A multi-omic approach reveals iron availability influences cell fate fidelity

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Abstract

Recent evidence has highlighted the importance of employing culture media designed to emulate the metabolic environment Here, we utilize the physiological medium Plasmax to examine the impact of nutrient availability on the human hepatocyte cell line, HepG2. Incubation of HepG2 cells in Plasmax suppressed a transcriptional program driven by Hepatocyte Nuclear Factor 4 (HNF4A), a master regulator of hepatocyte identity. Given that HepG2 cells were originally isolated from a patient with hepatoblastoma, this suggests reversion to the native state in physiological media. Importantly, exclusion of iron from Plasmax reinstated the HNF4A-driven transcriptional program. These studies suggest a relationship between iron availability and the fidelity of hepatocyte cell fate and highlight the importance of more faithfully recapitulating *in vivo* metabolite availability *in vitro*.

Introduction

In vitro cell culture models play a central role in biological and biomedical research. In recent years, efforts to improve the physiological relevance of these models have highlighted the importance of media composition on cellular phenotype and biological responses. For example, the dependence of some cancer cell lines on glutaminolysis is not observed in the *in vivo* context (Davidson *et al*, 2016). This has been attributed to the presence of high cystine concentrations in conventional *in vitro* culture conditions (Muir *et al*, 2017). More generally, conventional media (e.g. Dulbecco's Modified Eagle's Medium, DMEM) poorly recapitulate metabolite levels that cells would be exposed to *in vivo* (Eagle, 1959; Dulbecco & Freeman, 1959). The increasing awareness and recognition that the composition of cell culture media is important in preserving biological processes *in vitro* has led to ongoing efforts to develop cell culture media that better represent physiological metabolite concentrations (Vande Voorde *et al*, 2019; Cantor *et al*, 2017; Tardito *et al*, 2015). Studies employing physiological media have demonstrated that media composition can alter cellular dependencies via metabolic and transcriptional changes (Flickinger *et al*, 2024; Vande Voorde *et al*, 2019; Cantor *et al*, 2017; Apiz Saab *et al*, 2023; Rawat *et al*, 2024; Senkowski *et al*, 2023).

Hepatocytes, the major cell type in the liver, are widely modelled *in vitro* to study drug metabolism, drug-induced liver injury (DILI), and various liver diseases (Kaur *et al*, 2023; Yang *et al*, 2023). The most commonly used cell line in these contexts are HepG2 cells, which were originally derived from a hepatic tumour isolated from a 15-year-old male (Aden *et al*, 1979; Arzumanian *et al*, 2021). Although initially characterised as being derived from a hepatocellular carcinoma (HCC), subsequent histopathologic, genetic and molecular analysis revealed that the origin of HepG2 cells was instead from a hepatoblastoma (HB) (López-Terrada *et al*, 2009). Despite this, HepG2 cells are still widely utilized as a hepatocyte cell line as they exhibit the hallmarks of hepatocyte fate and function *in vitro* (Liu *et al*, 2022, 2021; Lin *et al*, 2016; Park *et al*, 2018; Zhang *et al*, 2018).

In this study, we examined the impact of nutrient availability on HepG2 cells by comparing culture in conventional media with culture in a media previously developed to more faithfully reflect metabolite abundance in human plasma (Plasmax) (Vande Voorde *et al*, 2019). We demonstrate that culturing HepG2 cells in Plasmax alters cell fate in a manner associated with loss of HNF4A. Moreover, we demonstrate that iron availability contributes to the regulation of hepatic cell fate. This research suggests an important role for physiological media in maintaining cell fate *in vitro*.

Results

HepG2 cells adopt a native hepatoblast-like state in physiological media

Typically, HepG2 cells are maintained in one of three conventional cell culture media: EMEM, high glucose DMEM (HG-DMEM) or low glucose DMEM (LG-DMEM) (Sanghvi *et al*, 2019; Chen *et al*, 2024; Jiang *et al*, 2023; Ong *et al*, 2023). To examine the impact of culture media on the transcriptional landscape, HepG2 cells were cultured in each of the three conventional media types or in the physiological medium Plasmax (Vande Voorde *et al*, 2019). Plasmax mimics metabolite concentrations found in human plasma and has a dramatically different composition than conventional cell culture media (Fig. S1A). While minimal transcriptional changes were observed in response to culture in any of the three conventional media, culture in Plasmax induced widespread transcriptional changes (Fig. S1B,C). Amongst the most significant changes observed in Plasmax, relative to EMEM, was upregulation of the pioneer transcription factor SRY-Box Transcription Factor 4 (*SOX4*), a regulator of hepatocyte dedifferentiation, and concomitant downregulation of genes (Apolipoprotein H, *APOH*; Albumin, *ALB*; Transferrin, *TF*) controlled by Hepatocyte Nuclear Factor 4 Alpha (HNF4A), a transcription factor that regulates hepatocyte identity (Fig. 1A) (Parviz *et al*, 2003; Sekiya & Suzuki, 2011; Katsuda *et al*, 2024). Downregulation of HNF4A in Plasmax was confirmed at the level of protein expression (Fig. 1B). Consistent with these observations, Gene Set Enrichment Analysis (GSEA) revealed downregulation of signatures associated with hepatocyte cell state and hepatocyte function in the context of culture in Plasmax (Fig. 1C). In the developmental context, hepatoblasts are bipotential progenitor cells that differentiate to give rise to both hepatocytes and cholangiocytes (Fig. S1D) (Gordillo *et al*, 2015). Culture in Plasmax induced an increase in the expression of genes associated with a hepatoblast-like state (e.g. Epithelial Cell Adhesion Molecule, *EPCAM* and SRY-Box Transcription Factor 9, *SOX9*) and, as previously mentioned, loss of genes associated with differentiated hepatocytes (e.g. *ALB*, *APOH*, and *TF*) suggesting that culture in physiological media drives dedifferentiation (Fig. 1D). In contrast, culture of the HCC-derived hepatocyte cell line Hep3B in Plasmax did not impact HNF4A protein expression (Fig, S1E). This was expected as Hep3B cells are not derived from HB and represent an intrinsically differentiated hepatocyte cell line. Finally, analysis of a publicly available dataset examining the impact of culture conditions on the basal-like breast cancer cell line MDA-MB-468 revealed a shift to a progenitor-like state when cells were cultured in Plasmax (Fig. S1F) (Vande Voorde *et al*, 2019; Charafe-Jauffret *et al*, 2006; Neve *et al*, 2006). Overall, these data suggest that culture in physiologic media maintains cell fate fidelity *in vitro*.

