# Dynamics of gene expression and chromatin marking during cell state transition

Beatrice Borsari, Amaya Abad, Cecilia C. Klein, Ramil Nurtdinov, Alexandre Esteban, Emilio Palumbo, Marina Ruiz-Romero, María Sanz, Bruna R. Correa, Rory Johnson, Sílvia Pérez-Lluch and Roderic Guigó

## **Supplementary Information**

Supplementary Figures 1-7 Supplementary Tables 1, 3-6



Supplementary Figure 1: Characterization of gene expression and histone modifications' profiles during transdifferentiation — See also Figure 1, Supplementary Tables 1-2. a: Flow-cytometry plots assessing expression of CD19 and Mac-1 antigens at the 12 time-points monitored during transdifferentiation. b: Classification of timeseries expression profiles. We selected a set of 12,248 protein-coding genes, which comprises 1,552 not expressed genes (0 TPM in all time-points and biological replicates) and 10,696 expressed genes (> 5 TPM in at least one time-point, and in both biological replicates). Within the set of expressed genes, we distinguished between genes with a stable expression profile throughout transdifferentiation (stably expressed; maSigPro FDR  $\geq$  0.05; n = 2,666), and genes showing significant changes in gene expression over time (differentially expressed or DE; maSigPro FDR < 0.05; n = 8,030). DE genes were further characterized into bending (1,409), down-regulated (4,016), peaking (502) and up-regulated (2,103) genes. Examples of genes belonging to the six types of expression profiles are provided. Gene expression values are reported in  $\log_2$  (TPM + 1). c: Average pile-up signal over the gene body  $\pm$  5 Kb (H3K36me3 and H4K20me1), or promoter regions  $\pm$  5 Kb from the Transcription Start Site (TSS; all other marks), computed at each of the 12 time-points. The vertical dashed lines mark the selected region of  $\pm$  2 Kb around the TSS. d: Proportion of genes contributing to the first two principal components (PC1 and PC2) of the joint PCA on expression and chromatin marks (Figure 1c), that are classified as bending, down-regulated, peaking, up-regulated or stably expressed.







Supplementary Figure 2: The correlation between chromatin marking and gene expression over time is lower than the one reported in steady-state conditions - See also Figure 1. a: Steady-state correlations between expression levels (x-axis) and H3K4me3 signals (y-axis) computed on the set of 12.248 genes (silent genes: dark gray; stably expressed genes: gray; DE genes: light gray). Upper panel: Pearson r between expression levels and H3K4me3 signals at paired time-points (0, 24, 48, 72, 120 and 168 hours). The magnitude of the correlation is reported on the top of each scatterplot. The linear regression line is depicted in brown. Lower panel: analogous representation after randomly shuffling the H3K4me3 signals among time-points. As a result, we computed the expression vs. chromatin correlation between unpaired time-points (0h - 24h; 24h - 120h; 48h - 168h; 72h -0h; 120h - 72h; 168h - 48h). Steady-state correlations computed on the whole set of genes are large despite the randomization of the data. b: Steady-states (dots) and time-course (violin and box plots) correlation values between expression levels and chromatin signals (analogous to Figure 1d) computed after randomly permuting the genes' signals of a given mark among time-points. In all cases we report the Pearson r values averaged over 1,000 permutations. For steady-states correlations, the median Pearson r values across time-points are: H3K27ac: 0.63; H3K9ac: 0.68; H4K20me1: 0.54; H3K36me3: 0.69; H3K4me3: 0.69; H3K4me1: 0.50; H3K4me2: 0.59; H3K9me3: -0.08; H3K27me3: -0.16. For time-course correlations, the median Pearson r values across genes are 0 (|r| < 0.001) for all marks. c: Steady-states (dots) and time-course (violin and box plots) correlation values between expression levels and chromatin signals (analogous to Figure 1d), computed after removing stably expressed and silent genes (i.e. only on the set of differentially expressed genes). The median steady-state Pearson r values for each mark are: H3K27ac: 0.53; H3K9ac: 0.58; H4K20me1: 0.56; H3K36me3: 0.60; H3K4me3: 0.51; H3K4me1: 0.17; H3K4me2: 0.26; H3K9me3: -0.08; H3K27me3: -0.23. The median time-course Pearson *r* values for each mark are: H3K27ac: 0.53; H3K9ac: 0.55; H4K20me1: 0.55; H3K36me3: 0.53; H3K4me3: 0.38; H3K4me1: 0.14; H3K4me2: 0.14; H3K9me3: 0.16; H3K27me3: -0.04. Silent genes contribute substantially to the steady state correlations, and partially contribute to the differences observed in Figure 1d between steady-state and time-course correlations, since the latter cannot be computed for silent genes (see Methods).



