Hyperactive CREB subpopulations increase during therapy in pediatric B-lineage acute lymphoblastic leukemia

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Supplementary Methods

Cell Staining

Antibodies were selected based on their ability to identify a leukaemia-associated immunophenotype to allow detection of MRD and normal B cells in all patients, enable exclusion of apoptotic cells, monitor cell proliferation and finally, identify phospho-signals of pathways that are recurrently activated in B lineage ALL. The Maxpar panel designer was used to designate metal tags (Fluidigm, San Francisco, USA). The full antibody panel is shown in Supplementary Table 4. Samples were stained for CyTOF analysis using a modified protocol acquired from Fluidigm. Briefly, $3x10^6$ cells were labelled with all antibodies, fixed in Maxpar Fix and Perm buffer (Fluidigm), stored overnight at 4°C and acquired by mass cytometry the next day.

All antibodies were validated using appropriate positive and negative control cell lines with known CD antigen expression or by specific stimulation and/or inhibition of signalling pathways using specific small molecule inhibitors (Supplementary Table 5). Single antibody experiments also confirmed negligible signal spill over into other detectors.

Mass Cytometry (CyTOF)

Sample counts and quality were checked on a BD Accuri flow cytometer and then, based on absolute cell count, adjusted to no more than 5 x 10^5 /ml per sample in ultra-pure de-ionised water with the addition of 10% (v/v) EQ, four element calibration beads (Fluidigm, San Francisco, USA). Samples were then acquired on a fully calibrated/tuned Helios CyTOF machine (Fluidigm, San Francisco, USA) after filtration at 30µm to minimise blockages in the machine. The target number of cells was 50,000 for diagnostic samples and 1x10⁶ for follow-up samples. Down sampling of mass cytometry data showed that MMIs were similar from 10,000 to 100 and even 40 cells (data not shown), although only 2 samples had less than 50 ALL cells. Aliquots of normal peripheral blood processed and stained in an analogous fashion to the experimental samples were run at the start and end of each acquisition block to track signal variation over the duration of the run. Signals were normalised using the EQ beads as per the Fluidigm method ¹ and transformed using the inverse hyperbolic sine (arsinh) function, with a cofactor of 5.

Manual Gating

CyTOF data was analysed using both Cytobank (Santa Clara, USA) and FlowJo (Ashland, USA). Sequential gating was performed to identify live, single, ALL and mature B-cells. Firstly, control beads were gated out, singlets were identified using the 191Ir DNA marker and then apoptotic cells gated out if positive for 195Pt cisplatin ¹, cleaved Caspase-3 or cleaved PARP (Supplementary figure 2). ALL cells and mature B-cells were then identified based on CD antigen expression; mature B-cells, by the immunophenotype, CD34- CD10-

CD22+ CD45+ and ALL cells by their LAIP, i.e. CD19+ CD10+/- CD34+/- and underexpression of CD45 and/or CD38 and/or overexpression of CD123 and/or CD58 ². MMI signals from ALL cells were normalised against internal mature B-cell populations by subtraction. Samples with less than 50 mature B-cells were normalised using the median values of mature B-cells from all samples. This was only necessary in 12 of 61 samples (8 presentation and 4 MRD samples).

CyTOF Workflow

The R pipeline CyTOF workflow (version 4) was used to computationally define cell populations using FlowSOM and ConsensusClusterPlus clustering, with data visualised using dimensional reduction technique, UMAP, among other graphical representations. Detailed methodology from ³ was followed. Matched presentation and MRD samples were pre-gated removing EQ beads, cells positive for cisplatin (dead), cCASPASE3 and / or cPARP (apoptotic). Samples were sequentially gated using LAIPs to select blast populations which were analysed using phospho-markers pCREB, pHH3, pp38, pAKT, pERK, pPLCg2, pS6, pSHP2, pSTAT4, pSTAT5, pZAP70, and pH2AX. CyTOF workflow was also used to graphically represent the differential cell population abundance between these matched populations. UMAP plots were generated using standard settings in the CyTOF workflow pipeline, with all gated cells used in the analysis. UMAPs were displayed by scaled expression of specific markers (scaling between 0 and 1 using percentile expression as the boundary), time point (Presentation or MRD), or designated cluster. Data was investigated for batch effect but no bias was identified (Supplementary Figure 5).