Trace element availability regulates hepatocyte differentiation

To examine the components of Plasmax contributing to dedifferentiation of HepG2 cells, variants of Plasmax lacking either trace elements, which are severely underrepresented in EMEM/DMEM, or lacking metabolites absent from EMEM/DMEM (termed "supplemental metabolites") were prepared (Fig. S1A) (Vande Voorde *et al*, 2019). Withdrawal of trace elements, but not supplemental metabolites, restored HNF4A protein expression to levels observed in EMEM (Fig. 2A). Moreover, transcriptomics revealed that trace element withdrawal restored hepatocyte gene expression and expression of signatures associated with hepatocyte cell state and hepatocyte function (Fig. 2B,C). Notably, *SOX4* expression was suppressed and returned to levels observed in EMEM when cells were cultured in Plasmax devoid of trace elements (Fig. 2C,D).

Multi-omics analysis reveals a relationship between trace element availability and metalloprotein expression

To gain insights regarding which trace element(s) was contributing to dedifferentiation in Plasmax, intracellular trace element abundance was quantified using inductively-coupled plasma mass spectrometry (ICP-MS). Given that serum can be a source of trace elements, trace elements were also quantified in fresh culture media. As expected, trace elements were elevated in Plasmax compared to EMEM (Fig. S2A). Interestingly, despite iron levels being increased by only four-fold in Plasmax relative to EMEM, HepG2 cells cultured in Plasmax exhibited more than a twenty-fold increase in intracellular iron (Fig. 3A). A three-fold increase in intracellular copper was also observed (Fig. 3A). To explore the role of iron in hepatocyte differentiation, iron salts were added back to Plasmax devoid of trace elements. A multidimensional scaling (MDS) plot of the transcriptome revealed that while withdrawal of trace elements from Plasmax resulted in a transcriptome more similar to EMEM, reintroduction of iron resulted in a transcriptome that was more similar to Plasmax (Fig. 3B). This trend was recapitulated at the proteome level where reintroduction of iron restored a proteomic profile similar to HepG2 cells incubated in complete Plasmax (Fig. 3C). Interestingly, a correlation plot of the transcriptome and proteome of cells cultured in Plasmax lacking trace elements compared to complete Plasmax revealed proteins that were significantly downregulated at the protein, but not the transcript, level in response to removal of trace elements. Notably, among these proteins were selenoproteins (e.g. Selenoprotein P, *SELENOP* and Glutathione Peroxidase 1, *GPX1*) and iron-regulated proteins (e.g. Ferritin Heavy Chain 1, *FTH1*) (Fig. 3D). These proteins belong to the metalloprotein superfamily and their translation is dependent on trace element availability (Copeland, 2003; Addess *et al*, 1997). Consistent with this, addition of iron salts to Plasmax devoid of trace elements was able to rescue the expression of iron-regulated proteins but not selenoproteins, demonstrating the importance of trace

elements in the post-transcriptional regulation of protein abundance (Fig. 3E). Taken together,
these results highlight a role for trace elements in the regulation of cellular phenotype and
demonstrate the importance of utilizing a multi-omic approach to interrogate the impact of
altered nutrient availability.

Iron availability contributes to the regulation of hepatocyte cell fate
Given that the intracellular levels of iron and copper were significantly increased in
HepG2 cells cultured in Plasmax (Fig. 3A), these trace elements were further examined for
their role in modulating hepatocyte cell fate. Interestingly, reintroduction of iron salts, but not
copper salts, to Plasmax devoid of trace elements suppressed HNF4A expression (Fig. 4A).
Moreover, re-introduction of iron salts suppressed signatures associated with the differentiated
hepatocyte cell state (Fig. 4B,C). The majority of labile iron is incorporated in the cofactor
heme(Ajioka *et al*, 2006). The transcriptional repressor BTB and CNC Homolog 1 (BACH1)
plays a central role in regulating intracellular heme homeostasis and is itself regulated by
heme availability (Oyake *et al*, 1996; Ogawa *et al*, 2001; Sun *et al*, 2002). Interestingly, BACH1
has also been shown to contribute to the regulation of cell fate (Wei *et al*, 2019; Oyake *et al*,
1996). Notably, proteomics analysis revealed that BACH1 target genes were upregulated after
reintroduction of iron salts to Plasmax devoid of trace elements (Fig. 4D). Finally, BACH1
protein expression was dramatically lower in HepG2 cells cultured in Plasmax versus EMEM
(Fig. 4E). Taken together, these data suggest that the iron-dependent dedifferentiation of
hepatocytes in Plasmax is mediated by the trace element iron through regulation of the
transcription factor BACH1 (Fig. S3A).

