribosome collisions, etc.<sup>46</sup>). The E3 ligase ZNF598 is recruited to collided ribosomes and mediates the ubiquitination of select ribosome subunits, initiating ribosome dissociation by the ASC-1 complex for recycling<sup>52</sup>. Depletion of ZNF598 leads to readthrough in reporters of stalled ribosomes due to cis-acting feedback regulation of translation initiation and base pair skipping<sup>48,53,54</sup>. Consistent with these reports, depletion of ZNF598 led to a significant increase in GPX4 levels in the LRP8KO cell lines but not in WT cell lines. Together with the observation of stalled ribosomes, the accumulation of trisomes, and the degradation of a N-terminal GPX4 early translation termination fragment, our findings support the conclusion that ribosomes collide at the GPX4 SEC UGA and undergo ZNF598-dependent disassembly. Interestingly, our data also indicate that the ribosome stalling and collisions are higher for GPX4 than other selenoproteins. In our SECIS swap experiments, the GPX4 construct with its cognate GPX4 SECIS led to the highest translation and was the only construct that rescued ferroptosis resistance in the LRP8KO cells. One possibility is that the GPX4 SECIS element confers adaptive stalling at the GPX4 UGA, providing a mechanism in which ribosomes are poised to resume translation upon sufficient selenium. Whether additional mechanisms regulate the selectivity of ribosome stalling warrants further study.

Our results suggest that LRP8 is a promising candidate for therapeutic targeting. It is upregulated in cancer, is positively correlated with ferroptosis resistance across hundreds of cancer cell lines, and has a limited tissue expression profile<sup>25</sup>. In addition, high LRP8 levels correlate with tumor grade and poor patient prognosis. Moreover, our data indicate that tranformation through expression of oncogenes (e.g., MYC, HRAS, KRAS) drives GPX4 expression, leading to a higher requirement for LRP8 selenium scavenging to maintain GPX4 translation. LRP8 KO cancer cell lines exhibit reduced tumor growth in xenografts<sup>55,56</sup>, though whether this is due to its regulation of ferroptosis remains unknown. Future studies directly examining whether LRP8 amplification drives selenium uptake, selenoprotein translation, and ferroptosis resistance in tumors will be beneficial for establishing the significance of the LRP8 amplification in cancer.

Together, our findings suggest that while high amount of GPX4 translation is likely a protective cancer adaptation, it becomes a liability during periods of low selenium due to the increase in ribosome collisions and the negative impact on GPX4 translation. Thus, ribosome stalling, ribosome collisions, and early GPX4 translation termination via disruptions in selenium metabolism are vulnerabilities that could be targeted to sensitize cancer cells to ferroptosis therapeutics. In addition, the discovery that GPX4 is reduced under limiting selenium conditions is counter to the canonical selenoprotein hierarchy model, indicating that we must revisit our assumptions of how selenoproteins are regulated in cancer.

## METHODS

#### **Cell Lines and culture conditions**

U-2 OS Tet-On cells were purchased from Clontech (#630919). MDA-MB-453 cells were purchased from the American Type Culture Collection (ATCC, # HTB-131). U-87 MG, A-375, SK-MEL-28, HCC1143, and HCC1937 were all obtained from UC Berkeley Cell Culture Facility. U-2 OS, MDA-MB-453, U-87 MG, A-375, SK-MEL-28, HEK293T were maintained in DMEM containing 4.5 g/l glucose and L-glutamine (Corning, #10-013-CMR). HCC1143 and HCC1937 were cultured in RPMI 1640 with L-glutamine (Gibco, #21875034). All media were supplemented with 10% fetal bovine serum (FBS, Gemini Bio Products), and all cell lines were grown at 37 °C with 5% CO2. All cell lines were tested for mycoplasma.

MCF10A isogenic cell lines were stably generated in previous study<sup>40</sup>. All MCF10A cell lines were grown in DMEM/F12 (Gibco, #11330057), containing 5% horse serum (Gibco, #16050122), 20ng/ml EGF (Gibco, #PHG0311), 0.5µg/ml hydrocortisone (SIGMA-ALDRICH, #H0888), 100ng/ml cholera toxin (SIGMA-ALDRICH, #C8052), 10µg/ml insulin (SIGMA-ALDRICH, #I1882)<sup>57</sup>. To directly compare the impact of LRP8KO on GPX4 levels in HCC1143 and MCF10A, cells were cultured in Human Plasma-Like Medium (HPLM, Gibco, #A4899101).

HCC1143 SEPHS2KO, SEPSECSKO and double KO with LRP8 were maintained in RPMI 1640 containing 2  $\mu$ M Fer1 until the time of the experiments. At that time, Fer1 was removed, and the experiments were performed within 24hr.

#### Generation of CRISPR-Cas9 genome-edited cell lines

For the CRISPR–Cas9 synthetic lethal screen, U-2 OS Tet-On and MDA-MB-453 lines stably expressing Cas9 were generated by infection with lentiCas9-Blast, a gift from F. Zhang (Addgene plasmid no. 52962) and cells were selected in medium containing 10µg/ml blasticidin (Gibco, # A1113903). Active Cas9 expression was validated by flow cytometry analysis following infection with a self-cutting mCherry plasmid (a gift from M. Bassik, Stanford University), which expresses mCherry and a sgRNA targeting the mCherry gene.

LRP8KO lines in MDA-MB-453, HCC1143, HCC1937, U-87 MG, A-375, SK-MEL-28 were generated by infection with plentiCas9-Blast and pMCB320 plasmid (gift from M. Bassik, Stanford University) encoding LRP8-targeting sgRNAs. Cells were selected in media containing 10  $\mu$ g/ml blasticidin and 1  $\mu$ g/ml puromycin. Single clones of LRP8KO from MDA-MB-453, HCC1143, and HCC1937 were isolated using cloning rings or serial dilution. LRP8KO line in MCF10A was generated by infection with plentiCRISPRv2-Cas9-Blast, a gift from Brett Stringer (Addgene plasmid no. 98291) encoding LRP8-targeting sgRNA. Cells were selected and maintained in media containing 20ug/mL blasticidin.

#### **Plasmids and siRNA**

Two CRISPR single guide RNA (sgRNA) sequences targeting LRP8 and one targeting SEPHS2 were selected based on the effective score from

the whole human CRISPR knockout library used for genetic screening. The oligonucleotide sequences preceding the protospacer motif were: sgLRP8-1, 5'GCCGGCCAAGGATTGCGAAA3'; sgLRP8-2, 5' GCTTAGACCACAGCGACG3'; sgSEHPS2, 5' GGTGTTAACCAAACCGTT3'. One other sgRNA sequence targeting LRP8 and sgRNAs targeting SEPSECS, LDLR, VLDLR and LRP2 were picked from pre-designed sequences by Integrated DNA Technologies (IDT): sgLRP8-3,5' GCCACTGCATCCACGAACGG3'; sgSEPSECS,5' GCTCGCATGAGCACCTCATA'; sgLDLR,5' GACGAGTTTCGCTGCCACGA3'; sgVLDLR,5' GTCAGGTCGGCAAGTTCGAG3'; sgLRP1-1, 5' ATGCCAACGAGACCGTATGC 3'; sgLRP1-2, 5' ATTGTGTCCCCACACTCGAT 3'; sgLRP2-1,5' CATACGGCGTCTCATGGCAC3'; sgLRP2-2,5' AGTGAACTGGTAACCACCGC3'; sgSELENOP-1,5'GATCCAATGCTAAACTCCAA3'; sgSELENOP-2, 5'ACGTGTATCTTTGGCTACTG 3'. All guide sequences were inserted into pMCB320 between BstX1 and BlpI.

