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An experimentally validated network of nine haematopoietic transcription

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factors reveals mechanisms of cell state stability

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25 Abstract

26 Transcription factor (TF) networks determine cell type identity by establishing and maintaining 27 lineage-specific expression profiles, yet reconstruction of mammalian regulatory network 28 models has been hampered by a lack of comprehensive functional validation of regulatory Here, we report comprehensive ChIP-Seq, transgenic and reporter gene 29 interactions. 30 experimental data that have allowed us to construct an experimentally validated regulatory 31 network model for haematopoietic stem/progenitor cells (HSPCs). Model simulation coupled 32 with subsequent experimental validation using single cell expression profiling revealed 33 potential mechanisms for cell state stabilisation, and also how a leukemogenic TF fusion 34 protein perturbs key HSPC regulators. The approach presented here should help to improve 35 our understanding of both normal physiological and disease processes.

36 Introduction

37 Tight regulation of gene expression is essential for both the establishment and maintenance of 38 cellular phenotypes within metazoan organisms. The binding of transcription factor proteins 39 (TFs) to specific DNA sequence motifs represents the primary step of decoding genetic 40 information into specific gene expression patterns. TF binding sites (TFBSs) or motifs are 41 usually short (6-10 bp), and therefore found just by chance throughout the genome. Functional 42 TFBSs often occur as evolutionarily conserved clusters, which in the case of enhancers can act 43 over long distances, thus necessitating comprehensive analysis of entire gene loci to understand 44 the transcriptional control mechanisms acting at mammalian gene loci.

45 Given the complex regulatory circuitries that arise when control of multiple genes is 46 considered, transcriptional control is often represented in the form of gene regulatory networks 47 (GRNs), which carry most mechanistic information when constructed from detailed knowledge 48 on the TFs and the *cis*-regulatory elements with which they interact (1-6). Importantly, 49 regulatory network models can provide much more than a representation of existing 50 knowledge, because network simulations can reveal possible molecular mechanisms that 51 underlie highly complex biological processes. Boolean modelling approaches have been used 52 to reconstruct core regulatory networks in blood stem cells (7) and myeloid progenitors (8), but 53 neither of these studies took into account the underlying regulatory structure of the relevant 54 gene regulatory elements. Full gene-regulatory information has been used for an ordinary 55 differential equation-based model (9, 10), but was restricted to a small three-gene core circuit. 56 Large consortia efforts such as ImmGen and FANTOM5 have created comprehensive networks 57 of either regulatory elements or gene signatures important for multipotency and differentiation 58 (11, 12). Furthermore, studies looking at gene regulation circuitry in embryonic stem (ES) cells 59 have proposed regulatory networks important for ES cell identity (13, 14). While the 60 complexities of transcriptional control demand approaches such as network modelling, no 61 single experimental method can provide the complex biological data required for the 62 construction of accurate models. The previously mentioned studies focus their attention on one 63 specific aspect of network modelling and importantly did not combine network analysis with 64 comprehensive functional validation. Given that the key building blocks are gene regulatory 65 sequences and the TFs bound to them, essential information for network reconstruction 66 includes (i) comprehensive TF binding data, (ii) in vivo validation of the functionality of TF-67 bound regions as bona fide regulatory elements, and (iii) molecular data on the functional 68 consequences of specific TF binding events (e.g. activation vs. repression). The regulatory 69 network model that we present in this study comprises all of the aforementioned components 70 and is accompanied by functional validation of model predictions.

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72 **Results**

73 In vivo validation of cis-elements as regulatory network nodes connecting 9 HSPC TFs

74 For the reconstruction of a core GRN model for HSPCs, we focussed on nine major HSPC 75 regulators (ERG, FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1, TAL1), for which 76 genome-wide binding patterns in the murine multipotent progenitor cell line HPC7 have 77 previously been published (15). First, we searched the literature to summarise known *cis*-78 regulatory regions for the nine TFs that possess haematopoietic activity in transgenic mouse 79 embryos, which recovered a total of 14 regions: Erg+85 (16), Fli1-15 (17), Fli1+12, Gata2-3 80 (18), Gata2+3 (= Gata2+9.5) (19), Gfilb+13, Gfilb+16, Gfilb+17 (16, 20), Lyll promoter 81 (21), Spil-14 (22), Runx1+23 (23), Tal1-4 (24), Tal1+19 (25) and Tal1+40 (26).

To extend this partial knowledge of relevant gene regulatory sequences to a comprehensive definition of how these nine TFs might cross-regulate each other, we made use of the genomewide binding data for the nine TFs (15) as well as information on acetylation of histone H3 at

85 lysine 27 (H3K27ac) (27) in the HPC7 blood progenitor cell line. Additional candidate gene 86 regulatory regions for all nine TFs were selected based on binding of at least three TFs and 87 H3K27ac, since it has been shown previously that transcriptionally active regions are 88 commonly bound by multiple TFs and display H3K27 acetylation (28). To assign putative 89 candidate regions to a given TF, they had to be located between its respective upstream and 90 downstream flanking genes, i.e. within the gene body itself or its 5' and 3' intergenic flanking 91 regions. The Erg gene locus for example contains five candidate cis-regulatory regions based 92 on these criteria, namely Erg+65, Erg+75, Erg+85, Erg+90 and Erg+149 (Fig. 1a), of which 93 only the Erg+85 region had previously been tested in transgenic mice (16). Inspection of the 94 gene loci of all nine TFs resulted in the identification of 35 candidate cis-regulatory regions 95 (Fig. 1b, Fig. 1-figure supplements 1-8). In addition to the 14 haematopoietic enhancers 96 previously published, eight of the 35 new candidate regulatory regions had previously been 97 shown not to possess activity in tissues of the blood system of mouse embryos: Gata2-83 98 (Gata2-77), Gfilb promoter (20), Spil-18, Spil promoter (22), Runxl P1 promoter (29), 99 Tall-9, Tall promoter (30) and Tall+6 (31). Of the remaining 27 candidate cis-regulatory 100 regions, two coincided with genomic repeat regions (Runx1-322 and Runx1+1) and were 101 excluded from further analysis because mapping of ChIP-Seq reads to such regions is 102 ambiguous. Since a comprehensive understanding of regulatory interactions among the nine 103 HSPC TFs requires in vivo validation of candidate regulatory regions, we next tested the 104 remaining 25 candidate *cis*-regulatory regions for their ability to mediate reporter gene 105 expression in embryonic sites of definitive haematopoietic cell emergence and colonisation, 106 namely the dorsal aorta and foetal liver of E10.5 to E11.5 transgenic LacZ-reporter mouse 107 embryos. For the Erg locus, this analysis revealed that in addition to the previously known 108 Erg+85 enhancer, the Erg+65 and Erg+75 regions also displayed activity in the dorsal aorta 109 and/or the foetal liver, while the Erg+90 and Erg+149 regions did not (Fig. 1c). Careful inspection of a total of 188 transgenic mouse embryos revealed that nine of the 25 identified regions showed *LacZ* expression in the dorsal aorta and/or foetal liver (Fig. 1b, Fig. 1-figure supplements 1-9). This large scale transient transgenic screen therefore almost doubled the number of known *in vivo* validated early haematopoietic regulatory elements for HSPC TFs.

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115 ChIP-Seq maps for a second progenitor cell line validate core regulatory interactions

116 Although HPC7 cells are a useful model cell line for the prediction of genomic regions with 117 haematopoietic activity in transgenic mouse assays (16), they are refractory to most gene 118 transfer methods and therefore not suitable for functional characterisation of regulatory 119 elements using standard transcriptional assays. By contrast, the 416b myeloid progenitor cell 120 line can be readily transduced by electroporation and therefore represents a candidate cell line 121 for functional dissection of individual regulatory elements. As ChIP-Seq profiles in 416b cells 122 had not been reported previously, we performed ChIP-Seq for H3K27ac and the nine TFs in 123 this cell line (Fig. 2a, Fig. 2-figure supplements 1-8). Alongside with our previously published 124 HPC7 data, this new 416b dataset represents the most complete genome-scale TF-binding 125 analysis in haematopoietic progenitor cell lines to date, with all new data being freely 126 accessible under the following GEO accession number GSE69776 and also at 127 http://codex.stemcells.cam.ac.uk/. Genome-wide TF binding patterns in 416b and HPC7 cells 128 were closely related when compared with binding profiles for the same factors in other 129 haematopoietic lineages (Fig. 2b, Fig. 2-figure supplement 9). Inspection of the gene loci for 130 the nine HSPC TFs not only revealed many similarities between 416b and HPC7 cells, but also 131 some differences in TF binding patterns. Overall, TF occupancy at the 23 regions with activity 132 in haematopoietic tissues (14 previously published (16-26) and 9 newly identified) does not 133 change between the two cell types in 71 % of all cases (147 of 207 binding events), is gained in 134 416b cells in 16 % (33 of 207) and lost in 13 % (27 of 207) of cases compared to HPC7 cells 135 (Fig. 2c). Next, all 23 elements were filtered to only retain those elements which were bound 136 by at least 3 of the 9 TFs and displayed elevated H3K27ac in HPC7 and 416 cells. This led to 137 the removal of the Gata2-3, which is not bound by any of the nine TFs in either cell type, 138 Gata2-92 and Gfi1b+13, which are only bound by one or no TFs in 416b cells, and Fli1-15, 139 which is not acetylated in 416b cells (Fig. 2c, Fig. 2-figure supplements 1-3). Overall, 19 cis-140 regulatory regions were therefore taken forward as a comprehensively validated set of regions 141 for the reconstruction of an HSPC regulatory network model.

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143 Comprehensive TFBS mutagenesis reveals enhancer-dependent effects of TF binding

144 The reconstruction of a core regulatory network model requires information about the effect of 145 TF binding on gene expression, which can be activating, repressing or non-functional. In order 146 to analyse the effects of all TF binding events at all 19 regulatory regions, we performed 147 luciferase reporter assays in stably transfected 416b cells. Based on multiple species 148 alignments between five species (mouse, human, dog, platypus, opossum), we identified 149 conserved TFBSs for the nine TFs (Fig. 3a, Fig. 3-figure supplements 1-19), and generated 150 mutant constructs for each of the 19 regulatory regions, resulting in 87 reporter constructs that 151 were tested by luciferase assays (19 wild-type, 68 mutants). To ensure that DNA binding of the 152 TFs was abrogated, the key DNA bases involved in DNA-protein interactions were mutated 153 and the resulting sequences were scanned to ensure that no new binding sites were created (32). 154 For each of the 19 regulatory regions the conserved TFBSs were mutated by family, for 155 example all six Ets sites within the Erg+65 region were mutated simultaneously in one 156 construct and this element was then treated as the Erg+65 Ets mutant. TFBS mutations 157 reduced or increased activity compared to the wild-type enhancer, or indeed had no significant

158 effect (Fig. 3b, Fig. 3-figure supplements 1-18). For instance, at the *Erg*+65 region, mutation of 159 the six Ets binding sites or the three Gata binding sites reduced luciferase activity, whereas 160 mutation of the three Ebox or the three Gfi motifs increased luciferase activity (Fig. 3b). Comparison of the luciferase assay results for all 19 cis-regulatory regions (Fig. 3c) reveals 161 162 that for each motif class mutation can result in activation, repression or no-change. This 163 observation even extends to single gene loci, where for example mutation of the Gata site 164 reduced activity of the *Erg*+65 region, but increased activity of the *Erg*+85 enhancer (Fig. 3c). 165 Taken together, this comprehensive mutagenesis screen highlights the dangers associated with 166 extrapolating TF function simply from ChIP-Seq binding events and thus underlines the 167 importance of functional studies for regulatory network reconstruction.