Discussion
The liver biopsy from which HepG2 cells were isolated in 1979 was described as a well
differentiated HCC (Aden *et al*, 1979). It was not until 2009 when the histopathology and
genetics of the original biopsy was revisited that it was reclassified as a HB (López-Terrada *et*
al, 2009). Despite this correction, HepG2 cells are still widely used to model hepatocytes/HCC
rather than hepatoblasts/HB (Liu *et al*, 2022, 2021; Lin *et al*, 2016; Park *et al*, 2018; Zhang *et*
al, 2018). This is reasonable as HepG2 cells cultured in conventional media exhibit
characteristics consistent with differentiated hepatocytes (Fig. 1C). In this study, we have
demonstrated that incubation in a physiological medium, Plasmax, causes HepG2 cells to
revert to their native hepatoblast state.
A previous study investigating the impact of cell culture conditions on HepG2 cells
demonstrated that increased amino acid availability promoted the acquisition of a
transcriptome similar to primary human hepatocytes (Boon *et al*, 12/2020). In other cell lines,
physiologically relevant metabolites that are underrepresented or absent in conventional

media, such as urea and the trace element selenium, have been shown to drive significant
changes in cell metabolism (Cantor *et al*, 2017; Vande Voorde *et al*, 2019). Here, we have
shown that underrepresentation of the trace element iron in conventional media drives
differentiation of HepG2 cells to a hepatocyte state. Maintenance of intracellular iron
homeostasis has been shown to play a role in determining fate in other cell types including
breast cancer cells, hematopoietic stem cells and alveolar cells (Kao *et al*, 2024; Zhuang *et
al*, 2025; Müller *et al*, 2020). Although trace elements exist in minute quantities in the plasma,
these studies highlight the importance of considering trace element availability when
employing cell culture models.

We demonstrate that removal of trace elements from Plasmax triggers the
downregulation of proteins harbouring iron response elements in the 5'-UTR of the associated
transcripts (IRE; e.g. ACO2, FTL, FTH1) (Aziz & Munro, 1987; Hentze *et al*, 1987; Shen *et al*,
2023). IREs are recognized by IRE binding proteins, which in the absence of iron, repress
protein expression by hindering the binding of translation initiation factors (Gray & Hentze,
1994). In addition to iron, the availability of other trace elements can dramatically impact the
proteome. For example, the translation of selenoproteins, which contain the cysteine analogue
selenocysteine (Sec), is dependent on selenium availability (Zinoni *et al*, 1986; Chambers *et
al*, 1986; Copeland, 2003; Kryukov *et al*, 2003). Since the protein expression of IRE-containing
proteins and selenoproteins are regulated at the translational level, changes in their
expression resulting from altered trace element availability would not be detected at the
transcriptional level. This underscores the importance of employing multi-omic approaches to
investigate the consequences of altering metabolite availability.

BACH1 is a transcription factor that regulates iron homeostasis and is highly
responsive to changes in iron availability (Kitamuro *et al*, 2003; Chen *et al*, 2023). Interestingly,
in lung cancer, BACH1 has been shown to drive changes in cell plasticity via epithelial-to-
mesenchymal transition (Wiel *et al*, 2019; Lignitto *et al*, 2019). Moreover, BACH1 has been
shown to interact with transcription factors that regulate self-renewal (e.g. NANOG, SOX2,
and OCT4) to repress transcription of mesodermal genes and promote pluripotency in human
embryonic stem cells (Wei *et al*, 2019). Our findings demonstrate that BACH1 is
downregulated in HepG2 cells cultured in Plasmax (Fig. 4E). Future studies investigating the
interplay between iron availability, BACH1 and cell fate are warranted.

In conclusion, our study adds to a growing body of literature highlighting the importance
of more faithfully recapitulating the *in vivo* metabolic microenvironment when employing *in
vitro* cell culture models. Considering these findings, we suggest that, in addition to providing
an opportunity to identify novel modulators of cell fate, physiological media will improve the *in
vivo* relevance of *in vitro* cell culture models by maintaining cell fate fidelity *in vitro*.

Materials and Methods

Cell culture

HepG2 cells were purchased from the European Collection of Authenticated Cell Cultures (ECACC) via CellBank Australia and Hep3B cells were purchased from American Type Culture Collection (ATCC). Both cell lines were routinely assayed for mycoplasma contamination. Cells were cultured in high glucose DMEM (DMEM-HG; Thermo Fisher Scientific, 11965118), low glucose DMEM (DMEM-LG; Thermo Fisher Scientific, 11885084), Plasmax (prepared in-house as previously described (Vande Voorde *et al*, 2019)) or EMEM, which was prepared by supplementing MEM, NEAA, no glutamine (Thermo Fisher Scientific, 10370) with 1 mM sodium pyruvate, 2 mM glutamine. Cells were maintained in a humidified incubator at 37°C with 5% CO_2. For all experiments, $2x10^5$ HepG2 cells and $8x10^4$ Hep3B cells were seeded in 6-well plates in EMEM containing 10% heat-inactivated FBS (HyClone™, SH30084). 24 hours after seeding, wells were washed with PBS and the appropriate media (DMEM-HG, DMEM-LG, Plasmax or EMEM) containing 10% heat-inactivated FBS was added. Media was refreshed after 48 hours and cells were harvested 96 hours after transition to the different media types.