Wildtype full-length LRP8 was cloned from a MDA-MB-453 complementary DNA (cDNA) library and inserted into pLenti-CMV-GFP-Hygro (Addgene #17446) between XbaI and BamHI. The PAM sequence for LRP8 guide 3 was then mutated without changing the encoded amino acids. LRP8 LDLa( 46-334), LRP8 LDL $\beta$ ( 462-681), LRP8ICD( 2-847) were sub-cloned from LRP8-GFP containing the PAM mutation.

Full-length cytoGPX4 and mitoGPX4 containing the SECIS element were synthesized using a gBlock, a synthesized double-stranded DNA fragment from IDT and inserted into pENTR1A-GFP-N2 (Addgene # 19364) between EcoRI and NotI, and GFP was removed. Both were subsequently cloned into pLenti-CMV-Hygro-DEST (Addgene # 17454) by gateway cloning. To make cytoGPX4 SECIS-GFP and mitoGPX4 SECIS-GFP, cytoGPX4 and mitoGPX4 were cloned from a MDA-MB-453 complementary DNA (cDNA) library and inserted into pENTR1A-GFP-N2 between EcoRI and KpnI, and then cloned into pLenti-CMV-Hygro-DEST. cytoGPX4U46C-GFP and cytoGPX4U46S-GFP were generated by site-directed mutagenesis from cytoGPX4 SECIS-GFP. GPX1 containing the SECIS element was synthesized as a gBlock from IDT, inserted into pENTR1A-GFP-N2 between the KpnI and NotI sites, and gateway cloned into pLenti-CMV-Hygro-DEST.

Full-length V5-cytoGPX4-Stag-GPX4SECIS was directly synthesized using a gBlock and inserted into pENTR1A-GFP-N2 between EcoRI and NotI. To make SEICS swap mutants, SECIS from GPX1, SEPHS2, SELENOK, SELENOS, SELENOW, SELENOF and TXRND2, the first SECIS from SELENOP were directly synthesized using a gBlock and insert into pENTR1A-V5-cytoGPX4-Stag-GPX4SECIS between ApeI and Not I. All entry plasmids were subsequently cloned into pLenti-CMV-Hygro-DEST by gateway cloning. For GFP tagged SECIS swap mutants, full-length GPX4 cotaining the SECIS element was amplified from pENTR1A-V5-cytoGPX4-Stag-GPX4SECIS and inserted into pENTR4-GFP-C3 (Addgene # 17397) between XhoI and EcoR I. The SECIS elements from aforementioned genes were subsequently inserted into this new backbone between ApeI and EcoRI, and gateway cloned into pLenti-CMV-Hygro-DEST.

The siRNA oligos smart pool targeting GPX4, LRP8, and ZNF598 as well as non-targeting control(siNT) were purchased from Horizon Discovery, and cells were transfected with the RNAiMAX reagent (Invitrogen).

#### Chemicals and reagents

1S,3R-RSL3 (referred to as RSL3) (#19288), Ferrostatin-1 (#17729), idebenone (#15475), Deferoxamine (DFO, #14595), Erastin2 (#27087), ML162 (#20455), ZVAD(OMe)-FMK (#27421), Necrostatin-1 (#11658), IKE (Imidazole Ketone Erastin, #27088), Tocopherol (#25985) Auranofin(#15316), Sulfasalazine(#15025) were all purchased from Cayman Chemical. Etoposide (#E1383), chloroquine (#C6628), and sodium selenite (#S5261), were all purchased from Sigma-Aldrich. Blasticidin S HCl (A1113903), Puromycin (A1113803), Hygromycin B (#10687010), SYTOX Green Dead Cell Stain (#34860), and MitoTracker Deep Red FM (M22426) were all purchased from Thermo Fisher Scientific.

#### Cell viability and death analysis

For cell death analysis using the Essen IncuCyte Live-Cell imaging system (Sartorius), cells were plated at a density of 5,000 cells per well in black 96-well plates (Corning, #3904) the day before imaging. The next day, the media were replaced with fresh media containing 30 nM SYTOX Green Dead Cell Stain (Invitrogen, #S34860) and compounds at different doses. The plates were transferred to an IncuCyte Zoom or S3 Live-Cell imaging system enclosed in an incubator set to 37 °C and 5% CO2. Three images per well were captured in the green and red channels every 1 or 2 hr over a 24 hr period, and the ratio of SYTOX Green-positive objects (dead cells) to mCherry positive objects (live cells) was quantified using the Sartorius IncuCyte 2020A. For each treatment condition, the SYTOX-to-total (SYTOX+mCherry)-object ratio was plotted against the 24 h imaging interval, the AUC (Area under the curve) was calculated, and the average AUC was plotted as a function of drug concentration (for example, RSL3) using Prism (GraphPad).

For cell viability analysis, the CellTiter-Glo assay was performed according to the manufacturer's instructions. Briefly, 5,000 cells were seeded in each well of a white 96-well plate (Corning, #3917) the day before compound treatments. The next day, media was replaced with 100  $\mu$ L fresh medium containing compounds at a different dose. Plates were incubated at 37 °C for 24 hr and then at room temperature for 30 min. 100  $\mu$ L CellTiter-Glo 2.0 reagent (Promega, #G9242) was mixed with the media. The plates were incubated at room temperature for 10 mins, and the luminescent signal was recorded with a SpectraMax i3 (Molecular Devices).

#### Western blotting

Cells were washed twice with phosphate-buffered saline (PBS), lysed in RIPA buffer supplemented with 1x Pierce EDTA-free Protease Inhibitor Cocktail (Thermo Scientific #A32963), and sonicated for 15 sec. The cell lysate was then centrifuged for 10 min at 15,000*g* to remove any cell debris. Protein concentrations were determined using the bicinchoninic acid (BCA) protein assay (Thermo Fisher Scientific), and equal amounts of protein by weight were combined with Laemmli buffer, boiled for 5 min at 95 °C, separated on 4–20% polyacrylamide gradient gels (Bio-Rad Laboratories), and transferred

onto nitrocellulose membranes (Bio-Rad Laboratories). Membranes were blocked in PBScontaining 0.1% Tween 20 (PBST) containing 5% (w/v) dried milk for 60 min. Membranes were incubated overnight at 4 °C in PBST containing 3% bovine serum albumin (BSA) (Sigma Aldrich) and primary antibodies. After 3 washes with PBST, membranes were incubated at room temperature for 60 min in 3% BSA in PBST containing fluorescent secondary antibodies, followed by 3 more washes with PBST. Immunoblots were then imaged on an LI-COR imager (LI-COR Biosciences).