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169 Dynamic Bayesian network modelling can incorporate complex regulatory information 170 and shows stabilization of the HSPC expression state

171 We next set out to construct a regulatory network model that incorporates the detailed 172 regulatory information obtained for potential cross-regulation of the nine HSPC TFs obtained 173 in the previous sections (summarised in Fig. 4a). We focussed on three categories of causal 174 relationships: (i) one or several TFs can bind to a certain type of motif at a given regulatory 175 region, and the probability of a motif being bound depends on the expression levels of the 176 relevant TFs; (ii) TFBS mutations at a given regulatory region altered luciferase activities 177 compared to the wild-type, thus capturing the impact of TF binding on activity of the given 178 regulatory region; (iii) individual regulatory regions show varying degrees of activation over 179 baseline controls, which translate into different relative strengths of individual *cis*-regulatory 180 regions. To incorporate this multi-layered experimental information, we constructed a three-181 tier dynamic Bayesian network (DBN) to jointly represent all those causal relationships (see

182 Material and Methods and Fig. 4b). The reconstructed DBN represents a first-order time-183 homogeneous Markov process, which is a stochastic process where the transition functions are 184 the same throughout all time points and the conditional probability distribution of future states depends only on the present state (see Material and Methods). The model is calculated so that 185 186 the expression at t+1 is influenced by the expression at t0; analogously, the expression at t0 is 187 influenced by the expression at t-1, and so on. Therefore, though the model does not 188 incorporate "epigenetic memory", past expression levels directly influence current expression 189 levels. Model execution therefore permits the simulation of gene expression states in single 190 cells over time, as well as the calculation of gene expression distributions for each gene across 191 a population of simulated single cells.

192 Having generated a DBN model incorporating extensive experimental information, we next 193 investigated the expression states following model execution. First, we investigated whether 194 the network model was compatible with the HSPC expression profile from which all the 195 experimental data are derived, namely co-expression of all nine TFs. To this end, model 196 execution was initiated with expression levels for all nine TFs set at the midpoint level of 0.5. 197 A representative single cell modelled over time rapidly adopts characteristic levels of 198 expression for each of the nine genes, with some genes showing perpetual fluctuations (Fig. 199 4c). The same expression levels were reached when the model was initiated with expression 200 starting at 0.2, 0.8 or with initially only FLI1, RUNX1 and TAL1 being expressed at 0.5 (Fig. 201 4-figure supplement 1). We next modelled the overall distribution of the nine TFs as might be 202 seen in a cell population by running 1000 model simulations (Fig. 4d). This analysis 203 demonstrated that our model is compatible with co-expression of all nine genes within the 204 same single cell. Moreover, stable expression over time for some genes as well as oscillations 205 around a characteristic mean expression level for other genes suggests that our model may have

206 captured those aspects of HSPC regulatory networks that ensure maintenance of 207 stem/progenitor cells.

208

209 Relative stability to experimental perturbation is recapitulated by the model

210 The TFs TAL1 and LYL1 are important regulators of adult haematopoiesis, but the deletion of 211 each factor individually has only minor effects on adult HSC function (33-35). Combined 212 deletion in adult HSCs however causes a severe phenotype with rapid loss of HSPCs (36). We 213 wanted to investigate to what extent our computer model could recapitulate these known 214 phenotypes through *in silico* perturbation simulations. To quantify if a change in the expression 215 profile of a given TF was significant we performed a Wilcoxon rank-sum test. Interestingly, 216 this significance calculation demonstrated that both large and small fold-changes can be 217 significant. Simulated perturbation of just LYL1 caused significant alterations to the expression 218 profiles of *Gfi1b*, *Tal1*, *Fli1* and *Gata2*, but none of these were associated with a substantial 219 shift in mean expression levels (Fig. 5a, Fig. 5-figure supplement 1). Perturbation of just TAL1 220 caused significant changes to the expression profiles of Runx1, Gfi1b and Gata2, and again 221 none of these were associated with a substantial shift in expression levels (Fig. 5b, Fig. 5-figure 222 supplement 1). Simultaneous deletion of both factors caused significant changes in gene 223 expression profiles in all TFs except for *Fli1*. Unlike for the single TF perturbations, *Gata2* and 224 *Runx1* showed substantial shifts in expression levels when both LYL1 and TAL1 were 225 simulated to be knocked down (Fig. 5c, Fig. 5-figure supplement 1). Of note, the significance 226 calculations highlight that there may be no one perfect way to visualize these small fold-change 227 alterations. We therefore also generated histogram plots as an alternative visualization (Fig. 5-228 figure supplement 2).

229 We next wanted to compare model predictions with actual experimental data in the 416b cell 230 line, from which the information for model construction had been derived. Because our DBN 231 model is particularly suited to model the expression states in single cells, we compared predicted and experimentally observed effects of knockdown or overexpression in single cells. 232 233 To this end we knocked down the expression of TAL1 in 416b cells by transfecting the cells 234 with siRNA against Tall (siTall) or control siRNA (siCtrl). Forty-eight hours after 235 transfection, gene expression for the nine network genes was analysed in 44 siTal1 treated cells 236 and 41 siCtrl treated cells. Importantly, 29 of 44 cells (66%) transfected with siTal1 showed no 237 expression of *Tall* anymore, demonstrating the successful knockdown (Fig. 5d, Fig. 5-source 238 data). Down-regulation of TAL1 caused a significant change in the expression profiles of 239 Tall, Flil and Gfilb, but a substantial shift of median expression was only observed for Tall 240 (Fig. 5-figure supplement 1). Experimental validation therefore confirmed the occurrence of 241 statistically significant small-fold changes in expression profiles following single TF 242 knockdown, although there was no perfect match between the genes affected in the model and 243 experiment. To extend comparisons between model predictions and experimental validation, 244 we investigated the consequences of knocking down the expression of PU.1 and 245 overexpressing GFI1B. Complete removal of PU.1 in silico after the model had reached its 246 initial steady state had no effect on the expression levels of the other TFs (Fig. 6a). To 247 investigate whether the model prediction is comparable to experimental data obtained from 248 single cells, single cell gene expression analysis using the Fluidigm Biomark HD platform was 249 performed using 416b cells transduced with shRNA against PU.1 (shPU.1) or luciferase 250 (shluc). Three days after transduction, 121 shPU.1 and 123 shluc transduced single cells were 251 analysed for their expression of Spil and the other eight TFs of the network. 18 shPU.1-252 transduced cells (15%) showed a complete loss of Spil, and expression of Spil in the 253 remaining cells was markedly reduced compared to the control cells (shluc) (Fig. 6a, Fig. 5source data), highlighting the efficiency of the PU.1 knockdown. *Spi1*, *Runx1*, *Erg* and *Fli1*showed a significant change in expression profiles after the depletion of PU.1, but this involved
a substantial shift in median expression levels only for *Spi1* and *Runx1* (Fig. 5-figure
supplement 1). Expression profiles of the remaining five TFs did not change as a result of
reduced PU.1 levels (Fig. 6a, Fig. 5-source data), therefore mostly confirming the model
prediction.

260 Next, we modelled GFI1B overexpression *in silico* by increasing the expression level of *Gfi1b* 261 to the maximum value after the model had reached its initial steady state which led to a 262 significant change in the expression profiles of Gfilb, Meis1, Erg and Runx1, although only 263 *Gfilb* and *Meis1* showed a substantial shift in median expression levels (Fig. 6b, Fig. 5-figure 264 supplement 1, Fig. 5-source data). Expression profiles of the other five TFs were unaltered. 265 Single cell gene expression analysis of 90 single 416b cells transduced with a Gfi1b-expressing 266 vector and 104 single 416b cells transduced with an empty control vector showed a significant 267 increase in the expression of *Gfilb* and a significant alteration to the expression profile of *Erg*. 268 but only the changes to Gfilb involved a substantial shift in median expression levels. No 269 significant expression changes were seen in any of the other seven network genes (Fig. 6b). 270 Both PU.1 and GFI1B perturbation studies therefore emphasize the resilience of the HSPC TF 271 network to single TF perturbation. Moreover, our *in silico* model reflects this, thus suggesting 272 that the comprehensive experimental information used to construct the network model has 273 allowed us to capture key mechanistic aspects of HSPC regulation. Of note, there were no 274 short-term major expression changes immediately after the perturbation in the silico 275 simulations for the three single TF perturbation described above. For completeness we 276 performed in silico modelling for all permutations of single TF knockdown / overexpression as 277 well as all pairwise combinations of all 9 TFs analysed (a total of 162 simulations, Fig. 6-figure 278 supplement 1).

280 Major perturbations by the AML-ETO oncoprotein are captured by the network model

281 As the TF network described above is relatively stable to single TF perturbations, we set out to 282 test whether a simulation that mimics the situation present in leukemic cells can influence the 283 expression states of the nine TFs in our network. The Aml-Eto9a translocation is amongst the 284 most frequent mutations in AML (reviewed in (37)). The resulting fusion protein is thought to 285 act in a dominant negative manner to repress RUNX1 target genes. To simulate the leukemic 286 scenario caused by AML-ETO expression, we fixed the level of *Runx1* to be the maximum 287 value 1 and at the same time converted all activating inputs of RUNX1 to inhibiting inputs in 288 our DBN model. Interestingly, this simulation of a "leukemic" perturbation caused significant 289 expression changes to all eight of the core HSPC TFs (Fig. 6c). To compare the AML-ETO 290 simulation results with experimental data, we utilised a doxycycline-inducible expression 291 system to generate 416b cells with inducible expression of AML1-ETO fused to a mCherry 292 reporter via a self-cleaving 2A peptide spacer. Following doxycycline induction, 56 single 293 mCherry positive and 122 single mCherry negative 416b cells were analysed by single cell 294 gene expression. Significant gene expression changes can be seen in six of the nine core HSPC 295 TFs (all except *Tall*, *Erg* and *Gata2*) thus highlighting significant overlap between predictions 296 and experimental validation, although there are also notable differences between model 297 predictions and the experimental data (see for example Gata2; Fig. 6c, Fig. 5-figure supplement 298 1, Fig. 5-source data). These results demonstrate that our new HSPC network model can 299 capture many gene expression changes caused by ectopic expression of a leukemia oncogene as 300 well as providing a useful model for normal HSPC transcriptional regulation. The inability of 301 any model to completely recapitulate experimental data is not unexpected. Possible reasons in 302 our case may include more complex activities of the onco-fusion protein than would be 303 captured by our assumption that its "only" function is as a straightforward dominant-negative

effect, or the fact that the computational model is a closed system of only the 9 network TFs,
whereas the experimental single cell perturbation is subject to possible knock-on consequences
from gene changes outside of the 9-TF network.

