# 1 Fumarate is an epigenetic modifier that elicits epithelial-to-

## 2 mesenchymal transition

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Mutations of the tricarboxylic acid cycle (TCA cycle) enzyme fumarate hydratase (FH) 25 cause Hereditary Leiomyomatosis and Renal Cell Cancer (HLRCC)<sup>1</sup>. FH-deficient renal 26 cancers are highly aggressive and metastasise even when small, leading to an abysmal 27 28 clinical outcome<sup>2</sup>. Fumarate, a small molecule metabolite that accumulates in FHdeficient cells, plays a key role in cell transformation, making it a bona fide 29 oncometabolite<sup>3</sup>. Furnarate was shown to inhibit  $\alpha$ -ketoglutarate (aKG)-dependent 30 dioxygenases involved in DNA and histone demethylation<sup>4,5</sup>. However, the link between 31 fumarate accumulation, epigenetic changes, and tumorigenesis is unclear. Here we show 32 33 that loss of FH and the subsequent accumulation of fumarate elicits an epithelial-tomesenchymal-transition (EMT), a phenotypic switch associated with cancer initiation, 34 invasion, and metastasis<sup>6</sup>. We demonstrate that fumarate inhibits Tet-mediated 35 demethylation of a regulatory region of the antimetastatic miRNA cluster<sup>6</sup> miR-200ba429, 36 37 leading to the expression of EMT-related transcription factors and enhanced migratory properties. These epigenetic and phenotypic changes are recapitulated by the incubation 38 of FH-proficient cells with cell-permeable fumarate. Loss of FH is associated with 39 suppression of miR-200 and EMT signature in renal cancer patients, and is associated 40 with poor clinical outcome. These results imply that loss of FH and fumarate 41 accumulation contribute to the aggressive features of FH-deficient tumours. 42

To identify oncogenic features associated with FH loss we performed unbiased proteomics analyses of mouse (*Fh1*-/-) and human (UOK262) FH-deficient cells<sup>7</sup> (Extended Data Fig. 1). We found that vimentin, a known EMT marker, is the most overexpressed protein in these cells, compared to FH-proficient counterparts (Fig. 1a). Gene expression profiling (Fig. 1b) followed by Gene Set Enrichment Analysis (GSEA)<sup>8</sup> confirmed an enrichment of EMT-related genes in FH-deficient cells (Extended Data Fig. 2 and Extended Data Fig. 3a, respectively). The reintroduction of full-length *Fh1* (*pFh1*) in *Fh1*-/- cells (Extended Data Fig. 1a-e) was 50 sufficient to rescue the EMT signature (Extended Data Fig. 2a and Extended Data Fig. 2c), to abolish vimentin expression (Fig. 1c-e), and to restore expression of E-Cadherin (Fig. 1c-d), a 51 key epithelial marker.  $Fh1^{-/-}+pFh1$  cells acquired an epithelial morphology (Extended Data 52 Fig. 1e) and their motility was reduced compared to that of Fh1-deficient cells (Fig. 1f-g). 53 UOK262 cells exhibited a strong Vimentin expression (Extended Data Fig. 3b-d), and 54 increased migration (Extended data Fig. 3e) compared to UOK262pFH. However, localisation 55 56 of E-Cadherin at the plasma membrane was not observed in UOK262pFH (Extended Data Fig. 3d). 57

EMT is orchestrated by several transcription factors, including Twist, Snai1, Snai2, and 58 Zeb1/2 (ref 9). Twist, which is activated by the Hypoxia-Inducible Factor HIF1 (ref 10), a key 59 player in FH-deficient tumours<sup>11</sup>, was elevated in Fh1-deficient cells (Fig. 1h). The silencing 60 of HIF1B, the constitutively expressed subunit of HIFs required for their transcriptional 61 activity<sup>12</sup>, failed to reduce the expression of EMT markers (Extended Data Fig. 4a-b), 62 suggesting that EMT in Fh1-deficient cells is likely HIF-independent. Snai2, Zeb1 and Zeb2 63 64 were also induced in Fh1-deficient cells, and their expression was reverted by Fh1 re-65 expression in these cells (Fig. 1h-i). Zeb2 expression was also decreased upon FH restoration in UOK262 cells (Extended Data Fig. 3f). Snai2 and Zeb1/2 are suppressed by antimetastatic 66 67 miRNAs miR-200ba429 and the miR-200c141 (ref 6). miRNA profiling revealed that miR-200 family members were among the most down-regulated miRNAs in Fh1-deficient cells (Fig. 68 2a). Suppression of MIR-200 was also observed in UOK262 cells compared to the non-69 transformed counterpart HK2 and partially restored by FH re-expression (Extended Data Fig. 70 3g-h). qPCR confirmed the miRNA profiling results and showed that the reconstitution of Fh1 71 in Fh1-deficient cells restored the expression levels of miR-200a and miR-200b and, in part, 72 that of miR-200c and miR-141 (Fig. 2b). We hypothesised that the partial restoration of miR-73 200c141 could be ascribed to the residual fumarate in  $Fh1^{-/-}+pFh1$  cells (Extended Data Fig. 74

1c and Extended Data Fig. 5b), which could also explain the partial recovery of the EMT gene signature (Extended Data Fig. 2a-c). Blunting fumarate levels by re-expressing high levels of Fh1 in  $Fh1^{-/-}$  cells rescued their phenotype (Extended Data Fig. 5b-g) and led to a full reactivation of the entire *miR-200* family (Extended Data Fig. 5h), indicating that members of this family have a different susceptibility to fumarate. The incomplete rescue of fumarate levels in UOK262pFH (ref 7) could also explain the partial restoration of *MIRNAs* and some EMT markers in these cells.

Since *miR-200ba429* expression was fully restored in *Fh1*<sup>-/-</sup>+*pFh1* and its expression 82 was sufficient to suppress vimentin and rescue E-cadherin expression in Fh1-deficient cells 83 (Fig. 2c), we investigated the role of this miRNA cluster in Fh1-dependent EMT. Repression 84 of *miR-200* is associated with its epigenetic silencing via CpG island hypermethylation<sup>13</sup>, 85 which can also be caused by downregulation of Tets<sup>14,15</sup>. We hypothesised that fumarate could 86 cause suppression of miR-200ba429 by inhibiting their Tets-mediated demethylation. The 87 combined silencing of *Tet2* and *Tet3*, the most abundant Tets isoform in *Fh1*<sup>fl/fl</sup> cells (Extended 88 89 Data Fig. 6a), but not the inhibition of aKG-dependent histone demethylases with GSK-J4 (ref 16), decreased miRNAs and E-Cadherin expression (Extended Data Fig. 6b-e), highlighting 90 the role of Tets in regulating EMT, in line with previous findings<sup>14,15</sup>. Genome Browser<sup>17</sup> view 91 92 of an ENCODE dataset generated in mouse kidney cells revealed a conserved CpG island at the 5' end of miR-200ba429, CpG43, that is enriched in binding sites for Tets and for lysine-93 methylated histone H3 (Extended Data Fig. 7a). Chromatin immunoprecipitation (ChIP) 94 experiments showed that a region adjacent to CpG43 is enriched for the repressive marks 95 H3K9me2 and H3K27me3 and depleted of the permissive marks H3K4me3 and H3K27Ac in 96 Fh1-deficient cells (Extended Data Fig. 7b) in the absence of changes in H3K4 and H3K27 97 methylation among the four cell lines (Extended data Fig. 7c). Chromosome Conformation 98 Capture (3C) analysis<sup>18</sup> identified a physical association between this regulatory region and the 99