RNA-Seq analysis

For RNA-Seq analysis, total RNA was extracted using the NucleoSpin RNA kit (Macherey-Nagel, 740955) as per manufacturer's instructions. RNA quality was confirmed using an Agilent 4200 TapeStation System. Libraries were prepared using the QuantSeq 3' mRNA-Seq kit (Lexogen, 015) and sequenced with an Illumina NextSeq 500, with single-end 75 bp reads to a depth of 5 M reads per sample. FASTQ files were uploaded to the Galaxy web platform for quality control (FastQC), trimming (Cutadapt), alignment (RNA STAR), and counting (featureCounts) (Afgan *et al*, 2016). Reads were aligned to the human genome assembly (Ensembl hg19, GRCh37). Analysis of differentially expressed genes was performed with Limma-Voom (v3.40.6) (Smyth, 2005; Law *et al*, 2014). Gene set enrichment analysis (GSEA) was performed and plotted in R using the 'clusterProfiler' package (Yu *et al*, 2012). Heatmaps and volcano plots were generated in R using the 'pheatmap' and 'ggplot' packages respectively(Kolde, 2012; Wickham, 2016).

Quantitative polymerase chain reaction (qPCR)

Total RNA was isolated using the NucleoSpin RNA Kit (Macherey-Nagel, 740955) following manufacturer's instructions. Complementary DNA (cDNA) was synthesized using the High-Capacity cDNA Reverse Transcription Kit (Thermo Fisher Scientific, 4368813) according to the manufacturer's guidelines. cDNA was diluted 5-fold in nuclease-free H_2O (Thermo Fisher Scientific, 10977015). qPCR was performed using Applied Bioystems Fast SYBR™ Green

Master Mix (Thermo Fisher Scientific, 4385616) and the Applied StepOnePlus Real-Time PCR

System (Thermo Fisher Scientific). Primers for *RPLP0* (5'-CAGATTGGCTACCCAACTGTT-3'

and 5'-GGGAAGGTGTAATCCGTCTCC-3'), *ALB* (5'-CTTGAATGTGCTGATGACAGG-3' and

5'-GCAAGTCAGCAGGCATCTCAT-3'), and *ACAT2* (5'-GCGGACCATCATAGGTTCCTT-3'

and 5'- CTGCAAGGCACACAGCTTTT-3') were used for qPCR. Relative gene expression was

determined using the ΔΔCt method(Rao *et al*, 2013) normalised to *RPLP0*.

Immunoblotting

Cells were washed with PBS and lysed in SDS lysis buffer (1% SDS, 50 mM Tris-HCl, 10 mM

EDTA) containing a protease inhibitor cocktail (Sigma-Aldrich, P8340) and Pierce™ Universal

Nuclease for Cell Lysis (Thermo Fisher Scientific, 88072). Lysates were resolved by SDS-

PAGE and transferred to nitrocellulose membrane. Membranes were probed with primary

antibodies recognising HNF4A (Cell Signaling Technology, 3113, 1:1000 dilution), BACH1

(Proteintech, 14018-1-AP, 1:500 dilution), and β-Actin (Cell Signalling Technology, 3700,

1:5000 dilution). Membranes were incubated with IRDye secondary antibodies (LI-COR, 926-

68070 and 926-32211) and imaged using the Odyssey DLx imaging system (LI-COR).

Inductively-coupled plasma mass spectrometry (ICP-MS)

ICP-MS was performed as previously described(Pyun *et al*, 2022). Cells were washed with

PBS and whole cell lysates were collected in SDS lysis buffer. Media with 10% FBS (500 µL)

was used to determine trace element abundance in EMEM and Plasmax. Lysates or media

were lyophilized prior to digestion in 65% nitric acid (Merck, 100441). Samples were heated

at 90°C for 20 minutes to complete the digestion and subsequently diluted with 1% (v/v) nitric

acid. Samples were run on the Agilent 8800 (ICPMS-QQQ-8800) system using a Helium

reaction gas cell. Raw parts per billion (ppb) data of the elements were converted to µmol/L

with dilution factors applied. The final concentrations of the metals were corrected with the

treatment blanks and normalized to the total protein to obtain a final unit expressed as

metal/mg protein. Fold changes were normalized to the average of controls.

Proteomic Analysis

Cells were washed with PBS and lysed in 200 µL of ice-cold RIPA buffer (1% NP-40, 0.5%

sodium deoxycholate, 0.1% SDS, 150 mM NaCl, 50 mM Tris-HCl, pH 7.5) containing a

protease-inhibitor cocktail (Sigma-Aldrich, P8340) and phosphatase inhibitors (Roche,

