

Supplementary Figure S1I Assessment of residual enzymatic activity following addition of different amounts of SDS to CCRF-CEM and SKOV-3 cell lines. Relative luminescence intensity after addition of different amounts of SDS (final concentration ranging from 0.01 to 2%) to (a) CCRF-CEM and (b) SKOV-3 cells. The luminescence intensities are normalized to the luminescence value of the sample without SDS. Each bar and the error bars represent the mean-normalized luminescence and the SEM of 6 independent replicates, respectively.



Supplementary Figure S2 | Assessment of residual metabolism in lysed CCRF-CEM cells. Series of 1D NMR spectra acquired every 30 minutes for a total of eight hours on cells lysed by ultrasonication without quenching the enzymatic activity. NMR signal intensities were normalized, as for the spectra in **Figure 1(b-c)**, using the first spectrum of the time series (BAA, branched amino acids lactate; Gln, glutamine).



Supplementary Figure S3 | Assessment of residual metabolism in CCRF-CEM cells using multivariate analysis. Principal component analysis was performed on ¹H NMR spectra of CCRF-CEM cells acquired every 30 minutes over a period of 8 hours for live cells, cell lysed using only ultrasonication and cells simultaneously lysed and SDS inactivated. 16 spectra per condition were included in the multivariate analysis.



Supplementary Figure S4 | Contribution of intracellular metabolome to the NMR spectra acquired on the entire well content. NMR spectra were acquired on the entire well content (including both endo- and exo-metabolomes), on the media incubated in the same 96-well plate where cells were seeded (in an empty well, not seeded with cells) and on the exo-metabolome and endo-metabolome previously separated. Representative expanded sections of ¹H NMR spectrum show the individual contributes of exo- and/or endo-metabolome to the NMR spectrum acquired for the entire well content (Tau, taurine; Gluc, glucose; GPCho, glycerophosphocholine; PCho, phosphocholine; Cho, choline; Pyr, pyruvate; Gln, glutamine; Glu, glutamate; Suc, succinate).



Supplementary Figure S5 | Assessment of plate-to-plate variability. PCA score plot (PC1 *versus* PC2) obtained from the analysis of the ¹H-NMR spectra acquired on simultaneously lysed and SDS-inactivated CCRF-CEM cell samples with and without asparaginase (1 u/ml) treatment. The cells were seeded and treated in randomized well positions, 6 wells per plate, over 5 different plates (in total 60 ¹H-NMR spectra, 30 replicates per treatment condition). We observed excellent grouping within each treatment condition and separation between the two groups along the first principal component (PC1 85.29%) without any relation to the plate of origin of the specific sample analyzed. Similarly also the higher principal components indicated no separation between samples prepared from different plates. In addition, the similar multivariate Z-factor values (calculated as detailed in Methods, **Eq. 2**) for each plate (**Supplementary Table 1**) support the robustness and the reproducibility of the method.



Supplementary Figure S6 | Pair-wise correlation of metabolites obtained screening a library of kinase inhibitors. Pair-wise correlation of relative concentrations (as percent of control) of selected metabolites obtained by screening CCRF-CEM cells following 24 hours of treatment with 56 KIs. (a) Correlation between lactate and glucose, (b) lactate and pyruvate, (c) glucose and choline and (d) glucose and alanine are shown.



Supplementary Figure S7 | High-content NMR-based metabolomic screening of nine selected KIs at 1 μ M as final concentration (high dose). (a) ATP assay was used to measure the cell viability of CCRF-CEM cells following 24 hours of treatment with 9 selected KIs. The drugs were eEF-2 kinase inhibitor (BIM-0207152), *5-Iodo-indirubin-3'*-monoxime (BIM-0207163), MK2a inhibitor (BIM-0086775), ERK Inhibitor II, FR180204 (BIM-0086749), PKC inhibitor (BIM-0050229), K-252a, Nocardiopsis sp. (BIM-0086768), *Fascaplysin, Synthetic* (BIM-0086776) all administered at 1 μ M (high dose). (b) Principal component analysis was performed on the ¹H NMR spectra acquired in triplicates and a multivariate Z-factor value was calculated for each KI. For a subset of all the observed metabolites we determined the Z_{bin} values (c) and their relative concentration (d, as percent of control).