100 transcription starting site of miR-200ba429, which sits in the intronic region of the gene Ttl10 (Extended Data Fig. 7d). This region was hypermethylated in Fh1-deficient cells and the re-101 expression of Fh1 restored its methylation levels (Fig. 2d and Extended Data Fig. 7e). Binding 102 103 of Tets to the CpG43 was comparable among the cell line tested (Extended Data Fig. 7f), suggesting that the changes in methylation of this region are, at least in part, caused by 104 inhibition of Tets enzymatic activity rather than by their differential binding to chromatin. 105 106 Consistently, 5-hydroxymethylcytosine (5hmc), the product of oxidation of 5-methylcytosine by Tets<sup>15</sup>, was significantly decreased in Fh1-deficient cells (Extended Data Fig. 7g). 107

Incubating cells with dimethyl aKG (DM-aKG), a cell-permeable derivative of aKG, 108 known to reactivate aKG-dependent dioxygenases<sup>19</sup>, restored the expression miR-200a in Fh1-109 deficient cells (Extended Data Fig. 6f). Conversely, treating  $Fh I^{fl/fl}$  and human FH-proficient 110 epithelial kidney cells HK2 with monomethyl fumarate (MMF), a cell permeable derivative of 111 fumarate triggered profound phenotypical (Extended Data Fig. 8a) and (epi)genetic (Fig. 3a-g) 112 changes that resembled those of FH-deficient cells. However, we could not observe induction 113 of *Snai2* that we observed in  $Fh1^{-/-}$  cells (Fig. 1h) and changes in *Vimentin* in HK2 cells, which 114 is expressed in these cells<sup>22</sup>, despite their epithelial origin. MMF did not cause mitochondrial 115 dysfunction but lead to a typical fumarate-dependent metabolic signature, characterised in both 116 117 cell types by accumulation of fumarate and fumarate-derived succinic-GSH (succGSH) and succinic-cysteine (2SC) that we and others recently described<sup>20,21</sup> (Extended Data Fig. 8b-c and 118 SI Table 3). To rule out the possibility that by-products of fumarate accumulation, rather than 119 fumarate itself, elicit EMT we analysed the effects of accumulation of succinate, another 120 metabolite that can inhibit Tets<sup>3-5</sup>, but cannot promote succination. Since we could not increase 121 succinate levels with the cell permeable dimethyl succinate (Extended Data Fig. 9a) we used 122 succinate dehydrogenase b (Sdhb)-deficient cell lines<sup>23</sup>, which accumulate succinate but not 123 fumarate by-products, including succGSH (Extended Data Fig. 9b-c). These cells exhibited 124

striking mesenchymal features (Extended Data Fig. 9d-e), and epigenetic suppression of the miR-200ba429 family (Extended Data Fig. 9f-g), in line with the hypermethylation phenotype and EMT signature recently observed in SDH-deficient cells<sup>24</sup>.

We next investigated the link between FH loss, fumarate accumulation and EMT in 128 renal cancer samples. Vimentin was highly expressed and E-Cadherin was decreased in a 129 previously published dataset<sup>25</sup> of HLRCC tumour samples, when compared to normal tissue 130 131 (Extended Data Fig. 10a). Two HLRCC tumours that we profiled (Fig. 4a), exhibited decreased 5hmC levels (Fig. 4b) despite comparable TETs levels (Extended Data Fig. 10b), MIR-200 132 suppression (Fig. 4c), a marked Vimentin staining and loss of E-Cadherin (Extended Data Fig. 133 10b), compared to matched normal tissue. We also took advantage of data from a collection of 134 papillary renal-cell carcinoma (KIRP), a tumour type associated with loss of FH<sup>26</sup>. These 135 tumours exhibited a partial EMT signature (Extended Data Fig. 10c) and downregulation of 136 MIR-200 (Extended Data Fig. 10d). FH levels were positively correlated with patients' survival 137 (Extended Data Fig. 10e) in line with the poor prognosis associated with EMT<sup>6</sup>. The five FH-138 mutant tumours in this cohort exhibited overexpression of Vimentin and suppression of E-139 140 Cadherin (Extended Data Fig. 10f), hypermethylation and suppression of MIR-200A and MIR-200B (Fig. 4d-e) in the absence of TETs mutations (Extended Data Fig. 10g). These tumours 141 142 were associated with the worst prognosis among papillary cancers (Extended Data Fig. 10h). FH mRNA was also significantly decreased in a panel of clear cell renal carcinoma (KIRC)<sup>27</sup> 143 (Extended Data Fig. 10i) and its levels negatively correlated with Vimentin (Pearson correlation 144 coefficient of -0.5, p-value < 1e-5; Fig. 4f) and positively with *E-Cadherin* (Pearson correlation 145 coefficient of 0.22, p-value < 1e-5; Fig. 4g), and were positively correlated with patients' 146 survival (Extended Data Fig. 10k), confirming the role of FH in tumour malignancy and patient 147 outcome. 148

149		Our results report a novel link between the loss of FH and epigenetic suppression of
150	miR-200 mediated by fumarate (see Extended Data Fig. 1f for a schematic). Although other	
151	mechanisms could contribute to fumarate-driven EMT, our findings offer an explanation for	
152	the suppression of MIR-200 in papillary and clear-cell renal carcinoma and the expression of	
153	EMT-related transcription factors, including ZEB2, in KIRC <sup>28</sup> . Our data imply that	
154	dysregulation of FH activity and fumarate accumulation have roles in EMT induction and may	
155	feature in other tumour types where FH loss has been reported, including neuroblastoma <sup>29</sup> ,	
156	colorectal and lung cancer <sup>30</sup> .	
157	Online Content. Methods, along with additional Extended Data display items and Source Data, are available in	
158	the online version of the paper; references unique to these sections appear only in the online paper.	
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268 Author Contributions M.S. and C.F. conceived the study. M.S. performed and analysed all the experiments on

cell lines with the help of A.V.D.; S.A.; and S.J.T.; and prepared the figures. E.Go. performed the

270 bioinformatics analyses with the supervision on J.S-R. I.T.J. helped M.S. with the invasion assays and

271 generation of constructs for miRNA and Fh1-GFP expression. V.Z. performed and analysed ChIP-PCR assays.

- A.S.C. performed and analysed all the metabolomics analyses with the help of E.G.. M.T. performed the work
- on human samples with input from P.H.M. A.W.; V.G.; P.H.M.; and E.M. provided the HLRCC samples. V.R
- and P.C. performed the proteomics analyses. H.Y. and B.H. supervised and performed the 3C experiments. S.C.
- and E.G provided Sdhb-deficient cells and generated the gene expression profile of these cells. S.F. and K.F.
- 276 performed cell motility assays. C.F. directed the research, prepared the figures and wrote the paper, with
- assistance from all other authors.