#### Supplementary Figure 3: Segmentation of time-series ChIP-seq data highlights a dual role of H3K9me3

— See also Figure 2. **a**: Log likelihood values for HMM models with increasing number of states (between 2 and 20). **b**: Frequency of the five states observed along the twelve time-points of transdifferentiation in the HMM-sequence profiles of the sets of silent, stably expressed and differentially expressed (DE) genes. **c**: Example of a silent gene (*TAC1*) marked exclusively by H3K9me3 along transdifferentiation. Expression and chromatin tracks from one biological replicate are displayed, as well as normalized line plots averaging the signal from the two replicates. The profile of HMM states is shown at the bottom. **d**: Analogous representation for *DGKQ*, a stably expressed gene marked by canonically active histone modifications and H3K9me3.



Supplementary Figure 4: Changes in chromatin marking over time can be uncoupled from changes in gene expression — See also Figure 3, Supplementary Tables 3-4. a: Distributions of genes' fold-change (FC: difference between maximum and minimum signals along transdifferentiation) for each histone mark. Differences in FC among sets of silent, stably expressed and DE genes were statistically assessed with Wilcoxon Rank-Sum test (two-sided). The magnitude of chromatin changes observed in stably expressed and silent genes is, in some cases, comparable to (H4K20me1 and H3K36me3 for silent; H3K27me3 and H3K9me3 for stably expressed), or even larger (H3K4me1 and H3K4me2 for silent) than the one observed for DE genes. b: Trajectories of transdifferentiation derived from a Principal Component Analysis performed jointly on expression and each histone mark's time-series profiles of DE genes, distinguishing between differentially marked (left) and stably marked (right) genes. Across all histone marks, transdifferentiation trends are clearer using the former set of genes, suggesting that the different resolution of PCA trends initially observed (Figure 1c) may be explained by the different amount of changes observed, over time, across histone marks. Unexpectedly, H3K4me1-, H3K4me2- and H3K9me3-differentially marked genes show a contrasting profile for expression and chromatin modifications along PC2, but different to the pattern observed for H3K27me3.

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Supplementary Figure 5: Genes in different stages of activation are associated with specific chromatin and gene expression patterns, and perform distinct functions — See also Figures 4-5, Supplementary Tables 5-6. a: Three-dimensional representation of the combinations of labels and histone marks (analysis attributes). The color code for the labels is analogous to Figure 4a. Histone marks are represented by numbers. **b**: Distributions of gene expression levels at 0 and 168 hours p.i., and fold-change (FC) in gene expression (168h - 0h) for upregulated genes that belong to clusters 1-3. Differences in gene expression levels among clusters were assessed with the Wilcoxon Rank-Sum test (two-sided). c: Density plot reporting the time-point at which the time-series expression profiles of up-regulated genes in clusters 1-3 reach a degree of up-regulation  $\geq$  25%. For this analysis, the time-series expression profile of each gene was re-scaled to a 0-100% range. d: Multidimensional scaling-based representation of the semantic dissimilarities between non-redundant Gene Ontology Biological Process terms enriched among up-regulated genes in clusters 1-3. Each circle represents a term, with the size and the color of the circle denoting the  $-log_{10}$  p value and the cluster of the term, respectively. GO terms that lie close to each other are semantically more similar. e: Analogous representation to Supplementary Figure 5d for cellular compartments. Cluster 1 genes are associated with metabolic functions mostly performed in intracellular compartments, suggesting a more housekeeping nature of these up-regulated genes. Cluster 2 genes perform functions related to the inflammatory response and to the cell membrane and projections, and are thus more likely to be involved in the transition from pre-B cells to macrophages. Cluster 3 genes are associated with macrophage-specific functions. f: Analysis of ENCODE RNA-seg data available for five cancer cell lines (MCF7, HepG2, A549, GM12878, K562), and two primary cell types (B cells and CD14+ monocytes) that are biologically similar to the cell types present at the beginning (pre-B) and at the end (macrophages), respectively, of our transdifferentiation model. Distributions of gene expression levels for up-regulated genes that belong to clusters 1-3. Differences in gene expression levels among clusters were assessed using Wilcoxon Rank-Sum test (two-sided). g: Analysis of ENCODE ChIP-seq data for the nine histone marks we have monitored along transdifferentiation in five cancer cell lines (MCF7, HepG2, A549, GM12878, K562) and two primary cell types (B cells and CD14+ monocytes). Proportions (%) of marked genes at gene body (H3K36me3, H4K20me1) and promoter regions (all other marks) among up-regulated genes in clusters 1-3. h: Percent stacked bar plot depicting the proportion of bending, down-regulated, peaking and up-regulated genes that belong to the three clusters.