307

308 Discussion

309 Transcription factor networks are widely recognised as key determinants of cell type identity. 310 Since the functionality of such regulatory networks is ultimately encoded in the genome, the 311 logic that governs interactions between network components should be identifiable, and in due 312 course allow for the construction of network models that are capable of capturing the behaviour 313 of complex biological processes. However, the construction of such network models has so far 314 been severely restricted because the identification and subsequent functional characterisation of 315 mammalian regulatory sequences represent major challenges, and the connectivity and 316 interaction rules within regulatory networks can be highly complex. Here we report a 317 comprehensive mammalian transcriptional network model that is fully grounded in 318 experimental data. Model simulation coupled with subsequent experimental validation using 319 sophisticated single cell transcriptional assays revealed the mechanistic basis for cell state 320 stability within a haematopoietic progenitor model cell line, and also how a leukemogenic TF 321 fusion protein can perturb the expression of a subset of key blood stem cell regulators.

Pictorial representations of putative network models are commonly shown in publications reporting ChIP-Seq TF binding datasets (38). However, due to the lack of experimental underpinning, such representations are simple images that do not encode any of the underlying gene regulatory logic, and importantly therefore cannot provide executable computational models that can be used to simulate biological systems. Although the experimentally-grounded network model shows good agreement with the relative expression states of the nine TFs for

the wild-type as well as the perturbation data, model predictions are not correct in all cases. Apart from the obvious caveat that any computer model is an abstraction of reality and therefore will not be correct in every detail, it also needs to be stressed that we treat the nine TFs as an isolated module for the computer simulations, and therefore could not account for possible influences by additional genes that may affect single cell gene expression measurements in the perturbation experiments.

334 Statistical significance calculations demonstrated that both the computer model and the 335 experimental data showed significant changes in gene expression profiles that were associated 336 with minimal fold-change alterations to median expression levels. Such alterations to 337 expression profiles were prevalent in both single and double-gene perturbations, whereas 338 substantial shifts in median expression were mostly restricted to the double perturbations (and 339 also the AML-ETO oncogene overexpression). This observation suggests that (i) our approach 340 has the capacity to reveal aspects of the fine-grained nature of biological networks, and (ii) the 341 network presented in this study is largely resistant to perturbations of individual TFs in terms 342 of substantial fold-change alterations in median expression levels. We believe that it may well 343 be possible that the statistically significant small-fold changes in HSPC network genes may be 344 responsible for the mild phenotypes seen when major HSPC regulators are deleted in adult HSPCs. Tall^{-/-} mice for example are not viable because TAL1 is absolutely required for 345 embryonic blood development (39), yet deletion of TAL1 in adult HSCs only causes minor 346 347 phenotypes (33). Another noteworthy observation is that it would have been impossible to 348 detect the statistically significant yet small fold-changes using conventional expression 349 profiling, because they only become apparent following the statistical analysis of expression 350 distributions generated by assaying lots of single cells. More generally it is important to 351 acknowledge that the question of how close the present model comes to capturing the underlying biological processes can only be revealed through much more exhaustiveexperimental validation studies.

354 A potential caveat for network reconstruction based on identification of regulatory elements 355 comes from the difficulties associated with capturing negative regulatory elements. As shown 356 elegantly for CD4 and CD8 gene silencers in the lymphoid lineage, TFs involved in the early 357 repression of a locus are not required for maintenance of the silenced state (40, 41). 358 Identification of negative regulatory inputs may therefore require an expansion of datasets to 359 look across sequential developmental stages. It will therefore be important in the future to 360 extend the work presented here to include additional HSPC regulators as well as additional 361 stages along the haematopoietic differentiation hierarchy. Of note, TF-mediated cellular 362 programming experiments have demonstrated that modules of 3-4 TFs are able to confer cell-363 type specific transcriptional programmes (42-45), consistent with the notion that a network 364 composed of nine key HSPC regulators is able to capture useful information about HSPC 365 regulatory programmes.

366 One of the most striking observations of the regulatory network defined here is the high degree 367 to which the HSPC expression state is stabilised. As such, this model is different from 368 previous experimentally-grounded transcriptional regulatory network models (46). These 369 earlier model organism networks have inherent forward momentum, where the model captures 370 the progression through successive embryonic developmental stages characterised by distinct 371 expression states.

The model reported here is based on and validated with data from haematopoietic progenitor cell lines, which can differentiate (47, 48), but can also be maintained in stable self-renewing conditions. A recent study by Busch and colleagues tracked labelled Tie2⁺ HSCs in the bone marrow, and showed that haematopoietic progenitors *in vivo* are also characterised by a

376 substantial self-renewal capability, therefore highlighting the stable state in which they can 377 reside for several months (49). The observed stability of the HSPC expression state presented 378 here is therefore likely to capture aspects of the regulatory mechanisms maintaining the steady 379 state of primary haematopoietic progenitor cells, a notion reinforced further by the fact that our 380 model is based on *in vivo* validated regulatory elements.

The two types of models therefore accurately capture the properties of the distinct biological processes, e.g. driving developmental progression on the one hand, and maintaining a given cellular state on the other. Different design principles are likely to be at play, with feedforward loops representing key building blocks of early developmental GRNs, while the network described here shows an abundance of auto-regulatory feedback loops and partially redundant enhancer elements, both of which may serve to stabilise a given cellular state.

387 Of particular interest may be the organisation of the *Runx1* gene locus, where RUNX1 protein 388 provides positive feedback at some, and negative feedback at other HSPC enhancers. Given 389 that these different enhancers employ overlapping yet distinct sets of upstream regulators, it is 390 tempting to speculate that such an arrangement not only stabilises a given expression level, but 391 also provides the means to either up- or down-regulate RUNX1 expression in response to 392 diverse external stimuli that may act on specific RUNX1 co-factors at either the repressing or 393 activating RUNX1 binding events. Taken together, we report widely applicable experimental 394 and computational strategies for generating fully validated regulatory network models in 395 complex mammalian systems. We furthermore demonstrate how such a model derived for 396 blood stem/progenitor cells reveals mechanisms for stabilisation of the progenitor cell state, 397 and can be utilised to analyse core network perturbations caused by leukemic oncogenes.

398

399 Materials and Methods

400 **ChIP-Sequencing and data processing**

401 The mouse myeloid progenitor 416b cell line (48) was received from Chester Beatty lab and
402 confirmed to be mycoplasma free. The cells were cultured in RPMI with 10 % FCS and 1 %
403 Penicillin/Streptomycin.

404 ChIP assays were performed as previously described (16, 27), amplified using the Illumina 405 TruSeq ChIP Sample Prep Kit and sequenced using the Illumina HiSeq 2500 System following 406 the manufacturer's instructions. Sequencing reads were mapped to the mm10 mouse reference 407 genome using Bowtie2 (50), converted to a density plot and displayed as UCSC genome 408 browser custom tracks. Peaks were called using MACS2 software (51). Mapped reads were 409 converted to density plots and displayed as UCSC genome browser custom tracks. The raw and 410 processed ChIP-Seq data have been submitted to the NCBI Gene Expression Omnibus 411 (www.ncbi.nlm.nih.gov/geo) and assigned the identifier GSE69776. A binary binding matrix 412 was created using in-house scripts, clustered using the dice coefficient and a heatmap was 413 plotted using gplots in R in order to compare newly generated ChIP-Seq data with previously 414 published data (52).

415

416 Analysis of enhancer activity in transient transgenic mouse embryos

417 Genomic fragments spanning the candidate *cis*-regulatory regions were generated by PCR or 418 ordered as gBlocks (Life Technologies GmbH) and cloned downstream of the LacZ gene in an 419 hsp68LacZ (Runx1 constructs) or SVLacZ (all other constructs) reporter vector. Coordinates of 420 candidate chromosomal regions and corresponding primer sequences are given in Fig. 3-figure 421 supplement 20. For Runx1, E10 mouse transient transgenic embryos carrying LacZ enhancer-422 reporter constructs were generated by pronuclear injection of (C57BL/6 x CBA)/F2 zygotes 423 following standard procedures. Transgenic embryos were identified by LacZ-specific PCR on 424 genomic DNA isolated from yolk sac (5'-GCAGATGCACGGTTACGATG-3'; 5'-425 GTGGCAACATGGAAATCGCTG-3'). Xgal staining and cryostat sectioning were performed 426 as previously described (23). Embryos were photographed using a Leica MZFLIII microscope, 427 Leica DFC 300F digital camera (Leica Microsystems, Milton Keynes, UK) and Openlab 428 software (Improvision, Coventry, UK) and sections were examined using a Nikon Eclipse 429 E600 microscope (Nikon, Japan) equipped with 20x and 40x Nomarski objectives. 430 Photographs were taken using a Nikon DXM 1200c Digital Camera (Nikon, Tokyo, Japan). 431 E11.5 transient transgenic embryos of all other candidate *cis*-regulatory regions were generated 432 by Cyagen Biosciences Inc (Guangzhou, China). Whole-mount embryos were stained with 5-433 bromo-4-chloro-3-indolyl-β-d-galactopyranoside (X-Gal) for β-galactosidase expression and 434 photographed using a Nikon Digital Sight DS-FL1 camera attached to a Nikon SM7800 435 microscope (Nikon, Kingston-upon-Thames, UK). Candidate transgenic mouse embryos with 436 LacZ staining in haematopoietic tissues were subsequently embedded in paraffin, stained with 437 0.1 % (w/v) Neutral Red and cut into 6 µm deep longitudinal sections. Images of sections were 438 acquired with a Pixera Penguin 600CL camera attached to an Olympus BX51 microscope. All 439 images were processed using Adobe Photoshop (Adobe systems Europe, Uxbridge, United 440 Kingdom).

441

442 Luciferase reporter assays

Wild-type and mutant DNA fragments for candidate regulatory regions were either cloned using standard recombinant DNA techniques, ordered as gBlocks (Life Technologies) or obtained from GeneArt® by Life Technolgies. DNA fragments were cloned into pGL2 basic or pGL2 promoter vectors from Promega using restriction enzymes or by Gibson Assembly. TFBSs for the nine TFs of interest (corresponding DNA sequences are listed in Fig. 3-figure supplement 19) were identified based on multiple species alignments between five species 449 (mouse, human, dog, platypus, opossum). Where a region contained multiple instances of the 450 same motif, a single mutant construct with all relevant motifs mutated simultaneously was 451 generated (for generated point mutations check Fig. 3a and Fig. 3-figure supplements 1-18). 452 Where TF binding was observed in ChIP-Seq experiments in 416b cells, but the TFBS was not 453 conserved, the motifs present in the mouse sequence were mutated. Stable transfections of the 454 416b cell line were performed using 10 µg reporter construct, 2 µg neomycin resistance plasmid and 1×10^7 416b cells in 180 µl culture medium per pulse. The sample was 455 456 electroporated at 220V and capacitance of 900 µF using the GenePulser Xcell Electroporation 457 System (Bio-Rad). Immediately after transfection, the sample was split into four culture plates. 458 Twenty-four hours after transfection Geneticin G418 (Gibco by Life Technologies) at a final 459 concentration of 0.75 mg/ml was applied to the culture to select for transfected cells. The 460 activity of the luciferase reporter constructs was measured 12-16 days after transfection by 461 using a FLUOstar OPTIMA luminometer (BMG LABTECH). The luciferase activity was 462 normalised to the cell number and presented as relative activity compared to the wild-type 463 construct. All assays were performed at least three times in quadruplicates.

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465 Single cell gene expression and data analysis

466 The TAL1 knockdown was performed using pools of siRNA against Tal1 (Dharmacon) which 467 were transfected into 416b cells. Briefly, 1×10^6 cells were electroporated with either a control 468 or Tal1 siRNA. Forty-eight hours after transfection, cells were sorted into 96 well PCR plates 469 containing lysis buffer using the BD Influx Cell Sorter.