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- cells are deposited at Array Express (<u>www.ebi.ac.uk/arrayexpress</u>, accession number A-AFFY-130).
- 283 Figure Legends

284 Figure 1. FH-deficient cells display mesenchymal features. a, b, Volcano plots of proteomics (a) and RNA-seq (b) experiments. FDR = false discovery rate. c, d, mRNA 285 expression measured by qPCR (c) and protein levels measured by western blot (d) of EMT 286 287 markers. e, Immunofluorescence staining for vimentin and E-cadherin. Scale Bar = 25  $\mu$ m. f, Cells migration assay. Data indicate cell index at 17 hours. Results were obtained from 4 (Fh1 288 -/-+pFh1) or 3 replicate wells and presented as mean  $\pm$  S.D. p-value was calculated using One 289 way-ANOVA. g, Average speed of cells. p-value was calculated using Mann-Whitney test. 290 Results were obtained from 3 independent cultures. h, mRNA expression of EMT-related 291 transcription factors measured by qPCR. i, Western blot analysis of Zeb1. Calnexin was used 292 as loading control. All qPCR results were obtained from 3 independent cultures and presented 293 as RQ with max values, normalised for  $\beta$ -actin. p-values was calculated using unpaired t-test. 294 \*P  $\leq 0.05$ , \*\*P  $\leq 0.01$ , \*\*\*P  $\leq 0.001$ , \*\*\*\*P  $\leq 0.0001$ . For western blot source data, see 295 Supplementary Figure 1. For Raw data see SI Table 2. 296

Figure 2. Loss of Fh1 triggers epigenetic suppression of *miR-200*. **a**, Volcano plot of miRNA profiling. **b**, miRNAs expression measured by qPCR. Date were normalised to *Snord95*. **c**, miRNAs and EMT markers expression in *Fh1*<sup>-/-</sup> cells expressing *miR-200ba429*.  $\beta$ -actin and *Snord95* were used as endogenous control for mRNA and miRNA, respectively. NTC= non-targeting control. **d**, Methylation-specific PCR of *CpG43*. U = un-methylated; M = methylated CpG island. The *miR-200ba429* cluster (blue) and *CpG43* (green) are represented in the schematic. qPCR results were obtained from at least 3 independent cultures and presented as RQ with max values. p-values was calculated using unpaired t-test. \*P  $\leq 0.05$ , \*\*P  $\leq 0.01$ , \*\*\*P  $\leq 0.001$ , \*\*\*\*P $\leq 0.0001$ . For gel source data, see Supplementary Figure 1. For Raw data see SI Table 2.

**Figure 3. Fumarate triggers EMT in FH-proficient cells.** miRNA methylation (**a**) and expression (**b**, **e**); EMT transcription factors (**c**, **f**) and EMT markers (**d**, **g**) levels from MMFtreated cells. Results were obtained from 3 independent cultures. qPCRs are presented as RQ with max values, normalised for *Snord95* (mouse) or *SNORD95* (human) for miRNAs, and for  $\beta$ -actin for mRNA. p-values were calculated using unpaired t-test. \*P  $\leq 0.05$ , \*\*P  $\leq 0.01$ , \*\*\*P  $\leq 0.001$ , \*\*\*\*P $\leq 0.0001$ . For gel source data, see Supplementary Figure 1. For Raw data see SI Table 2.

Figure 4. Loss of FH correlates with EMT signature in renal cancers. a-c, Metabolomic
analysis (a), 5hmc levels in DNA (b), and MIRNAs expression (c) in tumour samples from
two HLRCC patients. Results were obtained from 4 technical replicates per sample. qPCRs are
presented as RQ with max values, normalised for *RNU6B* and *SNORD61*. d, e, Expression
levels (d), and promoter methylation (e) of the indicated *MIRNAs* in KIRP patients f, g, *Vimentin* (f) and *E-Cadherin* (g) expression in clear cell renal cell carcinoma (KIRC) patients.
For Raw data see SI Table 2.

### 321 METHODS

### 322 No statistical methods were used to predetermine sample size.

323 Cell culture

*Fh1*-proficient (*Fh1*<sup>*fl/fl*</sup>), and the two Fh1-deficient clones (*Fh1*<sup>-/-CL1</sup>, and *Fh1*<sup>-/-CL19</sup>) cells were obtained as previously described<sup>7</sup>. *Fh1*<sup>-/-</sup>+*pFh1* were single clones generated from *Fh1*<sup>-/-CL19</sup> after stable expression of a plasmid carrying mouse wild-type *Fh1* gene (Origene, MC200586). Mouse cells were cultured using DMEM (Gibco-41966-029) supplemented with 10% heat

inactivated serum (Gibco-10270-106) and 50  $\mu g~x~mL^{\text{-1}}$  uridine. Genotyping of cells was 328 assessed as previously described<sup>7</sup>. Human FH-deficient (UOK262) and FH-restored 329 (UOK262pFH) were obtained as previously described<sup>7</sup> and cultured in DMEM (Gibco-41966-330 029) supplemented with 10% serum heat inactivated (Gibco-10270-106). HK2 cells were a gift 331 from the laboratory of E.R.M. These cells were authenticated by Short Tandem Repeat and 332 cultured in DMEM (Gibco-41966-029) supplemented with heat inactivated 10% serum. All 333 334 cell lines have been tested for mycoplasma contamination using MycoProbe® Mycoplasma Detection Kit (R&D Systems CUL001B), and were confirmed mycoplasma-free. 335

### 336 Generation of *Fh1*<sup>-/-</sup>+*pFh1*-*GFP* cells

Fh1-GFP vector was generated by amplifying wild-type Fh1 sequence using cDNA generated 337 from *Fh1<sup>fl/fl</sup>* cells by PCR. Restriction overhangs (KpnI, EcoRI) were included in the primer 338 sequence allowing for restriction enzyme cloning of Fh1 into the backbone vector pEF1 $\alpha$ -339 V5/His (Life Technology). We then used a two-step PCR "restriction-free" method to swap the 340 341 V5-His sequence within pEF1α with the AcGFP sequence to yield a fusion protein, Fh1-GFP. 1x10<sup>5</sup> Fh1<sup>-/- CL1</sup> cells were plated onto 6-well plate and the day after transfected with Fh1-GFP 342 vector using Lipofectamine 2000 following manufacturer's instructions. After 2 weeks, cells 343 were sorted for GFP expression and the medium-expressing population was maintained in 344 culture and amplified. pEF1a-GFP empty vector was used as control. Primers for cloning are 345 listed in SI Table 1. 346

### 347 Short hairpin RNA (shRNA) interference experiments

Lentiviral particles for shRNA delivery was obtained as previously described<sup>7</sup> from the filtered growth media of  $2x10^6$  HEK293T transfected with 3 µg psPAX, 1 µg pVSVG and 4 µg of the plasmid of interest using Lipofectamine 2000/3000 (Life Technology).  $1x10^5$  cells of the indicated genotype were then plated onto 6-well plates and infected with the viral supernatant in the presence of 4 µg x mL<sup>-1</sup> polybrene. After two days, the medium was replaced with selection medium containing 1  $\mu$ g x mL<sup>-1</sup> puromycin. pGIPZ vectors for shRNA against mouse *HIF1β* (RMM4532-EG11863), *Tet2* (RMM4532-EG214133), and *Tet3* (RMM4532-EG194388) were purchased from GE Healthcare UK. pLenti 4.1 Ex for expression of microRNAs was purchased from Addgene (Plasmid #35533 and #35534). pLenti 4.1 Ex scrambled vector was generated cloning a scrambled DNA sequence taken from a commercially available vector (pCAG-RFP-miR-Scrint Addgene no. 198252) into the empty backbone.