Supplementary Figure S8 | High-content NMR-based metabolomic screening of nine selected KIs at 0.1 μ M as final concentration (low dose). (a) ATP assay was used to measure the cell viability of CCRF-CEM cells following 24 hours of treatment with 9 selected KIs. The drugs were eEF-2 kinase inhibitor (BIM-0207152), *5-Iodo-indirubin-3'*-monoxime (BIM-0207163), MK2a inhibitor (BIM-0086775), ERK Inhibitor II, FR180204 (BIM-0086749), PKC inhibitor (BIM-0050229), K-252a, Nocardiopsis sp. (BIM-0086768), *Fascaplysin, Synthetic* (BIM-0086751), Wee1 Inhibitor II (BIM-0207209), and NF-KB activation inhibitor (BIM-0086776) all administered at 0.1 μ M (low dose). (b) Principal component analysis was performed on the ¹H NMR spectra acquired in triplicates and a multivariate Z-factor value was calculated for each KI. For a subset of all the observed metabolites we determined the Z_{bin} values (c) and their relative concentration (d, as percent of control).



Supplementary Figure S9 | Dose response experiments at different concentrations of selected KIs. ATP assay and high-content NMR-based metabolomic screening were used to measure the cell viability and the metabolomic response of CCRF-CEM cells following 24 hours of treatment using six different concentrations of KI in the range of 0.05-2 μ M. These doses are within the clinical relevant dose range for other KIs. ATP levels and relative concentrations of lactate and pyruvate calculated (as % of control) are reported as mean values +/- SEM. IC₅₀ values were calculated based on a 50% reduction of ATP levels induced by treatment (Supplementary Table S4). The drugs were a) K-252a, Nocardiopsis sp. (BIM-0086768), b) MK2a inhibitor (BIM-0086775), c) EF-2 kinase inhibitor (BIM-0207152), d) NF-KB activation inhibitor (BIM-0086776), e) PKC inhibitor (BIM-0050229), f) *Fascaplysin, Synthetic* (BIM-0086751), g) Wee1 Inhibitor II (BIM-0207209), h) ERK Inhibitor II, FR180204 (BIM-0086749), and i) *5-Iodo-indirubin-3'*-monoxime (BIM-0207163). For BIM-0086749, BIM-0207163, BIM-0207209 the IC50 values were not determined as these KIs failed to cause changes not only in ATP levels but also in lactate and pyruvate at the considered treatment doses in CCRF-CEM cells.



Supplementary Figure S10 | Cell viability of acute lymphoblastic leukemia primary cells from four patients following 24 hours of NF-kB activation and eEF-2 kinase inhibitor treatments. ATP measurements were performed on acute lymphoblastic leukemia primary cells from four patients. The cells were seeded for 24 hours in a 384-well plate at two different oxygen levels (20% and 5%) following individual treatment using a library of 246 kinase inhibitors (final concentration 1µM). Relative luminescence values were calculated by dividing the luminescence value of each sample by that of primary cells within the same plate receiving solvent control. The two kinase inhibitors BIM-0086776 (NF-kB activation inhibitor) and BIM-0207152 (eEF-2 kinase inhibitor) depicted similar response in the cellular survival regardless of the oxygen level in the environment. The Pearson correlation coefficient of the drug responses was 0.93983 and 0.95677 at 20% and 5% oxygen culture, respectively.

Supplementary Table S1. List of metabolites detected in CCRF-CEM cells using the NMRbased high content screening method. Metabolites are divided based on whether they are detectable either only in the extracellular or in both extra- and intracellular metabolome of CCRF-CEM cells contained in one well of a 96-well plate.