Viability assays using Alamar Blue

Cells were plated out in triplicate into flat bottomed 96-well plates and treated with the small molecule CREB inhibitor 666-15 (R and D systems, Abingdon, UK) diluted in DMSO, at a range of concentrations in standard media. PDX cells were maintained in RPMI-1640 supplemented with 20% FBS. After 96 hours, cytotoxicity was assessed using AlamarBlue Cell Viability Reagent (Thermofisher, Cramlington, UK) and fluorescence output measured at 560nM using a BMG Omega microplate reader. The replicate results were averaged and expressed as a percentage of the control vehicle (DMSO). Normalised results were plotted in GraphPad Prism software (GraphPad software Inc, San Diego, CA, USA) and fitted to a non-linear regression curve to estimate drug absolutes half-maximal inhibitory concentration (IC_{50}).

Ex vivo image-based drug response analysis

Drug responses were assessed in primary and primary-derived ALL cell co-cultures with hTERT-immortalised bone marrow mesenchymal stromal cells (MSCs) in black-walled, 384-well plates (Greiner Bio-One, Stonehouse, UK; #781186). MSCs were seeded at 2.5 x 10^3 per well in 50 µL RPMI-1640 supplemented with 10% FBS, left for 30 minutes at room temperature, then incubated at 37°C. Media was aspirated 24 hours later and approximately 3

x 10⁴ viable ALL cells from cryopreserved samples were added to each well in 25 µL serumfree AIM-V medium (ThermoFisher Scientific, UK). Following 24 hours co-culture, ALL cells were treated in technical triplicate with the small-molecule CREB inhibitor 666-15 (R&D Systems, Abingdon, UK) at indicated concentrations constituted in AIM-V medium (final DMSO concentration 0.1%). After 96 hours, co-cultured ALL cells and MSCs were stained with CyQUANT® Direct Cell Proliferation Assay (ThermoFisher Scientific, UK) nuclear stain, as per manufacturer's instructions.

Whole wells were imaged using an automated ZEISS CellDiscoverer 7 (Carl Zeiss AG, Oberkochen, Germany) equipped with an ORCA-Fusion camera (Hamamatsu Photonics K.K., Shizuoka, Japan) using a 5X Plan Apochromat objective and a 2X optovar, set to 37°C and 5% CO₂. A combined software autofocus and definite focusing strategy was used with a 20 ms exposure time in the 488/509 nm (ex/em) channel. Image acquisition was set to cover the entirety of each well with margins in a total of nine images saved in 16-bit TIF file

format. For analysis, images were segmented using a supervised machine learning pipeline to enumerate and discriminate ALL cells and MSCs, developed with the Python programming language and two open-source applications ^{4,5}. For pixel-based classification, the random forest classifier was implemented from the sklearn.ensemble.RandomForestClassifier module of Scikit-learn ⁶. Mean absolute live ALL and MSC replicate cell counts were expressed as a percentage of vehicle-treated cells (DMSO). Normalised results were again plotted and IC₅₀ values calculated.