470 The PU.1 knockdown was performed as previously described (27).

471 The MigR1-Gfi1b retroviral expression vector and the corresponding empty vector control (53)

472 were used for GFI1B overexpression. Two million 416b cells were transduced with the above

473 listed vectors by adding viral supernatant and 4 μ g/ml polybrene to the cells, followed by 474 centrifugation at 900 x g for 90 min at 32°C and incubation with 5% CO₂ at 32°C. Half of the 475 media was then replaced with fresh culture media and cells were incubated at 37°C with 5 % 476 CO₂. Forty-eight hours after transduction, GFP+ cells for each cell population were sorted into 477 96 well PCR plates containing lysis buffer using the BD Influx Cell Sorter.

478 To induce AML1-ETO9a expression, the 416b cell line was co-transfected with: 1) a plasmid 479 containing the tetracycline transcription silencer (tTS), the tetracycline transactivator (rtTA) 480 and blasticidine resistance under the control of the $EF1\alpha$ promoter; 2) a plasmid containing the 481 entire Aml-Eto9a cDNA (obtained from vector MigR1-AE9a, Addgene no. 12433) in frame 482 with a F2A element and the mCherry protein under the control of a tetracycline responsive 483 element; and 3) transposase PL623 (54) (kindly donated by Pentao Liu, Sanger Institute, 484 Cambridge) in order to promote simultaneous stable integration of the two constructs described 485 above. After 6 days of culture without selection, cells were incubated with 1 µg/ml of 486 Doxycycline for 24 hours and then stained with DAPI. mCherry positive and negative cells that 487 did not stain with DAPI were sorted into 96 well PCR plates containing lysis buffer using the 488 BD Influx Cell Sorter.

489 Single cell gene expression analysis was performed using the Fluidigm BioMark platform 490 followed by bioinformatics analysis as previously described (20). All cells that express less 491 than 48 % of genes assayed were removed from the analysis for PU.1 knockdown and GFI1B 492 over-expression, all cells expressing less than 56 % of genes assayed were removed from the 493 TAL1 knockdown and all cells that express less than 44 % of genes assayed were removed 494 from the analysis for the AML-ETO9a induction. Importantly, this thresholding resulted in the 495 removal of similar numbers of cells in both the perturbation and control arms of the 496 experiments. The raw data as well as the normalised data (normalised to Ubc and Polr2a) of the 497 gene expression analysis are listed in Fig. 5-source data).

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499 Computational modelling

The first-order DBN shown in Fig. 4b was established on the basis of regulatory information summarized in Fig. 4a. The DBN essentially presents a discrete-time stochastic process that has the Markov property, i.e. the state of the process at the next time point depends purely on its state at the current time point. Also note that this is a time-homogeneous (or time-invariant) DBN, where the transition functions/matrices are the same throughout all time points.

505 To specify parameters of the DBN, we defined a motif family at a specific regulatory region as 506 a unique binary variable; with value "1" indicating that no motif of a motif family is bound at 507 the specific region and value "2" indicating that at least one motif of the motif family is bound 508 by a TF at this region. We assumed that any of the following three factors can lead to a higher 509 probability of a motif being bound by a TF and therefore taking the value 2: (i) more motifs of 510 the same type present within a regulatory region; (ii) multiple TFs that can bind to the same 511 motif, such as TAL1 and LYL1 both binding to Eboxes; (iii) higher expression levels of the 512 TFs. The probabilities were thus calculated based on these three sources of information (see 513 below for an example). We next defined that every regulatory region was a continuous variable 514 on the close interval [0, 1], and its value was determined by the accumulated effects of all 515 motifs present with the regulatory region. Finally, the expression levels of the nine TFs were 516 also defined as continuous variables ranging from 0 to 0.8, and their expression levels were 517 determined by the accumulated activities of the relevant regulatory regions.

518 Considering that variables in the top tier of the DBN are binary whereas those in the middle 519 and bottom tiers are continuous, we found conditional linear Gaussian distribution (55) to be an 520 appropriate generic representation of the intra-slice conditional probability distributions. 521 Specifically, the regression coefficient of a regulatory region on a motif family was estimated 522 by normalizing the logarithmic deviation of luciferase activity, where deviation refers to the 523 change of luciferase activity between the wild-type and the mutated (one motif family at a 524 time) regulatory region (see below for a demonstration). Using the logarithmic deviation 525 allowed us to account for the differences in effect sizes of various motif families by rescaling 526 the differences to a comparable range. Similarly, for each of the nine genes, the regression 527 coefficient of its expression level on a relevant regulatory region was estimated by normalizing 528 the logarithmic deviation of luciferase activity, where deviation refers to the change of 529 luciferase activity compared to the empty vector controls. All Matlab source codes are 530 available at https://github.com/Huange and also http://burrn-sim.stemcells.cam.ac.uk/.

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532 Detailed explanation of the modelling of each tier of the DBN:

a) Estimating the discrete probability distribution of a motif variable

The probability of a motif family at a given regulatory region taking value 1 or 2 (i.e., being unbound or bound) was calculated based on: (i) the number of such motifs in that regulatory region; (ii) the expression levels of the relevant TFs.

537 For example, three Ebox motifs were found at Erg+65 (Fig. 3a). They can be bound by either 538 TAL1 or LYL1. Thus, we assigned that P(Ebox@Erg+65=1) and P(Ebox@Erg+65=2) were 539 determined by {3, TAL1, LYL1}. We assumed that (i) the expression level of a TF is 540 proportional to the probability of that TF binding to a target motif; and (ii) the bindings of TFs 541 to multiple motifs are independent events. Gene expression levels were defined within the 542 closed interval [0, 1], which is identical to the possible range of probabilities. For ease of 543 calculation, we took the expression level of a TF as its probability of binding to a motif. 544 Accordingly, we have

545
$$\tilde{P}(\text{Ebox}@\text{Erg}+65=1) = (1-p)^3 \times (1-q)^3$$
 (1)

546
$$\tilde{P}(\text{Ebox}@\text{Erg}+65=2) = \sum_{n=1}^{3} C(3,n) \times p^n \times (1-p)^{(3-n)} \times (1-q)^3$$

547
$$+\sum_{n=1}^{3} C(3,n) \times q^{n} \times (1-q)^{(3-n)} \times (1-p)^{3}$$
(2)

548
$$+\sum_{n=1}^{2}\sum_{m=1}^{3-n}C(3,n)\times p^{n}\times(1-p)^{(3-n)}\times C((3-n),m)\times q^{m}\times(1-q)^{(3-m)}$$

549 where p and q represent the expression levels of TAL1 and LYL1, respectively.

550 However, to remove the bias introduced by simply taking the expression level of a TF as its 551 probability of binding to a motif, we further normalized the resulting probabilities as below:

552
$$\tilde{Z} = \tilde{P}(\text{Ebox}@\text{Erg}+65=1) + \tilde{P}(\text{Ebox}@\text{Erg}+65=2)$$
 (3)

553
$$P(\text{Ebox}@\text{Erg}+65=1) = \tilde{P}(\text{Ebox}@\text{Erg}+65=1)/\tilde{Z}$$
(4)

554
$$P(\text{Ebox}@\text{Erg}+65=2) = \tilde{P}(\text{Ebox}@\text{Erg}+65=2)/\tilde{Z}$$
 (5)

555 It should be mentioned that the number of the same motifs in a regulatory region was directly 556 taken into account in the estimation of probabilities. One may raise the question of whether this 557 number has such strong power. Specifically, should the exponents in equations (1) and (2) 558 change linearly, or less than linearly, along with the increase in the number of Ebox motifs? To 559 address this issue, we replaced all exponents with their square roots and rerun the whole set of 560 simulations (data not shown). Results showed that using the square roots instead of the original 561 numbers (i) caused a more evenly distributed expression of the nine TFs over the hypothetical 562 interval [0, 1], (ii) captured the same trend in gene expression changes in some perturbations 563 (e.g. the AML-ETO simulation), but (iii) led to decreased expression levels of certain TFs in 564 other perturbations (e.g. PU.1 knockdown and GFI1B over-expression), which therefore 565 disagrees with the experimental data. In order to capture a better agreement of computational 566 and experimental results, we directly used the number of motifs to estimate the discrete 567 probability distributions.

570 The regression coefficient of a regulatory region on a motif family was estimated by 571 normalizing the logarithmic deviation of luciferase activity, e.g. comparing the change of 572 luciferase activity between the wild-type and mutated constructs. For example, when the luciferase activity for the wild-type Erg+65 region was set to 100 %, the simultaneous 573 574 mutation of all Ebox or Gfi motifs at this region resulted in increased luciferase activity (181.2 % or 475.9 %, respectively) (Fig. 3b). In contrast, simultaneous mutation of all Ets or Gata 575 576 motifs at this region led to reduced luciferase activity (1.3 % or 14.5 %, respectively). Based on 577 this information, we estimated the regression coefficient of the Erg+65 region on a relevant 578 motif family in the following way:

579
$$\alpha_{i} = \log\left(\frac{100}{l_{k}}\right) \times \left(\sum_{k} \left|\log\left(\frac{100}{l_{k}}\right)\right|\right)^{-1}$$
(6)

580 where $k \in \{1, ..., 4\}$, $l_1 = 181.2$, $l_2 = 475.9$, $l_3 = 1.3$, $l_4 = 14.5$; accordingly, $\alpha_1 = -0.070$, 581 $\alpha_2 = -0.185$, $\alpha_3 = 0.515$, $\alpha_4 = 0.230$. We can then formulate a linear regression equation as 582 below:

583
$$\tilde{y} = \alpha_1 x_1 + \alpha_2 x_2 + \alpha_3 x_3 + \alpha_4 x_4$$
 (7)

where \tilde{y} denote the estimated luciferase activity of *Erg*+65, and x_1 , x_2 , x_3 and x_4 represent the binding status of Ebox, Gfi, Ets and Gata motifs at *Erg*+65.

However, the minimum and maximum \tilde{y} obtained by the above formula are 0.235 (when $x_1 = x_2 = 2$ and $x_3 = x_4 = 1$) and 1.235 (when $x_1 = x_2 = 1$ and $x_3 = x_4 = 2$). To make the values of \tilde{y} fall in the desired closed interval [0, 1], an intercept of -0.235 has to be introduced into the linear regression model. In addition, a disturbance term has been included in the model in order to satisfy the generic assumption of conditional linear Gaussian distribution. Finally, the fully defined linear regression model regarding *Erg*+65 is given as:

592
$$\tilde{y} = c + \alpha_1 x_1 + \alpha_2 x_2 + \alpha_3 x_3 + \alpha_4 x_4 + \varepsilon$$
(8)

593 where c = -0.235, $\varepsilon \sim N(0, \sigma^2)$, and σ should be a very small value.

594

595 c) Estimating the expression level of a gene

596 For each gene studied, the regression coefficient of its expression level on a relevant regulatory 597 region was estimated by normalizing the logarithmic deviation of luciferase activity, where 598 deviation refers to the change of luciferase activity compared to an empty vector control.