#### **Supplementary Figure 6**





anticipate co-occur follow

75%-

100%-

50%

Supplementary Figure 6: The up-regulation of chromatin marks and gene expression follows a precise order only during the initial stage of gene activation — See also Figure 6. a: Alluvial plot describing the HMM time-series profiles for the 257 (upper panel) and 629 (lower panel) up-regulated genes that are not expressed (< 1 TPM) and expressed (> 25 TPM), respectively, at 0 hours p.i. **b**: Graphical representation of cases in which the up-regulation of chromatin signal anticipates (left), co-occurs with (middle), or follows (right) the up-regulation of gene expression. The expression and histone marks' time-series profiles of each gene were re-scaled to a 0-100% range prior to the analysis. We considered four degrees of up-regulation (25%, 50%, 75% and 100%) and computed, for each gene and histone mark, the time-point at which the expression and chromatin re-scaled values reach each of the four degrees of up-regulation. Here we depict a representation for the degree of up-regulation of 25%. c: Lag (hours) between 50%, 75% and 100% up-regulation in histone marks' signal and expression level for the 257 upregulated genes not expressed at 0 hours p.i. Negative lags correspond to changes in chromatin marks anticipating changes in gene expression; positive lags correspond to changes in chromatin marks following changes in gene expression. d: Analogous representation to Figure 6c for co-occurring changes between pairs of histone marks in genes that are either silent (upper panel) or expressed (lower panel) at 0 hours. For genes specifically activated during transdifferentiation (upper panel), the amount of co-occurring changes increases towards the end of the upregulation process. e: Analogous representation to Figure 6a for the 629 up-regulated genes expressed at 0 hours p.i.



Supplementary Figure 7: Chromatin marking cannot be fully recapitulated by gene expression — See also Figure 1, Supplementary Figure 1. a: Proportion of genes contributing to the first two principal components (PC1 and PC2) of the joint PCA on expression and chromatin marks in Figure 1c, that belong to the three clusters of DE genes (clusters 1-3) or that are stably expressed and differentially marked ("DM only"). While genes contributing to the transition from pre-B cells to macrophages (pc1-contributing genes, Figure 1c, Supplementary Figure 1d) show the canonical correlation with chromatin changes (cluster 2), a considerable fraction of genes involved in the intermediate stages of transdifferentiation (pc2-contributing genes) display expression and chromatin changes uncoupled from one another (cluster 1, or stably expressed and differentially marked - "DM only"). This further supports the hypothesis that chromatin changes are involved in a transient de-differentiation from pre-B cells into an intermediate state, and re-differentiation into macrophages. b: Among the set of stably expressed and differentially marked genes contributing to PC2 ("DM only" genes in Supplementary Figure 7a), number of genes with variable chromatin profiles for increasing numbers of histone marks. For instance, 79 genes present changes in three histone modifications along transdifferentiation. c: Example of a stably expressed gene (TALDO1) contributing to PC2 in the PCA in Figure 1c, and showing significant changes in some chromatin profiles along transdifferentiation. Expression and chromatin tracks from one biological replicate are displayed, as well as normalized line plots averaging the signal from the two replicates. Profiles of HMM states are shown at the bottom.