### 360 **RNA extraction and real time PCR**

Cells were plated the day before the experiments onto 6-well plates  $(3x10^5)$  or 12-well plates 361 (1x10<sup>5</sup>). Total RNA was isolated using RNeasy Kit (Qiagen). miRCURY<sup>™</sup> RNA Isolation Kit 362 (Exigon, Denmark) was used for microRNAs extraction. RNA isolation was carried following 363 manufacturer's protocols. RNA was quantified using the fluorimeter Qubit 2.0 (Life 364 365 Technologies) following manufacturer's instructions or Nanodrop (Thermo). Reverse transcription of RNA was performed using Quantitect-Reverse transcription kit (Qiagen) or 366 miScript PCR kit (Qiagen) using 300-500 ng of total RNA. Real time qPCR was performed 367 using Quantitect Syber Green master mix (Qiagen) or Taqman universal mix (Life Technology) 368 on a Step One Plus real-time PCR system (Life Technology). Experiments were analysed using 369 370 the software Expression Suite (Life Technology) and StepOne software 2.3 and Relative quantification (RQ) with max and min values (RQ max and RQ min) were calculated using 371 S.D. algorithm. Statistical analysis was performed using Expression Suite software on at least 372 373 three independent cultures. Housekeeping genes used for internal normalisation are  $\beta$ -Actin for mRNA and Snord95 Snord61 and RNU6B, for miRNAs. The primers were designed using 374 ProbeFinder- Roche or purchased by Qiagen and are listed in SI Table 1. 375

### 376 miRNA methylation analyses

5x10<sup>5</sup> cells were plated onto 6-cm dishes. Their genomic DNA was extracted using DNeasy kit
(Qiagen), and purified using DNA Cleaning and Concentrator kit (Zymo Research) following
manufacturer's instructions. 20 ng/well of genomic DNA, quantified using Qubit, were
digested using OneStep qMethyl kit (Zymo Research) following manufacturer's protocol.
Primers used are listed in the SI Table 1.

For methyl specific PCR (MSP) assay 500 ng of purified DNA were bisulphate converted using the EZ-DNA Methylation-direct kit (Zymo Research) following manufacturer's datasheet. 50 ng of bisulphate-converted DNA, quantified using Nanodrop spectrofluorimeter, were used for PCR reaction with AmpliTaq Gold (Life Technology) following manufacturer's protocol. The number of amplification cycles used was thirty. Methylation specific primers were designed using MethPrimer<sup>31</sup> (http://www.urogene.org/cgi-bin/methprimer/methprimer.cgi) and are listed in the SI Table 1.

### 389 Migration assay

Migration experiments were performed using xCELLigence instrument (ACEA Biosciences). In brief,  $5x10^4$  cells were plated onto CIM plates in medium supplemented with 1% FBS. Complete medium with 20% FBS was used as chemo attractant. Migration was registered in real time for at least 24 hours and cell index was calculated using the appropriate function of the xCELLigence software.

395 Motility assay

 $5x10^4$  mouse cells of the indicated genotype were plated the day before the experiment onto 6cm dishes. The day after, medium was replaced with fresh medium containing Hoechst (Sigma-Aldrich) and cells were incubated for 15 minutes at 37°C with 5% CO<sub>2</sub> before starting recording. Images were collected every minute for 3 hours using a Zeiss Axiovert 200M 400 microscope with a 10x objective. Analysis of cells movement was performed using cell tracker 401 (www.celltracker.website) implemented in MATLAB (MATLAB R2013b, The MathWorks 402 Inc., 2013) as previously described<sup>32</sup>. Three replicates were analysed for each cell type. All 403 tracks were examined and those belonging to non-isolated cells deleted. Average speed for 404 each cell was calculated as the sum length of the cell's trajectory divided by the total time over 405 which the trajectory was measured. Since the data were not normally distributed (Shapiro-Wilk 406 test), a Mann-Whitney test was used to compare the average speeds of the cells.

### 407 Oxygen consumption rate and Extracellular acidification rate measurements

Oxygen Consumption Rate (OCR) and Extracellular Acidification Rate (ECAR) were 408 409 measured using the real time flux analyser XF-24e (Seahorse Bioscience) as previously described<sup>7</sup>. In brief,  $4x10^4$  cells were left untreated and then treated with 1  $\mu$ M Oligomycin, 2 410 µM Carbonyl cyanide-p-trifluoromethoxyphenylhydrazone (FCCP), Rotenone and Antimycin 411 A (both 1 µM) (all purchased from Sigma-Aldrich). At the end of the run cells were lysed using 412 RIPA buffer (25 mM Tris/HCl pH 7.6, 150 mM NaCl, 1% NP-40, 1% sodium deoxycholate, 413 0.1% SDS). Protein content for each well was measured using BCA kit (Pierce) following 414 manufacturer's instruction. OCR and ECAR are normalised to total protein content were 415 416 indicated.

### 417 Immunofluorescence experiments

418  $5x10^4$  cells were plated onto chamber slides (Lab Tech), cultured in standard condition 419 overnight and then fixed using 100% methanol for 2 minutes at -20°C. After two washes in 420 PBS, cells were permeabilised and incubated with blocking solution (BSA 2%, 0.1% Triton X-421 100, 0.1% Tween 20 in PBS) for 30 minutes at room temperature. Cells were then incubated 422 with the primary antibody (overnight at 4°C). For 5hmc staining, cells were grown on 423 coverslips onto a 12-well plate. Cells were then fixed with 4% PFA in PBS for 15 minutes at 424 room temperature, washed three times in PBS and then incubated for 15 minutes with 0.4%

Triton X-100 in PBS. After three washes in PBS, cells were denaturated using a solution of 2 425 M HCl for 15 minutes at room temperature and neutralised using 100 mM Tris pH.8, for 5 426 minutes. After three washes in PBS, cells were incubated with blocking solution (5% FBS, 427 428 0.1% Triton X-100, 0.1% Tween 20 in PBS) for 1 hour and then primary antibody was added at 4°C overnight. After three washes in PBS, cells were incubated with secondary antibody 429 during 2 hours at room temperature and then slides or coverslips were mounted (Vectashield 430 431 with DAPI) and images taken using Leica confocal microscope TCS SP5 using 20X or 40X objectives. Laser intensity, magnification, and microscope settings per each channel were 432 433 maintained equal throughout the different experimental conditions. Antibodies used are listed in SI Table 1. 434