For example, when setting the luciferase activity of the wild-type constructs to 100 %, the luciferase activity of the empty vector controls relative to Erg+65, Erg+75 and Erg+85 wildtypes are 1.9 %, 1.0 % and 15.2 %, respectively (Fig. 3b, Fig. 3-figure supplement 1 and 2). Based on these data, we estimated the expression level of Erg on a relevant regulatory region in the following way:

604
$$\beta_{i} = \log\left(\frac{100}{l_{k}}\right) \times \left(\sum_{k} \left|\log\left(\frac{100}{l_{k}}\right)\right|\right)^{-1}$$
(9)

605 where $k \in \{1, 2, 3\}$, $l_1 = 1.9$, $l_2 = 1.0$, $l_3 = 15.2$; accordingly, $\beta_1 = 0.379$, $\beta_2 = 0.441$, 606 $\beta_2 = 0.180$. We can then formulate a linear regression equation as below:

$$p_3 = 0.100$$
. We can then formulate a finear regression equation as below.

$$607 \qquad \tilde{z} = \beta_1 \tilde{y}_1 + \beta_2 \tilde{y}_2 + \beta_3 \tilde{y}_3 \tag{10}$$

where \tilde{z} denote the estimated expression level of Erg; and \tilde{y}_1 , \tilde{y}_2 and \tilde{y}_3 represent the estimated activities of *Erg*+65, *Erg*+75 and *Erg*+85. Again, a disturbance term has been introduced to the model in order to meet the generic assumption of conditional linear Gaussian distribution. Thus, the fully defined linear regression model regarding *Erg* is given as:

612
$$\tilde{z} = \beta_1 \tilde{y}_1 + \beta_2 \tilde{y}_2 + \beta_3 \tilde{y}_3 + \varepsilon$$
 (11)

613 where $\varepsilon \sim N(0, \sigma^2)$ and σ should be a very small value.

614

615 Statistics

Significance for the results of the luciferase reporter assays was calculated by combining the pvalues of each experiment (generated by using the t-test function in Excel) using the Fisher's method, followed by the calculation of Stouffer's z trend if necessary. Significance tests for changes in TF expression levels caused by TF perturbations (both computational and experimental) were evaluated by Wilcoxon rank-sum tests.

621

622 Acknowledgments

623 We thank the CIMR Flow Cytometry Core facility, especially Dr Chiara Cossetti, for their 624 expertise with cell sorting. Dr Marina Evangelou for her help with statistical analysis of the 625 luciferase assay data, Lucas Greder for advice on cell transfection and stimulating discussions 626 and Cyagen Biosciences and the MRC MHU Transgenic Core for generating transgenic 627 embryos. Thanks are also extended to past and present members of the Göttgens and de Bruijn 628 lab for practical assistance in the analysis of transient transgenic embryos, and to Yoram 629 Groner and Ditsa Levanon for insightful discussions. We are grateful to Barbara L. Kee 630 (University of Chicago, USA) for providing the MigRI-Gfi1b vector and Peter Laslo 631 (University of Leeds, UK) for the shPU.1 construct.

632

633 Funding

Research in the authors' laboratories was supported by Bloodwise, The Wellcome Trust, Cancer Research UK, the Biotechnology and Biological Sciences Research Council, the National Institute of Health Research, the Medical Research Council, the MRC Molecular Haematology Unit (Oxford) core award, a Weizmann-UK "Making Connections" grant

- 638 (Oxford) and core support grants by the Wellcome Trust to the Cambridge Institute for Medical
- 639 Research (100140) and Wellcome Trust–MRC Cambridge Stem Cell Institute (097922).

640

641 **Competing Interests**

642 The authors declare that no competing interests exist.

643

644 **References**

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790 Figure legends

791 Figure 1: Identification of haematopoietic active *cis*-regulatory regions. (a) UCSC 792 screenshot of the *Erg* gene locus for ChIP-Sequencing data for nine haematopoietic TFs (ERG, 793 FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1 (15)) and for H3K27ac (27) 794 in HPC7 cells. Highlighted are all regions of the Erg gene locus that are acetylated at H3K27 795 and are bound by three or more TFs. Numbers indicate the distance (in kb) from the ATG start 796 codon. (b) Summary of the identification of candidate *cis*-regulatory regions for all nine TFs 797 and subsequent analysis in transgenic mouse assays. The inspection of the nine gene loci and the application of the selection criteria (\geq 3 TFs bound and H3K27ac) identified a total of 49 798 799 candidate *cis*-regulatory regions. The heatmap shows the binding pattern of the nine TFs to all 800 candidate regulatory elements in HPC7 cells: green = bound, grey = unbound. Haematopoietic 801 activity in E11.5 transgenic mice is indicated by the font color: black = active, red = not active. 802 Grey indicates genomic repeat regions that were not tested in transgenic mice. Detailed 803 experimental data corresponding to the summary heatmap can be found in Fig. 1-figure 804 supplement 1-8. (c) Haematopoietic activity of the five candidate Erg cis-regulatory regions 805 was determined in E11.5 transgenic mouse assays. Shown are X-Gal-stained whole-mount 806 embryos and paraffin sections of the dorsal aorta (DA, ventral side on the left/top) and foetal 807 liver (FL), sites of definitive haematopoiesis. Colour coding as in B.

809 Figure 1 – figure supplement 1: Identification of haematopoietic active *cis*-regulatory 810 elements for Fli1. (a) The candidate cis-regulatory elements were identified by ChIP-Seq 811 analysis of the TFs ERG, FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1 as 812 well as H3K27 acetylation in the haematopoietic stem/progenitor cell line HPC7. Highlighted 813 in pink are the candidate *cis*-regulatory regions which are bound by at least three of the nine 814 TFs and showed H3K27 acetylation. The numbering represents the direction and distance in 815 kilobases from the start codon ATG (pro = promoter). (b) Candidate regions were assayed for 816 haematopoietic enhancer activity in mouse transient transgenic embryos. X-Gal stained whole-817 mount E11.5 embryos and paraffin sections of the dorsal aorta (DA; longitudinal section, 818 ventral side on the left/top) and foetal liver (FL) are shown for the candidate *cis*-regulatory 819 regions. Transgenic mouse data are not shown for previously published regions, but relevant 820 publications are listed.

821

822 Figure 1 – figure supplement 2: Identification of haematopoietic active *cis*-regulatory 823 elements for Gata2. (a) The candidate *cis*-regulatory elements were identified by ChIP-Seq 824 analysis of the TFs ERG, FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1 as 825 well as H3K27 acetylation in the haematopoietic stem/progenitor cell line HPC7. Highlighted 826 in pink are the candidate *cis*-regulatory regions which are bound by at least three of the nine 827 TFs and showed H3K27 acetylation. The numbering represents the direction and distance in 828 kilobases from the start codon ATG (pro = promoter). (b) Candidate regions were assayed for 829 haematopoietic enhancer activity in mouse transient transgenic embryos. X-Gal stained whole-830 mount E11.5 embryos and paraffin sections of the dorsal aorta (DA; longitudinal section, 831 ventral side on the left/top) and foetal liver (FL) are shown for the candidate *cis*-regulatory regions. Transgenic mouse data are not shown for previously published regions, but relevantpublications are listed.

834

835 Figure 1 – figure supplement 3: Identification of haematopoietic active *cis*-regulatory 836 elements for *Gfilb*. (a) The candidate *cis*-regulatory elements were identified by ChIP-Seq 837 analysis of the TFs ERG, FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1 as 838 well as H3K27 acetylation in the haematopoietic stem/progenitor cell line HPC7. Highlighted 839 in pink are the candidate *cis*-regulatory regions which are bound by at least three of the nine 840 TFs and showed H3K27 acetylation. The numbering represents the direction and distance in 841 kilobases from the start codon ATG (pro = promoter). (b) All candidate regions were 842 previously published regions. Relevant publications are listed.

843

844 Figure 1 – figure supplement 4: Identification of haematopoietic active *cis*-regulatory 845 elements for Lyl1. (a) The candidate cis-regulatory elements were identified by ChIP-Seq 846 analysis of the TFs ERG, FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1 as 847 well as H3K27 acetylation in the haematopoietic stem/progenitor cell line HPC7. Highlighted 848 in pink are the candidate *cis*-regulatory regions which are bound by at least three of the nine 849 TFs and showed H3K27 acetylation. The numbering represents the direction and distance in 850 kilobases from the start codon ATG (pro = promoter). (b) Candidate regions were assayed for 851 haematopoietic enhancer activity in mouse transient transgenic embryos. X-Gal stained whole-852 mount E11.5 embryos and paraffin sections of the dorsal aorta (DA; longitudinal section, 853 ventral side on the left/top) and foetal liver (FL) are shown for the candidate *cis*-regulatory 854 regions. Transgenic mouse data are not shown for previously published regions, but relevant 855 publications are listed.

857 Figure 1 – figure supplement 5: Identification of haematopoietic active *cis*-regulatory 858 elements for *Meis1*. (a) The candidate *cis*-regulatory elements were identified by ChIP-Seq 859 analysis of the TFs ERG, FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1 as 860 well as H3K27 acetylation in the haematopoietic stem/progenitor cell line HPC7. Highlighted 861 in pink are the candidate *cis*-regulatory regions which are bound by at least three of the nine 862 TFs and showed H3K27 acetylation. The numbering represents the direction and distance in 863 kilobases from the start codon ATG (pro = promoter). (b) Candidate regions were assayed for 864 haematopoietic enhancer activity in mouse transient transgenic embryos. X-Gal stained whole-865 mount E11.5 embryos and paraffin sections of the dorsal aorta (DA; longitudinal section, 866 ventral side on the left/top) and foetal liver (FL) are shown for the candidate *cis*-regulatory 867 regions.

868

869 Figure 1 – figure supplement 6: Identification of haematopoietic active *cis*-regulatory 870 elements for Runx1. (a) The candidate cis-regulatory elements were identified by ChIP-Seq 871 analysis of the TFs ERG, FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1 as 872 well as H3K27 acetylation in the haematopoietic stem/progenitor cell line HPC7. Highlighted 873 in pink are the candidate *cis*-regulatory regions which are bound by at least three of the nine 874 TFs and showed H3K27 acetylation. The numbering represents the direction and distance in 875 kilobases from the start codon ATG (pro = promoter). (b) E10 embryos and cryosections of the 876 DA (transverse; ventral down) and FL are shown. For the Runx1+204 region, a larger 12 kb 877 fragment (chr16:92,620,915-92,631,936, mm9) was used for transient transgenesis, but similar 878 results were obtained with the +204 fragment alone (data not shown). The +24 element was 879 tested in conjunction with the +23 and did not change its tissue specificity (Bee et al., 2010).

880 Preliminary data show that the +24 on its own does not mediate robust tissue specific 881 expression of reporter genes. Transgenic mouse data are not shown for previously published 882 regions, but relevant publications are listed.

883

884 Figure 1 – figure supplement 7: Identification of haematopoietic active cis-regulatory 885 elements for Spil. (a) The candidate cis-regulatory elements were identified by ChIP-Seq 886 analysis of the TFs ERG, FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1 as 887 well as H3K27 acetylation in the haematopoietic stem/progenitor cell line HPC7. Highlighted 888 in pink are the candidate *cis*-regulatory regions which are bound by at least three of the nine 889 TFs and showed H3K27 acetylation. The numbering represents the direction and distance in 890 kilobases from the start codon ATG (pro = promoter). (b) All candidate regions were 891 previously published regions. Relevant publications are listed.