history marks	sile	ent	expressed		
nistone marks	unmarked	marked	unmarked	marked	
H3K4me1	1,165	387	52	10,644	
	(75.1%)	(24.9%)	(0.5%)	(99.5%)	
H3K4me2	1,225	327	45	10,651	
	(78.9%)	(21.1%)	(0.4%)	(99.6%)	
H3K9ac	1,500	52	130	10,566	
	(96.6%)	(3.4%)	(1.2%)	(98.8%)	
H2K27aa	1,478	74	159	10,537	
HSK27ac	(95.2%)	(4.8%)	(1.5%)	(98.5%)	
H3K4me3	1,488	64	183	10,513	
	(95.9%)	(4.1%)	(1.7%)	(98.3%)	
H3K36me3	1,444	108	354	10,342	
	(93.0%)	(7.0%)	(3.3%)	(96.7%)	
H4K20me1	1,348	204	1,851	8,845	
	(86.9%)	(13.1%)	(17.3%)	(82.7%)	
H3K9me3	990	562	7,201	3,495	
	(63.8%)	(36.2%)	(67.3%)	(32.7%)	
H2K27mo2	1,371	181	9,421	1,275	
H3K2/me3	(88.3%)	(11.7%)	(88.1%)	(11.9%)	

Supplementary Table 1: Numbers of unmarked and marked genes within the sets of 1,552 silent and 10,696 expressed genes — See also Figure 1 and Supplementary Figure 1. For a given histone mark, unmarked genes have no peaks called at any time-point in the region of interest, while marked genes have peaks called in the region of interest in at least one time-point (see Methods).

Supplementary Table 2: GO terms significantly enriched among genes contributing to Principal Components 1 and 2 — See also Figure 1 and Supplementary Figure 1. The list of terms refers to Biological Processes.

	unmarked	marked					
histone marks		stably differentially		dit	ferentially mark	lly marked	
				positively c.	uncorrelated	negatively c.	
	41	4,591	3,398	1,491	1,457	450	
H3K4IIIe I	(0.5%)	(57.2%)	(42.3%)	(43.9%)	(42.9%)	(13.2%)	
H3K4mo2	32	5,074	2,924	1,248	1,316	360	
H3K4Mez	(0.4%)	(63.2%)	(36.4%)	(42.7%)	(45.0%)	(12.3%)	
	107	2,996	4,927	3,239	1,548	140	
нзкуас	(1.3%)	(37.3%)	(61.4%)	(65.8%)	(31.4%)	(2.8%)	
H3K27ac	135	2,835	5,060	3,065	1,761	234	
	(1.7%)	(35.3%)	(63.0%)	(60.6%)	(34.8%)	(4.6%)	
H2K4mo2 150		4,310	3,570	2,048	1,402	120	
H3K4IIIe3	(1.9%)	(53.7%)	(44.4%)	(57.4%)	(39.3%)	(3.3%)	
H3K36me3 (3.5	283	4,801	2,946	2,472	459	15	
	(3.5%)	(59.8%)	(36.7%)	(83.9%)	(15.6%)	(0.5%)	
H4K20me1	1,403	2,484	4,143	2,782	1,256	105	
	(17.5%)	(30.9%)	(51.6%)	(67.2%)	(30.3%)	(2.5%)	
H3K9me3	5,363	1,698	969	253	615	101	
	(66.8%)	(21.1%)	(12.1%)	(26.1%)	(63.5%)	(10.4%)	
6,98		362	680	40	347	293	
nskz/mes	(87.0%)	(4.5%)	(8.5%)	(5.9%)	(51.0%)	(43.1%)	

**Supplementary Table 3: Decision-tree labelling of differentially expressed genes** — See also Figures 3-4, Supplementary Figure 4. Left side: numbers of unmarked and marked genes within the set of DE genes. Marked genes are further separated into genes that are either stably or differentially marked (i.e. have stable or variable chromatin profiles during transdifferentiation). The percentages refer to the total number of DE genes (n = 8,030). Right side: within the set of differentially marked genes, we distinguish between genes that are positively correlated, uncorrelated or negatively correlated with gene expression over time (see Methods). The percentages in this case are computed with respect to the number of differentially marked genes found for each histone modification.

