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Stress-induced transcriptional memory accelerates promoter-proximal pause release and decelerates termination over mitotic divisions

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1	Stress-Induced Transcriptional Memory Accelerates Promoter-Proximal
2	Pause-Release and Decelerates Termination over Mitotic Divisions
3	
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18	Keywords: Acquired stress resistance, chromatin accessibility, enhancer transcription, gene-enhancer
19	networks, nascent transcription program, Pol II pausing, progression of Pol II, recycling of Pol II,
20	transcription termination.

21 Summary

22

23 Heat shock instantly reprograms transcription. Whether gene and enhancer transcription fully 24 recover from stress, and whether stress establishes a memory by provoking transcription regulation 25 that persists through mitosis, remained unknown. Here, we measured nascent transcription and 26 chromatin accessibility in unconditioned cells and in the daughters of stress-exposed cells. 27 Tracking transcription genome-wide at nucleotide-resolution revealed that cells precisely restore 28 RNA Polymerase II (Pol II) distribution at gene bodies and enhancers upon recovery from stress. 29 However, a single heat exposure in embryonic fibroblasts primed a faster gene-induction in their 30 daughter cells by increasing promoter-proximal Pol II pausing, and by accelerating the pause-31 release. In the daughters of repeatedly stressed cancer cells, both basal and heat-induced 32 transcription was refined, and termination-coupled pre-mRNA processing decelerated. The slower 33 termination retained transcripts on the chromatin and reduced recycling of Pol II. These results 34 demonstrate that heat-induced transcriptional memory acts through promoter-proximal pause-35 release and pre-mRNA-processing at transcription termination. 36

37 Highlights

38

39 - Cell type-specific transcription precisely recovers after heat-induced reprogramming

- 40 Heat induction of quality control genes is accelerated in the daughters of stressed cells
- 41 Multiple heat shocks in cancer cells refine basal and inducible transcription over mitotic
 42 divisions
- 43 Promoter-proximal Pol II pausing, pause-release and transcription termination are the rate 44 limiting steps involved in establishing a transcriptional memory
- 45 Accessible chromatin spreads with heat-induced transcription to genes and enhancers
- 46 HSF1 triggers promoter-proximal Pol II pause-release *via* distal and proximal regulatory
 47 elements

48

49 Introduction

50

51 Heat shock fires transcription reprogramming, provoking an instant genome-wide change in RNA 52 synthesis from genes and enhancers (reviewed in Vihervaara et al., 2018). Upon heat shock, 53 hundreds of genes are rapidly induced by a potent trans-activator heat shock factor 1 (HSF1). 54 Activated HSF1 binds to heat shock elements (HSEs) at architecturally primed promoters and 55 enhancers (Rougvie and Lis, 1988; Rasmussen and Lis, 1993; Guertin and Lis, 2010; Vihervaara 56 et al., 2013; 2017; Ray et al., 2019), and it can trigger the release of promoter-proximally paused 57 Pol II into productive elongation (Duarte et al., 2016; Mahat et al., 2016). Concomitantly with the 58 heat-induced escape of Pol II from the promoters of activated genes, thousands of genes are 59 repressed *via* inhibition of the Pol II pause-release. This restricted entry of Pol II into productive 60 elongation causes the transcription machinery to accumulate at promoter-proximal regions of heat-61 repressed genes (Mahat et al., 2016; Vihervaara et al., 2017). As a consequence of the genome-62 wide re-coordination of Pol II pause-release, heat-stressed cells promptly switch their transcription 63 program to produce chaperones, reduce genome-wide transcription, and protect cellular integrity.

64

65 Stress responses are robustly activated and evolutionarily conserved to safeguard cells and 66 organisms. Severe stress can have long-lasting consequences for an individual (Guan et al., 2002; Sailaja et al., 2012) and cause physiological changes over generations (Kaati et al., 2002; Wei et 67 68 al., 2014; reviewed in Heard and Martienssen, 2014). The inheritance of physiological changes to 69 many types of stresses has been described, but the cellular mechanisms that establish, maintain and 70 execute transcriptional memory remain poorly understood (reviewed in Perez and Lehner, 2019). 71 Various stresses have been associated with long-term changes in the chromatin state (Guan *et al.*, 72 2002; Tetievsky and Horowitch, 2010; Sailaja et al., 2012; D'Urso et al., 2016; Lämke et al., 2016; 73 reviewed in D'Urso and Brickner, 2017), and shown to protect against protein misfolding by 74 increasing chaperone expression (Gerner and Schneider, 1975; Maytin et al., 1990; Yost and 75 Lindquist, 1991). However, stress-induced long-term changes in gene expression have been 76 investigated with steady-state RNA and protein analyses, which neither capture the processes of 77 nascent transcription nor reveal the mechanistic control of Pol II. Thus, we do not yet know whether 78 cells restore or adjust their program of nascent RNA synthesis when recovering from stress, and 79 whether regulation of Pol II at genes and enhancers encodes a memory of encountered stress.

80

81 Here, we provoked a genome-wide change in gene and enhancer transcription using heat shock and

82 asked whether proteotoxic stress reprograms transcription and transcriptional responsiveness over 83 mitotic divisions. We monitored nascent RNA synthesis at nucleotide resolution using Precision 84 Run-On sequencing (PRO-seq) that provides genome-wide maps of transcription-engaged Pol II complexes at genes and enhancers (Kwak et al., 2013; Core et al., 2014; Vihervaara et al., 2017). 85 86 By tracking engaged Pol II complexes through the rate-limiting steps of transcription, PRO-seq 87 allows identification of regulatory decisions at high fidelity and spatiotemporal resolution 88 (reviewed in Cardiello et al., 2019; Wissink et al., 2019). Simultaneously, changes in the chromatin 89 accessibility were measured with an assay for transposase-accessible chromatin using sequencing 90 (ATAC-seq; Buenrostro et al., 2013). We used mouse embryonic fibroblasts (MEFs) and human 91 K562 erythroleukemia cells that coordinate transcription upon heat shock with similar mechanisms 92 (Mahat et al., 2016; Vihervaara et al., 2017), yet display different cellular identities, patho-93 physiological states, and stress sensitivities (Lozzio and Lozzio, 1975; Mivechi 1989; Ahn et al., 94 2001; Luft et al., 2001; Vihervaara et al., 2013; Elsing et al., 2014).

95

96 We found that transcriptional reprogramming by heat shock is followed by a precise restoration of 97 basal cell type-specific transcription program within hours of recovery. In accordance, chromatin 98 accessibility spread with transcription to heat-induced genes and enhancers and returned to pre-99 stress levels during the recovery. This transient transcriptional response to stress enabled us to 100 investigate whether stress exposure establishes a transcriptional memory. In non-transformed 101 MEFs, a single heat shock primed a subset of genes for an instant induction in the daughter cells. 102 The faster responsiveness was established by increased promoter-proximal Pol II pausing and 103 accelerated pause-release upon an additional heat shock. In human K562 erythroleukemia cells, 104 repeated stress exposures decreased transcription of genes for protein synthesis and increased 105 transcription of pro-survival genes over mitotic division. The daughters of repeatedly heat-stressed 106 cells also prolonged the residency of Pol II at the termination window of active genes, concurrently 107 reducing transcript cleavage and recycling of Pol II to a new heat-induced initiation. These results 108 uncovered promoter-proximal Pol II pausing, pause-release and transcription termination as the 109 rate-limiting steps of transcription involved in establishing a memory over cell divisions.

- 110 **Results**
- 111

112 Normalization of PRO-seq Data to Measure Rapid Transcription Kinetics and Prolonged
113 Transcription Changes

114 We tracked the process of nascent transcription in acutely stressed cells, in cells recovering from 115 stress, and in the daughters of stress-exposed cells using PRO-seq. PRO-seq is a highly sensitive 116 method that maps engaged transcription complexes at nucleotide resolution across the genome 117 (Kwak et al., 2013), and provides instant measures of rate-limiting regulatory steps at genes and 118 enhancers upon transcriptional reprogramming (reviewed in Cardiello et al., 2019; Wissink et al., 119 2019). Since heat shock causes a global change in nascent transcription (reviewed in Vihervaara et 120 al., 2018), robust normalization strategies are required to precisely quantify transcription between 121 distinct stress conditions. We normalized the PRO-seq datasets of short (<1-hour) heat shock (HS) 122 kinetics using ends of over 150 kb long genes, which provide sample-intrinsic normalization 123 windows beyond the reach of acute heat-induced changes in transcription (Mahat et al., 2016; 124 Vihervaara et al., 2017). For samples cultured more than an hour under distinct conditions, we 125 adopted a whole-genome spike-in strategy (Booth et al., 2018), and used Drosophila S2 cells as an 126 extrinsic source of PRO-seq normalization counts (see Materials and Methods). Accurate 127 normalization was evident from the highly similar Pol II densities at gene bodies between 128 biological replicate pairs (Figures S1 and S2), and close to identical transcription profiles of heat-129 unresponsive genes, as demonstrated in cells cultured several days under distinct conditions 130 (Figures S1C and S2B).