892

893 Figure 1 – figure supplement 8: Identification of haematopoietic active *cis*-regulatory 894 elements for Tall. (a) The candidate *cis*-regulatory elements were identified by ChIP-Seq 895 analysis of the TFs ERG, FLI1, GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1 as 896 well as H3K27 acetylation in the haematopoietic stem/progenitor cell line HPC7. Highlighted 897 in pink are the candidate *cis*-regulatory regions which are bound by at least three of the nine 898 TFs and showed H3K27 acetylation. The numbering is based on the distance (in kb) to 899 promoter 1a. (b) All candidate regions were previously published regions. Relevant 900 publications are listed.

901

Figure 1 – figure supplement 9: Number of PCR and LacZ positive transgenic embryos
(E10.5-11.5) for each regulatory region.

904

905 Figure 2: Comparison of TF binding pattern at haematopoietic active *cis*-regulatory 906 regions in two haematopoietic progenitor cell lines, HPC7 and 416b. (a) UCSC screenshot 907 of the Erg gene locus for ChIP-Sequencing data for nine haematopoietic TFs (ERG, FLI1, 908 GATA2, GFI1B, LYL1, MEIS1, PU.1, RUNX1 and TAL1) and for H3K27ac in 416b cells. 909 Highlighted are those haematopoietic active Erg cis-regulatory regions that were identified 910 based on acetylation of H3K27 and TF binding in HPC7 cells followed by transgenic mouse 911 assays. Numbers indicate the distance (in kb) from the ATG start codon. (b) Hierarchical 912 clustering of the binding profiles for HPC7, 416b and other published datasets. The heatmap 913 shows the pairwise correlation coefficient of peak coverage data between pairs of samples in 914 the row and column. The order of the samples is identical in columns and rows. Details about 915 samples listed can be found in Fig. 2-figure supplement 9. (c) Pair-wise analysis of binding of 916 the nine TFs to haematopoietic active *cis*-regulatory regions of the nine TFs in HPC7 versus 917 416b cells. Green = bound in both cells types, blue = only bound in 416b cells, orange = only 918 bound in HPC7 cells, grey = not bound in either cell type.

919

920Figure 2 – figure supplement 1: UCSC screenshot for the *Fli1* gene locus demonstrating921binding patterns for nine key haematopoietic TFs and H3K27ac in 416b cells. Highlighted922in pink are *cis*-regulatory regions that were identified based on the selection criteria (\geq 3 TFs923bound and H3K27ac) in HPC7 cells and were shown to possess haematopoietic activity. The924numbering represents the distance (in kb) from the start codon ATG.

Figure 2 – figure supplement 2: UCSC screenshot for the *Gata2* gene locus demonstrating
binding patterns for nine key haematopoietic TFs and H3K27ac in 416b cells. Highlighted

in pink are *cis*-regulatory regions that were identified based on the selection criteria (\geq 3 TFs bound and H3K27ac) in HPC7 cells and were shown to possess haematopoietic activity. The numbering represents the distance (in kb) from the start codon ATG.

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932Figure 2 – figure supplement 3: UCSC screenshot for the Gfi1b gene locus demonstrating933binding patterns for nine key haematopoietic TFs and H3K27ac in 416b cells. Highlighted934in pink are cis-regulatory regions that were identified based on the selection criteria (\geq 3 TFs935bound and H3K27ac) in HPC7 cells and were shown to possess haematopoietic activity. The936numbering represents the distance (in kb) from the start codon ATG.
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937

938Figure 2 – figure supplement 4: UCSC screenshot for the Lyll gene locus demonstrating939binding patterns for nine key haematopoietic TFs and H3K27ac in 416b cells. Highlighted940in pink is the promoter ("pro") that was identified based on the selection criteria (\geq 3 TFs941bound and H3K27ac) in HPC7 cells and was shown to possess haematopoietic activity. The942promoter is labelled with "pro".

943

Figure 2 – figure supplement 5: UCSC screenshot for the *Meis1* gene locus demonstrating binding patterns for nine key haematopoietic TFs and H3K27ac in 416b cells. Highlighted in pink is the *cis*-regulatory region that was identified based on the selection criteria (\geq 3 TFs bound and H3K27ac) in HPC7 cells and was shown to possess haematopoietic activity. The numbering represents the distance (in kb) from the start codon ATG.

Figure 2 – figure supplement 6: UCSC screenshot for the *Runx1* gene locus demonstrating binding patterns for nine key haematopoietic TFs and H3K27ac in 416b cells. Highlighted in pink are *cis*-regulatory regions that were identified based on the selection criteria (\geq 3 TFs bound and H3K27ac) in HPC7 cells and were subsequently shown to possess haematopoietic activity. The numbering represents the distance (in kb) from the start codon ATG.

956

957Figure 2 – figure supplement 7: UCSC screenshot for the Spi1 gene locus demonstrating958binding patterns for nine key haematopoietic TFs and H3K27ac in 416b cells. Highlighted959in pink is the cis-regulatory region that was identified based on the selection criteria (\geq 3 TFs960bound and H3K27ac) in HPC7 cells and was shown to possess haematopoietic activity. The961numbering represents the distance (in kb) from the start codon ATG.

962

Figure 2 – figure supplement 8: UCSC screenshot for the *Tal1* gene locus demonstrating binding patterns for nine key haematopoietic TFs and H3K27ac in 416b cells. Highlighted in pink are *cis*-regulatory regions that were identified based on the selection criteria (\geq 3 TFs bound and H3K27ac) in HPC7 cells and were shown to possess haematopoietic activity. The numbering the distance (in kb) from promoter 1a.

968

Figure 2 – figure supplement 9: List of ChIP-Seq samples included in the heatmap in
Figure 2b.

972 Figure 3: TFBS mutagenesis reveals enhancer-dependent effects of TF binding on gene 973 expression. (a) Multiple species alignment of mouse (mm9), human (hg19), dog (canFam2), 974 opossum (monDom5) and platypus (ornAna1) sequences for the Erg+65 region. Nucleotides 975 highlighted in black are conserved between all species analysed, nucleotides highlighted in 976 grey are conserved between four of five species. Transcription factor binding sites (TFBS) are 977 highlighted in: blue = Ebox, purple = Ets, green = Gata, vellow = Gfi, red = Meis. The 978 nucleotides changed to mutate the TFBSs are indicated below the alignment. All binding sites 979 of one motif family (e.g. all Ebox motifs) were mutated simultaneously. (b) Luciferase assay 980 for the Erg+65 wild-type and mutant enhancer in stably transfected 416b cells. Each bar 981 represents the averages of at least three independent experiments with three to four replicates 982 within each experiment. Results are shown relative to the wild-type enhancer activity, which is 983 set to 100%. Error bars represent the standard error of the mean (SEM). Stars indicate 984 significance: ** = p-value < 0.01, *** = p-value < 0.001. P-values were calculated using t-985 tests, followed by the Fisher's method. (c) Summary of luciferase assay results for all 19 high-986 confidence haematopoietic active regulatory regions. Relative luciferase activity is illustrated 987 in shades of blue (down-regulation) and red (up-regulation). Crossed-out grey boxes indicate 988 that there is no motif for the TF and/or the TF does not bind to the region. Detailed results and 989 corresponding alignments with highlighted TFBSs and their mutations can be found in Figure 990 3-figure supplements 1-18.

991

Figure 3 – figure supplement 1: Multiple species alignment and luciferase assay results for *Erg*+75. (a) Multiple species alignment (MSA) with the following species: mouse (mm9), human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). Nucleotides highlighted in black are conserved between all species analysed, nucleotides highlighted in grey are conserved between four of five species. Transcription factor binding sites (TFBS) are

997 highlighted in: blue = Ebox, purple = Ets, yellow = Gfi. The nucleotides that were changed to 998 mutate the TFBSs are indicated below the MSA. All conserved binding sites of one motif 999 family (e.g. all Ebox motifs) were mutated simultaneously. Where TF binding was observed in 1000 ChIP-Seq experiments in 416b cells, but the TFBS was not conserved, the motifs present in the 1001 mouse sequence only were mutated. (b) For the luciferase reporter assays in stably transfected 1002 416b cells the averages of at least three independent experiments with three to four replicates 1003 within each experiment are shown. Error bars represent the standard error of the mean (SEM). Stars indicate significance: ** = p-value < 0.01, *** = p-value < 0.001. P-values were 1004 1005 generated using t-tests, followed by the Fisher's method and if necessary Stouffer's z trend.

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1007 Figure 3 – figure supplement 2: Multiple species alignment and luciferase assay results 1008 for *Erg*+85. (a) Multiple species alignment (MSA) with the following species: mouse (mm9), 1009 human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). Nucleotides 1010 highlighted in black are conserved between all species analysed, nucleotides highlighted in 1011 grey are conserved between four of five species. Transcription factor binding sites (TFBS) are 1012 highlighted in: blue = Ebox, purple = Ets, green = Gata, yellow = Gfi. The nucleotides that 1013 were changed to mutate the TFBSs are indicated below the MSA. All conserved binding sites 1014 of one motif family (e.g. all Ebox motifs) were mutated simultaneously. (b) For the luciferase 1015 reporter assays in stably transfected 416b cells the averages of at least three independent 1016 experiments with three to four replicates within each experiment are shown. Error bars 1017 represent the standard error of the mean (SEM). Stars indicate significance: *** = 1018 p-value < 0.001. P-values were generated using t-tests, followed by the Fisher's method and if 1019 necessary Stouffer's z trend.

1021 Figure 3 – figure supplement 3: Multiple species alignment and luciferase assay results 1022 for *Fli1*+12. (a) Multiple species alignment (MSA) with the following species: mouse (mm9), 1023 human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). Nucleotides 1024 highlighted in black are conserved between all species analysed, nucleotides highlighted in 1025 grey are conserved between four of five species. Transcription factor binding sites (TFBS) are 1026 highlighted in: blue = Ebox, purple = Ets. The nucleotides that were changed to mutate the 1027 TFBSs are indicated below the MSA. All conserved binding sites of one motif family (e.g. all 1028 Ebox motifs) were mutated simultaneously. (b) For the luciferase reporter assays in stably 1029 transfected 416b cells the averages of at least three independent experiments with three to four replicates within each experiment are shown. Error bars represent the standard error of the 1030 1031 mean (SEM). Stars indicate significance: *** = p-value < 0.001. P-values were generated using 1032 t-tests, followed by the Fisher's method and if necessary Stouffer's z trend.

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1034 Figure 3 – figure supplement 4: Multiple species alignment and luciferase assay results 1035 for Gata2-93. (a) Multiple species alignment (MSA) with the following species: mouse 1036 (mm9), human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). 1037 Nucleotides highlighted in black are conserved between all species analysed, nucleotides 1038 highlighted in grev are conserved between four of five species. Transcription factor binding 1039 sites (TFBS) are highlighted in: blue = Ebox, purple = Ets, green = Gata, red = Meis, turquoise 1040 = Runt. The nucleotides that were changed to mutate the TFBSs are indicated below the MSA. 1041 All conserved binding sites of one motif family (e.g. all Ebox motifs) were mutated 1042 simultaneously. (b) For the luciferase reporter assays in stably transfected 416b cells the 1043 averages of at least three independent experiments with three to four replicates within each 1044 experiment are shown. Error bars represent the standard error of the mean (SEM). Stars

1045 indicate significance: ** = p-value < 0.01, *** = p-value < 0.001. P-values were generated 1046 using t-tests, followed by the Fisher's method and if necessary Stouffer's z trend.