Supplementary Tables

Table S1. Clinical details of patients and PDX in the study

ID	Subgroup	Gender	Age at Pres (years)	Presentation WBC (x 10 ⁹ /L)	MRD Level Day 28 (%)	EFS Status	Survival Status	Karyotype	
L736	dic(9;20)	F	2	71.9	UN	Continous CR	Alive	48,XX,+X,dic(9;20)(p11~13;q11.21),+10,del(15)(q22),+21[7]	
L784	dic(9;20)	М	8	55.8	0.00%	Continous CR	Alive	45,XY,dic(9;20)(p11~13;q11)	
LK131	dic(9;20)	F	3	36	0.00%	Continous CR	Alive	47,XX,dic(9;20)(p13;q11.2),+21,inc[cp4]	
LK169	dic(9;20)	М	3	15	0.00%	Continous CR	Alive	47,XX,dic(9;20)(p13;q11.2),+21,+mar,inc[4]	
LK286	dic(9;20)	М	2	UN	0.00%	Continous CR	Alive	46,XY,dic(9;20)(p13;q11.2),add(7)(p11),+mar,inc[2]	
LK85	dic(9;20)	F	11	20.1	UN	UN	UN	47,XX,+8,dic(9;20)(p13;q11.2),-13,+21c,+21[8]	
L837	ETV6-RUNX1	F	6	125	0.01%	Relapse	Alive	48,XX,del(5)(q22q35),+10,+21[10]	
L847	ETV6-RUNX1	F	2	16.5	0.00%	Continous CR	Alive	46,XX[10]	
L997	ETV6-RUNX1	F	2	62.4	0.00%	Continous CR	Alive	46,XX[14]	
LK160	ETV6-RUNX1	F	2	109.1	0.00%	Continous CR	Alive	Fail	
LK207	ETV6-RUNX1	F	9	52	0.03%	Continous CR	Alive	48,XX,add(9)(p2),add(12)(p12),+21,+mar,inc[cp3]	
LK272	ETV6-RUNX1	М	7 Months	UN	0.47%	Continous CR	Alive	46,XY,del(12)(p11.2p13)[8]	
L835	HeH	М	4	7.8	0.36%	Continous CR	Alive	53,XY,+X,+4,+10,+14,+17,+18,+21[6]	
LK150	HeH	М	2	UN	0.04%	Continous CR	Alive	.nuc ish(DXZ1x3,ABL1x3,IGHx4,RUNX1x4)[~80%]	
LK171	HeH	М	16	0.6	0.01%	Continous CR	Alive	54~56,XY,+X,+4,+6,+9,+10,+14,+17,+18,+21,+21[cp3]	
LK198	HeH	М	6	30.5	0.05%	Continous CR	Alive	.arr[hg19](4,6,14,17,21,X,Y)x3,(10p15.3q23.31)x3,(10q25.2q26.3)x3	
LK20	HeH	М	4	1.6	0.01%	Continous CR	Alive	51~54,XY,+X,+4,+6,+14,+18,+21,+21[cp3]	
LK231	HeH	М	3	9.6	0.24%	Continous CR	Alive	62,inc[1]/46,XY[2]	
L904	iAMP21	F	14	5	3.39%	Relapse	Alive	46,XX,t(2;16)(p12;q23),-21,+mar[5]	
LK248	iAMP21	F	8	UN	0.05%	Relapse	Dead	46,XY,+X,del(4)(q25),del(9)(p21),del(11)(q13),add(14)(q32),-20,add(21)(q22)[8]	
LK219	IGH-CRLF2	М	1	UN	UN	Continous CR	Alive	.nuc ish(IGHx2)(5'IGH sep 3'IGHx1)[88%]/(CRLF2x2)(5'CRLF2sep 3'CRLF2x1)[96%]	
L727	MLL Translocation	F	1	94	UN	Continous CR	Alive	46,XX,t(11;12)(q23;q13)[7]	
LK176	MLL Translocation	М	1	109.6	0.00%	Continous CR	Alive	46,XY,t(11;17)(q23;p13)[7]/46,idem,del(9)(q13q22)[3]	
L787	Other	М	19	7.7	26.70%	Relapse	Alive	46,XY[20]	
L792	Other	М	5	10.9	UN	Continous CR	Alive	46,XY,i(21)(q10)[2]	
L839	Other	М	3	30	0.00%	Continous CR	Alive	46,XY,-2,der(10)t(2;10)(q21;q22),+der(14)[3]	
L844	Other	М	11	49	0.00%	Continous CR	Alive	46,XY,add(9)(q34),i(9)(q10)[9]	
L858	Other	F	14	33.9	0.03%	Continous CR	Alive	46,XX[20]	
L936	Other	F	2	UN	0.00%	Continous CR	Alive	UN	
L955	Other	F	5	UN	0.01%	Continous CR	Alive	UN	
L958	Other	F	9	UN	UN	Continous CR	Alive	47,XX,+21c[20]	
LK82	Other	М	7	11.4	0.04%	Relapse	Alive	46,XY,del(6)(q1q2),add(9)(p1),inc[4]	
LK114	Other	М	9	UN	0.28%	UN	UN	UN	
LK157	Other	М	3	121	0.00%	Continous CR	Alive	53~55,XY,+X,+3,+6,+9,+14,+17,+18,+18,+21[cp8]	
LK172	Other	F	4	UN	0.03%	Continous CR	Alive	47,XX,t(6;20)(p25;q11.2),+22[9]	
LK182	Other	F	5	13.4	0.00%	Continous CR	Alive	46,XX[15]	
LK196	Other	М	16	315.5	0.00%	Relapse	Dead	46,XY[20].arr[hg19](9p21.3)x0,(14q32.33)x1	
LK221	Other	F	1	77.8	UN	Continous CR	Alive	46,XX[20]	
LK275*	Other	F	15	UN	51.50%	Continous CR	Alive	.nuc ish(PAX5x2)(5'PAX5 sep 3'PAX5x1)[66%]/(JAK2x2)(5'JAK2 sep3'JAK2x1)[58%]	
L730	t(1;19)	F	11	86	UN	Continous CR	Alive	46,XX,der(19)t(1;19)(q23;p13)[4]	
LK263	t(1:19)	F	7	UN	0.00%	Continous CR	Alive	46.XX.der(19)t(1:19)(q23;p13.3)[7]	
LK38	t(1;19)	М	4	28	0.00%			Fail	
L707 PDX	TCF3/HLF	F	16	39.1	UN	UN	UN	46,XX,der(19)t(17;19)(q22;p13)[12]/46,idem,fra(10)(q25)[17]	
L829 (rel) PDX	HeH	F	3	11.7	UN	UN	UN	51,XX,+X,+6,+14,+21,+21[2]	
L920 PDX	Failed	F	4	22.2	UN	UN	UN	UN	