### 435 Protein lysates and Western Blot

Cell lysates were prepared in RIPA buffer. Protein content was measured using BCA kit 436 437 (Pierce) following manufacturer's instructions. 50-100 µg of proteins were heated at 70°C for 10 minutes in presence of Bolt Loading Buffer 1x supplemented with 4% β-mercaptoethanol 438 (Sigma). Samples were then loaded onto Bolt Gel 4-12% Bis-Tris (Life Technology) and run 439 using MOPS 1x or MES 1x buffer at 165 V constant for 40 minutes. Dry transfer of the gels 440 was carried using IBLOT2 system (Life Technology). Membranes were then incubated in 441 442 blocking buffer (5% BSA or 5% milk in TBS 1x + 0.01 % Tween 20) for one hour at room temperature. Primary antibodies in blocking buffer were incubated overnight at 4°C. Secondary 443 antibodies (conjugated with 680 or 800 nm fluorophores from Li-Cor) were diluted 1:2000 in 444 445 blocking buffer and incubated for one hour at room temperature. Images were acquired using Odyssey software (Li-Cor). Primary antibodies are listed in SI Table 1. 446

### 447 Chronic treatment of mouse and human cells

448  $FhI^{fl/fl}$  cells were cultured either with 200  $\mu$ M monomethyl-fumarate (MMF, Sigma-Aldrich)

for 2 weeks and then with 400  $\mu$ M MMF for the following 6 weeks, or with 4 mM monomethyl-

450 succinate (MMS, Sigma-Aldrich) for 8 weeks. HK2 cells were cultured with MMF 400  $\mu$ M for 451 8 weeks. *Fh1*<sup>-/-</sup> cells were treated with the indicated doses of dimethyl aKG (DM-aKG, Sigma-452 Aldrich). *Fh1*<sup>fl/fl</sup> cells were treated with histone demethylase inhibitor GSKJ4 (Tocris) 1  $\mu$ M 453 for 8 weeks. MMF, MMS and GSKJ4 were added twice a week after passaging the cells.

### 454 Chromatin immunoprecipitation (ChIP)-real time PCR (ChIP-PCR)

455 ChIP was performed as previously described<sup>33</sup>. Enrichment was determined by Real-time PCR 456 and ChIP signal was normalised to input, IgG only ChIP and negative control (genomic region 457 devoid of histone markers). For Tets ChIP-PCR, the signal was normalised over input and IgG 458 ChIP, as Tet-specific genomic negative controls are not as readily identifiable. Antibodies and 459 primers for ChIP-PCR are indicated in SI Table 1.

### 460 Chromatin Conformation Capture assay (3C)

3C assay coupled with quantitative PCR (qPCR) was performed as previously described<sup>18</sup>. In 461 brief, 10<sup>7</sup> cells were crosslinked with 1% formaldehyde for 10 minutes at room temperature 462 and were quenched with glycine. Cells were then lysed by dounce homogenization in ice-cold 463 lysis buffer (10 mM Tris-HCl pH 8.0, 10 mM NaCl, 0.2% Igepal CA-630, all from Sigma) 464 supplemented with protease inhibitor (Roche). Cells were then washed in 1.2x NEB buffer 2 465 (New England Biolabs). Non-crosslinked proteins were removed with SDS (Sigma- Aldrich) 466 and were then quenched with Triton X-100. Chromatin was digested overnight with EcoR I 467 restriction enzyme (New England Biolabs). Afterwards EcoR I was inactivated by heating at 468 65°C for 20 minutes. In-nuclear DNA ligation was performed at 16°C for 4 hours in the mixture 469 containing 1x T4 DNA ligase buffer (New England Biolabs), 10 mg/ml BSA (New England 470 471 Biolabs), and  $1U/\mu L$  T4 DNA ligase (Invitrogen). Ligation mixture was then incubated with Proteinase K (Roche) at 65°C overnight to reverse the crosslinking and was incubated with 472 473 RNase A (Roche) at 37°C for 1 hour. DNA was purified with Phenol (pH 8.0, Sigma) once and

474 then with Phenol:Chloroform:Isoamyl Alcohol (25:24:1, pH 8.0, Sigma), followed by ethanol precipitation by adding 2.5 volume of ice-cold 100% ethanol and 1/10 volume of 3 M sodium 475 acetate (pH 5.2, Lonza). DNA pellet was washed with 70% ethanol twice and was eventually 476 477 dissolved in 100 µL distilled water. The concentration of 3C DNA was determined by Qubit dsDNA HS assays (Invitrogen). 100 ng DNA was taken to run qPCR in duplicate wells for 478 each 3C sample, using Taqman Universal PCR Master Mix (Applied Biosystems) and specific 479 Taqman primers and probes on ABI 7900 (Applied Biosystems) following manufacturer's 480 instruction. Data were analysed as recommended<sup>18</sup> and were normalized to the internal loading 481 482 control of Gapdh locus. Calculation of primers location was based on the transcription start site (TSS) of *Ttll10* transcript (ENSMUST0000097731). Oligo sequences are listed in the SI 483 484 Table 1.

### 485 Metabolomic analyses

486  $3x10^5$  cells were plated onto a 6-well plate and cultured in standard conditions for 24 hours. Medium was replenished with fresh one and, after 24 hours, intracellular metabolites were 487 extracted as previously described<sup>20</sup>. LCMS analysis was performed on a QExactive Orbitrap 488 mass spectrometer coupled to Dionex UltiMate 3000 Rapid Separation LC system (Thermo). 489 The liquid chromatography system was fitted with either a SeQuant Zic-HILIC column 490 491 (column A, 150 mm  $\times$  4.6 mm, internal diameter 3.5  $\mu$ m), or a SeQuant Zic-pHilic (column B, 150 mm  $\times$  2.1 mm, internal diameter 3.5 µm) with guard columns (20 mm  $\times$  2.1 mm, internal 492 diameter 3.5 µm) both from Merck (Darmstadt, Germany). With column A, the mobile phase 493 was composed by 0.1% aqueous formic acid (solvent A) and 0.1% formic acid in acetonitrile 494 (solvent B). The flow rate was set at 300  $\mu$ L x min<sup>-1</sup> and the gradient was as follows: 0-5 min 495 80 % B, 5-15 min 15 min 30% B, 15-20 min 10 % B, 20-21 min 80% B, hold at 80% B for 9 496 minutes. For column B, the mobile phase was composed of 20 mM ammonium carbonate and 497 0.1% ammonium hydroxide in water (solvent C), and acetonitrile (solvent D). The flow rate 498

was set at 180 µL x min<sup>-1</sup> with the following gradient: 0 min 70% D, 1 min 70% D, 16 min
38% D, 16.5 min 70% D, hold at 70% D for 8.5 minutes. The mass spectrometer was operated
in full MS and polarity switching mode. Samples were randomised, in order to avoid machine
drift, and were blinded to the operator. The acquired spectra were analysed using XCalibur
Qual Browser and XCalibur Quan Browser softwares (Thermo Scientific) by referencing to an
internal library of compounds. Calibration curves were generated using synthetic standards of
the indicated metabolites.

