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Supplemental information

Integrated drug profiling and CRISPR screening

identify BCR::ABL1-independent vulnerabilities

in chronic myeloid leukemia

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20 Figure S1: Effect of culturing media composition and sorting status on the drug sensitivity profile of CML-LSPCs. 21 Related to Figure 1. Flowcytometry dot plot showing the expression of CD45, CD34 and CD38 markers on CD34+ sorted 22 cells from a CP-CML bone marrow at a) basal, b) after 72 hours in StemSpan media, c) after 72 hours in StemSpan media 23 supplemented by stemregenin1, d) after 72 hours in StemSpan media supplemented by stemregenin1 and UM729, e) after 24 72 hours in StemSpan media supplemented by commercial CD34 expansion cocktail, f) after 72 hours in StemSpan media 25 supplemented by commercial CD34 expansion cocktail, stemregenin1 and UM729. StemSpan media with no additional 26 supplementation was selected for subsequent experiments, because it achieved the best balance between viability 27 maintaining and minimizing differentiation. g) Correlation of drug sensitivity scores (DSS) of LSPCs cultured in stemspan 28 media (SS) and stemspan media supplemented with CD34+ expansion cytokine cocktail (SS+CD34ES). Dose response 29 curve comparing LSPCs response to h) imatinib, i) dasatinib, j) ponatinib, when cultured in SS media (red) versus 30 SS+CD34ES (Blue). Viability is normalized and expressed as percentage of viability of cells in DMSO-treated wells. Our 31 data shows that cytokine supplements that support LSCs ex vivo expansion can also push cells to differentiate, activate 32 several BCR-ABL independent pathways, and affect DSRT profiles even when initially use CD34+ sorted samples. 33 Cytokine-induced differentiation was associated with the loss of sensitivity to TKIs and other functional classes such as 34 VEGFR and AKT inhibitors, with increased activity of some mTOR and JAK inhibitors. k) Heatmap of DSS scores of 39 35 drugs from 57 samples, including 50 CML, 4 atypical CML (Philadelphia negative) and 3 healthy donors. Ex-vivo DSRT 36 experiments were done using either stemspan (SS) or mononuclear cell media (MCM). A subset of CML samples was 37 sorted for CD34+ cells. Part of this data (unsorted CML data) was previously published.(1) Explanatory tracks from above 38 are disease status, sorting status, CML phase, blast percentage in the initial sample (prior to processing/sorting), and media 39 used in the experiments.

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- Figure S2: Drug sensitivity profiles of CML-LSPCs. Related to Figure 1. a) Dot plot showing DSS scores of the top 25
 drugs in CML-LSPCs samples (n=16). Each dot represents an individual sample and is colored according to CML phase,
 brown for CP and red for AP/BP. Additionally, a BP-patient with ABL T315I mutation is marked with (x). Milciclib,
 asciminib, azd1775, idasanutlin were tested in a subset of samples. b) Volcano plot comparing DSS scores of CML-LSPCs
 and healthy CD34+ samples. Drugs with significantly higher activity in CML-LSPCs are highlighted in red and those
- 49 active in healthy CD34+ are highlighted in blue. TKIs (imatinib, dasatinib, nilotinib, ponatinib, bosutinib, radotinib) are
- 50 circled with a red circle in the figure. Comparison of DSS scores is done using non-parametric Mann-Whitney testing. FDR
- values (adjusted p-values for multiple comparisons) <0.15 are considered significant. c) Dose response curves showing
- 52 response of individual response curves of CP (brown, n=12), BP (red, n=4), and healthy CD34+ (blue, n=3) samples to
- selected drugs. BP patient with T315I mutation and lymphoid BP patient curves are marked with different dashed lines.
- 54 Bar plot of the differential drug sensitivity of e) CP-LSPCs (n = 12), and f) BP-LSPCs (n=4) compared to healthy CD34+
- 55 (n=3). Drugs are colored by their functional classes. (*) indicates drugs that were tested only in a subset of samples.
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- 60 Figure S3: Differential drug activities in CML-LSPCs and healthy CD34+. Related to Figures 1 and 2. a) Dose response 61 curves showing response of CP-LSPCs (brown), BP-LSPCs (red), and healthy CD34+ (blue) to 20 drugs. Dots represent 62 median viability values for each drug concentration and the error bars represent the interquartile ranges. (*) For mepacrine, 63 curve fitting model perform poorly in fitting all dose responses in CP-LSPCs. So, a line connecting dose responses was 64 used instead. (**) indicates drugs that were tested only in a subset of samples. Dot plot showing the correlations of DSS 65 scores between b) CML-LSCs (CD34+CD38-) and CML-LPCs (CD34+CD38+), and c) CML-LSCs and healthy CD34+ 66 cells. Drugs are colored according to their targeting functional classes as indicated. d) Dose response curves showing 67 individual responses of LSCs (blue), LPCs (red), of CP patients (solid curves) and BP patients (dashed curves) to the drugs 68 shown in figure 2b.
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Figure S4: Flowcytometry-based drug sensitivity profiles of CML-LSCs, CML-LPCs. Related to Figure 2. a) Dose
response curves showing response of LSCs (blue), LPCs (red) from 12 CML patient' samples to 20 drugs. B) Phase specific
dose response curves showing response of LSCs (blue), LPCs (red), of CP patients (n=6, solid curves, and dots) and BP
patients (n=6, dashed curves, x-centered dots) to 16 drugs.