The following blotting reagents and antibodies were used: GPX4 (Abcam, #ab125066,1:2000), GPX4 (Invitrogen, #LF-MA0085), GPX1 (Abcam, #ab22604), SEPHS2 (Sigma-Aldrich, #SAB2700271), SELENOH (Sigma-Aldrich, #HPA048362), SELENOF (Sigma-Aldrich, #HPA054937), SELENOS (Sigma-Aldrich, #HPA010025), SELENOT (Sigma-Aldrich, #HPA039780), SELENOK (Sigma-Aldrich, #HPA008196), MSRB1 (Proteintech, #15333-1-AP), SELENOI (Novus Biologicals, #H00085465-A01), SELENOO (Abcam, # ab172957), SELENOM (Santa Cruz, #sc-514952), SELENON (Santa Cruz, #sc-365824), SELENOW (Rockland,# 600-401-A29S), TXNRD1 (Santa Cruz, #sc-28321), TXNRD2 (Proteintech, #16360-1-AP), TXNRD3 (Proteintech, #19517-1-AP), DIO2 (Proteintech, #26513-1-AP), LRP8 (Abcam, #ab108208), LRP1 (Life Technologies, #A531959), ACTB (Santa Cruz, #sc-47778,1:2000), a-Tubulin (Cell Signaling, #2144,1:2000), FSP1 (Santa Cruz, #sc-377120), SLC7A11 (Cell signaling, #12691), ACSL3/ACSL4 (Sigma-Aldrich, #SAB2701949), GFP (Santa Cruz, #sc-9996, 1:2000), EEFSEC (Santa Cruz, #sc-365707), SECISBP2(Proteintech, #12798-1-AP), ZNF598(Sigma-Aldrich, #HPA041760) IRDye800 conjugated secondary (LI-COR Biosciences, #926-32211, 1:20000) and anti-mouse Alexa Fluor 680 conjugated secondary (Invitrogen, #A21058, 1:30000). All primary antibodies were diluted in 1:1000 unless stated otherwise.

#### Fluorescence microscopy

Cells were washed 3x with Dulbecco's phosphate-buffered saline (DPBS), fixed for 20 min in DPBS containing 4% (w/v) paraformaldehyde, and washed 3x again with DPBS. Cells were permeabilized for 2 min with DPBS containing 0.2% Triton X-100, washed 3x with DPBS, and incubated in blocking solution (1% BSA, 0.3M glycine in DPBS) for 30 min. Cells were incubated with anti-GPX4 antibody in blocking solution (1:100 dilution) overnight at 4 °C, washed 3x, and incubated for 1 h at room temperature in blocking solution (Thermo Fisher Scientific). After an additional 3x washes, coverslips were mounted on glass slides using Permount mounting medium (Fisher Chemical). Images were acquired using an epifluorescence microscope (Axio Observer 7, Carl Zeiss) fitted with a 63x plan-Apochromat oil objective [Numerical Aperture (NA),1.4]. Digital images were captured with cameras (Axiocam 712 mono, Zeiss) using Zeiss Zen 3.2 software.

#### CRISPR-Cas9 synthetic lethal screen

The CRISPR–Cas9 screen was performed as previously described<sup>4</sup>. The genome-wide human CRISPR sgRNA knockout library contains 9 sublibraries, comprising in total 225,171 elements—including 212,821 sgRNAs targeting 20,549 genes (about 10 sgRNAs

per gene) and 12,350 negative-control sgRNAs. To generate lentiviral particles, each sublibrary was co-transfected with third-generation lentiviral packaging plasmids (pVSVG, pRSV and pMDL) into HEK293T cells. Media containing lentivirus was collected 48 and 72 h after transfection, combined, filtered, and then used to infect approximately  $2.0 \times 10^8$ U-2 OS Tet-On cells or MDA-MB-453 cells stably expressing Cas9. After 72 hr of growth, infected cells were selected in media containing 1 µg/ml puromycin until over 90% cells were mCherry-positive. Cells were then re-seeded in 500-cm<sup>2</sup> plates (about  $8 \times 10^6$  cells per plate) and recovered in media lacking puromycin for 24 h. For the screen, a total of about  $2.5 \times 10^8$  cells (~1,000-fold library coverage) were treated with either DMSO or 0.5  $\mu$ M RSL3 for 10 days. Cells were then trypsinized, collected by centrifugation at 1,000g, washed twice with PBS, and pellets were frozen at -80 °C. Genomic DNA was extracted using the QIAamp DNA Blood Maxi Kit (QIAGEN) according to the manufacturer's instructions. sgRNA sequence libraries were prepared from genomic DNA by two rounds of PCR using the Herculase II Fusion DNA Polymerase (Agilent). sgRNA sequences were amplified by the primers oMCB1562 and oMCB1563 and then indexed using the Illumina TruSeq LT adaptor sequences (AD002, AD004, AD006, AD009, AD0012, AD0014, AD0016, AD0019, AD0022 for DMSO and AD003, AD005, AD007, AD010, AD0013, AD0015, AD0018, AD0021, AD0025 for RSL3), for downstream deep sequencing analysis. PCR products were separated on a 2% tris-borate-EDTA (TBE)-agarose gel, purified using the QIAquick Gel Extraction Kit (Qiagen) and assessed for quality using a Fragment Analyzer (Agilent). PCR amplicons from each sample were pooled in a 1:1 ratio (DMSO: RSL3) based on their concentrations as determined by Qubit Fluorometric Quantification. Then each sample-pair was pooled together in a ratio based on the number of elements in each sublibrary. sgRNA sequences were analyzed by deep sequencing using the primer oMCB1672 on an Illumina NextSeq instrument at the Oklahoma Medical Research Foundation. Sequence reads were aligned to the sgRNA reference library using Bowtie software. For each gene, a gene effect and score (likely maximum effect size and score), and p-value were calculated using the casTLE statistical framework as previously described<sup>58,59</sup>.

#### Competitive growth assay

 $5 \times 10^4$  WT (no mCherry tag) and sgLRP8 (with mCherry tag) cells were mixed together and seeded in wells of a 6-well plate. 48 hr after the seeding, cells were treated with various compounds and cultured at 37 °C for another 48 hr. Live cells were then collected and analyzed by flow cytometry on a BD LSRFortessa running BD FACSDiva to measure the ratio of mCherry negative to mCherry positive cells. Data were analyzed using FlowJo.

#### BODIPY 581/591 C11 analysis

Cells seeded in a 6-well plate were treated with 200nM RSL3 for 5 hr and washed once with DPBS containing calcium and magnesium. Cells then were incubated in DPBS containing  $5\mu$ M BODIPY 581/591 C11 (Invitrogen, #D3861) at 37 °C for 10 min and washed 3x with DPBS without calcium or magnesium. Cells were detached from the plate with trypsin, and green fluorescence was analyzed by flow cytometry (>10000 cells) on a BD LSRFortessa. Data were analyzed using FlowJo.

#### Selenium measurement by ICP-MS

Inductively coupled plasma mass spectrometry (ICP-MS) measurements were performed at the OHSU Elemental Analysis Core. Cells were harvested directly into 15 ml metal-free centrifuge tubes (VWR, #89049-170). An aliquot was removed for cell counting, and then media was removed (as much as possible). For digestion, 100 µl of concentrated HNO<sub>3</sub> (trace metal grade, Fisher # 7697-37-2) was added to each cell pellet (containing approximately  $10^6$  cells), the tubes were loosely capped, and the samples were heated for 1-2 hrs at 90°C on a heating block.  $1500 - 2000 \,\mu$ l of 1% HNO<sub>3</sub> was added to each sample after digestion. The following digestion and background controls were prepared (each in triplicate): (1) NIST bovine liver standard (SRM 1577c): ~10 mg (weighed on a precision balance (+/-0.1 mg)) was added to 200 µl of 50% HNO<sub>3</sub> (prepared from trace metal grade HNO<sub>3</sub>) and heated for 2 hrs at 90°C in a loosely capped 15 ml centrifuge tube (metal free, VWR, #490001), (2) Solution standard: 2 µl of calibration standard #2 ("CEM2", LGC Standards #VHG-SM70B-100) was added to 200 µl of 50% HNO<sub>3</sub> and heated for 2 hrs at 90°C in a loosely capped 15ml centrifuge tube (VWR, #490001), (3) Blank: 200 µl of 50% HNO<sub>3</sub> (prepared from trace metal grade HNO<sub>3</sub>) was added to an empty tube and heated for 2 hr at 90°C in a loosely capped 15ml centrifuge tube (VWR, #490001).