4906845001). Protein (50 µg per sample) was reduced by adding a final concentration of 10

mM TCEP (Sigma-Aldrich, 646547) and incubated at 37°C for 45 min. Samples were then

alkylated with 50 mM iodoacetamide (Sigma-Aldrich, I1149) and incubated in the dark for 45

min. After acidification with 2.5% phosphoric acid (Sigma-Aldrich, 79617), samples were

passed through S-Trap micro columns (Protifi, C02-micro). Proteins were digested overnight
at 37°C with a 1:20 dilution of Pierce™ Trypsin Protease (Thermo Fisher Scientific, 90057).
Peptides were eluted sequentially with 50 mM triethylammonium bicarbonate buffer (TEAB),
0.2% formic acid, and 50% acetonitrile/0.2% formic acid. Finally, the eluent was lyophilized
and reconstituted in 2% acetonitrile/0.05% trifluoroacetic acid to make up the peptide solution
for LC-MS/MS analysis by data-independent acquisition using a Thermo OrbiTrap Ascend
mass spectrometer. Data analysis was performed using the software suite, DIA-NN (Demichev
et al, 2020). Heatmaps and volcano plots were generated in R using the 'pheatmap' and
'ggplot' packages respectively (Kolde, 2012; Wickham, 2016).
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Quantification and Statistical Analysis
Statistical analyses were performed with Prism 9 software (GraphPad Software). All statistical
analyses for data comparing two groups were performed with an unpaired Student's t-test.
One-way ANOVA with the Holm–Sidak method for multiple comparisons was used for
comparison of more than two groups. All immunoblots are representative of results from at
least three independent experiments. All other statistical details of experiments can be found
in the figure legends.
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Author contributions

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Figure 1. HepG2 cells adopt a native hepatoblast-like state in physiological media.
(A) Volcano plot of differentially expressed genes (DEGs) identified from RNA-Seq analysis
comparing HepG2 cells cultured in Plasmax with HepG2 cells cultured in EMEM, n=3.
Hepatocyte differentiation markers are highlighted in maroon. Significantly upregulated genes
are highlighted in red. Significantly downregulated genes are highlighted in blue. (B)
Representative immunoblot analysis of HepG2 cells cultured in EMEM or Plasmax. (C) Gene
set enrichment analysis (GSEA) plots derived from RNA-Seq analysis comparing HepG2 cells
cultured in Plasmax with HepG2 cells cultured in EMEM demonstrating signatures associated
with hepatocyte cell state and function. (D) Heatmap of hepatocyte and hepatoblast gene
expression in HepG2 cells culture in EMEM or Plasmax as determined by RNA-Seq analysis,
n=3.
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Figure 2. Trace element availability regulates hepatocyte differentiation
(A) Representative immunoblot analysis of HepG2 cells cultured in EMEM, Plasmax, Plasmax devoid of trace elements (TE) or Plasmax devoid of supplemental metabolites (SM). (B) GSEA plots derived from RNA-Seq analysis comparing HepG2 cells cultured in Plasmax with HepG2 cells cultured in EMEM or comparing HepG2 cells cultured in Plasmax-TE with HepG2 cells cultured in EMEM demonstrating signatures associated with hepatocyte cell state and function. (C) Volcano plot of DEGs identified from RNA-Seq analysis comparing HepG2 cells cultured in Plasmax-TE with HepG2 cells cultured in Plasmax, n=3. Hepatocyte differentiation markers are highlighted in maroon. Significantly upregulated genes are highlighted in red. Significantly downregulated genes are highlighted in blue. (D) *SOX4* transcript expression in counts per million (CPM) based on RNA-Seq analysis of HepG2 cells cultured in EMEM, Plasmax, or Plasmax-TE, n=3. For all experiments, ***P <0.001, ns = not significant.

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Figure 3. Multi-omics analysis reveals a relationship between trace element availability
and metalloprotein expression
(A) Relative intracellular abundance of trace elements in HepG2 cells cultured in EMEM (blue)
or Plasmax (red) n=3. (B) MDS plot of RNA-Seq data from HepG2 cells cultured in EMEM,
Plasmax, Plasmax-TE, or Plasmax-TE supplemented with iron salts (0.12 µM ferric nitrate and
1.04 µM ferric sulfate; Plasmax-TE+Fe), n=3. (C) MDS plot of proteomic data from HepG2
cells cultured in EMEM, Plasmax, Plasmax-TE, or Plasmax-TE+Fe, n=5. (D) Correlation
between proteomic and transcriptomic data from HepG2 cells cultured in Plasmax-TE with
HepG2 cells cultured in Plasmax. Significantly differentially downregulated proteins whose
transcripts were not significantly altered are highlighted in green. Significantly differentially
upregulated proteins whose transcripts were not significantly altered are highlighted in
magenta. Metalloproteins are highlighted in blue. (E) Heatmap of metalloprotein expression in
HepG2 cells cultured in EMEM, Plasmax, Plasmax-TE or Plasmax-TE+Fe as determined by
proteomic analysis, n=5. For all experiments, $*P < 0.05$, ns = not significant.

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Figure 4. Iron availability contributes to the regulation of hepatocyte cell fate
(A) Representative immunoblot analysis of HepG2 cells cultured in Plasmax, Plasmax-TE,
Plasmax-TE+Fe, Plasmax-TE supplemented with copper salts (0.005 µM cupric sulfate), or
Plasmax-TE supplemented with iron and copper salts (0.12 µM ferric nitrate, 1.04 µM ferric
sulfate, 0.005 µM cupric sulfate). (B) GSEA plots derived from RNA-Seq analysis comparing
HepG2 cells cultured in Plasmax-TE with HepG2 cells cultured in Plasmax and comparing
HepG2 cells cultured in Plasmax-TE+Fe with HepG2 cells cultured in Plasmax demonstrating
signatures associated with hepatocyte cell state and function. (C) Heatmap of hepatocyte and
hepatoblast gene expression in Plasmax, Plasmax-TE or Plasmax-TE+Fe as determined by
RNA-Seq analysis, n=3. (D) Volcano plot of differentially expressed proteins identified from
proteomic analysis comparing HepG2 cells cultured in Plasmax-TE+Fe with HepG2 cells
cultured in Plasmax-TE, n=5. BACH1 targets are highlighted in maroon. Significantly
upregulated proteins are highlighted in red. Significantly downregulated proteins are
highlighted in blue. (E) Representative immunoblot analysis of HepG2 cells cultured in EMEM
or Plasmax.
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References