131

132 De Novo Identification of Transcribed Enhancers from Nascent Transcription Profile

133 Active enhancers generally produce unstable and short enhancer RNAs (eRNAs) from divergent 134 initiation regions (Core et al., 2014; Henriques et al., 2018; Mikhaylichenko et al., 2018; Tippens 135 et al., 2018; Tome et al., 2018; Tippens et al., 2020). The specific pattern of eRNA transcription is 136 used for identification of transcribed enhancers de novo at high spatiotemporal resolution (Melgar 137 et al., 2011; Azofeifa and Dowell, 2017; Vihervaara et al., 2017; Chu et al., 2018; Wang et al., 138 2019). There is no method for in vivo functional validation of all the computationally identified 139 enhancers, but we confirmed that the putative enhancers that we identified from PRO-seq 140 (dnasequence.org; Wang et al., 2019) precisely captured functionally verified enhancers of MYC 141 (Fulco et al., 2016) and beta globin locus control element (Li et al., 2002, Song et al., 2007) in 142 K562 cells (Figure S3A-B). The putative enhancers also contained the expected chromatin modifications (Figure S3C), and 76% of them localized to transcription-associated chromatin loops
(Figure S3D). Our analyses strengthen and extend previous studies (Vihervaara *et al.*, 2017;
Henriques *et al.*, 2018; Mikhaylichenko *et al.*, 2018; Chu *et al.*, 2018; Wang *et al.*, 2019; Tippens *et al.*, 2020), showing that promoter-distal transcription regulatory elements with divergently
oriented Pol II include functional enhancers. For simplicity, we refer to the enhancer candidates
identified from PRO-seq data as enhancers.

149

150 Gene and Enhancer Transcription Is Precisely Restored after an Acute Heat Shock

151 A single heat shock induced hundreds and repressed thousands of genes, and caused Pol II to 152 accumulate at transcribed enhancers (Mahat et al., 2016; Vihervaara et al., 2017; Figure 1A). To address whether this heat-induced reprogramming of RNA synthesis is followed by restoration or 153 154 readjustment of transcription, we measured nascent RNA synthesis in MEFs upon a 4- or 48-hour 155 recovery from a single 1-hour heat shock (Figures 1 and S1A). We verified that the transiently 156 heat-shocked MEFs continued to proliferate and did not undergo cell cycle arrest or apoptosis 157 (Figure S4A). Moreover, Pol II levels remained constant throughout the experimentation (Figure 158 S4B). Surprisingly, during only a 4-hour recovery, the genome-wide profile of gene body and 159 enhancer transcription was precisely restored to the level observed prior to the heat shock (Figure 160 1A-B). Despite the full recovery of transcription at enhancers and gene bodies, certain promoter-161 proximal regions gained new pause sites (Figure 1B), or increased Pol II pausing at a single site 162 (Figure S4C-D), during the recovery. Consequently, the genome-wide average of paused Pol II 163 remained elevated, even when measured 48 hours after the heat exposure (Figure 1C).

164

165 Heat Shock Primes Accelerated Gene Induction over Mitotic Divisions

166 Individual genes and whole transcription programs can be coordinated at the step of promoter-167 proximal pause-release (Rougvie and Lis, 1988; Boettiger and Levine, 2009; Mahat et al., 2016; 168 Vihervaara et al., 2017). To address whether the changed Pol II pausing in daughter cells alters 169 genes' heat responsiveness, we preconditioned MEFs with a single 1-hour heat shock, allowed a 170 48-hour recovery and measured transcription kinetics provoked by an additional heat shock. Instant 171 and sustained changes in heat-induced transcription were assayed with PRO-seq upon 0, 12.5, 25, 172 and 40 minutes of heat shock, and by comparing the transcriptional stress response between 173 unconditioned and preconditioned cells (Figures 2A and S1B). Analyses of productive elongation 174 with DESeq2 (Love et al., 2014) showed clear differences in transcription upon 12.5 minutes of 175 heat shock in preconditioned versus unconditioned cells (Figure S5A). Several genes, e.g.



Figure 1. Transcription of genes and enhancers precisely recovers after heat-induced reprogramming. A) DESeq2-analysis of differential gene and enhancer transcription in mouse embryonic fibroblasts (MEFs). Up and Down denote a statistically significant increase or decrease, respectively, in Pol II density at gene bodies (upper panels) and enhancers (lower panels) upon heat shock and recovery, as compared to optimal growth conditions. **B)** Transcriptional profile of a heat-induced *Hsph1* gene in the non-heat-shock condition, upon 1 h of heat shock, and upon recovery from a 1-h heat shock. Inset depicts promoter-proximal region. The dashed line indicates highest Pol II pausing density in non-heat-shocked cells, and asterisks denote prominent Pol II pausing on sense (orange) and antisense (black) strand after recovery. **C)** Average promoter-proximal pausing measured at all transcribed genes. Shaded area indicates 12.5 to 87.5% confidence interval. Bin size is 20 nt. HS: heat shock; NHS: non-heat shock; Rec: recovery. The y-axis in B is in linear scale from 172 to -172 for each browser track.

176 polyubiquitin-coding *Ubc* (Figure 2B) and metallothionein *Mt1* (Figure S5B) had gained a faster 177 heat induction by preconditioning, whereas others, e.g. serum response factor (Srf), displayed a 178 slower heat induction (Figure S5C). At Ubc, the promoter-proximal Pol II pausing was elevated 179 after preconditioning (0-min inset in Figure 2B), and the paused Pol II was released faster into 180 elongation upon heat shock (12.5-min inset in Figure 2B). At Mt1, prominent Pol II pausing was 181 detected upon 12.5 minutes of heat shock only in unconditioned cells, while in preconditioned cells 182 it was actively elongating at all time points (Figure S5B). Noteworthy is that unconditioned cells 183 also gained efficient Pol II pause-release and high heat-induced transcription after 12.5 minutes of 184 heat shock (Figures 2B, S5A-B), indicating that preconditioning accelerated the onset of heat 185 shock-induced transcription.

186

187 Faster Pause-Release Accelerates Gene Induction in Preconditioned Cells

188 More than 400 heat-activated genes displayed an accelerated induction after preconditioning, 189 measured as a significant increase in productive elongation upon 12.5 minutes of heat shock 190 (Figure S5A). To investigate whether the increased Pol II density on the gene bodies could be 191 explained by changes in initiation, pausing, or pause-release, we monitored Pol II progression 192 through the promoter-proximal region. At genes with accelerated induction, the average Pol II 193 pausing was similar between unconditioned and preconditioned cells upon 12.5 minutes of heat 194 shock, but more Pol II had escaped into productive elongation in preconditioned cells (Figures 2C 195 and S5A). In comparison, preconditioning did not change Pol II progression through the pause at 196 genes that were highly (Figure 2C) or early (Figure S5D) heat-induced in unconditioned cells. The 197 faster progression of Pol II through the promoter-proximal region at a subset of genes revealed that 198 preconditioning produces a transcription memory that primes a selected set of genes for a more 199 rapid heat activation.

200

201 A faster entry of Pol II into productive elongation can be accomplished by an accelerated onset of 202 trans-activation, as demonstrated at Ubc (Figure 2B) and Mt1 (Figure S5B), or by a faster moving 203 Pol II. At over a 100 kb long vinculin (Vcl) gene (Figure 2D), the wave of productive elongation 204 extended tens of kb both in unconditioned and preconditioned cells upon a 12.5-minute heat shock, 205 showing an instant *trans*-activation regardless of the preconditioning. Intriguingly, the elongation 206 wave had proceeded farther at Vcl in preconditioned cells (Figure 2D), indicative of a faster moving 207 Pol II. In agreement, Pol II density at the pause of Vcl (insets in Figure 2D) was lower in 208 preconditioned cells, which demonstrates a shorter residence time of Pol II at the pause region







before entering into productive elongation. Regardless whether a gene gained accelerated induction due to a faster onset of *trans*-activation, faster moving Pol II through promoter-proximal region and gene body, or their combination, our results uncover the promoter-proximal pause-regulation as a mechanistic step for enabling an accelerated heat induction.

213

214 Single Heat Shock Preconditioning Accelerates Induction of Quality Control Genes

215 Genes that gained a faster heat induction by preconditioning were enriched for lysosomal, 216 autophagocytosis and membrane-associated functions (Figure S5E). These genes encode a 217 machinery for clearing damaged organelles and proteins through lysosomal degradation (reviewed 218 in Guido et al, 2010). In comparison, genes that were highly or early induced, regardless of the 219 preconditioning, encoded chaperones, cytoskeletal components, and negative regulators of 220 transcription (Figure S5E). Hence, preconditioning MEFs with a single heat shock primed the 221 lysosomal pathway of quality control for instant transcriptional activation, a pathway that 222 complements the chaperone-mediated combating of proteotoxic stress.