### 506 **Proteomics analysis**

Proteomics experiments were performed using mass spectrometry as reported before<sup>34,35</sup>. In 507 508 brief, cells were lysed in urea lysis buffer (8 M urea, 10 mM Na<sub>3</sub>VO<sub>4</sub>, 100 mM β-Glycerol 509 phosphate and 25 mM Na<sub>2</sub>H<sub>2</sub>P<sub>2</sub>O<sub>7</sub> and supplemented with phosphatases inhibitors-Sigma) and proteins reduced and alkylated by sequential addition of 1 mM DTT and 5 mM iodoacetamide. 510 Immobilised trypsin was then added to digest proteins into peptides. After overnight incubation 511 with trypsin, peptides were desalted by solid phase extraction (SPE) using OASIS HLB 512 columns (Waters) in a vacuum manifold following manufacturer's guidelines with the 513 exception that the elution buffer contained 1 M glycolic acid. 514

Dried peptide extracts were dissolved in 0.1% TFA and analysed by nanoflow LCMS/MS in 515 an LTQ-orbitrap as described before<sup>34,35</sup>. Gradient elution was from 2% to 35% buffer B in 90 516 minutes with buffer A being used to balance the mobile phase (buffer A was 0.1% formic acid 517 518 in water and B was 0.1% formic acid in acetonitrile). MS/MS was acquired in multistage acquisition mode. MS raw files were converted into Mascot Generic Format using Mascot 519 520 Distiller (version 1.2) and searched against the SwissProt database (version 2013.03) restricted to human entries using the Mascot search engine (version 2.38). Allowed mass windows were 521 10 ppm and 600 mmu for parent and fragment mass to charge values, respectively. Variable 522

523 modifications included in searches were oxidation of methionine, pyro-glu (N-term) and phosphorylation of serine, threonine and tyrosine. Results were filtered to include those with a 524 potential for false discovery rate less than 1% by comparing with searches against decoy 525 526 databases. Quantification was performed by obtaining peak areas of extracted ion chromatographs (XICs) for the first three isotopes of each peptide ion using Pescal <sup>36,37</sup>. To 527 account for potential shifts in retention times, these were re-calculated for each peptide in each 528 529 LCMS/MS run individually using linear regression based on common ions across runs (a script written in python 2.7 was used for this retention time alignment step). Mass and retention time 530 531 windows of XICs were 7 ppm and 1.5 minutes, respectively.

### 532 Toray miRNA array

533 Initial sample quality control was performed using a Bioanalyzer 2200 system in conjunction with the Total RNA Nano chip (Agilent, Cheadle UK). 250 ng total RNA were labelled using 534 the miRCURY LNA microRNA Hy5 Power labelling kit (Exiqon, Vedbæk Denmark) 535 according to the Toray array protocol. Samples were hybridized to the Human/Mouse/Rat 536 miRNA 4-plex miRBase v17 array (Toray, London UK) and subsequently scanned using the 537 3D-Gene Scanner 3000 (Toray) according the manufacturer's instructions. Data was 538 normalized according to instructions provided by Toray. Briefly, presence or absence of signals 539 540 was determined using a cut off defined as the mean of the middle 90% of the blank control intensities (background average intensity) +  $2\sigma$ . Positive control signals were removed and the 541 background average intensity subtracted from the signal intensities to give the background 542 543 subtracted signal intensities (y). Normalised signal intensities (NSI) were then calculated as follows:  $NSI = \frac{25y}{y}$ . Raw data are presented in SI Table 4. 544

### 545 Mass spectrometry-based analysis of methylated DNA of HLRCC tumours

546 DNA from healthy and tumour tissue was extracted using DNeasyKit (Qiagen) following 547 manufacturer's instructions. 0.5-1  $\mu$ g of DNA resuspended in 25  $\mu$ L of water was first 548 denatured at 100°C for 30 seconds, cooled on ice, and then added of 2  $\mu$ L of 20 mM ZnSO<sub>4</sub>. 549 DNA was digested at 50°C for 16 hours using 1  $\mu$ L Nuclease P1 (200 units x mL<sup>-1</sup>, Sigma 550 Aldrich) and dephosphorylated at 65°C for 2 hours by adding 1  $\mu$ L of Bacterial alkaline 551 phosphatase BAP (150 U x  $\mu$ L<sup>-1</sup>, Life Technology). pH was then adjusted using 30  $\mu$ L of 0.5 552 M Tris-HCl pH 7.9 for one hour at 37°C.

Analysis of global levels of C, 5hmC and 5mC was performed on a QExactive Orbitrap mass 553 554 spectrometer coupled to a Dionex UltiMate 3000 Rapid Separation LC fitted with an Acquity UHPLC HSS T3 column (100 x 2.1 mm, 1.8 µm particle size). The mobile phase consisted of 555 0.1% aqueous formic acid (solvent A) and 0.1% formic acid in acetonitrile (solvent B) at a flow 556 rate of 300 µl x min<sup>-1</sup>. Calibration curves were generated using synthetic standards for 2'-557 deoxycytidine, 5-methyl- and 5-hydroxymethyl-2'-deoxycytidine (Berry&Associates). The 558 mass spectrometer was set in a positive ion mode and operated in parallel reaction monitoring. 559 Ions of masses 228.10, 242.11, and 258.11 were fragmented and full scans were acquired for 560 the base fragments 112.0505, 126.0661, and 146.0611  $\pm$  5ppm (corresponding to C, 5mC and 561 562 5hmC, respectively). The extracted ion chromatogram (EIC) of the corresponding basefragment was extracted using the XCalibur Qual Browser and XCalibur Quan Browser 563 software (Thermo Scientific), and used for quantification. Quantification was performed by 564 565 comparison with the standard curve obtained from the pure nucleoside standards running with the same batch of samples. The level of 5hmC present in the sample was expressed as a 566 567 percentage of total cytosine content.

### 568 Immunohistochemistry on HLRCC tumours

569 Specimens were formalin fixed and embedded in paraffin wax; 3-µm serial sections mounted 570 on Snowcoat X-tra slides (Surgipath, Richmond, IL) were dewaxed in xylene and rehydrated 571 using graded ethanol washes. For antigen retrieval, sections were immersed in preheated

DAKO target retrieval solution (DAKO) and treated for 90 seconds in a pressure cooker. 572 Sections analysed contained both tumour and adjacent normal renal parenchyma acting as an 573 internal control; in addition, substitution of the primary antibody with antibody diluent was 574 used as a negative control. Antigen/antibody complexes were detected using the Envision 575 system (DAKO) according to the manufacturer's instructions. Sections were counterstained 576 with hematoxylin for 30 seconds, dehydrated in graded ethanol washes, and mounted in DPX 577 (Lamb, London, United Kingdom). Antibodies used were: E-cadherin (HECD1, CRUK) and 578 vimentin (clone V9, Dako). TET1 (SAB 2501479) and TET2 (HPA 019032) antibodies were 579 580 purchased by Sigma Aldrich.

### 581 miRNA expression on HLRCC tumours

Total RNA was extracted from tumour and healthy tissue using miRCURY kit (Exiqon,
Denmark) following manufacture's protocols. RNA reverse-transcription and real-time qPCR
were obtained as described above. Data are normalised to healthy tissue using both *SNORD61*and *RNU6B* as endogenous controls.

### 586 Clinical details of HLRCC patients

The patients consented to use of tissues for study approved by the National Research Ethics
Committee London (REF number 2002/6486 and 03/018). FH mutations in HLRCC Patient A
is c.1300T>C, and in Patient B is c.1189G>A

### 590 **Bioinformatics and statistical analyses**

591 Volcano plots were generated using the log10 fold-change on the x-axis and the -log10 of the 592 multi hypothesis corrected p-value (false-discovery rate) on the y-axis generated by Limma<sup>38</sup> 593 differential analysis. The Epithelial–Mesenchymal Transition gene signature was extracted 594 from Taube and colleagues<sup>39</sup>. Signature enrichment was performed with the commonly used 595 Gene-Set Enrichment Analysis (GSEA)<sup>8</sup> test. Signature significance was calculated by 596 randomizing the genes signatures 10000 times.