ICP-MS analysis was performed using an Agilent 7700x equipped with an ASX 500 autosampler. The system was operated at a radio frequency power of 1550 W, an argon plasma gas flow rate of 15 L/min, and an Ar carrier gas flow rate of 0.9 L/min. Elements were measured in either kinetic energy discrimination (KED) mode using He gas (4.3 ml/min) (Mn, Fe, Cu, Zn) or in mass-on-mass (hydrogen) mode using H<sub>2</sub> gas (3.4 ml/min) (Se). Data were quantified using weighed, serial dilutions of a multi-element standard ("CEM 2", (VHG-SM70B-100) Mn, Fe, Cu, Zn) and a single element standard for Se (VHG LSEN-100). Data were acquired in triplicate and averaged. A coefficient of variance (CoV) was determined from frequent measurements of a sample containing ~10 ppb of Mn, Fe, Cu, and Zn and ~1 ppb of Se. An internal standard (Sc, Ge, Bi) continuously introduced with the sample was used to correct for detector fluctuations and to monitor plasma stability. The accuracy of the calibration curve was assessed by measuring NIST reference material (water, SRM 1643f) and found to be within 96% – 105% for all elements.

#### **Glutathione measurements**

The day before the experiment,  $2.5 \times 10^5$  control, LRP8KO1, or LRP8KO2 HCC1143 cells per well were seeded in duplicate into a 6-well plate (Corning, #07-200-83). The following day, cells were harvested by scraping (2 wells/genotype were combined) and prepared for measurement of total intracellular glutathione (GSH+GSSG) using a glutathione assay kit based on Ellman's reagent (DTNB, 5,5'-dithio-bis-2-nitrobenzoic acid) according to the manufacturer's protocol (Cayman Chemical, t#703002). Data are presented as DNTB fluorescence normalized to total protein. Three independent biological replicates were analyzed for each genotype.

#### **RNA-seq and RT-qPCR**

Control and two LRP8KO HCC1143 cell lines were incubated in regular medium or medium containing 200nM Se for 48 hr. Total RNA was extracted using the Monarch Total RNA

Miniprep Kit (New England Biolabs, NEB, #T2010S). RNA-seq libraries were constructed using the Swift Rapid Library Prep Kit (Swift Bio #R2096) with NEBNext Poly(A) mRNA Magnetic Isolation Module (NEB #E7490L) according to the manufacturer's instructions. Samples were sequenced on an Illumina NovaSeq 6000 with PE150 reads. Differential gene expression was analyzed using DESeq2<sup>60</sup>.

The same sets of RNA samples were reverse transcribed using Protoscript II First Strand cDNA Synthesis Kit (NEB #E6560S). cDNA was measured using a QuantStudio 7 Flex Real-time PCR machine (Applied Biosystems) with Power SYBR green PCR master mix (Thermo Fisher Scientific, #4368577). Fold change in mRNA levels were determined using the 2-delta cycle threshold method, normalized to actin (ACTB) mRNA. IDT predesigned PrimeTime primer pairs were purchased, and sequences are as follows: GPX4\_1, 5'-GCTGTGGAAGTGGATGAAGA-3'; GPX4\_2, 5'-CAGCCGTTCTTGTCGATGA-3'; ACTB\_1, 5'-ACAGAGCCTCGCCTTTG-3'; ACTB\_2, 5'-CCTTGCACATGCCGGAG-3'. V5-GPX4, 5'- CTAACCCTCTCCTCGGTCTC-3';

#### **Ribosome profiling**

Cells were washed once in ice-cold PBS and lysed without cycloheximide in ribosome buffer (20 mM Tris•Cl pH 7.4, 150 mM NaCl, 5 mM MgCl2, 1 mM DTT) with 1% v/v Triton X-100 and 25 U / ml Turbo DNase I [McGlincy et al 2017]. RNA content of cell lysates was quantified using Quant-iT RiboGreen RNA assay kit. Ribosome footprints were generated using Nuclease P1 [NEB M0660S], following a protocol to be described elsewhere (Ferguson L et al., unpublished). 300 µL of lysate was adjusted to pH 6.5 with the addition of 21 µL of 300 mM Bis-Tris. Ribosome footprinting was carried out by adding 900 U Nuclease P1 per 30 µg of total RNA, and nuclease treatment proceeded for 1 hr at 37 °C as described in Ferguson L et al. (unpublished). Nuclease-treated lysates were overlayed on 1M sucrose cushions and ribosomes were sedimented by centrifugation in a TLA-110 rotor at 100,000 RPM for 1 hr. RNA was harvested from the ribosomal pellet using a DirectZol RNA Purification Kit according to the manufacturer's instructions. Footprints were separated by denaturing electrophoresis in a 15% polyacrylamide gel containing 7 M and 0.6 X TBE. Gel slices containing RNA between 30 and 40 nt were excised and the RNA was eluted overnight at room temperature in elution buffer (300 mM NaCl, 10 mM Tris pH 8, 1 mM EDTA, 0.25% v/v SDS) and precipitated by addition of 3 volumes of ethanol followed by 3 hr -80 °C incubation. RPFs were pelleted by a 30 min 20,000 x g centrifugation at 4 °C. The RPF pellet was washed with 70% ethanol once before being resuspended in 10 mM Tris pH 8 and quantifed by NanoDrop.

Sequencing libraries were constructed using the Ordered Two-Template Relay approach for small RNA library construction<sup>61</sup> in a protocol to be described elsewhere (Ferguson et al., unpublished). 30 to 40 ng of RPFs were used for Ordered Two-Template Relay ribosome profiling (OTTR-RP). The cDNA product from OTTR-RP was quantified by qPCR [McGlincy et al 2017], and deep sequencing libraries were prepared by amplification of cDNA with unique i5 and i7 TruSeq primers in 12 cycles of PCR. Libraries were sequenced on a NovaSeq S4 with 150 base paired-end sequencing, and only the R1 reads were used for analysis. Adapters were trimmed using Cutadapt v3.2<sup>62</sup>.

Human rRNA reads were removed by mapping to several human rRNA sequences and loci (U13369.1, NR\_145819.1, NR\_146144.1, NR\_146151.1, NR\_146117.1, X12811.1, ENST00000389680.2, ENST00000387347.2, NR\_003287.4, NR\_023379.1, NR\_003285.3, NR\_003286.4) by Bowtie v1.0.0<sup>63</sup> allowing for up to three mismatches. Human tRNA reads were removed by tRAX v1.0<sup>64</sup>. Reads that did not align to rRNA or tRNA references were then aligned with Bowtie by mapping to the GENCODE v37 protein coding transcripts, and both gene-level quantification and multi-mapping read handling were performed by RSEM v1.1<sup>65</sup>. Up to two mismatches were allowed while mapping RPFs to protein coding transcripts, and protein coding gene quantification was restricted to those reads which aligned to the 15<sup>th</sup> to the  $-10^{th}$  codon of the coding sequence, and any read with more than 250 alignments were ignored.

#### Pause detection and translation efficiency measurements

Pause detection and coverage was performed on reads which aligned to the NCBI RefSeq isoform for each selenoprotein transcript. The 5' positions of alignments were used to determine the start of the A-site codon by adding 15 to frame-0 alignments, 16 to frame-2 alignments, or 17 to frame-1 alignments. Collapsed codon counts for a gene were rescaled by dividing each codon by the average codon counts, and the replicates were collapsed by averaging the rescaled codon density for each codon. For each selenoprotein, the upstream density was taken by summing the densities from the start codon to the SEC UGA codon, and the downstream density was taken by summing the densities from the codon after the SEC UGA to the stop codon. Upstream and downstream densities were rescaled by the length of the respective regions. Translation efficiency estimates were made by DESeq2 following the deltaTE approach using ribosome profiling and aforementioned RNA-seq gene-level counts made by RSEM<sup>66</sup>. RNA-seq reads were requantified using the same procedure for ribosome profiling prior to translation efficiency estimates.