Extracellular	Intracellular	Extracellular + intracellular			
2-Oxoisocaproate	-	2-Oxoisocaproate			
3-Methyl-2-oxovalerate	-	3-Methyl-2-oxovalerate			
-	AMP	-			
-	ATP	-			
Acetate	Acetate	Acetate			
Acetone	Acetone	Acetone			
Alanine	Alanine	Alanine			
Arginine	-				
Asparagine	Asparagine	Asparagine			
Aspartate	Aspartate	Aspartate			
Choline	Choline	Choline			
Creatine	-	Creatine			
Cystine	-	Cystine			
Ethanol	Ethanol	Ethanol			
Formate	Formate	Formate			
Fructose	-	Fructose			
Fumarate	-	Fumarate			
Glucose	Glucose	Glucose			
Glutamate	Glutamate	Glutamate			
Glutamine	Glutamine	Glutamine			
-	Glycero-3-phosphocholine	Glycero-3-phosphocholine			
Glycine	Glycine	Glycine			
Histidine	-	Histidine			
Isoleucine	-	Isoleucine			
Lactate	Lactate	Lactate			
Leucine	-	Leucine			
Lysine	-	Lysine			
Myo-Inositol	Myo-Inositol	Myo-Inositol			
Methanol	Methanol	Methanol			
Methionine	-	Methionine			
Niacinamide	-	Niacinamide			
Ornithine	-	Ornithine			
Panthotenate	-	Panthotenate			
Phenylalanine	-	Phenylalanine			
-	Phosphocholine	Phosphocholine			
Proline	-	Proline			
Propionate	-	Propionate			
Pyridoxine	-	Pyridoxine			
Pyruvate	-	Pyruvate			
Serine	-	Serine			
Succinate	Succinate	Succinate			
-	Taurine	_*			
Threonine	-	Threonine			
Tryptophan	-	Tryptophan			
Tyrosine	-	Tyrosine			
Valine	-	Valine			
trans-4-Hydroxy-L-proline	-	trans-4-Hydroxy-L-proline			
*Taurine covered by glucose signals of the medium					

Supplementary Table S2. Comparison of percent variability explained by the first two components (PC1 % and PC2 %) of the principal component analysis and multivariate Z-factor values (Z, calculated using equation 2) of one-dimensional (1D) ¹H NMR spectra acquired on CCRF-CEM leukemia cells as solvent control and treated asparaginase at A1, 1 u/ml for 5 different plates.

	PC1 %	PC2 %	Z
Plate1	87.77	3.97	0.90
Plate2	88.04	3.06	0.82
Plate3	88.14	3.93	0.77
Plate4	85.97	4.023	0.83
Plate5	87.55	4.86	0.84
All Plates	83.53	3.65	0.79

Supplementary Table S3. Comparison of percent variability explained by the first two components (PC1 % and PC2 %) of the principal component analysis and multivariate Z factor values (Z, calculated using equation 2) of ¹H NMR spectra acquired using one-dimensional (1D), CPMG and 1D projections of 2D JRES spectra (pJRES) for CCRF-CEM leukemia cells treated with dexamethasone (Dex), dichloroacetate (DCA), rapamycin, (Rap) vincristine (Vin) and asparaginase at three different doses (A1, 1 u/ml; A01, 0.1 u/ml; A001, 0.01 u/ml).

Dmug Tr	1D			CPMG			pJRES		
Diug II.	PC1 %	PC2 %	Ζ	PC1 %	PC2 %	Ζ	PC1 %	PC2 %	Z
Dex	51.98	31.93	-1.86	58.80	26.40	0.15	64.01	10.15	0.41
DCA	90.57	6.42	0.86	94.60	3.16	0.91	93.14	2.13	0.90
Rap	70.00	19.49	0.60	79.63	10.87	0.74	79.91	5.88	0.72
Vin	58.40	30.92	-2.62	59.73	16.17	-1.97	55.81	12.38	0.47
A1	87.77	3.97	0.90	89.67	5.32	0.91	91.27	2.28	0.90
A01	88.12	7.30	0.75	92.04	3.69	0.86	90.86	2.96	0.88
A001	87.94	7.33	0.68	91.17	3.64	0.84	91.02	2.83	0.79



Supplementary Table S4. List of 56 kinase inhibitors screened.

		-100			
BIM-0086768	C27H21N3	467.47	EMD Biosciences	420298	K-252a, Nocardiopsis sp.
BIM-0053458	C13H16N6	^H # ^H + + + + + + + + + + + + + + + + + + +		154020	
BIM-0207135	C23H20N4	о с (ССС, нин 2 884.43	Calbiochem	203294 Chloride SALT	420.9 Bisindolylmaleimide II, Hydrochloride
BIM-0086675	C17H12N2	¹⁰ 5	EMD Biosciences	343021	Re3 Inhibitor II
BIM-0086735	C1 8H24N6	HO NH H	EMD Biosciences	203600	Bohemine
BIM-0086751	C18H11N2+	271.29	EMD Biosciences	341251 Chloride SALT	Fascaplysin, synthetic
BIM-0050990	C18H17NO	211.33	LOPAC 10658		Casein kinase-1 (CK-1 delta/epsilon) inhibitor.
BIM-0207156	C1.5H8CIF6	383.67 ^{CI}	Calbiochem	401482	383,7 IKK-2 Inhibitor V
BIM-0086693	C18H16FN:	325.34	EMD Biosciences	521233	PDGF Receptor Tyrodine Kinase Inhibitor IV
BIM-0086716	C20H21N3	335.4	EMD Biosciences	616453 Chloride SALT	TGF-b Ri Inhibitor III
BIM-0207195	C18H15N3/	321.33	Galbiochem	555555	321.3 Rho Kinase Inhibitor V
BIM-0086736	C17H11CIN	294.74	EMD Blosciences	217695	Cáld Inhibitor
BIM-0086762	C12H10FN:	279.29	EMD Biosciences	401481	IKG-2 Inhibitor IV
BIM-0207137	C24H29N7		Calbiochem	203851	431.5 CR8, (R)-Isomer