Patient cohort used throughout this study including group-based qualifier (L or LK number), confirmed cytogenetic subgroup, age at presentation, white blood cell count (WBC) at presentation, MRD percentage at end of induction (day 28), trial assigned to each patient (if known), and karyotype at diagnosis. UN= Unknown. PDX = Patient derived xenograft. * denotes identified PAX5-JAK2 translocation confirmed by fluorescent in situ hybridisation.

ID	Subgroup	Gende r	Age at Pres (years)	Presentation WBC (x 10 ⁹ /L)	Karyotype	Time Point	MRD % by Flow Cytometry
L835	НеН	М	4	UN	53,XY,+X,+4,+10,+14,+17,+18,+21[6]	Presentation Day 28	86.20% 0.36%
L936	Other	F	2	UN	UN	Presentation Day 28	76.00% 0.09%
LK20	НеН	М	4	1.6	51~54,XY,+X,+4,+6,+14,+18,+21,+21[cp3]	Presentation Day 8	54.76% 17.50%
LK172	Other	F	4	UN	47,XX,t(6;20)(p25;q11.2),+22[9]	Presentation Day 8	63.25% 17.55%
LK198	НеН	М	6	30.5	.arr[hg19](4,6,14,17,21,X,Y)x3,(10p15.3q23.3 1)x3,(10q25.2q26.3)x3	Presentation Day 28	73.44% 0.05%
LK219	IGH Translocation	М	1	UN	.nuc ish(IGHx2)(5'IGH sep 3'IGHx1)[88%]/(CRLF2x2)(5'CRLF2 sep 3'CRLF2x1)[96%]	Presentation Day 8	50.50% 82.82%
LK231	НеН	М	3	9.6	62,inc[1]/46,XY[2]	Presentation Day 28	7.55% 0.24%
LK248	iAMP21	F	8	UN	46,XY,+X,del(4)(q25),del(9)(p21),del(11)(q13),add(14)(q32),-20,add(21)(q22)[8]	Presentation Day 8 Day 28	66.33% 32.81% 0.05%
LK272	ETV6- RUNX1	М	7 Months	UN	46,XY,del(12)(p11.2p13)[8]	Presentation Day 28	80.41% 0.47%
LK275	Other	F	15	UN	.nuc ish(PAX5x2)(5'PAX5 sep 3'PAX5x1)[66%]/(JAK2x2)(5'JAK2 sep3'JAK2x1)[58%]	Presentation Day 8 Day 28 Week 10 Week 16	78.14% 93.39% 51.50% 2.06% 0.06%
LK286	dic(9;20)	М	2	UN	46,XY,dic(9;20)(p13;q11.2),add(7)(p11),+mar ,inc[2]	Presentation Day 28	88.89% 1.02%