The TCGA RNA-seq and miRNA-seq data-sets for clear cell (KIRC) and papillary (KIRP) 597 598 renal carcinoma were downloaded from the Broad Firehose webpage (http://gdac.broadinstitute.org/). Differential analysis was performed with R package Limma<sup>38</sup> 599 using voom<sup>40</sup> to transform the RNA-seq counts. Cancer patients were ranked according to FH 600 601 expression and survival analysis was performed by comparing the overall survival time of upper vs. lower quartile of the FH-ranked list of patients. Kaplan Meier curves were built using 602 in-house R scripts and significance was calculated using the R package Survival by applying a 603  $\chi^2$  test. Hive plots were generated using the R package "HiveR". 604

Graphpad Prism 6 was used to generate graphs and perform statistical analysis (one-way ANOVA test with Tukey's post hoc test for multiple comparisons was used unless otherwise indicated). ChIP statistical analysis was generated using Excel (Microsoft). Except for metabolomic experiments, no randomization or blinding was performed. No statistical method or power analysis was used to predetermine sample size.

610 Code availability

The R and Python scripts for the analyses found 611 above can be at http://www.ebi.ac.uk/~emanuel/Sciacovelli\_et\_al/. 612

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### 640 Extended Data Figure Legends

### 641 Extended Data Figure 1. Characterisation of Fh1-deficient and Fh1-rescued cells. a, PCR

to assess *Fh1* recombination. The putative genotypes are indicated on the right and are based 642 on the expected size of the genomic PCR amplification products as from Frezza et al<sup>7</sup>. Fh1<sup>fl/fl</sup> 643 = 470 bp and  $Fh1^{-/-}$  = 380 bp. **b**, Fh1 protein levels measured by western blot of cells of the 644 indicated genotype. Calnexin was used as loading control for western blot. c, Intracellular 645 fumarate levels measured by LCMS and normalised to total ion count. Results were obtained 646 from 4 independent cultures and are indicated as average  $\pm$  S.D., p-values were calculated from 647 one-way ANOVA. d, Oxygen Consumption rate (OCR) and Extracellular Acidification rate 648 (ECAR) assessed using the Seahorse Extracellular Flux Analyser. Results were obtained from 649 5 replicate wells and are presented as average  $\pm$  S.D.. e, Bright field images of cells of the 650 indicated phenotype. Bar =  $400 \mu m$ . Western blot and gel sources are presented in 651 Supplementary Figure 1. Raw data are presented in SI Table 2. \*P  $\leq 0.05$ , \*\*P  $\leq 0.01$ , \*\*\*P 652  $\leq 0.001$ , \*\*\*\**P* $\leq 0.0001$ . **f**, Schematic representation of the proposed link between loss of FH, 653 654 fumarate accumulation, and epigenetic suppression of the antimetastatic cluster of miRNA miR-200. Upon accumulation of fumarate as a result of FH inactivation, the TET-mediated 655

demethylation of the *miR-200ba429* cluster is inhibited, leading to their epigenetic suppression.

As a consequence, Zeb1/2 are de-repressed, eliciting a signalling cascade that leads to EMT.

Extended Data Figure 2. EMT signature in  $Fh1^{-/-}$  cells. a, Volcano plot of RNA-seq analysis. Gene expression was normalised to  $Fh1^{fl/fl}$  or  $Fh1^{-/-}+pFh1$  cells as indicated. b, c, Gene set enrichment analysis (b) and EMT enrichment score (c) of the indicated cell lines.

Extended Data Figure 3. EMT signature in UOK262 cells. a, Gene set enrichment analysis 661 and EMT enrichment score of the indicated cell lines. Gene expression was normalised to 662 UOK262pFH. **b**, **c**, mRNA expression measured by qPCR (**b**) and protein levels measured by 663 western blot (c) of the indicated EMT markers. d, Immunofluorescence staining for Vimentin 664 and E-Cadherin. DAPI was used as marker for cell nuclei. Scale Bar =  $25 \mu m. e$ , Cell migration 665 666 rate. Results were obtained from 14 replicate wells and presented as mean  $\pm$  S.D.. f, mRNA expression of EMT-related transcription factors ZEB1 and ZEB2 from RNA-seq data as in Fig. 667 1a. g, Expression levels of the indicated miRNAs measured by qPCR. h, Volcano plot of 668 miRNA profiling. All qPCR experiments were obtained from 3 independent experiments and 669 presented as RQ with max values, normalised to  $\beta$ -actin or RNU6B/SNORD61 as endogenous 670 control for mRNA and miRNA analyses, respectively. \*P  $\leq 0.05$ , \*\*P  $\leq 0.01$ , \*\*\*P  $\leq 0.001$ , 671 \*\*\*\*P < 0.0001. Western blot sources are presented in Supplementary Figure 1. Raw data are 672 presented in SI Table 2. 673

### 674 Extended Data Figure 4. EMT features in Fh1-deficient cells are independent from HIF.

675 mRNA levels of EMT genes (**a**) and HIF target genes (**b**) in  $Fh1^{-/-}$  cells infected with shRNA 676 against HIF1 $\beta$  measured by qPCR. Results were obtained from 3 independent cultures and 677 presented as RQ with max values using  $\beta$ -actin as endogenous control. NTC = non-targeting 678 control. p-values from unpaired t-test are indicated in the graph. LdhA = lactate dehydrogenase 679 A; Pdkl = pyruvate dehydrogenase kinase 1;  $Glut \ l$  = glucose transporter 1. \*P  $\leq 0.05$ , \*\*P 680  $\leq 0.01$ , \*\*\*P  $\leq 0.001$ , \*\*\*\*P $\leq 0.0001$ . Raw data are presented in SI Table 2.

Extended Data Figure 5. EMT signature in Fh1-reconstituted cells. a, Fh1 protein levels 681 682 measured by western blot. Calnexin was used as loading control. b, Intracellular fumarate levels the measured by LCMS. Data are presented as average  $\pm$  S.D., c, Representative bright 683 field images of cells of the indicated genotype. Scale Bar = 400  $\mu$ m. d, e, mRNA expression 684 685 measured by qPCR (d) and protein levels measured by western blot (e) of the indicated EMT markers. f, Average speed of cells calculated after tracking cells for 3 hours as in Fig. 1g. 686 Results were generated from 3 independent cultures. g, mRNA expression of EMT-related 687 transcription factors.  $\beta$ -actin was used as endogenous control. EV = empty vector. **h**, 688 Expression levels of the indicated miRNAs measured by qPCR and normalised to Snord95 and 689 Snord61 as endogenous control. All qPCR results were obtained from 3 independent cultures 690 and presented as RQ with max values. \*P  $\leq 0.05$ , \*\*P  $\leq 0.01$ , \*\*\*P  $\leq 0.001$ , \*\*\*\*P  $\leq 0.001$ . 691 Western blot sources are presented in Supplementary Figure 1. Raw data are presented in SI 692 Table 2. 693