#### Spheroid culture

2500 cells in 100  $\mu$ L RPMI media supplemented with complete serum were seeded in 96-well Black/Clear Round Bottom Ultra-Low Attachment Spheroid Microplates (Corning, #4515). Cells were incubated at 37 °C for 30 min, followed by the addition of 100  $\mu$ L RPMI media containing 2% Matrigel (Corning, #354234). Plates were centrifuged at 750g for 15 min and grown at 37 °C for 2 days. For IKE treatment, 100  $\mu$ L RPMI media was slowly removed without disturbing the spheroid. Another 100  $\mu$ L RPMI media containing 1% Matrigel, 18  $\mu$ M IKE, and 60 nM SYTOX Green dye was added back into each well. Spheroids were imaged in the IncuCyte S3 with a 10x objective.

#### **BONCAT** for analysis of GPX4 translation

Cells were grown in 15-cm dishes until 70% confluency. RPMI media was replaced with methionine-free RPMI (Gibco, #A1451701) and cells were cultured for 1 hr to remove existing methionine. 25  $\mu$ M Click-I AHA (L-Azidohomoalanine, Thermo Fisher, #C10102) was added to the media, cells were incubated at 37 °C for 2 hr, and cells subsequently washed 3x with cold PBS. Cells were lysed with RIPA buffer and sonication. Protein was quantified using the BSA assay, equal protein amounts were collected across the samples and subjected to 25  $\mu$ M DBCO-PEG4-biotin (Sigma-Aldrich, #760749) at room temperature

for 30 min. Acetone precipitation was performed to remove any excess DBCO-biotin in the sample. The protein pellet was then resuspended in 2% SDS and diluted with RIPA buffer. Meanwhile, 25 µL per sample of NeutrAvidin Agarose resin (Pierce, # 29201) were washed 3x in RIPA buffer and distributed to the lysates. Resin and lysates were incubated at 4 °C overnight. The beads were washed 4x with RIPA containing 400mM NaCl and were boiled in RIPA (with 1x Laemmli buffer and 25mM Biotin) for 5 min at 95 °C. One third of the lysates were separated on 4–20% polyacrylamide gradient gels for western blot analysis. The remaining two thirds of cell lysates were separated on another gradient gel, and 10–25 kDa regions were cut, extracted, and processed for MS analysis. Briefly, gel bands were destained with 10 gel volumes of 50 mM ammonium bicarbonate (ABC) pH 8.0 and 50% acetonitrile (ACN) with agitation for 45 min. The solution was removed and replaced with 100% ACN to ensure complete gel dehydration. Modified sequencing grade trypsin (Promega #PRV5111) was diluted to 50 ng/uL using 50 mM ABC and added to gel pieces at approximately equivalent gel volumes and incubated on ice for 1 hr. Another 1x gel volume of trypsin was then added to samples and digested overnight at 37 °C. Digests were quenched with 50% acetonitrile, 5% trifluoroacetic acid, and vortexed. Digested peptides were transferred into fresh Eppendorf tubes, two additional extraction steps were performed, and peptides were combined and then dried to completion in a speed vac. Peptides were resuspended in 1% formic acid and separated on an Easy nLC 1000 UHPLC equipped with a 15 cm nanoLC column. Using a flow rate of 300 nL/min, the linear gradient was 5% to 35% over B for 90 min, 35% to 95% over B for 5 min, and 95% hold over B for 15 min (solvent A: 0.1% formic acid (FA) in water, solvent B: 0.1% FA in ACN). Peptide identities and relative abundances were determined using Proteome Discoverer 2.4. Ion chromatograms were extracted using Xcalibur Qual Browser for each peptide of interest with a mass tolerance of 0.2 Da. Results were normalized against the average control value and are represented as average  $\pm$  SD of three replicates.

#### Statistical analysis and reproducibility

All figures, including Western blots, dose-response curves, and panels are representative of at least three biological replicates unless stated otherwise. Western blots in Fig, 4c; Extended Data Figures 8a, 9a were performed once. Western blots in Fig 1b, 2b, 3a–b; Extended Data Figures 3k, 4a, 6b, 8d–g, 9f,10a–b are representative of two biological replicates. *P*-values for pairwise comparisons were calculated using the two-tailed t-test. For comparison across multiple experimental groups, *p*- values were calculated using one-way ANOVA or two-way ANOVA.

#### **Extended Data**



#### Extended Data Fig. 1: Cell-specific role for FSP1 in ferroptosis.

**a-b**, Summary of FSP1 gene expression and ML162 (**a**) and ML210 (**b**) sensitivity in various cancer cells. Data were mined from the CTRP database. **c**, Schematics of CRISPR-Cas9 screen strategy. **d**, Dose response of RSL3-induced cell death of control and FSP1KO in U-2 OS and MDA-MB-453. Shading indicates 95% confidence intervals for the fitted curve, and each data point is the average of three replicates. **e**, Gene effects and gene scores calculated for individual genes analyzed in the genome-wide CRISPR screen of U-2 OS cells. **f**, Histogram of FSP1 from casTLE analysis showing the negative enrichment of FSP1 compared to controls. **g**, Schematic of cell competitive growth assay. **h-j**, Quantification of the ratio between mCherry+ : mCherry– cells after the indicated treatment. Data represent mean  $\pm$  S.E.M. of three biological replicates, which were compared using a two-tailed, unpaired t-test. \*\*\*\*P < 0.0001, \*\*\*P < 0.001, \*\*P < 0.01, \*P < 0.05.

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Extended Data Fig. 2: Analysis of LRP8 in cancers.

**a**, Relative expression of LRP8 in normal tissue and tumors from various primary sites. Plotted data were mined from the TCGA database. LRP8 is highly expressed in tumors across many cancer types. n=BRCA: N(112), T(1093); BLCA: N(19), T(408); CESC: N(3), T(304); CHOL: N(9), T(36); COAD: N(41), T(458); COADREAD :N(51), T(623); ESCA:N(11), T(184); HNSC: N(44), T(520); LICH: N(50), T(371); LUAD: N(59), T(515); LUCS: N(51), T(501); PAAD: N(4), T(178); PCPG: N(3), T(179); READ: N(10), T(166); SARC: N(2), T(259); STAD: N(35), T(415); STES: N(46), T(599); UCEC: N(35), T(545). **b**, Relative expression of LRP8 in various subtypes of breast cancer, n= Normal(473), LA(379), LB(244), HER2+(230), TNBC(251). **c**, Relative expression of LRP8 in breast cancer of different grades. n= I(7), II(58), III(46). The box and whiskers plot in **a-c** were generated by Tukey method. **d**, Kaplan-Meier survival curve showing that patients with higher expression of LRP8 have poorer survival rate. Plotted data were mined from the TCGA database.



Extended Data Fig. 3: Analysis of LRP8 as a ferroptosis resistance factor.