223

Human K562 Cancer Cells Restore Basal and Heat-Induced Transcription after a Single Heat
Shock

226 Cancer cells live under conditions where both intracellular and extracellular stresses challenge the 227 cells' integrity and proliferation (reviewed in Hanahan and Weinberg, 2011; Chen and Xie, 2018). 228 To understand the transcriptional mechanisms by which cancer cells adapt to stress, we moved 229 from stress-sensitive untransformed MEFs to human K562 erythroleukemia cells. K562 cells are a 230 patient-derived malignant cancer cell line (Lozzio and Lozzio, 1975; Koeffler and Kolde, 1980), 231 known to tolerate extended heat treatments and develop thermotolerance (Mivechi, 1989; 232 Vihervaara et al., 2013). Preconditioning K562 cells with a single heat shock recapitulated the instant heat-induced reprogramming of transcription (Figure S6A) and the precise restoration of 233 234 cell type-specific transcription program upon a 48-hour recovery (Figure S6B), alike MEFs (Figure 235 1A). Furthermore, the daughters of cells exposed to a single heat stress displayed an unaltered 236 stress response by inducing and repressing virtually the same set of genes (Figures S6C and S7A), 237 and with strikingly similar kinetics (Figure S7A-B), as their parental cells. The similar stress 238 responses in unconditioned and singly preconditioned K562 cells may reflect the constitutive stress 239 response in cancer cells (Mivechi 1989; Leppä et al., 2001; Chatterjee and Burns, 2017; Klimczak 240 et al., 2019).

241

242 Multiple Heat Shocks Reprogram Basal Transcription in Cancer Cells

243 Pathophysiological stresses caused by cancer and neurodegeneration are often sustained or 244 repeated. To investigate whether repeatedly encountered stress affects gene and enhancer 245 transcription, we preconditioned K562 cells with a total of nine 1-hour heat shocks during three 246 consecutive days. After a 48-hour recovery, the basal transcription in daughter cells and their 247 transcriptional response to an additional single heat shock was measured (Figure 3A). K562 cells 248 proliferated throughout the six days of preconditioning, recovery and additional heat shock (Figure 249 S8A) without showing signs of apoptosis or increased polyploidy (Figure S8B). PRO-seq datasets 250 were normalized using whole-genome spike-in (Figure S8C-D), and Pol II protein levels were 251 verified to remain constant during the experiments (Figure S8E).

252

253 Following the recovery from nine heat shocks, the vast majority of genes and virtually every 254 enhancer had restored their transcription to a level detected in unstressed cells (Figures 3B and 255 S9A), including lineage-specific regulators GATA and TAL1 (Fujiwara et al., 2009; Wu et al., 256 2014; Huang et al., 2016). However, preconditioning with several heat shocks caused elevated 257 synthesis of seven genes and reduced synthesis of over 500 genes (Figure 3B-C). The most 258 prominent increase in basal transcription was detected for HSPA8 (Figure 3C) that encodes HSP70 259 cognate (HSC70), a constitutively expressed chaperone important for protein homeostasis (Ignolia 260 and Craig, 1982; Kampinga et al., 2009). Genes with repressed basal transcription encode 261 regulators of protein production and maturation (Figure S9B-C; Supplemental Dataset 1), 262 suggesting a slower protein production in the daughters of repeatedly stressed cancer cells.

263

264 Repeated Stress Re-Wires Heat-Inducibility

265 Subjecting the daughters of repeatedly stressed cells to an additional heat shock revealed that some 266 genes had lost, gained or accelerated heat induction due to preconditioning (Figure 3D). One of the 267 genes that had lost heat induction encodes protein phosphatase 1 regulatory subunit 15A 268 (PPP1R15A *alias* GADD34; Figure 3D), which is a key regulator of translation and maintains 269 protein production in stressed cells (Harding et al., 2009; Walter and Ron, 2011). Genes with 270 accelerated heat induction included *clusterin* (*CLU*; Figure 3D), a glycosylated chaperone that 271 facilitates autophagy, ameliorates ER-stress, and enhances cancer cell survival (Zhang et al., 2014). 272 The few genes that had gained heat induction encode proteins with functions in cell survival and 273 growth arrest (Supplemental Dataset 1). We did not detect activation of apoptotic pathways or 274 changes in cell cycle regulators (Figure S9D; Supplemental Dataset 1). This underscores the



D puogun 60' 30' 60' 426 0'-426 30' 60' 40' 60'

60'



Figure 3

preCond

@ 42°C

↓

0' 30' 60'

Up = 412

<u>Down</u> = 4,138

10

10

15

Up = 1,094

Down = 722

15

20

↓

preCond 30': unCond 0'

5

5

Increased

10 kb

48h

ດ່

Figure 3. Repeated heat shocks refine basal and inducible transcription in the daughter cells. A) Experimental setup for preconditioning human K562 cells with multiple heat shocks. Genome-wide nascent transcription was measured upon a 0, 30 or 60-min heat shock in unconditioned cells (left panel), and in cells that were pre-exposed to nine 1-h heat shocks during three consecutive days, and allowed to recover for 48 h prior to an additional 1-h heat shock (right panel). B) DESeq2-analysis of differential gene and enhancer transcription. Up and Down denote numbers of genes (upper panels) and enhancers (lower panels) with significantly heatinduced or heat-repressed Pol II density, respectively, as measured against non-stressed cells (unCond 0'). C) Transcriptional profiles of genes with unchanged (left panel), decreased (middle panel) or increased (right panel) basal transcription due to preconditioning. D) Transcriptional profiles of genes that had lost (left panel), gained (middle panel), or accelerated (right panel) heat-induction as a result of preconditioning. E) Average Pol II density at promoter-proximal regions of heat-induced genes. Shaded area indicates 12.5 to 87.5% confidence interval. Bin size is 20 nt.



survival potential of K562 cancer cells throughout the series of protein-damaging stress (Figure

- 276 S8A-B), an adaptation that involves altering the transcription program to maintain homeostasis.
- 277

278 Repeated Heat Shocks Reduce Initiation and Prolong Termination over Mitotic Divisions

279 The most striking change in transcription in the daughters of repeatedly preconditioned cells was 280 a global reduction in Pol II density at the promoter-proximal regions of heat-activated genes 281 (Figures 3E and 4A). In PRO-seq, the 3'-end of each read reports the genomic position of 282 transcribing Pol II and it is used for mapping the active sites of transcription. Instead, the 5'-ends 283 of PRO-seq reads are enriched at the initiating base of each transcript, providing a read-out for the 284 usage of transcription start sites (TSSs). Visualizing the 5'-ends of PRO-seq reads revealed that 285 initiation was severely declined at heat-induced genes after preconditioning (Figure 4B). In 286 comparison, distribution of the 3'-ends of PRO-seq reads showed that both the pausing and the 287 pause-release followed a similar course (Figure 4B). The reduction in heat-induced initiation in 288 preconditioned cells occurred concurrently with an increase in Pol II density at the termination 289 window (Figure 4A-D). Indeed, the more actively the gene was transcribed upon heat shock, the 290 more Pol II accumulated at the termination window (rho 0.55) and the less Pol II was engaged at 291 the gene's promoter-proximal region (rho -0.43) in preconditioned cells (Figure 4C). The increased 292 Pol II density in preconditioned cells was confined to 5000 nucleotides (nt) downstream of the 293 cleavage and polyadenylation site (CPS; Figure 4D). This local confinement of Pol II at the 294 termination window differs from previously described run-through transcription that has been 295 detected under stress conditions (Vilborg et al., 2017). While the run-through transcription can 296 extend tens of kb downstream of CPS (median 8.9 kb) and does not locally confine Pol II to CPS 297 (Vilborg *et al.*, 2017; Figure S9D), the daughters of repeatedly preconditioned cells accumulated 298 Pol II at the termination window (Figure 4A-D).

299

300 Chromatin Accessibility Spreads from Primed Promoters to Heat-Induced Genes

Promoter architecture primes genes for heat activation (reviewed in Vihervaara *et al.*, 2018), and changes in epigenetic landscape have been coupled to transcriptional memory (reviewed in D'Urso and Brickner, 2017). To study whether the compromised Pol II progression through genes in repeatedly stressed cells was coupled to altered chromatin accessibility, we performed ATAC-seq (Buenrostro *et al.*, 2013) in unconditioned, singly preconditioned and repeatedly preconditioned K562 cells (Figures S10-11A). Measuring chromatin accessibility prior to and upon heat shock revealed that chromatin accessibility spread with transcription into heat-induced genes, and that





Vihervaara et al.

「 128 0' 一

L -128

30'

60³

L

Α

unCond

Revised

10 kb

Promoter-proximal

3719

-3719

inset

3' termination

-347

inset

Figure 4. Initiation is reduced and termination prolonged in the daughters of repeatedly stressed K562 cells. A) Nascent transcription along HSPH1 showing reduced density of engaged Pol II at the promoter-proximal region (light blue dashed circle) and increased density downstream of the Cleavage and Polyadenylation Site (CPS; green dashed circle) in preconditioned cells. B) Promoter-proximal region of HSPH1 showing active sites of transcription (3'-end of each PRO-seq read), and initiation intensity (5'-end of each PRO-seq read). The arrowheads compare the intensity of initiation, the arrow denotes transcription initiation site upon heat shock. C) Transcriptional activity of heat-induced genes (n=587) compared with the change in Pol II density at promoter-proximal region (0 to \pm 1000 from the TSS, upper panel) or termination window (+100 to +6000 from the CPS, lower panel) due to preconditioning. Spearman's rank correlations (rho) and the most affected genes are indicated. D) Average density of engaged transcription complexes along highly heat-induced genes in unconditioned (upper panels) and preconditioned (lower panels) cells. The light blue arrowheads indicate the promoter-proximal Pol II, the green arrowheads show the site of increased Pol II engagement in preconditioned cells. E) Average ATACseq density at highly heat-induced genes in unconditioned (upper panels) and preconditioned (lower panels) cells. Shaded area indicates 12.5 to 87.5% confidence interval. Bin size is 20 nt.