Addess KJ, Basilion JP, Klausner RD, Rouault TA & Pardi A (1997) Structure and dynamics of the iron responsive element RNA: implications for binding of the RNA by iron regulatory binding proteins. *J Mol Biol* 274: 72–83

Aden DP, Fogel A, Plotkin S, Damjanov I & Knowles BB (1979) Controlled synthesis of HBsAg in a differentiated human liver carcinoma-derived cell line. *Nature* 282: 615–616

Afgan E, Baker D, van den Beek M, Blankenberg D, Bouvier D, Čech M, Chilton J, Clements D, Coraor N, Eberhard C, *et al* (2016) The Galaxy platform for accessible, reproducible and collaborative biomedical analyses: 2016 update. *Nucleic Acids Res* 44: W3–W10

Ajioka RS, Phillips JD & Kushner JP (2006) Biosynthesis of heme in mammals. *Biochim Biophys Acta* 1763: 723–736

Apiz Saab JJ, Dzierozynski LN, Jonker PB, AminiTabrizi R, Shah H, Menjivar RE, Scott AJ, Nwosu ZC, Zhu Z, Chen RN, *et al* (2023) Pancreatic tumors exhibit myeloid-driven amino acid stress and upregulate arginine biosynthesis. *Elife* 12

Arzumanian VA, Kiseleva OI & Poverennaya EV (2021) The curious case of the HepG2 cell line: 40 years of expertise. *Int J Mol Sci* 22: 13135

Aziz N & Munro HN (1987) Iron regulates ferritin mRNA translation through a segment of its 5' untranslated region. *Proc Natl Acad Sci U S A* 84: 8478–8482

Boon R, Kumar M, Tricot T, Elia I, Ordovas L, Jacobs F, One J, De Smedt J, Eelen G, Bird M, *et al* (12/2020) Amino acid levels determine metabolism and CYP450 function of hepatocytes and hepatoma cell lines. *Nat Commun* 11: 1393

Cantor JR, Abu-Remaileh M, Kanarek N, Freinkman E, Gao X, Louissaint A Jr, Lewis CA & Sabatini DM (2017) Physiologic medium rewires cellular metabolism and reveals uric acid as an endogenous inhibitor of UMP synthase. *Cell* 169: 258-272.e17

Chambers I, Frampton J, Goldfarb P, Affara N, McBain W & Harrison PR (1986) The structure of the mouse glutathione peroxidase gene: the selenocysteine in the active site is encoded by the "termination" codon, TGA. *EMBO J* 5: 1221–1227

Charafe-Jauffret E, Ginestier C, Monville F, Finetti P, Adélaïde J, Cervera N, Fekairi S, Xerri L, Jacquemier J, Birnbaum D, *et al* (2006) Gene expression profiling of breast cell lines identifies potential new basal markers. *Oncogene* 25: 2273–2284

Chen L, Zhang C, Xue R, Liu M, Bai J, Bao J, Wang Y, Jiang N, Li Z, Wang W, *et al* (2024) Deep whole-genome analysis of 494 hepatocellular carcinomas. *Nature* 627: 586–593

Chen Y, Guo X, Zeng Y, Mo X, Hong S, He H, Li J, Fatima S & Liu Q (2023) Oxidative stress induces mitochondrial iron overload and ferroptotic cell death. *Sci Rep* 13: 15515

Copeland PR (2003) Regulation of gene expression by stop codon recoding: selenocysteine. *Gene* 312: 17–25

Davidson SM, Papagiannakopoulos T, Olenchock BA, Heyman JE, Keibler MA, Luengo A,
Bauer MR, Jha AK, O'Brien JP, Pierce KA, *et al* (2016) Environment impacts the
metabolic dependencies of Ras-driven non-small cell lung cancer. *Cell Metab* 23:
517–528

Demichev V, Messner CB, Vernardis SI, Lilley KS & Ralser M (2020) DIA-NN: neural
networks and interference correction enable deep proteome coverage in high
throughput. *Nat Methods* 17: 41–44

Dulbecco R & Freeman G (1959) Plaque production by the polyoma virus. *Virology* 8: 396–
397

Eagle H (1959) Amino acid metabolism in mammalian cell cultures. *Science* 130: 432–437

Flickinger KM, Wilson KM, Rossiter NJ, Hunger AL, Vishwasrao PV, Lee TD, Mellado Fritz
CA, Richards RM, Hall MD & Cantor JR (2024) Conditional lethality profiling reveals
anticancer mechanisms of action and drug-nutrient interactions. *Sci Adv* 10:
eadq3591

Gordillo M, Evans T & Gouon-Evans V (2015) Orchestrating liver development.
Development 142: 2094–2108

Gray NK & Hentze MW (1994) Iron regulatory protein prevents binding of the 43S translation
pre-initiation complex to ferritin and eALAS mRNAs. *EMBO J* 13: 3882–3891

Hentze MW, Caughman SW, Rouault TA, Barriocanal JG, Dancis A, Harford JB & Klausner
RD (1987) Identification of the iron-responsive element for the translational regulation
of human ferritin mRNA. *Science* 238: 1570–1573