	silent		stably expressed			
histone	histone unmarked ma		arked unmarked		marked	
mark		stably	differentially		stably	differentially
H3K4me1	1,165	114	273	11	1,711	944
	(75.1%)	(7.3%)	(17.6%)	(0.4%)	(64.2%)	(35.4%)
H3K4me2	1,225	91	236	13	1,904	749
	(78.9%)	(5.9%)	(15.2%)	(0.5%)	(71.4%)	(28.1%)
	1,500	15	37	23	1,338	1,305
НЗК9ас	(96.6%)	(1%)	(2.4%)	(0.9%)	(50.2%)	(48.9%)
H3K27ac	1,478	28	46	24	1,197	1,445
	(95.2%)	(1.8%)	(3%)	(0.9%)	(44.9%)	(54.2%)
H3K4me3	1,488	30	34	33	1,741	892
	(95.9%)	(1.9%)	(2.2%)	(1.2%)	(65.3%)	(33.5%)
H3K36me3	1,444	78	30	71	2,204	391
	(93%)	(5%)	(1.9%)	(2.7%)	(82.7%)	(14.7%)
H4K20me1	1,348	88	116	448	1,221	997
	(86.9%)	(5.7%)	(7.5%)	(16.8%)	(45.8%)	(37.4%)
H3K9me3	990	445	117	1,838	558	270
	(63.8%)	(28.7%)	(7.5%)	(68.9%)	(20.9%)	(10.1%)
	1,371	138	43	2,433	125	108
n3K2/me3	(88.3%)	(8.9%)	(2.8%)	(91.3%)	(4.7%)	(4.1%)

**Supplementary Table 4: Absent, stable and differential chromatin marking over time among silent and stably expressed genes** — See also Figure 3, Supplementary Figure 4. Numbers of unmarked and marked genes within the sets of 1,552 silent and 2,666 stably expressed genes. Marked genes are further separated into genes that are either stably or differentially marked.

Experiment ID	Accession file ID	Replicate	Biosample term name
ENCSR000CON	ENCFF369ZNM	1	A549
ENCSR000CON	ENCFF627QMV	2	A549
ENCSR000CTV	ENCFF485EUP	1	B cell
ENCSR000CTV	ENCFF231GYC	2	B cell
ENCSR000CUC	ENCFF299BIL	1	CD14-positive monocyte
ENCSR000CUC	ENCFF397DFK	2	CD14-positive monocyte
ENCSR000AED	ENCFF902UYP	1	GM12878
ENCSR000AED	ENCFF550OHK	2	GM12878
ENCSR000CPE	ENCFF004HYK	1	HepG2
ENCSR000CPE	ENCFF401KRE	2	HepG2
ENCSR000CPH	ENCFF172GIN	1	K562
ENCSR000CPH	ENCFF768TKT	2	K562
ENCSR000CPT	ENCFF009GDJ	1	MCF-7
ENCSR000CPT	ENCFF885LEQ	2	MCF-7

**Supplementary Table 5: ENCODE PolyA+ RNA-seq experiments in seven cell types** — See also Supplementary Figure 5. The ENCODE accession numbers allow to uniquely identify the experiment and gene expression quantification file (tsv) on the ENCODE portal (<u>https://www.encodeproject.org/</u>).