308 upon recovery, the chromatin accessibility was restored to pre-stress levels (Figures 4E, S11B-C 309 and S12A). However, ATAC-seq found only minor, if any, changes in the chromatin due to 310 preconditioning (Figures 4E, S11B-C, S12A-D). Particularly, at genes with the highest heat 311 induction, the difference in Pol II densities was pronounced between unconditioned and repeatedly 312 preconditioned cells (Figure 4D), but the corresponding average ATAC-seq densities showed no 313 significant differences (Figure 4E). Only a few genes with the most remarkable changes in Pol II 314 progression displayed minor changes in chromatin accessibility due to preconditioning (Figures 315 S11B-C and S12C-D).

316

317 Chromatin state could change without detectable differences in transposase accessibility. 318 Therefore, we performed MNase-coupled chromatin immunoprecipitation (MNase-ChIP; Skene 319 and Henikoff, 2015) to quantify the levels of histones H2.AZ, H3 and H4, as well as histone H4 320 acetylation (H4ac) at the promoters and +1 nucleosomes of HSPA1A and HSPH1. In accordance 321 with our ATAC-seq results and previous studies (Petesch and Lis, 2008; Mueller et al., 2017), 322 chromatin accessibility increased at the +1 nucleosomes upon stress-induced activation (Figure 323 S12E-F). However, we did not find clear differences in the histone levels between unconditioned 324 and repeatedly preconditioned cells either under basal or heat-induced conditions (Figure S12E-F). 325

326 Reduced Initiation in Preconditioned Cells Occurs in the Presence of HSF1

327 Heat-induced trans-activation of primed genes requires strong transcription factors, such as HSF1 328 (reviewed in Vihervaara et al., 2018). To investigate whether a deficiency in HSF1 reduced 329 initiation at heat-induced genes, we analyzed the expression and DNA-binding ability of HSF1. 330 The transcription (Figure S13A), mRNA expression (Figure S13B) and protein levels (Figure 331 S13C) of HSF1 were comparable in unconditioned and repeatedly preconditioned K562 cells. The 332 binding of HSF1 to the promoters of HSPA1A and HSPH1 was also similar in unconditioned and 333 preconditioned cells (Figures 5A and S13D). Despite the uncompromised capacity of HSF1 to bind 334 to its cis-acting elements, the RNA synthesis of HSPA1A and HSPH1 was severely reduced, as 335 were the levels of their corresponding mature mRNAs in preconditioned cells (Figures 5A and 336 S13D). These results coupled the reduced initiation of heat-activated genes (Figure 4A-D) to their 337 lower mRNA expression (Figures 5A and S13D). Furthermore, the reduced initiation in an open 338 chromatin environment and in the presence of a potent trans-activator, manifested that the key step 339 for decreased heat activation resided upstream of the promoter architecture and HSF1 binding, *i.e.* 340 at the level of Pol II recruitment.

341

342 Initiation and Chromatin Opening Are Abated at Heat-Induced Enhancers after Preconditioning 343 We depleted K562 cells of HSF1 (Figure 5B) and identified over 200 genes and close to 500 344 enhancers that were heat-induced in an HSF1-dependent manner (Figures 5C-F and S13E-F). In 345 addition to trans-activating genes by binding to their promoters (reviewed in Vihervaara and 346 Sistonen, 2014), the ability of HSF1 to *trans*-activate genes from enhancers became evident. At the 347 Tax1 binding protein 1 (TAX1BP1) locus, HSF1 only bound to a divergently transcribed enhancer 348 4.5 kb upstream of the promoter (Figure 5C-D), but it was essential for the heat-induced eRNA 349 transcription and for the release of paused Pol II from the TAX1BP1 promoter (Figure 5C-E). 350 Importantly, in repeatedly preconditioned cells, the heat-induced recruitment of Pol II to the 351 HSF1-dependent enhancers was diminished (Figure 5F), uncovering a globally decreased initiation 352 at heat-induced promoters and enhancers (Figures 4C-D and 5C-F). The reduced transcription at 353 HSF1-dependent enhancers after preconditioning was recapitulated in the ATAC-seq data (Figure 354 5G); Transcription-coupled chromatin opening did not occur at HSF1-activated enhancers in 355 repeatedly preconditioned cells, while it was detected in unconditioned and singly preconditioned 356 cells (Figures 5G and S14). In comparison, highly transcribed enhancers showed similar chromatin 357 accessibility regardless of preconditioning or heat shock (Figures 5G and S14).

358

359 Pol II Accumulates at the Termination Window of Actively Transcribed Genes

360 The reduced initiation in preconditioned cells prompted us to quantify the distribution of 361 transcription complexes across the genome. We counted engaged Pol II molecules at distinct 362 genomic regions (Figure S15A-B) and found an accumulation of Pol II at the termination window 363 of actively transcribed genes (Figure S15B-E). Over 400 genes simultaneously reduced 364 engagement of Pol II at the promoter-proximal region and increased Pol II engagement at the 365 termination window in the daughters of repeatedly stressed cells (Figure S15D). These genes were 366 characterized by high nascent transcription upon heat shock and included many heat-repressed 367 genes that retained active transcription during heat stress (Figure S15B-E).

368

369 Repeated Heat Shocks Reduce Transcript Cleavage and Recycling of Pol II

To understand why Pol II accumulated downstream of CPS in preconditioned cells, we examined the processing of transcripts at the termination window. At CPS, the nascent transcript is cleaved, exposing an uncapped 5'-end of the RNA (Figure 6A). The uncapped 5'-end of the nascent transcript is then targeted by exonuclease XRN2, which chases down Pol II and terminates



Figure 5. HSF1 *trans*-activates genes *via* promoters and enhancers. **A)** HSF1-binding intensity to the *HSPH1* promoter (uppermost panel), nascent transcription of *HSPH1* as measured from the first intron (middle panel), and relative level of polyA-containing *HSPH1* mRNA (bottom panel) in unconditioned and preconditioned K562 cells. ** indicates p-value < 0.05 and *** p-value < 0.005. **B)** HSF1 protein expression in scrambled-transfected (Scr) and HSF1-depleted (shHSF1) K562 cells. **C-E)** HSF1 drives heat-induced transcription of *TAX1BP1* gene *via* an upstream enhancer. **C)** Transcription of *TAX1BP1* and its upstream enhancer in the presence and absence of HSF1. **D)** Inset of *TAX1BP1* enhancer (green bar) and TSS (purple arrow), showing heat-induced HSF1 binding (gray) to the enhancer, and TBP binding to the promoter (purple). **E)** Inset showing enhancer transcription in the presence and absence of HSF1 in unconditioned and preconditioned cells upon a 60-min heat shock. **F)** Average Pol II density at HSF1-dependently heat-induced enhancers in the presence (Scr) and absence (shHSF1) of HSF1. **G)** Average ATAC-seq density at HSF1-dependent and highly transcribed enhancers. In F and G, the shaded area indicates 12.5 to 87.5% confidence interval, and bin size is 20 nt. TBP: TATA box Binding Protein. ChIP-seq data for TBP was obtained from ENCODE (Consortium EP, 2011) and for HSF1 from Vihervaara *et al.* (2013).

374 transcription (reviewed in Proudfoot, 2016; Wissink et al., 2019). Thus, mapping the 5'-ends of 375 Pol II-associated transcripts at the termination window can provide a read-out for transcript 376 cleavage (Figure 6A). For example, the robustly heat-induced DNAJB1 gene displayed a clear 377 decrease in initiation and a profound accumulation of Pol II at the termination window after 378 preconditioning (Figure 6B-C). In unconditioned cells, the 5'-ends of PRO-seq reads demonstrated 379 a prominent cleavage at the annotated CPS of DNAJB1 (Figure 6C). In preconditioned cells, the 380 cleavage site had shifted downstream to a single site at the end of the termination window (Figure 381 6C), and this site occurred at the region of increased Pol II density (Figure 6B).