1047

1048 Figure 3 – figure supplement 5: Multiple species alignment and luciferase assay results 1049 for Gata2+3. (a) Multiple species alignment (MSA) with the following species: mouse (mm9), 1050 human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). Nucleotides 1051 highlighted in black are conserved between all species analysed, nucleotides highlighted in 1052 grey are conserved between four of five species. Transcription factor binding sites (TFBS) are 1053 highlighted in: blue = Ebox, purple = Ets, green = Gata. The nucleotides that were changed to 1054 mutate the TFBSs are indicated below the MSA. All conserved binding sites of one motif 1055 family (e.g. all Ebox motifs) were mutated simultaneously. (b) For the luciferase reporter 1056 assays in stably transfected 416b cells the averages of at least three independent experiments 1057 with three to four replicates within each experiment are shown. Error bars represent the 1058 standard error of the mean (SEM). Stars indicate significance: *** = p-value < 0.001. P-values 1059 were generated using t-tests, followed by the Fisher's method and if necessary Stouffer's z 1060 trend.

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Figure 3 – figure supplement 6: Multiple species alignment and luciferase assay results for *Gfi1b***+16. (a)** Multiple species alignment (MSA) with the following species: mouse (mm9), human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). Nucleotides highlighted in black are conserved between all species analysed, nucleotides highlighted in grey are conserved between four of five species. Transcription factor binding sites (TFBS) are highlighted in: blue = Ebox, purple = Ets, green = Gata, yellow = Gfi, red = Meis, turquoise = Runt. The nucleotides that were changed to mutate the TFBSs are indicated 1069 below the MSA. All conserved binding sites of one motif family (e.g. all Ebox motifs) were 1070 mutated simultaneously. Where TF binding was observed in ChIP-Seq experiments in 416b 1071 cells, but the TFBS was not conserved, the motifs present in the mouse sequence only were 1072 mutated. (b) For the luciferase reporter assays in stably transfected 416b cells the averages of 1073 at least three independent experiments with three to four replicates within each experiment are 1074 shown. Error bars represent the standard error of the mean (SEM). Stars indicate significance: 1075 ** = p-value < 0.01, *** = p-value < 0.001. P-values were generated using t-tests, followed by 1076 the Fisher's method and if necessary Stouffer's z trend.

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1078 Figure 3 – figure supplement 7: Multiple species alignment and luciferase assay results 1079 for Gfilb+17. (a) Multiple species alignment (MSA) with the following species: mouse 1080 (mm9), human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). 1081 Nucleotides highlighted in black are conserved between all species analysed, nucleotides 1082 highlighted in grey are conserved between four of five species. Transcription factor binding 1083 sites (TFBS) are highlighted in: blue = Ebox, purple = Ets, green = Gata, yellow = Gfi, red = 1084 Meis. The nucleotides that were changed to mutate the TFBSs are indicated below the MSA. 1085 All conserved binding sites of one motif family (e.g. all Ebox motifs) were mutated 1086 simultaneously. (b) For the luciferase reporter assays in stably transfected 416b cells the 1087 averages of at least three independent experiments with three to four replicates within each 1088 experiment are shown. Error bars represent the standard error of the mean (SEM). Stars 1089 indicate significance: ** = p-value < 0.01, *** = p-value < 0.001. P-values were generated 1090 using t-tests, followed by the Fisher's method and if necessary Stouffer's z trend.

1092 Figure 3 – figure supplement 8: Multiple species alignment and luciferase assay results 1093 for Lyll promoter. (a) Multiple species alignment (MSA) with the following species: mouse 1094 (mm9), human (hg19), dog (canFam2) and opossum (monDom5). Nucleotides highlighted in 1095 black are conserved between all species analysed, nucleotides highlighted in grey are 1096 conserved between three of four species. Transcription factor binding sites (TFBS) are 1097 highlighted in: purple = Ets, green = Gata. The nucleotides that were changed to mutate the 1098 TFBSs are indicated below the MSA. All conserved binding sites of one motif family (e.g. all 1099 Ets motifs) were mutated simultaneously. (b) For the luciferase reporter assays in stably 1100 transfected 416b cells the averages of at least three independent experiments with three to four 1101 replicates within each experiment are shown. Error bars represent the standard error of the 1102 mean (SEM). Stars indicate significance: *** = p-value < 0.001. P-values were generated using 1103 t-tests, followed by the Fisher's method and if necessary Stouffer's z trend.

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1105 Figure 3 – figure supplement 9: Multiple species alignment and luciferase assay results 1106 for Meis1+48. (a) Multiple species alignment (MSA) with the following species: mouse 1107 (mm9), human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). 1108 Nucleotides highlighted in black are conserved between all species analysed, nucleotides 1109 highlighted in grey are conserved between four of five species. Transcription factor binding 1110 sites (TFBS) are highlighted in: purple = Ets, green = Gata, vellow = Gfi, red = Meis. The 1111 nucleotides that were changed to mutate the TFBSs are indicated below the MSA. All 1112 conserved binding sites of one motif family (e.g. all Ets motifs) were mutated simultaneously. 1113 (b) For the luciferase reporter assays in stably transfected 416b cells the averages of at least 1114 three independent experiments with three to four replicates within each experiment are shown. 1115 Error bars represent the standard error of the mean (SEM). Stars indicate significance: *** =

p-value < 0.001. P-values were generated using t-tests, followed by the Fisher's method and if
necessary Stouffer's z trend.

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1119 Figure 3 – figure supplement 10: Multiple species alignment and luciferase assay results 1120 for Spil-14. (a) Multiple species alignment (MSA) with the following species: mouse (mm9), 1121 human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). Nucleotides 1122 highlighted in black are conserved between all species analysed, nucleotides highlighted in 1123 grey are conserved between four of five species. Transcription factor binding sites (TFBS) are 1124 highlighted in: blue = Ebox, purple = Ets, turquoise = Runt. The nucleotides that were changed 1125 to mutate the TFBSs are indicated below the MSA. All conserved binding sites of one motif 1126 family (e.g. all Ebox motifs) were mutated simultaneously. (b) For the luciferase reporter 1127 assays in stably transfected 416b cells the averages of at least three independent experiments 1128 with three to four replicates within each experiment are shown. Error bars represent the standard error of the mean (SEM). Stars indicate significance: ** = p-value < 0.01, *** =1129 1130 p-value < 0.001. P-values were generated using t-tests, followed by the Fisher's method and if 1131 necessary Stouffer's z trend.

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Figure 3 – figure supplement 11: Multiple species alignment and luciferase assay results for *Runx1-59.* (a) Multiple species alignment (MSA) with the following species: mouse (mm9), human (hg19) and dog (canFam2). Nucleotides highlighted in black are conserved between all species analysed, nucleotides highlighted in grey are conserved between two of three species. Transcription factor binding sites (TFBS) are highlighted in: blue = Ebox, purple = Ets, green = Gata, red = Meis. The nucleotides that were changed to mutate the TFBSs are indicated below the MSA. All conserved binding sites of one motif family (e.g. all Ebox 1140 motifs) were mutated simultaneously. (b) For the luciferase reporter assays in stably 1141 transfected 416b cells the averages of at least three independent experiments with three to four 1142 replicates within each experiment are shown. Error bars represent the standard error of the 1143 mean (SEM). Stars indicate significance: *** = p-value < 0.001. P-values were generated using 1144 t-tests, followed by the Fisher's method and if necessary Stouffer's z trend.

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1146 Figure 3 – figure supplement 12: Multiple species alignment and luciferase assay results 1147 for Runx1+3. (a) Multiple species alignment (MSA) with the following species: mouse 1148 (mm9), human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). 1149 Nucleotides highlighted in black are conserved between all species analysed, nucleotides 1150 highlighted in grey are conserved between four of five species. Transcription factor binding 1151 sites (TFBS) are highlighted in: blue = Ebox, purple = Ets, green = Gata, yellow = Gfi, red = 1152 Meis, turquoise = Runt. The nucleotides that were changed to mutate the TFBSs are indicated 1153 below the MSA. All conserved binding sites of one motif family (e.g. all Ets motifs) were 1154 mutated simultaneously. Where TF binding was observed in ChIP-Seq experiments in 416b 1155 cells, but the TFBS was not conserved, the motifs present in the mouse sequence only were 1156 mutated. (b) For the luciferase reporter assays in stably transfected 416b cells the averages of 1157 at least three independent experiments with three to four replicates within each experiment are 1158 shown. Error bars represent the standard error of the mean (SEM). Stars indicate significance: * = p-value < 0.05, ** = p-value < 0.01, *** = p-value < 0.001. P-values were generated using 1159 1160 t-tests, followed by the Fisher's method and if necessary Stouffer's z trend.

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Figure 3 – figure supplement 13: Multiple species alignment and luciferase assay results
for *Runx1*+23. (a) Multiple species alignment (MSA) with the following species: mouse

1164 (mm9), human (hg19), dog (canFam2) and opossum (monDom5). Nucleotides highlighted in 1165 black are conserved between all species analysed, nucleotides highlighted in grey are 1166 conserved between three to four species. Transcription factor binding sites (TFBS) are 1167 highlighted in: blue = Ebox, purple = Ets, green = Gata, red = Meis, turquoise = Runt. The 1168 nucleotides that were changed to mutate the TFBSs are indicated below the MSA. All 1169 conserved binding sites of one motif family (e.g. all Ebox motifs) were mutated 1170 simultaneously. (b) For the luciferase reporter assays in stably transfected 416b cells the 1171 averages of at least three independent experiments with three to four replicates within each 1172 experiment are shown. Error bars represent the standard error of the mean (SEM). Stars 1173 indicate significance: * = p-value < 0.05, *** = p-value < 0.001. P-values were generated using 1174 t-tests, followed by the Fisher's method and if necessary Stouffer's z trend.

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1176 Figure 3 – figure supplement 14: Multiple species alignment and luciferase assay results 1177 for Runx1+110. (a) Multiple species alignment (MSA) with the following species: mouse 1178 (mm9), human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). 1179 Nucleotides highlighted in black are conserved between all species analysed, nucleotides 1180 highlighted in grey are conserved between four of five species. Transcription factor binding 1181 sites (TFBS) are highlighted in: blue = Ebox, purple = Ets, green = Gata. The nucleotides that 1182 were changed to mutate the TFBSs are indicated below the MSA. All conserved binding sites 1183 of one motif family (e.g. all Ets motifs) were mutated simultaneously. Where TF binding was 1184 observed in ChIP-Seq experiments in 416b cells, but the TFBS was not conserved, the motifs 1185 present in the mouse sequence only were mutated. (b) For the luciferase reporter assays in 1186 stably transfected 416b cells the averages of at least three independent experiments with three 1187 to four replicates within each experiment are shown. Error bars represent the standard error of 1188 the mean (SEM). Stars indicate significance: ** = p-value < 0.01, *** = p-value < 0.001. P-

values were generated using t-tests, followed by the Fisher's method and if necessaryStouffer's z trend.