Jiang X, Liu K, Jiang H, Yin H, Wang E-D, Cheng H, Yuan F, Xiao F, Wang F, Lu W, *et al*
(2023) SLC7A14 imports GABA to lysosomes and impairs hepatic insulin sensitivity
via inhibiting mTORC2. *Cell Rep* 42: 111984

Kao Y-R, Chen J, Kumari R, Ng A, Zintiridou A, Tatiparthy M, Ma Y, Aivalioti MM, Moulik D,
Sundaravel S, *et al* (2024) An iron rheostat controls hematopoietic stem cell fate. *Cell*
Stem Cell 31: 378-397.e12

Katsuda T, Sussman JH, Ito K, Katznelson A, Yuan S, Takenaka N, Li J, Merrell AJ, Cure H,
Li Q, *et al* (2024) Cellular reprogramming in vivo initiated by SOX4 pioneer factor
activity. *Nat Commun* 15: 1761

Kaur S, Kidambi S, Ortega-Ribera M, Thuy LTT, Nieto N, Cogger VC, Xie W-F, Tacke F &
Gracia-Sancho J (2023) In vitro models for the study of liver biology and diseases:
Advances and limitations. *Cell Mol Gastroenterol Hepatol* 15: 559–571

Kitamuro T, Takahashi K, Ogawa K, Udono-Fujimori R, Takeda K, Furuyama K, Nakayama
M, Sun J, Fujita H, Hida W, *et al* (2003) Bach1 functions as a hypoxia-inducible
repressor for the heme oxygenase-1 gene in human cells. *J Biol Chem* 278: 9125–
9133

Kolde R (2012) Pheatmap: pretty heatmaps. *R package version*

Kryukov GV, Castellano S, Novoselov SV, Lobanov AV, Zehtab O, Guigó R & Gladyshev VN
(2003) Characterization of mammalian selenoproteomes. *Science* 300: 1439–1443

Law CW, Chen Y, Shi W & Smyth GK (2014) voom: Precision weights unlock linear model
analysis tools for RNA-seq read counts. *Genome Biol* 15: R29

Lignitto L, LeBoeuf SE, Homer H, Jiang S, Askenazi M, Karakousi TR, Pass HI, Bhutkar AJ,
Tsirigos A, Ueberheide B, *et al* (2019) Nrf2 Activation Promotes Lung Cancer
Metastasis by Inhibiting the Degradation of Bach1. *Cell* 178: 316-329.e18

Lin C-Y, Chang T-W, Hsieh W-H, Hung M-C, Lin I-H, Lai S-C & Tzeng Y-J (2016)
Simultaneous induction of apoptosis and necroptosis by Tanshinone IIA in human
hepatocellular carcinoma HepG2 cells. *Cell Death Discov* 2: 16065

Liu F, Tian T, Zhang Z, Xie S, Yang J, Zhu L, Wang W, Shi C, Sang L, Guo K, *et al* (2022)
Long non-coding RNA SNHG6 couples cholesterol sensing with mTORC1 activation
in hepatocellular carcinoma. *Nat Metab* 4: 1022–1040

Liu Z, Xu Y, Zhang W, Gao X, Luo G, Song H, Liu J & Wang H (2021) Identification of targets
of JS-K against HBV-positive human hepatocellular carcinoma HepG2.2.15 cells with
iTRAQ proteomics. *Sci Rep* 11: 10381

López-Terrada D, Cheung SW, Finegold MJ & Knowles BB (2009) Hep G2 is a
hepatoblastoma-derived cell line. *Hum Pathol* 40: 1512–1515

Muir A, Danai LV, Gui DY, Waingarten CY, Lewis CA & Vander Heiden MG (2017)
Environmental cystine drives glutamine anaplerosis and sensitizes cancer cells to
glutaminase inhibition. *Elife* 6: e27713

Müller S, Sindikubwabo F, Cañeque T, Lafon A, Versini A, Lombard B, Loew D, Wu T-D,
Ginestier C, Charafe-Jauffret E, *et al* (2020) CD44 regulates epigenetic plasticity by
mediating iron endocytosis. *Nat Chem* 12: 929–938

Neve RM, Chin K, Fridlyand J, Yeh J, Baehner FL, Fevr T, Clark L, Bayani N, Coppe J-P,
Tong F, *et al* (2006) A collection of breast cancer cell lines for the study of functionally
distinct cancer subtypes. *Cancer Cell* 10: 515–527

Ogawa K, Sun J, Taketani S, Nakajima O, Nishitani C, Sassa S, Hayashi N, Yamamoto M,
Shibahara S, Fujita H, *et al* (2001) Heme mediates derepression of Maf recognition
element through direct binding to transcription repressor Bach1. *EMBO J* 20: 2835–
2843

Ong AJS, Bladen CE, Tigani TA, Karamalakis AP, Evason KJ, Brown KK & Cox AG (2023)
The KEAP1-NRF2 pathway regulates TFEB/TFE3-dependent lysosomal biogenesis.
Proc Natl Acad Sci U S A 120: e2217425120

Oyake T, Itoh K, Motohashi H, Hayashi N, Hoshino H, Nishizawa M, Yamamoto M & Igarashi
K (1996) Bach proteins belong to a novel family of BTB-basic leucine zipper
transcription factors that interact with MafK and regulate transcription through the NF-
E2 site. *Mol Cell Biol* 16: 6083–6095

Park S, Park J-H, Jung H-J, Jang J-H, Ahn S, Kim Y, Suh P-G, Chae S, Yoon JH, Ryu SH, *et*
al (2018) A secretome profile indicative of oleate-induced proliferation of HepG2
hepatocellular carcinoma cells. *Exp Mol Med* 50: 1–14