BIM-0207157	C12H11N3	261.3		Calbiochem	401483	261.3 IKK-2 Inhibitor VI
		C	ů , , , , , , , , , , , , , , , , , , ,			
BIM-0085686	C18H13N3	287.32		EMD Biosciences	420126 METHANESULFONATE (MESYL/	TEJ SA JAK3 Inhibitor VI
BIM-0207186	C16H14BrP	452.28 I,	7. 9.70	Calbiochem	528116 H2O	470.3 PI 3-K? Inhibitor VIII
BIM-0086753	C14H10IN8	395.22		EMD Biosciences	361541	GSK-3b Inhibitor II
BIM-0085780	C19HZ5CIN	388.89		EMD Blosdences	540500	Purvalanci A
BIM-0086695	C10H4N6O	224.18		EMD Bosciences	521275	PDK1/Akt/FIt Dual Pathway inhibitor
BIM-0207138	C24H29N7	б 431.53 м'		Galbiochem	203882	431.5 CR8, (S)-Isomer
BIM-0086696	CI 3HEN4O	268.29 N ⁻	Č.	EMD Blosdences	527450	PKR inhibitor
BIM-0207178	C25H21N7	467.48 н _з н		Calbiochem	524611	467.5 PIKfyve Inhibitor
BIM-0086708	C18HZ6Cl2	465.39 J		EMD Blosdences	555554	Rho Kinase Inhibitor IV
BIM-0086723	C17H13N3	307.37 Н ₂		EMD Blosdences	676489	VEGF Receptor 2 Kinase Inhibitor IV
BIM-0086737	C15H13F2†	425.44		EMD Biosaiences	217714	Cdld./2 Inhibitor III
BIM-0086758	C18H14N4	318.33		EMD Biosciences	361354	GSK-3b inhibitor XII, TWS119
BIM-0086710	C28H26N4	466.53	NH-CO	EMD Blosdences	569397	Staurosporine, Streptomyces sp.

	AND	Ć		
BIM-0086659 (23H20N4)	400.43	EMD Blosdences	189404	Aurora Kinase Inhibitor II
BIM-0086668 C28H25F21	489.58	EMD Biosciences	266788	Diacylglycerol Kinase Inhibitor II
BIM-0207170 C21H16N4	340.38	Galbiochem	475864 H2O	358.4 MK-2 Inhibitor III
BIM-0051107 C13HBN40	ко на конструкции и на конструкции на констру на конструпни на конструпни на констру на констру на конструпни на	s [¥] LOPAC T 6943		Protein tyrosine kinase inhibitor
BIM-0207207 C20H12N2-	H0	Calbiochem	681637 H2O	346,3 Wee1/Ohk1 Inhibitor
BIM-0207140 C18H13N3v	351.45	Galbiochem	217699	351.4 Cdk1 hhibitor IV, RO-3306
BIM-0086681 (30H42N2)	574.66	►o EMD Biosciences	375670	Herbimycin A, Streptomyces sp.
BIM-0207160 (22H19N9)	469.53	Calbiochem	401488	469,5 IKK-3 Inhibitor IX
BIM-0207189 (2.8H26M4	452.53	Calbiochem	539644	482.5 UCN-01
B/M-0207208 C20H11CIN	HO	Calbiochem	681 640	362.8 Wee1 Inhibitor
B/M-0086789 CL3H11N3/	241.25	EMD Biosciences	572650	509516
B/M-0206950 C12H11N3/	213.24 °°	Calbiochem	217707	213.2
BJM-0207209 (24H39C)N	H0 + + + + + + + + + + + + + + + + + + +	Calbiochem	681641	418.9 West Inhibitor II
BIM-0086776 C22H20N4	H ₂ N () () () () () () () () () () () () ()) EMD Biosciences	481406	NF-KB Activation Inhibitor