**a**, Western blot to validate LRP8KO in MDA-MB-453 cells. Two single-clonal LRP8KO lines generated from different sgRNAs were selected and compared with parental cells stably expressing Cas9. **b**, Western blot to validate LRP8KO in HCC1937 cells. Two single-clonal LRP8KO lines generated from the same sgRNA were selected and compared with control cells expressing sgSAFE. **c**, Dose response of RSL3-induced cell death of control and LRP8KO MDA-MB-453 cells. **d**, Dose response of RSL3-induced cell death of control and LRP8KO HCC1937 cells. **e**, Dose response of RSL3-induced cell death of control and LRP8KO HCC1143 cells by cell-titer glow assay. **f**, Dose response of erastin2-induced cell death of control and LRP8KO cells treated with 3  $\mu$ M auranofin alone or in the presence of 2  $\mu$ M Fer1 over 43hr. **h**, Time-lapse cell death analysis of control and LRP8KO cells treated with 500  $\mu$ M sulfasalazine alone or in the presence of 2  $\mu$ M Fer1 over 48hr. **i**, Dose response of RSL3-

induced cell death in control, LRP8KO, and LRP8KO expressing LRP8-GFP by cell titer glow assay. **j**, Dose response of IKE-induced cell death of control, LRP8KO, and LRP8KO expressing LRP8-GFP. **k**, Validation of LRP8 overexpression in LRP8KO MDA-MB-453 cells. **l**, Cell viability of MDA-MB-453 control and LRP8KO cells stably expressing GFP or LRP8-GFP subjected to 100 nM RSL3 for 24 hr. **l**, Validation of LRP8 overexpression in LRP8KO MDA-MB-453 cells. **m**, Live-cell imaging of control and LRP8KO cells incubated with SYTOX Green and treated with 100 nM RSL3 alone or co-treated with 2  $\mu$ M Fer1. Scale Bar, 100  $\mu$ m. **n**, Cell viability of control and LRP8KO cells following treatment with RSL3, etoposide, and H<sub>2</sub>O<sub>2</sub> for 24 hr (RSL3, 200 nM; etoposide, 100  $\mu$ M; H<sub>2</sub>O<sub>2</sub>, 30  $\mu$ M). In **c**,**d**,**e**,**f**, and **i**,**j** shading indicates 95% confidence intervals for the fitted curve and each data point is the average of three biological replicates. Data in **g** and **h** represent mean ± S.E.M. of three biological replicates. Data in **l** and **n** represent mean ± S.E.M. of three biological replicates by two-tailed, unpaired t-test. \*\*\*\*P<0.0001, \*\*\*P<0.001, \*P<0.05.



**Extended Data Fig. 4: LRP8 promotes ferroptosis resistance in multiple cancer cell lines. a**, Validation of LRP8KO in multiple cancer cell lines. Westen blot of pools of LRP8KO cells generated from two different sgRNAs and control Cas9-expressing cells. **b-d**, Time-lapse cell death analysis of U87-MG (**b**), A375 (**c**), and SK-MEL28 (**d**) cells treated with RSL3 over 24 hr or 72 hr. Data represent mean ± S.E.M. of three replicates.



**Extended Data Fig. 5: Role of selenium metabolism and lipoprotein receptors in ferroptosis. a**, Overview of genome-wide gene coessentiality, highlighting LRP8 in a selenocysteine metabolism cluster. **b**, Schematic of selenocysteine synthesis. **c**, Time-lapse cell death analysis of control and CRISPR KO of genes from the selenoprotein synthesis pathway [SEPHS2 (left), SPESECS (mid), PSTK (right)]. Cells were treated with 100 nM RSL3 for 24 hr (n = 1). **d**, Quantification of the percentage of SYTOX green positive cells (dead cells) of control and single or double KO of indicated genes related to selenocysteine metabolism. **e**, Time-lapse cell death analysis of control and CRISPR knockout of genes from lipoprotein receptor superfamily [LDLR (left), VLDLR (mid), LRP2 (right)]. Cells were treated with 100 nM RSL3 for 24 hr (Data represent mean  $\pm$  S.E.M. of four independent experiments). **f**, Quantification of the percentage of SYTOX green positive cells (dead cells) of control and single or double KO of selection (dead cells).





#### Extended Data Fig. 6: Role of LRP1 and SELENOP in ferroptosis.

a, Histograms of LRP1 results from casTLE analysis, including the average for the entire population (red line) and for the LRP1 sgRNAs (blue line). b, Representative immunoblotting of GPX4 in HCC1143 control and LRP1KO cells. c, Dose response of RSL3-induced cell death of HCC1143 control, LRP8KO, LRP1KO and LRP1/LRP8 double KO cells. d, Time-lapse cell death analysis of HCC1143 control, LRP8KO, LRP1KO and LRP1/LRP8 duoble KO cells. Cells were treated with 111 nM RSL3 for 24 hr. e, Ouantification of the percentage of SYTOX green positive cells (dead cells) of control and single or double KO of indicated genes after 111 nM RSL3 for 24 hr. f, Histograms of SELENOP results from casTLE analysis, including the average for the entire population (red line) and for the SELENOP sgRNAs (blue line). g, Dose response of RSL3-induced cell death of HCC1143 control and single or double KO cells of indicated genes. h, Dose response of RSL3-induced cell death of HCC1143 control and LRP8KO cells subjected to non-targeting or SELENOP siRNA. In c,g-h, Shading indicates 95% confidence intervals for the fitted curves and each data point is the average of three biological replicates. All data represent mean  $\pm$  S.E.M. of three biological replicates. Data in e represent mean  $\pm$  S.E.M. of three biological replicates by one-way ANOVA. \*\*\*\*P < 0.0001, \*P < 0.05.



#### Extended Data Fig. 7: Measurement of metals in LRP8 knockout cells.

**a-d**, Total levels of iron (**a**), copper (**b**), manganese (**c**), and zinc (**d**) in control and LRP8KO cells alone or the presence of 200 nM Se by ICP-MS. **e**, Measure of the glutathione level (DNTB) in HCC1143 control and LRP8KO cells. **f**, Quantification of SYTOX green positive cells in KO cells of indicated genes subjected to 3  $\mu$ M erastin2. **g**) Immunoblot showing the expression of GFP tagged LRP8 wildtype or truncation mutants in LRP8KO HCC1143 cells. **h**, Cell viability of control cells or LRP8KO cells stably expressing indicated LRP8 mutants in the presence of 3  $\mu$ M erastin2 for 24 hr. All data represent mean  $\pm$  S.E.M. of three biological replicates by one-way ANOVA (**a-d,h**) or paired t-test (**e,f**). \*\*\*\*P < 0.0001, \*\*P < 0.01, \*P < 0.05.



Extended Data Fig. 8: LRP8 is essential for maintenance of GPX4 and suppression of ferroptosis in cancer cells.

**a**. Representative western blot of HCC1143 cell lysates subjected to various antioxidants for seven days. **b**, Representative western blot of GPX4 in MDA-MB-453 cell lysates from multiple clonal LRP8KO lines. **c**, Quantification of GPX4 levels from **b** (three independent replicates). **d-f**, Representative western blot of GPX4 in HCC1937 (**d**), U87-MG (**e**), SKMEL38 (**f**) LRP8KO cells. **g,h**, Western blot of GPX4 in MDA-MB-453 (**g**) and HCC1143 (**h**) LRP8KO cells stably expressing LRP8 wildtype or various truncation mutants. **i**, Representative western blot of cell lysates from MCF10A and HCC1143 cultured in Human Plasma-Like Medium (n = 3 independent experiments). **j**, Representative western blot of lysates from MCF10A control and LRP8KO cells stably expressing MYC, HRasG12V and KRasG12V (n = 3 independent experiments). **k**, Quantification of protein levels from panel **h**. The level of GPX4 was normalized to the levels of ACTB from the same lysate sample and subsequently normalized to that of control expressing the same

oncogene. **l**, Representative Western blot analysis of cell lysates from MCF10A-HRasG12V subjected to siNT or siLRP8. **m**, Quantification of protein levels from **l** (n = 3 independent experiments). **n**, Representative Western blot analysis of cell lysates from MCF10A-HER2 treated with siNT or siLRP8 for 7 days. **o**, Quantification of protein levels from **l** (n = 3 independent experiments).**p**, Representative immunoblotting of GPX4 in MCF10A-MYC control and LRP8KO cells. Cell lysates were collected under basal conditions or pre-treated with 200 nM Se for 48 hr. **q**, Cell viability of MCF10A-MYC control and LRP8KO cells upon treatment with 9  $\mu$ M RSL3 24 hr. Data in **c,k,m,o,q** represent mean  $\pm$  S.E.M. of three biological replicates by two-tailed, unpaired t-test. \*\*\*\*P < 0.0001, \*\*P < 0.01, \*P < 0.05.