382

383 We investigated whether reduced cleavage at the termination window could cause the global 384 change in Pol II distribution by analyzing initiation and cleavage at the genes that displayed a 385 prominent change in Pol II progression (Figure 6D). Paused Pol II at the promoter-proximal region 386 has transcribed through fewer nucleotides (<60 nt) than the sequenced read length in our PRO-seq 387 data (75 nt). Thus, the TSS-containing reads report both the initiating base (5'-end of the read) and 388 the position of Pol II at the pause region (Rasmussen et al. 1993; Nechaev et al., 2010; Tome et 389 al., 2018), and allows deducing whether Pol II resides at the pause or has proceeded into productive 390 elongation (Figure 6D upper left panel). The decrease in promoter-proximal Pol II in 391 preconditioned cells comprised of transcripts with the whole spectrum of PRO-seq read lengths 392 (20-75 nt), which indicates less initiating, pausing and early elongating Pol II complexes (Figure 393 6D). This reduction in all promoter-proximal Pol II states corroborates our analyses at individual 394 genes where Pol II recruitment was found as the major rate-limiting step of decreased transcription 395 in preconditioned cells (Figures 4B and 6C). At the region downstream of CPS, the read length 396 provides a measure of transcript cleavage: Reads shorter than the maximum sequenced read length 397 contain transcripts that have been cleaved to release the pre-mRNA (Figure 6D upper right panel). 398 The genome-wide increase in Pol II density at the termination window (Figures 4C-D and S15A-399 D) comprised almost exclusively of reads with the maximum read length (Figure 6D). This selective increase in transcription complexes with no signs of cleavage indicated that the 400 401 accumulation of Pol II at CPS co-occurred with reduced pre-mRNA processing. Moreover, the 402 reduction in a gene's initiation strongly correlated with the Pol II accumulation at its termination 403 window (p=-0.51, rho=-0.29; Figure S15F), coupling the prolonged termination to the same gene's 404 lower rate of initiation. Since transcript cleavage is required to release Pol II from the chromatin, 405 a compromised recycling of Pol II from the end of the gene into a new initiation could account for 406 the global change in transcription in preconditioned cells.



Figure 6

Figure 6. Prolonged termination co-occurs with decreased RNA-cleavage and reduced recycling of Pol II to the gene's promoter and connected enhancers. A) Schematic: 3'-nts of PRO-seq reads report the active sites of transcription, while 5'-nts provide a read-out for initiation (promoter-proximal region) and transcript cleavage (termination window). Pol II is depicted as a red rocket going from right to left. Green sphere in the end of the RNA molecule indicates 5'-cap that protects the transcript from exonucleosomal degradation. B) Active sites of transcription (3'-nts of PRO-seq reads) at DNAJB1 gene. The boxed areas compare heat-induced transcription in unconditioned and repeatedly preconditioned K562 cells. C) 5'-nts of PRO-seq reads along DNAJB1. Initiation is indicated with light blue arrowheads, transcript cleavage sites are denoted with dashed red circles. D) Upper left panel: schematic presentation of TSS-overlapping PRO-seq reads. Paused Pol II associates with 25 to 60 nt long reads, while productively elongating Pol II has proceeded beyond the +60 nt from the TSS. Lower left panel: lengths of TSS-overlapping PROseq reads at genes where Pol II progression changes due to preconditioning (n=429). The reduction of promoter-proximal Pol II in repeatedly preconditioned cells consist of paused (25 to 60 nt long reads) and early elongating (>60 nt long reads) transcription complexes. Upper right panel: schematic representation of CPS-overlapping PROseq reads. Reads shorter than the maximum read length (here 75 nt) report events of transcript cleavage. Lower right panel: lengths of CPSspanning reads at genes with a changed Pol II progression (n=429). Accumulated Pol II molecules in termination windows of repeatedly preconditioned cells associate with uncleaved transcripts. E) Fold change of engaged Pol II in preconditioned over unconditioned cells at termination windows, promoter-proximal regions, and connected enhancers. The red dashed line indicates fold change 1. Increased and decreased denote higher and lower, respectively, Pol II density after preconditioning.



407

408 Enhancers with Reduced Initiation Connect to Genes with Increased Pol II Density at the 409 Termination Window

410 Enhancers recruit transcription factors and Pol II, and they are brought to physical proximity with 411 the target genes via chromatin looping (reviewed in Field and Adelman, 2020). To analyze 412 recycling of Pol II between genes and enhancers, we identified chromatin loops and measured Pol 413 II density at the connected genes and enhancers. Enhancers that looped to genes with increased Pol 414 II density at the termination window showed a significant reduction in heat-induced Pol II density 415 after preconditioning (Figures 6E and S15G). In contrast, enhancers that looped to genes without 416 a prominent change in the termination displayed similar Pol II densities in unconditioned and 417 preconditioned cells (Figures 6E and S15G). Monitoring the progression of Pol II through the 418 distinct rate-limiting steps of transcription allows us to propose a model (Figure 7) where reduced 419 transcript cleavage at the termination window retains Pol II bound to chromatin and diminishes 420 recycling of the transcription machinery. The limited availability of Pol II in preconditioned cells 421 lowers initiation without the need to change the chromatin state or HSF1-binding. The lower 422 initiation rate, in turn, reduces mRNA production in preconditioned cells. Our model also explains 423 the lower enhancer transcription in preconditioned cells, identifying the affected enhancers to 424 reside in chromatin loops with genes where Pol II accumulates at the termination window.

Heat shock response:



Figure 7. Model for heat-induced transcriptional memory accelerating promoter-proximal pause-release and decelerating termination over mitotic divisions. In unconditioned cells (upper panel), paused Pol II is rapidly released from the promoters of heat-induced genes into elongation, and it efficiently proceeds through the gene. A single heat shock exposure (lower left panel) primes an additional set of genes for instant heat-induction in the daughter cells by increasing Pol II pausing and by triggering a more rapid release of Pol II into productive elongation. Multiple heat shocks (lower right panel) cause reduced transcript cleavage at the 3'-end of active genes, which decelerates termination, and decreases recycling of the transcription machinery to heat-activated genes and enhancers.

- 425 **Discussion**
- 426

427 Control of Pol II Pause-Release Enables Rapid and Reversible Transcriptional Reprogramming
428 The groundbreaking model by Conrad Waddington (1957) describes developing cells as marbles

429 that roll down an energy landscape of hills and valleys. While rolling down, cells take different 430 paths and commit to distinct cell types, remodeling their chromatin environment and transcription 431 program (reviewed in Takahashi and Yamanaka, 2015). Reversing from a differentiated to 432 pluripotent cell, instead, requires specific transcription factors that push the cell up the energy 433 landscape, which rarely occurs in nature (Gurdon et al., 1958; Takahashi and Yamanaka 2006). 434 Here, we showed that after genome-wide reprogramming of transcription by heat shock, cells 435 return to their cell type-specific transcription program within hours of recovery (Figure 1). In 436 Waddington's landscape, the heat-induced reprogramming would be analogous with the cell 437 transiently occupying a near-by valley, but during recovery, returning to its cell type-specific basal 438 transcription program. This rapid reprogramming and precise recovery highlight the plasticity of 439 transcription program and implies that the transcriptional heat shock response is truly transient.

440

441 The rapid and reversible heat-induced reprogramming can be explained mechanistically by 442 genome-wide control of promoter-proximal Pol II pause-release. An important consequence of 443 repressing thousands of genes by preventing the release of Pol II from their promoter-proximal 444 regions is its rapid reversibility; a simple reactivation of the pause-release can restore productive 445 gene transcription throughout the genome without extensive chromatin remodeling. In this regard, 446 Pol II pausing can be considered as a memory that marks active genes and maintains open and 447 accessible promoters during their transient repression. Indeed, reprogramming of transcription 448 during differentiation involves gene silencing and activation by remodeling the chromatin 449 (reviewed in Perino and Veenstra, 2016; Gökbuget and Blelloch, 2019). The reported changes in 450 the chromatin upon heat shock (Zobeck et al., 2010; Petesch and Lis, 2012, Niskanen et al., 2015, 451 Mueller et al, 2017; Vihervaara et al, 2017) involve modifications that are likely to transiently 452 compartmentalize distinct gene activities (reviewed in Vihervaara et al., 2018). Moreover, 453 chromatin conformation remains stable upon heat shock (Ray et al., 2019), which implies that the 454 rapid recovery from stress does not require rewiring of the chromatin connectivity. We conclude that as chromatin architecture is primed for an instantaneous transcriptional response to heat shock 455 456 (Vihervaara et al., 2017; Ray et al., 2019), the Pol II pausing at heat-repressed genes primes rapid 457 and robust transcriptional recovery, providing a memory of the cell's transcription program.

459 Stress-Induced Control of Pol II Is Carried over Mitotic Divisions

A single heat shock, which is unlikely to cause permanent or long-lasting damage to the cell, did not change the basal transcription but increased Pol II pausing (Figure 1). The pausing of Pol II, in turn, can function as a space-holder for a rapid signal-responsive regulation. In accordance, the daughter cells of singly preconditioned MEFs were able to accelerate Pol II entry into productive elongation (Figure 2). The faster induction of the machinery that clears damaged proteins and organelles *via* lysosomal degradation (Figure 7) is likely to raise another instant cytoprotective arm next to the rapidly heat-induced chaperone expression.

467

468 Cancer cells are highly stress-tolerant (Hanahan and Weinberg, 2011). Accordinly, human K562 469 erythroleukemia cells proliferated through multiple heat shocks and adapted nascent transcription 470 program to support survival. Two mitotic divisions after nine heat exposures, transcription of 471 certain pro-survival genes was elevated, expression of genes that maintain protein production was 472 decreased (Figures 3), and processing of transcripts at the 3'-ends of active genes was decelerated 473 (Figure 6). In cells with decreased protein synthesis, the decelerated transcription termination likely 474 serves to reduce the mRNA load as fewer Pol II molecules become available for new rounds of 475 heat-induced transcription (Figures 6-7). The increased association of uncleaved transcripts at the 476 3'-ends of genes could provide a reservoir of pre-mRNAs that are rapidly processed to mature 477 mRNAs once the cell restores its protein synthesis. Our results demonstrate that priming a faster 478 gene activation and refining transcription over mitotic divisions can occur via regulation of Pol II 479 (Figures 2-4), without involving major changes in chromatin accessibility or binding-activity of 480 HSF1 (Figures 4 and 5). Taken together, cells exposed to stress can establish a memory by 481 regulating the key rate-limiting steps of transcription.