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81 Figure S5: Flowcytometry-based drug profiling highlights mepacrine's specific targeting of primitive CML-LSCs.

82 Related to Figure 2. Bar plots showing the response of LSCs (CD34+CD38-) cells to the tested drugs in a) all samples, b)

CP samples, c) BP samples. The percentage of LSCs fraction of total CD34+ cells in the 3rd concentrations of all tested 83 84 drugs are compared to the percentage in control (DMSO) wells. A dashed line indicates the median of control wells. Bar 85 height represent median values with error bars representing the interquartile range. d) Flowcytometry panels showing the 86 expression of myeloid differentiation markers CD38 (x-axis) and CD11b (y-axis) on CD34+ gated cells from imatinib, 87 mepacrine and navitoclax treated CML cells over 3 log concentrations. e-f) Colony forming assay (CFA) (patient 88 number=2, each is shown in a separate plot) and g-h) long term culture initiating cells (LTC-IC) assay (patient number=2, 89 each is shown in a separate plot) of CML-LSPCs in the presence of imatinib, mepacrine and navitoclax as individual drugs 90 and imatinib-drug combination at the indicated concentrations. Colony count output is expressed as percentage of the drug-91 treated conditions from control (dmso-treated) condition in CFA analysis. For LTC-IC the colony count is normalized to 92 be expressed as colony count per 10⁴ input CD34+ LSPCs. Each experiment is done in replicate (replicates are shown 93 separately in the figure) using 2 different patient samples. A suboptimal mepacrine concentration (2500nM) was used in 94 the 1st LTC-IC experiment (panel g) since the 5000 nM concentration used in CFA (panel e) wiped out all cells. For the 2nd 95 LTC-IC experiment (panel h), the 5000nM mepacrine concentration was used for a shorter overnight incubation period 96 rather than 48 hours used in the 1st experiment. i,j) Pathway enrichment figures showing the enriched pathways from gene 97 set enrichment analysis (GSEA) from i) upregulated and j) downregulated differentially expressed genes between 98 mepacrine and DMSO treated CML-LSPCs.



103 Figure S6: Drug combination screening identified AZD1775, idasanutlin and venetoclax as promising candidates 104 for combinations with TKIs. Related to Figure 3. a) Heatmaps of dose-combination responses in CML-LSPCs samples, 105 including 6 BP and 6 CP-LSPCs, for the most synergistic imatinib-drug combinations (AZD1775-imatinib, idasanutlin-106 imatinib, venetoclax-imatinib). An example heatmap is shown on the left for each imatinib-drug combination with percent 107 inhibition values are indicated in the heatmaps. Heatmaps from the 12 individuals are shown on the right with HSA synergy 108 score indicated on the top of each heatmap. b) Heatmap of synergy scores of 18 imatinib-drug combinations in CML-109 LSPCs samples (n=12). Synergy score >5 is considered synergistic, and >10 is highly synergistic. (*) imatinib-110 dexamethasone combination showed universally high synergistic score in all samples, which can be a technical outlier 111 (dose-response curves seem to converge, suggesting no real synergy). c) Dot plot showing comparison of drug DSS scores 112 from Ba/f3 cells transduced with either p210 BCR::ABL1 wild type or T315I mutant form. d-e) Dose response curves 113 showing individual FC-DSRT responses of d) LSCs (red), e) LPCs (brown) of CML patients. Dose response curves of 114 CML- samples are represented in solid lines, except for BP samples with ABL1-KD mutations (T315I, E255K) and 115 lymphoid BP patient that are marked with different dotted/dashed curves as indicated. f) Heatmaps of dose-combination 116 responses in 3 CP-LSPCs samples, for the combinations of AZD1775, idasanutlin, and venetoclax with either dasatinib or 117 asciminib (examples of second or third line TKIs respectively). Heatmaps from individual samples are shown with percent 118 inhibition values are indicated in the heatmaps and with HSA synergy score indicated on the top of each heatmap. Synergy 119 score >5 is considered synergistic, and >10 is highly synergistic.