# Extended Data Fig. 9: LRP8KO impacts GPX4 translation but not transcription or protein turnover

**a**, Validation of GPX4 wildtype and mutants expression in HCC1143 LRP8KO cells. **b**, Immunofluorescence of GPX4 (green) in LRP8KO cells stably expressing cytoGPX4 or

mitoGPX4. Mitochondria were labeled by MitoTracker Deep Red. Scale bars, 10  $\mu$ m. **c**, Relative GPX4 mRNA levels in control and LRP8KO cells as measured by quantitative PCR. Data represent mean ± S.E.M. of three biological replicates by two-tailed, unpaired t-test. **d**, Gene expression profiles of 23 human selenocysteine genes detected in control and LRP8KO HCC1143 cells with or without pre-treatment with 200 nM Se for 24 hr. Gene expression in LRP8KO cells is represented as log2 fold change relative to that of control cells from the same condition. **e**, Raw sequence counts of the 23 selenocysteine genes from RNA-seq. **f**, western blot of GPX4 in control and LRP8KO cells following 10  $\mu$ M MG132 or 20  $\mu$ M Chloroquine treatment for 24 hr. **g**, Representative western blots of AHA labeled, newly translated GPX4,GPX1 and SELENOH in control and LRP8KO cells. **h**, Quantification of GPX4 protein levels from **g**. Data represent mean ± S.E.M of five biological replicates by one-way ANOVA, and adjusted using Bonferroni correction for multiple comparisons. \*\*\*\*P < 0.0001.



#### Extended Data Fig. 10: GPX4 SEICS impacts on ribosome collision

**a**, Western blotting of control and LRP8KO cell lysates subjected to different dose of non-targeting or GPX4 siRNA. **b**, Immunoblotting analysis of SECISBP2 for EEFSEC from HCC1143 Control and LRP8 cells stably expressing V5-GPX4-Stag. Cells were incubated with vehicle or 200nM Se for 72hr before the harvest for co-immunoprecipitation. **c**, Representative western blot showing the protein level of different GPX4 SECIS-Swap mutants in HCC1143 control and LRP8KO cells (n = 3 independent experiments). **d**, Quantification of the percentage of SG+ cells (dead cells) in control and LRP8KO cell lines stably expressing the indicated GPX4-SECIS-Swap mutants over 24hr in the present of 100nM RSL3. Heatmap data represent mean  $\pm$  S.E.M. of three biological replicates. **e**, Relative V5-GPX4 mRNA levels in control and LRP8KO cells stably expressing the indicated GPX4-SECIS-Swap mutants as measured by quantitative PCR. Data represent mean  $\pm$  S.E.M. of two biological replicates by two-tailed, unpaired t-test.

#### Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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#### Data availability

All data that support the conclusions in this manuscript are available from the corresponding author upon reasonable request. Raw data for Figure 1d can be accessed in Supplementary Dataset 2. Raw data for Figure 5–6 can be accessed in Supplementary Dataset 4 and 6. Raw data for Extended Data Figure 1e can be accessed in Supplementary Dataset 1. Raw data for Figure 1a, 2a, Extended Data Figure 1a, 1b are publicly available from the CTRP and CCLE databases(portals.broadinstitute.org). Raw data for Extended Data Figure 2a are publicly available from TCGA database (portal.gdc.cancer.gov). Raw data for Figure 3a are publicly avaiable from from FIREWORKS(mendillolab.shinyapps.io/fireworks/). Raw data for Extended Data Figure 5a are publicly available from Co-essentiality browser (coessentiality.net).

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# Fig. 1: Genome-wide CRISPR screen identifies LRP8 as a genetic modifier of ferroptosis resistance in triple-negative breast cancer cells.

**a**, Summary of FSP1 gene expression and RSL3 sensitivity in various cancer cells, data were mined from the CTRP database. AUC is the area under the curve from RSL3 dose response analyses of cell viability. **b**, Western blot of lysates from MDA-MB-453 cells and U2-OS cells indicates FSP1 protein levels and KO efficiency. **c**, Dose response of RSL3 induced cell death in U-2 OS and MDA-MB-453 cells treated with vehicle or  $5\mu$ M iFSP1. Shading indicates 95% confidence intervals for the fitted curved and each data point is the average of three replicates. AUC, Area Under the Curve. **e**, Gene effects and gene scores calculated for individual genes analyzed in the genome-wide CRISPR screen in MDA-MB-453 cells. **f**, Histograms of selected individual gene results from casTLE analysis, including the average for the entire population (red line) and for the indicated gene sgRNAs (blue line).



#### Fig. 2: LRP8 promotes ferroptosis resistance in breast cancer cells.

a, LRP8 expression is positively correlated with resistance to ferroptosis inducers in cancer cells. Plotted data were mined from the CTRP database, which contains correlation coefficients between gene expression and drug sensitivity for 907 cancer cell lines treated with 545 compounds. b, Western blot analysis of the LRP8 KO in HCC1143 cells with multiple sgRNAs. The "Cas9" line indicates parental HCC1143 cells stably expressing Cas9. The "Control" expresses "sgSAFE" control sgRNA (referred as "control" hereafter) c, Dose response of RSL3-induced cell death in control and LRP8 single clonal KO cells. d. Dose response of IKE-induced cell death in control and LRP8KO cells. e. Cell viability of control and LRP8KO cells 24 hr after treatment with the indicated ferroptosis inducers by cell-titer glow assay (RSL3, 200nM; ML162, 200 nM; ML210, 400 nM; Erastin 2, 400 nM). f. Cell viability of control and LRP8KO cells treated with RSL3 in the presence of inhibitors of different types of cell death for 24 hr (RSL3, 200 nM; Fer1, 2  $\mu$ M; DFO, 100 µM; idebenone, 10 µM; tocopherol, 10 µM; ZVAD, 20 µM; chloroquine, 200 μM; Nec-1, 1 μM). g, Control and LRP8KO cells treated with 200nM RSL3 for 5 hrs were labeled with BODIPY 581/591 C11. Green fluorescence intensity was analyzed by flow cytometry. h, Quantification of FITC intensity from g. i, Spheroids from control and LRP8KO cells stably expressing mCherry were incubated with IKE or IKE+Fer1 and SG and visualized using live-cell imaging. j,k, Quantification of the size of each spheroid (j) and the total intensity of the SG signal (k) over 24 hr. In c-d, Shading indicates 95% confidence intervals for the fitted curves and each data point is the average of three

biological replicates. All data represent mean  $\pm$  S.E.M. of three biological replicates, except for erastin2 (n=6) in **f**, by two-tailed, unpaired t-test (**e**, **f**, **h**). For **j** and **k**, a total of 14, 15, 10, 8, 10 and 12 independent spheroids were collected in three biological repeats for control\_vehicle, LRP8KO2\_vehicle, Control\_IKE, LRP8KO2\_IKE, Control\_IKE+Fer1, LRP8KO2\_IKE+Fer1, respectively. \*\*P < 0.01, \*P < 0.05.