482

483 *Limitations*

This study tracks the process of nascent transcription at genes and enhancers across the genome, and identifies the rate-limiting steps involved in establishing a transcriptional memory of cellular stress. Nevertheless, the factors that execute the increased Pol II pausing and trigger a faster release of the paused Pol II in the daughters of stress-exposed cells remain to be identified. Likewise, the molecular machinery at the termination window that is involved in retaining Pol II associated with the nascent transcript are currently unknown. Increased residency of Pol II at the termination window correlated with reduced initiation at the gene's TSS and connected enhancers. The

⁴⁵⁸

491 movements of Pol II between genes and enhancers remain to be shown. The memory-induced 492 changes in Pol II regulation can occur without major changes in chromatin accessibility, but our 493 results do not exclude the involvement of transcriptional regulators in priming a faster 494 transcriptional response to stress or coordinating prolonged termination in the daughters of heat-495 shocked cells.

496

497 **Competing Interests**

- 498 The authors declare no competing interests.
- 499

500 Author Contributions

501 A.V., J.T.L. and L.S. conceived and designed the study. A.V., D.B.M., S.V.H. and M.A.H.B.

- 502 conducted the laboratory work, and A.V. and D.B.M. performed the computational data analyses.
- All the authors interpreted the results. A.V., J.T.L. and L.S. wrote the manuscript with edits fromD.B.M., S.V.H. and M.A.H.B.
- 505

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517 Figure Legends

518

519 Figure 1. Transcription of genes and enhancers precisely recovers after heat-induced 520 reprogramming. A) Differential gene and enhancer transcription upon heat shock and recovery in 521 MEFs. Up and Down denote a statistically significant increase or decrease in Pol II density at gene 522 bodies (upper panels) and enhancers (lower panels). B) Transcriptional profile of a heat-induced

523 Hsph1 gene in the non-heat-shock condition (NHS), upon a 1-h heat shock (HS), and upon recovery

from a 1-h heat shock (Rec). Inset depicts promoter-proximal region. The dashed line indicates the highest Pol II pausing density in non-heat-shocked cells and asterisks denote prominent Pol II pausing on sense (orange) and anti-sense (black) strand after recovery. **C)** Average promoterproximal pausing measured at all transcribed genes. Shaded area: 12.5-87.5% confidence interval. The y-axis in B is in linear scale from 172 to -172 for each track.

529

530 Figure 2. A single heat shock primes accelerated gene induction over mitotic divisions. A) 531 Experimental setup for measuring transcription kinetics in MEFs. Transcription was analyzed upon 532 heat shock in unconditioned cells (unCond, upper panel), and in cells that were preconditioned with 533 a 1-h heat shock and 48-h recovery (preCond, lower panel). B) Nascent transcription at Ubc in 534 unconditioned and preconditioned cells. Insets show Pol II density in promoter-proximal region in 535 unconditioned (upper panels) and preconditioned (lower panels) cells. C) Average intensity of 536 promoter-proximally engaged Pol II upon a 12.5-min heat shock at genes that gain a faster heat-537 induction by preconditioning (upper panel) or at genes that are highly heat-induced regardless of 538 preconditioning (lower panels). Pol II density after the pause-release is indicated with an 539 arrowhead. Shaded area: 12.5-87.5% confidence interval. D) Heat-induced wave of transcription 540 along Vcl gene. The blue dashed region indicates an advancing wave of transcription that has 541 proceeded farther in preconditioned than in unconditioned cells upon a 12.5-min heat shock. Insets 542 show promoter-proximal Pol II density in unconditioned (upper panels) and preconditioned (lower 543 panels) cells. Grey vertical lines in insets mark 100 nt intervals.

544

545 Figure 3. Repeated heat shocks refine basal and inducible transcription in daughter cells. A) 546 Experimental setup for preconditioning human K562 cells with multiple heat shocks. Nascent 547 transcription was measured upon heat shock in unconditioned cells (unCond, left panel), and in 548 cells that were pre-exposed to nine 1-h heat shocks during three consecutive days and allowed to 549 recover for 48 h prior to an additional 1-h heat shock (preCond, right panel). B) Differential gene 550 and enhancer transcription. Up and Down denote numbers of genes (upper panels) and enhancers 551 (lower panels) with significantly heat-induced or heat-repressed Pol II density, as measured against 552 non-stressed cells (unCond 0'). C) Transcriptional profiles of genes with unchanged (left panel), 553 decreased (middle panel) or increased (right panel) basal transcription due to preconditioning. D) 554 Transcriptional profiles of genes that had lost (left panel), gained (middle panel), or accelerated 555 (right panel) heat-induction as a result of preconditioning. E) Average Pol II density at promoter-556 proximal regions of heat-induced genes. Shaded area: 12.5-87.5% confidence interval.

557

558 Figure 4. Initiation is reduced and termination prolonged in the daughters of repeatedly 559 stressed K562 cells. A) Nascent transcription along HSPH1 showing reduced density of engaged 560 Pol II at the promoter-proximal region (light blue dashed circle) and increased density downstream 561 of the Cleavage and Polyadenylation Site (CPS; green dashed circle) in preconditioned cells. B) 562 Promoter-proximal region of HSPH1 showing active sites of transcription (3'-end of each PRO-563 seq read), and initiation intensity (5'-end of each PRO-seq read). Arrowheads compare the intensity 564 of initiation, the arrow denotes transcription initiation site upon heat shock. C) Transcriptional 565 activity of heat-induced genes (n=587) compared with the change in Pol II density at promoter-566 proximal region (0 to +1000 from TSS, upper panel) or termination window (+100 to +6000 from 567 CPS, lower panel) due to preconditioning. Spearman's rank correlations (rho) and the most affected 568 genes are indicated. D) Average density of engaged transcription complexes along highly heat-569 induced genes in unconditioned (upper panels) and preconditioned (lower panels) cells. Light blue 570 arrowheads indicate the promoter-proximal Pol II, green arrowheads show the site of increased Pol 571 II engagement in preconditioned cells. E) Average ATAC-seq density at highly heat-induced genes 572 in unconditioned (upper panels) and preconditioned (lower panels) cells. Shaded area: 12.5-87.5% 573 confidence interval.

574

575 Figure 5. HSF1 trans-activates genes via promoters and enhancers. A) HSF1-binding intensity 576 to the HSPH1 promoter (uppermost panel), nascent transcription of HSPH1 as measured from the 577 first intron (middle panel), and relative level of polyA-containing HSPH1 mRNA (bottom panel) in unconditioned and preconditioned K562 cells. ** p-value <0.05; *** p-value <0.005. B) HSF1 578 579 protein expression in scrambled-transfected (Scr) and HSF1-depleted (shHSF1) K562 cells. C) 580 Transcription of TAX1BP1 and its upstream enhancer in the presence and absence of HSF1. D) 581 Inset of TAX1BP1 enhancer (green bar) and TSS (purple arrow), showing heat-induced HSF1 582 binding (gray) to the enhancer and TBP binding to the promoter (purple). E) Inset showing 583 enhancer transcription in the presence and absence of HSF1. F) Average Pol II density at HSF1-584 dependently heat-induced enhancers. G) Average ATAC-seq density at HSF1-dependent and 585 highly transcribed enhancers. In F and G, the shaded area: 12.5-87.5% confidence interval.

586

587 Figure 6. Prolonged termination co-occurs with decreased RNA-cleavage, and reduced 588 initiation at the gene's promoter and connected enhancers. A) Schematic: 3'-nts of PRO-seq 589 reads report the active sites of transcription and 5'-nts provide a read-out for initiation (promoter590 proximal region) and transcript cleavage (termination window). Pol II is depicted as a red rocket 591 going from right to left. Green sphere in the end of the RNA molecule indicates 5'-cap that protects 592 the transcript from exonucleosomal degradation. **B)** Active sites of transcription at *DNAJB1* gene. 593 The boxed areas compare heat-induced transcription in unconditioned and repeatedly 594 preconditioned K562 cells. C) 5'-nts of PRO-seq reads along DNAJB1. Initiation is indicated with 595 light blue arrowheads, transcript cleavage sites are denoted with dashed red circles. **D)** Upper left 596 panel: schematic presentation of TSS-overlapping PRO-seq reads. Paused Pol II associates with 597 25-60 nt long reads, while productively elongating Pol II has proceeded beyond the +60 nt from 598 TSS. Lower left panel: lengths of TSS-overlapping PRO-seq reads at genes where Pol II 599 progression changes due to preconditioning (n=429). Upper right panel: schematic representation 600 of CPS-overlapping PRO-seq reads. Reads shorter than the maximum read length (75 nt) report 601 events of transcript cleavage. Lower right panel: lengths of CPS-spanning reads at genes with 602 changed Pol II progression (n=429). Accumulated Pol II molecules in termination windows of 603 repeatedly preconditioned cells associate with uncleaved transcripts. E) Fold change of engaged 604 Pol II in preconditioned over unconditioned cells at termination windows, promoter-proximal 605 regions, and connected enhancers. The red dashed line indicates fold change 1. Increased and 606 decreased denote higher and lower Pol II density after preconditioning.