123 Figure S7: Genome scale CRISPR screening and individual gene CRISPR KO validation in CML cell lines. Related 124 to Figures 4 and 5. a) Schematic figure of STRING protein interaction analysis (from the Swiss Institute of Bioinformatics 125 [https://string-db.org/]) of resistance/sensitization hits identified by genome wide CRISPR screens and their connection 126 with BCR-ABL. We have highlighted pathways enriched with specific drugs. b-e) Dot plot showing the correlations of 127 DSS scores between control K562 cells (transduced with non-targeting sgRNA) and b) KCTD5-KO, c) APAF1-KO, d) 128 IGF1R-KO, and e) CDK2-KO. All condition were tested in duplicate. Drugs are colored according to their targeting 129 functional classes as indicated. Correlations were performed using Spearman correlation. f) Bar plots of the drug sensitivity 130 scores of imatinib, dasatinib and azd1775 in different individual gene-KO LAMA84 cells. DSS scores were obtained from 131 classic 72-hours DSRT experiments (see Supplemental methods) and were normalized and expressed as percentage of the 132 drug DSS scores in parental LAMA84 cells (indicated by dashed line). CRISPR/Cas9 expressing LAMA84 cells transduced 133 with non-targeting gRNA was used as a control (Ctrl). g) Dose-response curves of imatinib, dasatinib, and azd1775 134 individual gene-KO K562 cells. Dose response curve of the drugs in parental K562 cells are represented by dashed curve. 135 Viability of the cells at different concentrations is presented as percentage of the viability of dmso treated wells. A dashed 136 line indicates 50% viability of cells. h-i) Dot plot showing the correlations of DSS scores between control K562 cells 137 (transduced with non-targeting sgRNA) and h) KCTD5-KO, and i) APAF1-KO. Drugs are colored according to their 138 targeting functional classes as indicated. Data correlations were performed using Spearman correlation test. 139



143 Figure S8: KCTD5-KO confers an imatinib-resistance phenotype through dysregulation of several signaling and 144 protein processing pathways. Related to Figures 5 and 6. a) Bar plot showing fold changes in the gene expression levels 145 of KCTD5, APAF1, EIF2AK1, CCNC and IGF1R genes in imatinib-, dasatinib- and nilotinib-resistant K562 cells from 146 previously published gene expression data.(2) All changes in the figure were reported as significant (q<0.05, calculated 147 using Cuffdiff tool) except for those marked with (*). b) Dot plot of the expression values of KCTD5 gene in previously 148 published transcriptional data(3) from BP, CP-LSPCs and healthy CD34+ samples (n=7, 5 and 4 respectively). Bar height 149 represents the interquartile range, the middle line represents median values with error bars representing range. O-values 150 calculated using Bayesian statistical test. c) Dot plot of the expression values of KCTD5 gene in previously published 151 transcriptional data(3) from CP-LSPCs samples, that were subsetted according to imatinib DSS response into DSS-low 152 (relatively resistant group, DSS <15, n=1) and DSS-high (sensitive group, DSS >15, n=3). The middle line represents 153 median values with error bars representing range. d-g) Growth curves showing growth of control and KCTD5-KO K562 154 and LAMA84 cells in presence of different imatinib concentrations. Dots represent median values with error bars representing 95% of confidence intervals (CI). * p<0.05, ** p<0.01, *** p<0.001, **** p<0.0001, * p<0.1 (adjusted p 155 156 value, multiple unpaired t-test corrected for multiple comparisons). h) Protein levels of KCTD5, CUL3 and B-actin proteins 157 in untreated and imatinib-treated (0.5 µmol) control and KCTD5-KO K562 cell lysates. The levels of CUL3 demonstrated 158 1.27-fold increase and 0.44-fold decrease in imatinib-treated control and KCTD5-KO samples compared to untreated 159 control samples respectively by densitometry analysis. Data is from a replicate experiment to confirm findings in Figure 160 6C. j) Protein levels of BCR-ABL, phosphorylated BCR-ABL (p-BCR-ABL), AKT and phosphorylated AKT (p-AKT) 161 and B-actin proteins in untreated and imatinib-treated (1 µmol) control and KCTD5-KO K562 cell lysates. Densitometric 162 analysis revealed elevation of p-AKT levels (normalized to total AKT levels) in KCTD5-KO K562 compared to control 163 K562 cells, with ratios of 1.15 and 1.61 in presence and absence of imatinib respectively. j-k) Dose-response curves of 164 combinations of imatinib with j) the de-ubiquitinase inhibitor VLX1570 (100 nM), k) the AKT inhibitor ipatasertib 165 (100nM), l) the MEK inhibitor cobimetinib (30nM) and m) the mTOR inhibitor everolimus (3nM), in control (solid curves) 166 and KCTD5-KO (dashed curves) K562 cells. Viability of the cells at different concentrations is presented as percentage of 167 the viability compared to DMSO treated wells. A dashed line indicates 50% viability of cells. n) Dot plot showing the 168 correlations of DSS scores (Pearson correlation) between control K562 cells and KCTD5-KO, using a 528-drug library. 169 Drugs are colored according to their targeting functional classes as indicated. o) CFA and p) LTC-IC assay of CML-LSPCs 170 in the presence of imatinib (1000 nM), everolimus (100 nM), and cobimetinib (1000 nM) as individual drugs and imatinib-171 drug combination at the indicated concentrations. Colony count output is expressed as percentage of the drug-treated 172 conditions from control (dmso-treated) condition in CFA analysis. For LTC-IC the colony count is normalized to be 173 expressed as colony count per 10⁴ input CD34+ LSPCs.

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