Fig. 3: LRP8 regulation of selenium levels impacts ferroptosis resistance.

**a**, Coessentiality network analysis for LRP8 in pan-cancer context by FIREWORKS. Two primary modules, (1) glutathione and NAD metabolism and (2) selenocysteine metabolism, are positively associated with LRP8. The thickness of the line represents person correlation. **b**, Gene ontology (GO) analysis of the genes in the selenocysteine metabolism cluster. **c-e**, Quantification of the percentage of SG+ cells (dead cells) in control and single or double KO cell lines targeting the indicated genes related to selenocysteine metabolism (**c**), lipoprotein receptors (**d**), or LRP2 (**e**). **f**, ICP-MS measurement of the selenium levels in control and LRP8KO cells alone or in the presence of 200 nM Se for 24 hr. **g**, Live-cell imaging of control and LRP8KO spheroids cultured with IKE or Se. Live cells stably express mCherry and dead cells are labeled with SG. **h**,**i**, Quantification of the size of each spheroid (**h**) or the total intensity of green signal (**i**) over 24 hr. **j**, Cell viability of control and LRP8KO cells upon treatment with 100 nM RSL3 combined with vehicle control or different [Se] for

24 hr. **k**, Quantification of SG+ cells in the indicated KO cells treated with 100 nM RSL3 for 24 hr. **l**, Schematic illustration of LRP8 domains. **m**, Cell viability of control cells or LRP8KO stably expressing the indicated LRP8 mutants in the presence of 100 nM RSL3 for 24 hr. Data represent mean  $\pm$  S.E.M. of three biological replicates, except for **m**, where n=4. Data were compared using an unpaired two-tailed t-test (**c-f,k**),one-way ANOVA (**m**) and two-way ANOVA (**j**). In **h** and **i**, a total of 11, 12, 8, 7, 12 and 12 independent spheroids were collected in three biological repeats for Control\_Se, LRP8KO2\_Se, Control\_IKE, LRP8KO2\_IKE, Control\_IKE+Se, LRP8KO2\_IKE+Se, respectively. \*\*\*\*P < 0.001, \*\*P < 0.01, \*P < 0.05.



# Fig. 4: Altered selenocysteine protein expression in LRP8KO cells confers a ferroptosis vulnerability

**a**, Representative immunoblotting of 18 selenocysteine proteins in control and LRP8KO cells. Cell lysates were collected under basal conditions or pre-treated with 200 nM Se for 48 hr(n = 3 independent experiments). **b**, Quantification of protein levels from panel **a**. The level of each protein was normalized to the levels of ACTB from the same lysate sample and subsequently normalized to that of control under basal conditions. The fold changes are represented as a heat map. **c**, Western blot analysis of cell lysates from control and LRP8KO cells comparing the protein levels of SLC7A11, ACSL3, ACSL4, and FSP1 **d**, Timeline of the Se washout assay. **e**, Quantification of selenocysteine protein level upon Se washout (n = 3 independent experiments). The level of each protein was first normalized to that of ACTB from the same lysate sample and subsequently normalized to the level in the LRP8KO at Day 0. The fold changes are represented as a heat map. **f**, comparison of selenocysteine protein level between the steady state condition (**a**,**b**) and time to reach 50% of Day 0 upon

Se washout (e). Selenoproteins that never reached 50% within 7 days of Se withdrawal are indicated as "8 Day". Groups of selenoproteins that responded similarly are indicated by the circles. **g,h**, Cell viability of control and LRP8 cells stably expressing the indicated proteins in the presence of 100 nM RSL3 (g) or 3  $\mu$ M erastin2 (h) for 24 hr. **i**, Representative Western blot showing the changes in selenocysteine protein levels upon the overexpression of GPX4 (long or short isoform) or GPX1(*n* = 3 independent experiments). **j**, Quantification of protein levels from **i**. The level of each protein was first normalized to that of ACTB from the same lysate sample and subsequently normalized to that of LRP8KO. The fold changes were represented as a heat map. Data represent mean ± S.E.M. of three biological replicates. \*\*\*\*P < 0.0001.

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#### Fig. 5: GPX4 translation is disrupted under selenium-limiting conditions.

a, Experimental workflow for AHA translational analysis of GPX4 in control and LRP8KO cells with or without Se treatment. b, Representative LC traces of a GPX4 peptide from AHA labelled control, LRP8KO, and no-AHA cell lysates. c, Quantification of the relative abundance of the GPX4 peptide from **b** (Data represent mean  $\pm$  S.E.M. of three biological replicates). The relative abundance of each sample was first measured by relative intensity and normalized to the level of AHA labeled control from the same replicate. d, Scatter plots of fold changes in translation efficiency (TE) between control and two LRP8KOs, respectively. Transcripts with significant TE changes are labeled as black dots. All selenoprotein transcripts are highlighted in cyan. e, Fold changes in TE for the two LRP8KO cells in response to Se treatment. f, Heatmap summary from panels (d) and (e) showing the TE fold change for 17 selenoproteins in the indicated cell lines in the presence and absence of Se treatment. The TE from all groups was normalized to the TE from control cells under steady-state (vehicle) and represented as log2 fold changes. g, Quantification of the overall density of ribosome-protected fragments (RPFs) from 5' (Cyan) and 3' (Red) of the SEC in control and LRP8KOs under steady-state or Se-treated conditions. h, Heat map summary of the fold change in the ratio of RPFs 3' / 5' of the SEC codon from selected selenoprotein gene transcripts. Those with low counts or a short distance between the SEC and stop codon (<10 nt) were excluded. \*\*P < 0.01, \*P < 0.05.



# Fig. 6. GPX4 is susceptible to ribosome stalling and early translation termination under selenium-limiting conditions.

a-c, Empirical Cumulative Distribution Function of GPX4 RPFs in control (a), LRP8KO1 (b), and LRP8KO2 (c) cells incubated with vehicle or Se. The positions of the start and stop codon are indicated by red dash lines, and the location of SEC is marked by a black dash line and black arrowhead. d, Western blotting showing full-length and fragments of GPX4 in control and LRP8KO cells in the presence of 10  $\mu$ M MG132(n = 2 independent experiments). e, Representative western blots of AHA labeled, newly translated GPX4 from exogenous GPX4 SECIS-Swap constructs in control and LRP8KO cells (n = 3 independent experiments). f, Schematic illustration of the design of the GPX4 SEICS-Swap mutants. g, RPFs accumulated at the 5' position of the SEC locus on the GPX4 transcript under steady-state (left) or following Se treatment (right). h, Representative immunoblotting of GPX4 in control and LRP8KO2 cells subjected to non-targeting or ZNF598 knockdown by siRNA. **i**, Quantification of GPX4 level from **h** (Data represent mean  $\pm$  S.E.M. of five biological replicates). j, A model illustrating the mechanism by which LRP8 suppresses ferroptosis. LRP8-mediates the uptake of the SEC-rich protein SEPP1, which is broken down in the lysosome to release selenium. Selenium is employed in the translation of selenoproteins such as GPX4. In the absence of LRP8, selenium becomes limiting for the

translation of a subset of selenoproteins, including GPX4. Prolonged ribosome stalling at the GPX4 SEC UGA causes ribosome collisions and early translation termination. The resulting decrease in GPX4 levels sensitizes cells to ferroptosis induction by agents targeting the glutathione-GPX4 pathway. \*P < 0.05.