607

608 Figure 7. Model for heat-induced transcriptional memory accelerating promoter-proximal 609 pause-release and decelerating termination over cell divisions. In unconditioned cells (upper 610 panel), paused Pol II is rapidly released from the promoters of heat-induced genes into elongation, 611 and it efficiently proceeds through the gene. A single heat shock exposure (lower left panel) primes 612 an additional set of genes for instant heat-induction in the daughter cells by increasing Pol II 613 pausing. Multiple heat shocks (lower right panel) cause reduced transcript cleavage at the 3'-end 614 of active genes, which decelerates termination and decreases recycling of the transcription 615 machinery to heat-activated genes and enhancers.

- 616
- 617
- 618 Supplemental Figure Legends
- 619

Supplemental Figure 1 (related to Figures 1 and 2). Normalization of PRO-seq data for
 accurate quantification of transcriptional responses in MEFs. A-B) Correlation plots of gene
 body transcription (log2RPK) between biological PRO-seq replicates of acute stress and recovery

623 from stress (A), and rapid stress-induced transcriptional changes in unconditioned and singly 624 preconditioned MEFs (B). Please see Figure 2A for a schematic presentation of preconditioning 625 with a single heat shock exposure. C) Average profile of nascent transcription at heat-unresponsive 626 genes in unconditioned and preconditioned MEFs after normalizing the datasets against whole 627 genome run-on RNAs from spiked-in, permeabilized *Drosophila* S2 cells. **D**) Upper panel: 628 Correlation of gene body transcription (log2RPK) between non-heat-shocked cells (0') and cells 629 exposed to a 1-h heat shock followed by a 48-h recovery (1h HS + 48h Rec). Lower panel: 630 Correlation plots of gene body transcription (log2RPK) between non-heat-shocked MEFs mapped in this study (y-axis) and in our previous study (x-axis; Mahat et al., 2016). In panels C, F-H, Rho 631 632 indicates Spearman rank correlation.

633

634 Supplemental Figure 2 (related to Figure 3). Normalization of PRO-seq data for accurate 635 quantification of transcriptional responses in human K562 cells. A) Correlation plots of gene 636 body transcription (log2RPK) between biological PRO-seq replicates in unconditioned and singly 637 preconditioned K562 cells. The preconditioning was conducted as for MEFs, illustrated in Figure 638 2A. B) Average profile of nascent transcription at heat-unresponsive genes in unconditioned and 639 singly preconditioned K562 cells after normalizing the datasets against whole genome run-on 640 RNAs from spiked-in Drosophila S2 cells. TSS: transcription start site; CPS: cleavage and 641 polyadenylation site.

642

643 Supplemental Figure 3 (related to Figures 1, 3, 5 and 6). De novo identification of putative 644 enhancers by their profile of divergent transcription captures functionally verified 645 enhancers. A) MYC locus in human K562 cells showing functionally verified enhancers (Fulco et 646 al., 2016) with green bars, and their physical connections to the MYC promoter, indicated by Pol 647 II ChIA-PET data. Please note that only the connections between functionally verified enhancers 648 and the MYC promoter are shown. De novo identified putative enhancers are indicated with blue 649 bars. The browser tracks depict GATA1 binding (Consortium EP, 2011), and nascent transcription 650 at the locus, demonstrating divergent transcription at each functionally identified enhancer. B) Beta 651 globin locus containing Haemoglobin subunit epsilon 1 (HBE1) gene and the locus control element 652 with functionally verified enhancers. The four enhancers active in erythrocyte lineages (hypersensitive sites, HSSs, 1-4) are indicated with gold bars, and are shown to harbor prominent
GATA1 binding and divergent transcription. C) Average profiles of indicated chromatin marks
(Consortium EP, 2011) at the *de novo* identified putative enhancers. D) Percent of the *de novo*identified enhancers that localize to transcription-linked chromatin loops, deduced from the Pol II
ChIA-PET data (ENCODE, GSM970213).

658

659 Supplemental Figure 4 (related to Figures 1 and 2). Promoter-proximal Pol II pausing 660 changes during recovery from an acute heat shock in MEFs. A) FACS-defined fraction of 661 mouse embryonic fibroblasts (MEFs) with indicated DNA content during heat shock, recovery, 662 and an additional heat shock exposure. Cells with a diploid genome are indicated with G1 and 663 duplicated (tetraploid) genome with G2/M. Apoptotic refers to cells with fragmented genome (sub 664 G1). B) Protein levels of Pol II during heat shock in unconditioned and singly preconditioned 665 MEFs. Beta-tubulin serves as a loading control. C-D) Transcriptional profile of a heat-repressed 666 (C) and a heat-induced (D) gene, at which promoter-proximal Pol II pausing increases (D) or 667 remains elevated (E) during recovery from a single heat shock. The lower panels show insets of 668 the promoter-proximal region, depicting the highly reproducible change in transcriptionally 669 engaged Pol II upon heat shock and recovery between the replicates.

670

671 Supplemental Figure 5 (related to Figure 2). A subset of genes gains faster heat-672 responsiveness by single preconditioning in MEFs. A) DESeq2-analysis of differential gene 673 transcription between unconditioned (unCond) and singly preconditioned (preCond) MEFs at the 674 indicated time points of heat stress. Pol II density was quantified from gene bodies (+500 from TSS 675 to -500 from CPS). Up denotes gene bodies with significant (p <0.001) increase in heat-induced 676 transcription in preconditioned cells as compared to unconditioned cells. Down denotes gene 677 bodies where transcription in preconditioned cells is significantly (p <0.001) lower than in 678 unconditioned cells. In the 12.5-min time point, HS-induced indicates heat-induced genes that gain 679 higher gene body transcription, and HS-repressed denotes heat-repressed genes that gain deeper 680 transcription reduction, due to preconditioning. We refer to these genes as faster heat-induced and 681 faster heat-repressed, respectively, throughout the manuscript. B-C) Browser shot examples of 682 genes with faster (left panel) and slower (right panel) heat induction after preconditioning. Gene 683 body RPK (gbRPK) is indicated and bolded in 12.5-min conditions that show statistically

684 significant change between unconditioned and preconditioned cells. D) Average Pol II density at 685 the promoter-proximal regions of genes that are called heat-induced upon the 12.5-min time point 686 in unconditioned cells. The Pol II density in D is compared between unconditioned (black dotted 687 line) and preconditioned (vellow solid line) cells upon a 12.5-min heat shock. Arrowheads denote 688 the signal downstream of Pol II pausing, as in Figure 2C. The right panel in D depicts the region 689 around the pause in an expanded scale. Shaded area indicates 12.5-87.5% confidence interval in 690 each 20-nt window. E) Enriched gene ontology terms among genes that gain faster heat-induction 691 by preconditioning, are highly heat-induced regardless of preconditioning, or that are instantly 692 induced in unconditioned cells.

693

694 Supplemental Figure 6 (related to Figures 2 and 3.) Human K562 cells precisely restore 695 transcription of genes and enhancers after a single heat shock. A) DESeq2-analysis of 696 differential gene (upper panels) and enhancer (lower panels) transcription in unconditioned 697 (unCond) human K562 cells upon an acute heat shock response. Up and Down denote a statistically 698 significant increase or decrease, respectively, in Pol II density upon heat shock, as compared to 699 optimal growth conditions. Pol II density was quantified from gene bodies (+500 from TSS to -500 700 from CPS), or along the length of each enhancer. B) DESeq2-analysis of differential gene (left 701 panel) and enhancer (right panel) transcription 48 h after a single 1-h heat shock exposure. C) 702 DESeq2-analysis of differential gene (upper panels) and enhancer (lower panels) transcription 703 upon heat shock that was induced 48-h after recovery from a single 1-h heat shock (single 704 preCond).

705

706 Supplemental Figure 7 (related to Figures 2 and 3). Human K562 cells provoke a highly 707 similar heat shock response in unconditioned cells and in daughters of cells that experienced 708 a single 1-hour heat shock. A) DESeq2-analysis of differential gene transcription between 709 unconditioned (unCond) and singly preconditioned (preCond) K562 cells, as measured at the 710 indicated time points of heat stress. The preconditioning was conducted as for MEFs, illustrated in 711 Figure 2A. Up denotes gene bodies with significant (p < 0.05) increase in heat-induced transcription 712 in preconditioned cells as compared to unconditioned cells. Down denotes gene bodies where 713 transcription in preconditioned cells is significantly (p < 0.05) lower than in unconditioned cells. 714 **B-C)** Browser shot examples of nascent transcription at heat-induced *BAG3* (**B**) and *HSPH1* (**C**) 715 genes comparing the close to identical heat shock responses between unconditioned (unCond) and preconditioned (preCond) human K562 cells. Insets depict the region around the promoter-proximal pause in an expanded scale.