Parviz F, Matullo C, Garrison WD, Savatski L, Adamson JW, Ning G, Kaestner KH, Rossi
JM, Zaret KS & Duncan SA (2003) Hepatocyte nuclear factor 4alpha controls the

development of a hepatic epithelium and liver morphogenesis. *Nat Genet* 34: 292–
296

Pyun J, McInnes LE, Donnelly PS, Mawal C, Bush AI, Short JL & Nicolazzo JA (2022)
Copper bis(thiosemicarbazone) complexes modulate P-glycoprotein expression and
function in human brain microvascular endothelial cells. *J Neurochem* 162: 226–244

Rao X, Huang X, Zhou Z & Lin X (2013) An improvement of the 2ˆ(-delta delta CT) method
for quantitative real-time polymerase chain reaction data analysis. *Biostat Bioinform*
Biomath 3: 71–85

Rawat V, DeLear P, Prashanth P, Ozgurses ME, Tebeje A, Burns PA, Conger KO, Solís C,
Hasnain Y, Novikova A, *et al* (2024) Drug screening in human physiologic medium
identifies uric acid as an inhibitor of rigosertib efficacy. *JCI Insight* 9

Sanghvi VR, Leibold J, Mina M, Mohan P, Berishaj M, Li Z, Miele MM, Lailler N, Zhao C, de
Stanchina E, *et al* (2019) The Oncogenic Action of NRF2 Depends on De-glycation
by Fructosamine-3-Kinase. *Cell* 178: 807-819.e21

Sekiya S & Suzuki A (2011) Direct conversion of mouse fibroblasts to hepatocyte-like cells
by defined factors. *Nature* 475: 390–393

Senkowski W, Gall-Mas L, Falco MM, Li Y, Lavikka K, Kriegbaum MC, Oikkonen J, Bulanova
D, Pietras EJ, Voßgröne K, *et al* (2023) A platform for efficient establishment and
drug-response profiling of high-grade serous ovarian cancer organoids. *Dev Cell* 58:
1106-1121.e7

Shen M, Goforth JB & Eisenstein RS (2023) Iron-dependent post transcriptional control of
mitochondrial aconitase expression. *Metallomics* 15

Smyth GK (2005) limma: Linear Models for Microarray Data. In *Bioinformatics and*
Computational Biology Solutions Using R and Bioconductor pp 397–420. New York:
Springer-Verlag

Sun J, Hoshino H, Takaku K, Nakajima O, Muto A, Suzuki H, Tashiro S, Takahashi S,
Shibahara S, Alam J, *et al* (2002) Hemoprotein Bach1 regulates enhancer availability
of heme oxygenase-1 gene. *EMBO J* 21: 5216–5224

Tardito S, Oudin A, Ahmed SU, Fack F, Keunen O, Zheng L, Miletic H, Sakariassen PØ,
Weinstock A, Wagner A, *et al* (2015) Glutamine synthetase activity fuels nucleotide
biosynthesis and supports growth of glutamine-restricted glioblastoma. *Nat Cell Biol*
17: 1556–1568

Vande Voorde J, Ackermann T, Pfetzer N, Sumpton D, Mackay G, Kalna G, Nixon C, Blyth K,
Gottlieb E & Tardito S (2019) Improving the metabolic fidelity of cancer models with a
physiological cell culture medium. *Sci Adv* 5: eaau7314

Wei X, Guo J, Li Q, Jia Q, Jing Q, Li Y, Zhou B, Chen J, Gao S, Zhang X, *et al* (2019) Bach1
regulates self-renewal and impedes mesendodermal differentiation of human
embryonic stem cells. *Sci Adv* 5: eaau7887

Wickham H (2016) ggplot2: Elegant Graphics for Data Analysis Cham: Springer International
Publishing

Wiel C, Le Gal K, Ibrahim MX, Jahangir CA, Kashif M, Yao H, Ziegler DV, Xu X, Ghosh T,
Mondal T, *et al* (2019) BACH1 Stabilization by Antioxidants Stimulates Lung Cancer
Metastasis. *Cell* 178: 330-345.e22

Yang S, Ooka M, Margolis RJ & Xia M (2023) Liver three-dimensional cellular models for
high-throughput chemical testing. *Cell Rep Methods* 3: 100432

Yu G, Wang L-G, Han Y & He Q-Y (2012) clusterProfiler: an R package for comparing
biological themes among gene clusters. *OMICS* 16: 284–287

Zhang Z-L, Liu G-C, Peng L, Zhang C, Jia Y-M, Yang W-H & Mao L (2018) Effect of PAK1
gene silencing on proliferation and apoptosis in hepatocellular carcinoma cell lines
MHCC97-H and HepG2 and cells in xenograft tumor. *Gene Ther* 25: 284–296

Zhuang X, Wang Q, Joost S, Ferrena A, Humphreys DT, Li Z, Blum M, Krause K, Ding S,
Landais Y, *et al* (2025) Ageing limits stemness and tumorigenesis by reprogramming
iron homeostasis. *Nature* 637: 184–194

Zinoni F, Birkmann A, Stadtman TC & Böck A (1986) Nucleotide sequence and expression of
the selenocysteine-containing polypeptide of formate dehydrogenase (formate-
hydrogen-lyase-linked) from Escherichia coli. *Proc Natl Acad Sci U S A* 83: 4650–
4654