Table S2. Clinical details of patients used in the paired presentation and MRD analyses.

UN - data are unknown.

Antigon	MMI	Danga	MMI	Danga	р
Anugen	Pres	Kange	MRD	Kange	value
pp38	0.92	2.73	1.54	10.96	0.20
pAKT	4.12	98.45	0.93	3.21	0.45
pCREB	48.62	126.89	42.59	132.03	0.54
pERK	0.91	6.21	0.83	3.41	0.85
pHH3	28.33	160.24	23.92	61.05	0.64
pPLCg2	0.12	190.3	0.1	0.32	0.48
pS6	5.76	43.59	3.17	10.67	0.26
pSHP2	5.68	34.52	4.67	32.78	0.70
pSTAT4	0.6	3.98	0.69	4.35	0.77
pSTAT5	1.72	16.48	1.66	7.92	0.95
pZAP70	0.18	0.54	0.26	1.72	0.28
pH2AX	3.64	13.05	5.67	20.01	0.12

 Table S3. MMI of mature B-cells presentation and 'on-treatment' bone marrow samples.

MMI of mature B-cells in presentation and MRD samples. A paired, two tailed, t test was performed to assess differences in the MMI of antigens analysed.

Label	Torrat	Antibody
Laber	Target	Clone
89Y	CD45	HI30
141Pr	pSHP2 [Y580]	D66F10
142Nd	Caspase 3 (Cleaved)	D3E9
143Nd	PARP (Cleaved)	F21-852
144Nd	CD38	HIT2
147Sm	pHistone H2A.X [Ser139]	JBW301
150Nd	pStat5 [Y694]	47
151Eu	CD123 (IL-3R)	6H6
152Sm	pAkt [S473]	D9E
156Gd	p-p38 [T180/Y182]	D3F9
158Gd	CD10	HI10a
159Tb	CD22	HIB22
162Dy	pPLCg2 [pY759]	K86689.37
163Dy	CD34	581
165Ho	pCREB/ATF1 [S133]	87G3
167Er	pERK 1/2 [T202/Y204]	D13.14.4E
169Tm	CD19	HIB19
171Yb	pZAP70 [Y319]/Syk [Y352]	17a
172Yb	pS6 [S235/S236]	N7548
174Yb	pStat4 [Y693]	38/p-Stat4
175Lu	pHistone H3 [S28]	HTA28
176Yb	CD58 (LFA-3)	TS2/9
191Ir	Iridium	NA
195Pt	Cisplatin	NA

Table S4. Antibody panel for mass cytometry of B lineage ALL.

The antibody panel used for mass cytometry detailing metal isotope labels and antibody clones.