1191

1192 Figure 3 – figure supplement 15: Multiple species alignment and luciferase assay results 1193 for Runx1+204. (a) Multiple species alignment (MSA) with the following species: mouse 1194 (mm9), human (hg19), dog (canFam2), opossum (monDom5) and platypus (ornAna1). 1195 Nucleotides highlighted in black are conserved between all species analysed, nucleotides 1196 highlighted in grey are conserved between four of five species. Transcription factor binding 1197 sites (TFBS) are highlighted in: blue = Ebox, purple = Ets, yellow = Gfi, turquoise = Runt. The 1198 nucleotides that were changed to mutate the TFBSs are indicated below the MSA. All 1199 conserved binding sites of one motif family (e.g. all Ets motifs) were mutated simultaneously. 1200 Where TF binding was observed in ChIP-Seq experiments in 416b cells, but the TFBS was not 1201 conserved, the motifs present in the mouse sequence only were mutated. (b) For the luciferase 1202 reporter assays in stably transfected 416b cells the averages of at least three independent 1203 experiments with three to four replicates within each experiment are shown. Error bars 1204 represent the standard error of the mean (SEM). Stars indicate significance: *** = 1205 p-value < 0.001. P-values were generated using t-tests, followed by the Fisher's method and if 1206 necessary Stouffer's z trend.

1207

1208 Figure 3 – figure supplement 16: Multiple species alignment and luciferase assay results

for *Tal1-4.* (a) Multiple species alignment (MSA) with the following species: mouse (mm9), human (hg19) and dog (canFam2). Nucleotides highlighted in black are conserved between all species analysed, nucleotides highlighted in grey are conserved between two of three species. Transcription factor binding sites (TFBS) are highlighted in: purple = Ets. The nucleotides that were changed to mutate the TFBSs are indicated below the MSA. All conserved binding sites of the Ets motif family were mutated simultaneously. (b) For the luciferase reporter assays in stably transfected 416b cells the averages of at least three independent experiments with three to four replicates within each experiment are shown. Error bars represent the standard error of the mean (SEM). Stars indicate significance: ** = p-value < 0.01. P-values were generated using t-tests, followed by the Fisher's method and if necessary Stouffer's z trend.

1219

1220 Figure 3 – figure supplement 17: Multiple species alignment and luciferase assay results 1221 for Tal1+19. (a) Multiple species alignment (MSA) with the following species: mouse (mm9), 1222 human (hg19), dog (canFam2) and opossum (monDom5). Nucleotides highlighted in black are 1223 conserved between all species analysed, nucleotides highlighted in grey are conserved between 1224 three of four species. Transcription factor binding sites (TFBS) are highlighted in: purple = Ets. 1225 The nucleotides that were changed to mutate the TFBSs are indicated below the MSA. All 1226 conserved binding sites of the Ets motif family were mutated simultaneously. (b) For the 1227 luciferase reporter assays in stably transfected 416b cells the averages of at least three 1228 independent experiments with three to four replicates within each experiment are shown. Error bars represent the standard error of the mean (SEM). Stars indicate significance: *** = 1229 1230 p-value < 0.001. P-values were generated using t-tests, followed by the Fisher's method and if 1231 necessary Stouffer's z trend.

1232

1233 Figure 3 – figure supplement 18: Multiple species alignment and luciferase assay results

1234 for *Tal1*+40. (a) Multiple species alignment (MSA) with the following species: mouse (mm9),

human (hg19) and dog (canFam2). Nucleotides highlighted in black are conserved between all

1236 species analysed, nucleotides highlighted in grey are conserved between two of three species.

1237 Transcription factor binding sites (TFBS) are highlighted in: blue = Ebox, purple = Ets, green = 1238 Gata. The nucleotides that were changed to mutate the TFBSs are indicated below the MSA. 1239 All conserved binding sites of one motif family (e.g. all Ebox motifs) were mutated 1240 simultaneously. (b) For the luciferase reporter assays in stably transfected 416b cells the 1241 averages of at least three independent experiments with three to four replicates within each 1242 experiment are shown. Error bars represent the standard error of the mean (SEM). Stars indicate significance: * = p-value < 0.05. P-values were generated using t-tests, followed by the 1243 1244 Fisher's method and if necessary Stouffer's z trend.

1245

1246 Figure 3 – figure supplement 19: List of TF binding sites and the TFs that bind to them.

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Figure 3 – figure supplement 20: List of co-ordinates and primer sequences for the
regulatory regions analysed in this study.

1250

1251 Figure 4: A three-tier DBN incorporating transcriptional regulatory information can 1252 recapitulate the HSPC expression state. (a) Representation of the complete network diagram 1253 generated using the Biotapestry software (56). (b) Schematic diagram describing the DBN which 1254 contains three tiers: I. TF binding motifs within regulatory regions, II. cis-regulatory regions 1255 influencing the expression levels of the various TFs, and III. genes encoding the TFs. The output of tier III, namely the expression levels of the TF, feed back into the TF binding at the 1256 1257 various motifs of tier I. The model therefore is comprised of successive time slices (t). (c) 1258 Simulation of a single cell over time. The expression levels of all 9 TFs are the same at the 1259 beginning (0.5). The simulation rapidly stabilizes with characteristic TF expression levels. (d) 1260 Simulation of a cell population by running the model 1000 times. The scale of the x-axis is1261 linear. Each simulation was run as described in (c).

1262

Figure 4 - figure supplement 1: Simulation of a single cell over time with different expression levels at the beginning. The simulation rapidly stabilizes with characteristic TF expression levels irrespective of the starting conditions. (a) The expression levels of all 9 TFs are 0.2 at the start of the simulation. (b) The expression levels of all 9 TFs are 0.8 at the start of the simulation. (c) The expression levels for FLI1, RUNX1 and TAL1 are set to be 0.5 at the beginning, with all other TFs not being expressed (value of 0).

1269

1270 Figure 5: The DBN recapitulates the consequences of TAL1 and LYL1 single and double 1271 perturbations as seen in vivo and in vitro. Computational prediction of gene expression 1272 patterns for the nine TFs of interest after perturbation of TAL1 (a), LYL1 (b) or both (c). 1273 Deletion of TAL1 or LYL1 on their own has no major consequences on the expression levels 1274 of the other eight TFs of the gene regulatory network, but simultaneous deletion of both TAL1 1275 and LYL1 caused changes in expression of several genes, mainly a decrease in Gata2 and 1276 *Runx1*. This major disruption of the core GRN for blood stem/progenitor cells is therefore 1277 consistent with TAL1/LYL1 double knockout HSCs showing a much more severe phenotype 1278 than the respective single knock-outs. One thousand simulations were run for each perturbation 1279 to determine the TFs expression levels in a "cell population" by selecting expression levels at 1280 random time points after reaching its initial steady state. Expression levels of 0 resemble no 1281 expression, whereas expression levels of 1 stand for highest expression level that is possible in 1282 this system. The scale of the x-axis is linear. (d) Gene expression levels measured in single 1283 416b cells transfected with siRNA constructs against Tall or a control. The density plots of 1284 gene expression levels after perturbation of TAL1 indicate the relative number of cells (y-axes) 1285 at each expression level (x-axes). The scale of the x-axis is linear. The values indicate the 1286 results of the Wilcoxon rank-sum test: alterations to the expression profiles are indicated by the 1287 p-value (statistical significance: p < 0.001 for computational data and p < 0.05 for experimental 1288 data); substantial shifts in median expression level are indicated by the shift of median (SOM) 1289 (SOM >0.1 for computational data and >1 for experimental data). For details, see Fig. 5 – 1290 figure supplement 1; for full expression data, see figure 5 – source data.

1291

1292 Fig. 5 - figure supplement 1: Significance tests for the computational and experimental 1293 data after TF perturbations. To determine statistical significance the Wilcoxon rank-sum test 1294 was used. Alterations to the expression profiles are indicated by the p-value; with statistically 1295 significance defined as follows: p < 0.001 for computational data and p < 0.05 for experimental 1296 data. Significance of a substantial shift in median expression levels are as follows: shift of 1297 median >0.1 for computational data and >1 for experimental data (because of different scales). 1298 If the number for the shift of median is negative, the median of the perturbation data is smaller 1299 than that of the wild-type control; if the number is positive, the median of the perturbation is 1300 larger than that of the control. For simplicity, all significant changes are highlighted in red (p-1301 value) and blue (shift of median).

1302

Figure 5 - figure supplement 2: Histogram plots showing the gene expression
distributions of all nine genes of the network for the following perturbations: (a) LYL1

- down-regulation; (b) TAL1/SCL down-regulation; (c) LYL1 and TAL1/SCL down-regulation;
- 1306 (d) PU.1 down-regulation; (e) GFI1B up-regulation; and (f) AML-ETO9a simulation.
- 1307

Figure 5 - source data: Raw and normalised data for the single cell gene expression
experiments presented in this study: 1) TAL1 down-regulation (related to Fig. 5 d), 2) PU.1
down-regulation (related to Fig. 6 a), 3) GFI1B up-regulation (related to Fig. 6b) and 4) AMLETO9a perturbation (related to Fig. 6 c)

1312

1313 Figure 6: The DBN captures the transcriptional consequences of network perturbations. 1314 **Left panel:** Computational prediction of gene expression after perturbation of specific TFs. 1315 1000 simulations were run for each perturbation to determine expression levels in a "cell 1316 population" (expression at 0 resembles no expression, whereas expression of 1 represents the 1317 highest possible expression level). The scale of the x-axis is linear. Right panel: Density plots 1318 of gene expression levels in single 416b cells after perturbation of specific TFs indicating the 1319 relative number of cells at each expression level. The scale of the x-axis is linear. The values 1320 indicate the results of the Wilcoxon rank-sum test: alterations to the expression profiles are 1321 indicated by the p-value (statistical significance: p < 0.001 for computational data and p < 0.051322 for experimental data); substantial shifts in median expression level are indicated by the shift of 1323 median (SOM) (SOM >0.1 for computational data and >1 for experimental data). For details, 1324 see Fig. 5 – figure supplement 1. (a) PU.1 down-regulation: (Left) Computational prediction of 1325 gene expression after PU.1 knockdown (Spi1 was set to 0 after reaching its initial steady state). 1326 (Right) Gene expression levels measured in single 416b cells transduced with shRNA 1327 constructs against shluc (wild-type) or shPU.1 (PU.1 knockdown). (b) GFI1B over-expression: 1328 (Left) Computational prediction of gene expression after over-expression of GFI1B (Gfi1b was 1329 set to 1 after reaching its initial steady state). (Right) Gene expression levels in single 416b 1330 cells transduced with a Gfilb-expressing vector compared to an empty vector control (wild-1331 type). (c) Consequences of the AML-ETO9a oncogene: (Left) Computational prediction of 1332 gene expression patterns after introducing the dominant-negative effect of the AML-ETO9a

1333 oncogene (Runx1 was fixed at the maximum value of 1 after reaching its initial steady state 1334 and in addition all Runt binding sites were set to have a repressive effect). (Right) Gene 1335 expression levels measured in single 416b cells transduced with an AML-ETO9a expressing 1336 vector fused to mCherry. mCherry positive cells were compared to mCherry negative cells 1337 (wild-type).

Figure 6 – figure supplement 1: Summary of all computational simulations for perturbations of one or two TFs. The results for a total of 162 simulations are shown. The data can be accessed using the embedded hyperlinks. The y-axes show the number of cells and the x-axes the relative expression level. Blue curves represent wild-type data and red curves represent perturbation data.





hematopoietic active region hematopoietic inactive region genomic repeat region, not tested











Gata2

Meis1

M

Tal1

0.5

Gata2

Meis1

Tal1

p = 4.1e-7

5

0

high

high