Histone mark	Experiment ID	Accession file ID	Biosample term name
H3K27ac	ENCSR000AUI	ENCFF268BMM	A549
H3K27me3	ENCSR000AUK	ENCFF368SNX	A549
H3K4me1	ENCSR000AUM	ENCFF761SFV	A549
H3K4me2	ENCSR000AVI	ENCFF260MGY	A549
H3K4me3	ENCSR000DPD	ENCFF820IQP	A549
Н3К9ас	ENCSR000ASV	ENCFF649ABE	A549
H3K9me3	ENCSR000AUN	ENCFF900ULD	A549
H4K20me1	ENCSR000AUO	ENCFF505MWT	A549
H3K27ac	ENCSR000AUP	ENCFF041HKG	B cell
H3K27me3	ENCSR162DGX	ENCFF428KOX	B cell
H3K36me3	ENCSR424XBP	ENCFF649XGE	B cell
H3K4me1	ENCSR290YLQ	ENCFF778RHF	B cell
H3K4me2	ENCSR000AUY	ENCFF615MAT	B cell
H3K4me3	ENCSR878JSF	ENCFF225QYU	B cell
Н3К9ас	ENCSR799SLA	ENCFF890NWX	B cell
H3K9me3	ENCSR005WWZ	ENCFF281WGS	B cell
H4K20me1	ENCSR000AVJ	ENCFF856EUL	B cell
H3K27ac	ENCSR000ASJ	ENCFF239LOH	CD14-positive monocyte
H3K27me3	ENCSR000ASK	ENCFF930KLN	CD14-positive monocyte
H3K36me3	ENCSR000ASL	ENCFF108MXF	CD14-positive monocyte
H3K4me1	ENCSR000ASM	ENCFF673ZGJ	CD14-positive monocyte
H3K4me3	ENCSR000ASN	ENCFF691MBD	CD14-positive monocyte
H3K9ac	ENCSR000ATF	ENCFF994MCP	CD14-positive monocyte
H3K9me3	ENCSR000ASP	ENCFF236ADT	CD14-positive monocyte
H4K20me1	ENCSR000ASQ	ENCFF887JRI	CD14-positive monocyte
H3K27ac	ENCSR000AKC	ENCFF690GQK	GM12878
H3K27me3	ENCSR000DRX	ENCFF103NGB	GM12878
H3K36me3	ENCSR000DRW	ENCFF144MAY	GM12878
H3K4me1	ENCSR000AKF	ENCFF378FBA	GM12878
H3K4me2	ENCSR000AKG	ENCFF514YHH	GM12878
H3K4me3	ENCSR057BWO	ENCFF296PTF	GM12878

H3K9ac	ENCSR000AKH	ENCFF637GBK	GM12878
H4K20me1	ENCSR000AKI	ENCFF154MVT	GM12878
H3K27me3	ENCSR000DUE	ENCFF034QJR	HepG2
H3K36me3	ENCSR000DUD	ENCFF370NTL	HepG2
H3K4me1	ENCSR000APV	ENCFF095ZHO	HepG2
H3K4me2	ENCSR000AMC	ENCFF948LWD	HepG2
H3K4me3	ENCSR575RRX	ENCFF229PGV	HepG2
H3K9ac	ENCSR000AMD	ENCFF129YID	HepG2
H3K9me3	ENCSR000ATD	ENCFF997LPG	HepG2
H4K20me1	ENCSR000AMQ	ENCFF031AYD	HepG2
H3K27me3	ENCSR000EWB	ENCFF233ODK	K562
H3K36me3	ENCSR000DWB	ENCFF514DBT	K562
H3K4me1	ENCSR000EWC	ENCFF359WWB	K562
H3K4me2	ENCSR000AKT	ENCFF168NKC	K562
H3K4me3	ENCSR668LDD	ENCFF465RJJ	K562
H3K9ac	ENCSR000EVZ	ENCFF257END	K562
H3K9me3	ENCSR000APE	ENCFF361WTS	K562
H3K27ac	ENCSR000EWR	ENCFF040ZCD	MCF-7
H3K27me3	ENCSR000EWP	ENCFF825FPO	MCF-7
H3K4me1	ENCSR493NBY	ENCFF158SKW	MCF-7
H3K4me2	ENCSR875KOJ	ENCFF651IUJ	MCF-7
H3K4me3	ENCSR000DWJ	ENCFF530SPD	MCF-7
H3K9ac	ENCSR056UBA	ENCFF636NEF	MCF-7
H3K9me3	ENCSR000EWQ	ENCFF348ISZ	MCF-7
H4K20me1	ENCSR639RHG	ENCFF052ILJ	MCF-7

**Supplementary Table 6: ENCODE histone ChIP-seq experiments in seven cell types** — See also Supplementary Figure 5. The ENCODE accession numbers allow to uniquely identify the experiment and peak call file (bigBed) on the ENCODE portal (<u>https://www.encodeproject.org/</u>).

#### Supplementary Table 7: Catalog of 12,248 protein-coding genes analyzed in this study.

For each gene we provide the level of expression at 0 hours p.i. (average of the normalized levels from the two biological replicates), the type of expression profile (silent / stably expressed / bending / down-regulated / peaking / up-regulated) and the chromatin marking status (unmarked / stably marked / differentially marked) with respect to each of the nine histone marks. In the case of DE genes, we further specify the type of relationship with gene expression over time (positively correlated / uncorrelated / negatively correlated), as well as the corresponding chromatin cluster (1: stable / uncorrelated marking; 2: positively correlated marking; 3: absence of marking).