Target		Cells used in	
Protein	Label	validation	Stimulation
pSHP2	141Pr	Jurkat	1µM Wortmannin, 15 mins at 37°C
cCaspase3	142Nd	Pre-B 697	500nM Dexamethasone, 48 hours at 37°C
cPARP	143Nd	Pre-B 697	500nM Dexamethasone, 48 hours at 37°C
pHistone			
H2AX	147Sm	Jurkat	50µM Etoposide, 2 hours at 37°C
pSTAT5	150Nd	Jurkat	Pervanadate, 15 mins at 37°C
pAkt	152Sm	Jurkat	1µM Wortmannin, 2 hours at 37°C
p-p38	156Gd	PBMC	40nM PMA, 10 mins at 37°C
pPLCγ2	162Dy	Ramos	Pervanadate, 15 mins at 37°C
			50nM PMA, 1µg/ml Ionomycin, 15 mins at
pCREB	165Ho	PBMC	37°C
pERK1/2	167Er	PBMC	40nM PMA,10 mins at 37°C
pZAP70/Syk	171Yb	Jurkat	Pervanadate, 15 mins at 37°C
pS6	172Yb	PBMC	50nM PMA, 30 mins at 37°C
pSTAT4	174Yb	Jurkat	Pervanadate, 15 mins at 37°C
			100nM Nocodazole, 24 hours at room
pHistone H3	175Lu	Jurkat	temperature

 Table S5. Validation of Signalling Antibodies.

Pervanadate working solution was comprised of sodium orthovanadate (125μ M) and hydrogen peroxide (530μ M). PBMC- peripheral blood mononuclear cells.

Supplementary Figures

Figure S1. CONSORT diagram for the study.





Figure S2. Western analyses for pSTAT5 and pERK.

Western analysis of presentation ALL samples probed with antibodies to assess JAK-STAT and RAS pathway activation. M is the molecular weight marker lane. LK219 (pERK positive by CyTOF) had a low molecular weight band (not visible in figure) for pERK which may be due to sample degradation.



Figure S3. Sequential gating protocol for BCP-ALL cells and mature B-cells

B Mature B-Cell Sequential Gating



Sequential gating of cell populations. Gating first assesses acquisition of sample by analysing time against event length, allowing for the removal of aberrantly acquired cells that are a result of blockages. Next, EQ quality control beads are removed by gating out events positive for 140Ce. Singlets are then selected by assessing DNA against event length, removing debris and doublets. Next the viability marker cisplatin is used to separate dead cells from living. Dying cells are removed by selecting events negative for apoptotic markers cleaved CASPASE3 and cleaved PARP. At this stage only living healthy cells remain, from this population B lymphocytes are selected by gating for CD19+ events. CD34 heterogeneous cells are selected and a final marker, either CD45, CD38, CD58, or CD123 are used to identify leukaemic cells (A). Mature B-cells undergo identical initial gating, but CD34 negative cells are selected, followed by selection of CD10 negative/low and CD22 positive cells. A final gate is used, CD45 positive, CD22 positive cell population is selected to ensure only mature B-cells are selected (B).





Bone marrow samples taken at disease presentation, or during induction therapy were processed and ALL cells quantified by both flow and mass cytometry using a standardised sequential gating strategy (n=45). Artificially created 'mock' MRD samples were also prepared (n=11) and included quality control MRD samples from an external quality assurance provider (n=9). The percentage of leukaemic cells ranged from 0.004% to 94.4%, with a mean of 17.71% and SD of +/-28%. Values were highly concordant between both technologies (r^2 = 0.97).





Histograms of *CXCR4* (A, C) and *MKNK2* (B and D) gene expression in PreB697 cells after dosing with IC_{50} concentrations of dexamethasone, vincristine or CV for 3, 6 and 24 hours. Data are expressed relative to basal gene expression at time 0. Mean and SEM of 4 biological replicates are shown. ** denotes p<0.01.



Figure S6. Batch effect analyses in gated leukemic cells and gated mature B-cells.



Batch effect testing on gated blast cells using UMAP. UMAP analysis of sample distribution showing a heterogeneous mix of batch (A) and patient samples (B). Investigation of gated mature B-cells shows negligible level of batching apart from batch 18 (C). The three islands separated from the main population of mature B-cells show biological rationale for separation. The top left island (1) is mainly populated from clusters 2, 3, and 4 which are characterised by high expression of CD123 and CD38. The top middle island (2) is predominantly populated by clusters 18 and 13 which are characterised by high pSHP2 expression. The right most island is predominantly populated by cluster 20 which is characterised by pH2AX indicating likely damaged cells (D). Heatmap showing signalling composition of each cluster (E).

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