Supplementary Table S5. IC₅₀ values obtained from the dose response experiments performed using 6 different concentrations of 9 KIs in a clinically relevant range (0.05-2 μ M). IC₅₀ values were determined as the treatment dose that induced a 50% reduction of ATP levels. No ATP level-dependent inhibition was observed following treatment of CCRF-CEM cells with BIM-0086749, BIM-0207163, BIM-0207209 in the range of doses used in this study.

Kinase Inhibitors	$IC_{50} (\mu M) \pm SEM$
BIM 0086768	$0.190 \pm 0.0078 \ \mu M$
BIM 0086775	$0.646 \pm 0.0180 \ \mu M$
BIM 0207152	$0.374 \pm 0.0281 \ \mu M$
BIM 0086776	$0.006 \pm 1.275 \text{ e}^{-04} \mu\text{M}$
BIM 0050229	$0.545 \pm 0.0087 \ \mu M$
BIM 0086751	1.879 ± 0.055 μM
BIM 0207209	No Effect
BIM 0086749	No Effect
BIM 0207163	No Effect

Supplementary Methods

miRNA transfections

For transfection of HeLa cells, miR16 and miR122 precursors and pre-miR (as negative control; Applied Biosystems, TX) were used. The cells were transfected with TransIT-TKO (Mirus Bio Corp., WI) according to the manufacturer's instruction. Fifty µl of transfection mixture containing 50 nM of miRNAs and TransIT-TKO transfection reagent in Opti-mem (Invitrogen, CA) was incubated for 20-25 minutes at room temperature and added into each well. The cells were cultured with the transfection mixture for 24 hours before proceeding to the metabolomic assays. All the experiments were performed in 6 replicates per condition.

ATPlite luminescence measurements

ATP Detection Assay (Perkin Elmer, MA) was used according to manufacturer's instruction to quantify the viability of cells in each well. Briefly, 50 µL of the reagent were added to each well, and thoroughly mixed for 2 minutes at 600 rpm using a plate shaker. Luminescence was measured using Biosystems Analyst HT microplate reader (LJL Biosystems, Inc., Sunnyvale, CA). Relative luminescence values were calculated by dividing the luminescence value of each treated sample by that of cells within the same plate receiving solvent control (negative controls).

Multivariate Z factor and Z_{bin} factor

The projected value $P_i^{C/T}$ for the *i*-th sample was calculated as a weighted sum of the solvent control (C) or drug treatment (T) spectral data values $x_{ij}^{C/T}$ for all the j data points (np) of the

NMR spectra. The weights are obtained from the loadings values of the first principal component of a principal component analysis (PCA).

$$P_{i}^{C/T} = \sum_{j=1}^{np} L_{j}^{1} \cdot x_{ij}^{C/T}$$
(S1)

The multivariate Z factor is then calculated as:

$$Z = 1 - 3 \cdot \frac{\sigma^{C} + \sigma^{T}}{\left| \mu^{C} - \mu^{T} \right|}$$
(S2)

Where μ^{C} and μ^{T} , and σ^{C} and σ^{T} are the means and standard deviations of P^C (solvent control) and P^T (drug treatment), respectively. The Z-factor can have values within the range of $-\infty \le Z \le 1$; Z-factor values between 0.5 and 1 indicate an excellent separation of groups; $0 \le Z \le 0.5$ indicates moderate separation while Z =0 points to poor separation. For Z < 0, the method is not suitable for screening.

Alternatively, a calculation of Z_{bin} factor values for every point/bin (*i*) of the spectrum can be calculated as follows:

$$Z_{\text{bin}} = 1 - 3 \cdot \frac{\sigma_i^{\text{C}} + \sigma_i^{\text{T}}}{\left|\mu_i^{\text{C}} - \mu_i^{\text{T}}\right|}$$
(S3)

where μ_i^C and μ_i^T , and σ_i^C and σ_i^T are the means and standard deviations at each point/bin (*i*) of the NMR spectra for solvent control (C) and drug treated (T) samples, respectively.