Extended Data Fig. 6. Role of Tets and Histone Demethylases in EMT induction. a, 694 Expression levels of Tet1-3 in Fh1 fl/fl from RNA-seq data. b, d, Expression levels of Tet2/3 695 (b), miRNA200 (c), and E-cadherin (d) in Fh1  $^{fl/fl}$  cells upon combined silencing of Tet2 and 696 *Tet3*. The results are presented as RQ with max values obtained from technical replicates.  $\beta$ -697 actin and Snord61 were used as endogenous control for mRNA and miRNA, respectively. e, 698 699 Expression levels of the indicated miRNAs upon inhibition of histone demethylases by GSK J4. Snord61 and Snord95 were used as endogenous controls. f, Expression of the indicated 700 miRNAs in Fh1<sup>-/-</sup> cells incubated for 24 hours with 5 mM DM-aKG measured by qPCR. 701 Results were obtained from 4 (vehicle) or 5 (Fh1-'-CL19) and 3 (Fh1-'-CL1) (DM-aKG) 702

independent cultures and presented as RQ with max values, normalised to *Snord95* as endogenous control. \*P  $\leq 0.05$ , \*\*P  $\leq 0.01$ , \*\*\*P  $\leq 0.001$ , \*\*\*\*P $\leq 0.0001$ .

Extended Data Fig. 7. Characterisation of the regulatory CpG island CpG43. a. Snapshot 705 706 of Genome Browser view of genomic DNA around the miR200ba429 cluster taken from NCBI37/mm9. Tet2 ChIP was obtained from GSE41720, sample GSM1023124. Shaded 707 rectangles indicate miR-200ba429 and CpG43. b, ChIP-PCR of the indicated histone marks in 708 709 a region adjacent CpG43. Data were obtained from 3 independent cultures and are presented as average  $\pm$  S.D. p-values from unpaired t-tests are indicated in the graph. c, Expression levels 710 of H3 histone marks in cells of the indicated genotypes measured by western blot. H3 used as 711 loading control. **d**, 3C data of the genomic region adjacent to CpG43 analysed in  $Fh1^{fl/fl}$  cells. 712 The position of CpG30 and CpG43, and of the predicted restriction sites are indicated in the 713 graph. Results were generated from 2 independent cultures. e, DNA methylation of the CpG43714 assessed by qPCR using OneStep qMethyl kit. Data were obtained from 3 independent 715 experiments and normalised to methylation levels of the region in *Fh1<sup>fl/fl</sup>*. Data are presented 716 as average  $\pm$  S.E.M.. **f**, ChIP-PCR of Tets binding to CpG43. Data were obtained from three 717 718 replicates and are presented as average  $\pm$  S.D., g, 5hmc nuclear staining assessed by immunofluorescence using 5hmc antibody. Nuclear staining was quantified using Image J and 719 720 an average of 120 cells was used per genotype. p-values from One-way ANOVA test. Representative images of 5hmc staining are shown. DAPI is used to indicate the nuclei. Bar = 721 20 µm. \*P  $\leq 0.05$ , \*\*P  $\leq 0.01$ , \*\*\*P  $\leq 0.001$ , \*\*\*\*P  $\leq 0.0001$ . Western blot sources are presented 722 in Supplementary Figure 1. Raw data are presented in SI Table 2. 723

# Extended Data Fig. 8. Monomethyl Fumarate (MMF) triggers EMT in FH-proficient cells. a, Bright field images of cells treated for 6 weeks with MMF. Arrows indicate the typical protrusion of cells of mesenchymal phenotype. Bar = 400 µm. b, Oxygen consumption rate of

727 the indicated cell lines treated chronically with MMF (as in Fig. 3). See Methods for drugs concentrations. OCR was normalised to total protein content. Results were obtained from 6 728 (for mouse cells) or 8 (for human cells) wells  $\pm$  SD.. c, Hive plot of metabolomics data of 729 730 mouse and human cells treated with MMF (as in Fig. 3). All identified metabolites are included on the y-axis and grouped into human (pink) and mouse (green) cells. Metabolites accumulated 731 (right x-axis) or depleted (left x-axis) in MMF-treated cells versus control are indicated by a 732 connecting arc and their fold-change is colour-coded. Metabolites accumulated commonly 733 across the two cell lines are highlighted with a solid line. 2SC: 2-succinic-cysteine, succGSH: 734 735 succinic-GSH. Raw data are presented in SI Table 2. Raw metabolomic data are presented in SI Table 3. 736

Extended Data Fig. 9. Succinate triggers EMT in Sdhb-deficient cells. a, Intracellular 737 succinate levels after incubation with 4 mM MMS measured by LCMS. Data are presented as 738 average  $\pm$ S.D., **b**, **c**, Intracellular succinate (**b**) and succGSH (**c**) levels in Sdhb-deficient cells 739 measured by LMCS. Data are presented as average  $\pm$ S.D.. **d**, Bright field images of cells of the 740 741 indicated genotype. Bar =  $400 \,\mu\text{m}$ . e, Gene set enrichment analysis and EMT enrichment score 742 from expression analysis of the indicated cell lines. f, g, miRNA expression levels normalised to *Snord*61 and *Snord*95 as endogenous control ( $\mathbf{f}$ ) and *CpG*43 methylation ( $\mathbf{g}$ ). Experiments 743 744 were performed as in Fig. 2b and 2d, respectively. \*P  $\leq 0.05$ , \*\*P  $\leq 0.01$ , \*\*\*P  $\leq 0.001$ , \*\*\*\*P < 0.0001. Gel sources are presented in Supplementary Figure 1. Raw data are presented 745 in SI Table 2. 746

# Extended Data Fig. 10. Expression of FH and EMT markers in kidney cancer. a, Expression levels of *Vimentin* and *E-Cadherin* in HLRCC patients obtained from Ooi et al<sup>25</sup>. b, Immunohistochemistry staining of Vimentin and E-Cadherin (left), and TET1 and TET2 (right) in HLRCC patients obtained as in Fig. 4a. Bar = 100 µm. The insert in the left panel

751 indicate a 3X digital magnification,  $Bar = 50 \mu m$ . c, Gene set enrichment analysis and EMT enrichment score from RNA-seq data of papillary renal cell carcinoma (KIRP) obtained by 752 Linehan et al<sup>26</sup>. **d**, Volcano plot of MIRNA expression in KIRP. **e**, Kaplan-Meier curve of 753 KIRP patients separated according to FH expression. f. Vimentin and E-Cadherin expression 754 in FH-mutant KIRP compared to normal renal tissue. g, Frequency of mutations in FH and 755 TET1, TET2 and TET3 in KIRP analysed using NCBO BioPortal. Only cancers with mutations 756 in the indicated genes are shown. h, Kaplan-Meier curve of FH-wild type and FH-mutant KIRP. 757 i, Expression levels of *FH*, *Vimentin*, and *E-Cadherin* in clear cell renal cell carcinoma (KIRC) 758 obtained from TCGA dataset<sup>27</sup>. j, Volcano plot of miRNA expression in KIRC. j, Kaplan-759

760 Meier curve of KIRC patients separated according to *FH* expression.