718

719 Supplemental Figure 8 (related to Figure 3). Human K562 cells proliferate through repeated 720 heat shock exposures. A) Relative number of K562 cells in scrambled transfected (Scr) and HSF1-721 depleted (shHSF1) cells, as counted by dividing the number of cells at each day with the number 722 of cells at day 1. The relative cell count is plotted in a logarithmic scale, and theoretical exponential 723 growth indicated with a dotted gray line, demonstrating that K562 cells maintain their proliferation 724 rate throughout the preconditioning with nine heat shock exposures. B) FACS-defined fraction of 725 cells with fragmented (indicative of apoptosis), or polyploid, genome. The slightly higher number 726 of apoptotic cells in day 1 is likely a consequence of electroporation 24 h before the first heat shock 727 treatment of preconditioning. C) Average Pol II density along the coding and non-coding strands 728 of heat-unresponsive genes, shown in unconditioned and repeatedly preconditioned cells after 729 normalizing the samples against whole-genome spike-in from Drosophila S2 cells. Please note that 730 the whole-genome (isolated nuclei) spike-in allows accurate normalization between the samples 731 that were grown several days in distinct cell cultures. D) Correlation plots of gene body 732 transcription (log2RPK) between biological PRO-seq replicates in unconditioned (upper panels) 733 and repeatedly preconditioned (lower panels) cells. Rho indicates Spearman rank correlation. E) 734 Pol II protein levels during heat shock in unconditioned and repeatedly preconditioned (preCond) 735 K562 cells.

736

737 Supplemental Figure 9 (related to Figures 2 and 3). Human K562 cells retain cell type-specific 738 transcription throughout repeated heat exposures, but reduce transcription of ER-linked 739 genes. A) Browser track examples of basal transcription at lineage specific factor genes TAL1, 740 GATA1 and GATA2. The distribution of nascent transcription complexes at each gene is depicted 741 in cells that were not exposed to stress (unCond), or that had recovered 48 h from nine 1-h heat 742 shocks (preCond). B) Browser track examples of basal transcription at genes involved in protein 743 maturation via endoplasmic reticulum (ER) to Golgi pathway. C) Enriched gene ontology terms 744 among genes that show decreased basal transcription in preconditioned cells. D) Basal and heat-745 responsive transcription at cell cycle regulators CDK1 and CCND1 in unconditioned and 746 preconditioned K562 cells. Heat-induced run-through transcription (also known as Downstream of 747 Genes, DoG) is indicated downstream of CPS in CDK1.

748

Supplemental Figure S10 (related to Figures 4-5). ATAC-seq data in unconditioned, singly preconditioned, and repeatedly preconditioned K562 cells. A-B) Correlation plots of ATAC-seq replicates in unconditioned and singly preconditioned (A), as well as in unconditioned and repeatedly preconditioned (B) K562 cells. The ATAC-seq read counts were measured at each peak called with MACS2 from combined bam files of all samples and replicates reported in A, respective B. Rho indicates spearman rank correlation.

755

756 Supplemental Figure S11 (related to Figure 4-5). Heat-induced gene activation triggers 757 increased chromatin accessibility along the gene. A) Schematic presentation of transposase Tn5-758 released chromatin fragments. The ends of fragments are used as indication of accessible sites, 759 whereas the middle of the fragment approximates the genomic sites that were shielded from 760 fragmentation. B) ATAC-seq (fragment center) and PRO-seq signal at HSPH1 gene upon heat-761 induced transcriptional activation in unconditioned and repeatedly preconditioned K562 cells. (C) 762 Insets of termination window (left panel) and promoter-proximal region (right panel) of HSPH1. 763 The browser tracks in insets overlay ATAC-seq signal from unconditioned (black) and repeatedly 764 preconditioned (colored) cells.

765

766 Supplemental Figure S12 (related to Figures 4-6). Rapid nucleosomal loss at heat-induced 767 genes occurs in unconditioned and repeatedly preconditioned K562 cells. A) Average ATAC-768 seq density from whole fragments at highly heat-induced genes in unconditioned (upper panels) 769 and singly preconditioned (lower panels) cells. B) PRO-seq profile of active sites of transcription 770 at heat-induced DNAJB1 gene showing similar Pol II density in singly preconditioned and 771 unconditioned K562 cells. C-D) Browser images of ATAC-seq signal (whole fragments) at 772 DNAJB1. In C, chromatin openness is compared between unconditioned (black) and singly 773 preconditioned (aqua) cells, in D, between unconditioned (black) and repeatedly preconditioned 774 (aqua) cells. The transcription profile for DNAJB1 in repeatedly preconditioned cells is shown in 775 Figure 6B. E-F) MNase-coupled ChIP-qPCR measured levels of histores H2A.Z, H3 and H4, and 776 acetylation of H4 (H4ac) at the HSPAIA and HSPH1 promoters and +1 nucleosomes in 777 unconditioned and repeatedly preconditioned K562 cells.

778

Supplemental Figure S13 (related to Figure 5). HSF1 is indispensable for heat-induced
activation of genes and enhancers. A) Nascent transcription profile of *HSF1* gene in
unconditioned and repeatedly preconditioned K562 cells. B) Relative levels of HSF1 mRNA in

782 unconditioned and repeatedly preconditioned K562 cells. C) Levels of HSF1 protein in 783 unconditioned and repeatedly preconditioned K562 cells. Beta-tubulin serves as a loading control. 784 **D)** HSF1 binding at the promoter (uppermost panel), transcription of coding sequence (middle 785 panel), and relative expression of polyA-containing mRNA (lowest panel) of HSPA1A in 786 unconditioned and repeatedly preconditioned K562 cells. ** indicates p-value <0.05 and *** p-787 value <0.005. E) Transcription profile of HSF1-dependently heat-induced BAG3 gene in 788 unconditioned and repeatedly preconditioned cells in the presence or absence of HSF1. F) HSF1-789 dependent heat-inducibility of genes (upper panel) and enhancers (lower panel). HSF1-dependency 790 for each individual gene or enhancer was measured by dividing transcription (gene body RPK) in 791 shHSF1 by transcription in Scr, after basal transcription was removed from the level of 792 transcription upon heat shock.

793

Supplemental Figure S14 (related to Figure 5). Heat-induced changes in chromatin accessibility are highly similar in unconditioned and singly preconditioned K562 cells. ATACseq signal (whole fragment) at indicated enhancers in unconditioned and singly preconditioned K562 cells. In A and C, the shaded area indicates 12.5-87.5% confidence interval in each 20-nt window. Please note the intact heat-induced enhancer accessibility in singly preconditioned cells, as comparison to the lack of chromatin opening in repeatedly stressed cells showing in Figure 5G.

801 Supplemental Figure S15 (related to Figures 5 and 6). Daughters of repeatedly 802 preconditioned cells display a genome-wide change in Pol II distribution. A) Schematic representation of genomic regions within which the distribution of engaged Pol II molecules was 803 804 measured. The numbers below each region indicate the percentage of all uniquely mapping PRO-805 seq reads that localize to the given region in unconditioned K562 cells. NHS: non-heat shock; 30 806 min and 60 min indicate the time of heat shock at 42° C. B) Percentage of all uniquely mapping 807 PRO-seq reads at the indicated regions of heat-induced (left panel) and heat-repressed (right panel) 808 genes and enhancers. Black dashed circles indicate genomic regions with increased total 809 engagement of Pol II in repeatedly preconditioned cells. Gray dashed circles indicate regions with 810 reduced Pol II engagement in repeatedly preconditioned cells. The colored triangles above the bars 811 denote the time of the heat shock. C) Heat-repressed beta-actin (ACTB) exemplifies reduced Pol 812 II engagement at the 5' region (dashed circles), and increased engagement downstream of the CPS 813 (dashed squares) in repeatedly preconditioned versus unconditioned cells upon heat shock. Despite 814 prominent heat-repression, the gene body transcription of ACTB (log2RPK in blue) remains high 815 (8.06) upon heat shock. Please see Figures 5A, 5B and 6B for examples of heat-induced genes with 816 similarly changed pattern of nascent transcription complexes in repeatedly preconditioned versus 817 unconditioned cells. D) Difference in heat-induced Pol II density between repeatedly 818 preconditioned and unconditioned K562 cells, as measured along genes that show reduced Pol II 819 engagement at the 5'-end and increased engagement downstream of CPS (n=429 genes). E) Gene 820 body transcription (log2RPK) plotted cumulatively for genes with unchanged (shades of gray) or 821 changed (shades of orange) distribution of Pol II due to preconditioning. Genes with changed Pol 822 II distribution constitute primarily of highly transcribed genes (median log2RPK: 6.06), whereas 823 genes with no detectable change (shades of gray) show modest transcription level (median 824 log2RPK: 3.29). F) Gene-by-gene comparison of the change in Pol II engagement (preCond 60' -825 unCond 60') along the termination window (+100 to +6000 from CPS) and the promoter-proximal 826 region (0 to +1000 from TSS). Each dot is a gene with a changed Pol II distribution at '5 and 3' 827 ends (n=429). p: Pearson, rho: Spearman correlation. P-values for p and rho $<2.2 \times 10^{-16}$. Dashed red line: y = -x. G) Pol II density at enhancers that connect to promoters of the indicated gene groups. 828 829 The Pol II density at enhancers is compared between unconditioned (unCond) and repeatedly 830 preconditioned (preCond) cells upon a 60-min heat shock (HS60). Please note that only enhancers 831 that connect to genes with reduced promoter-proximal Pol II density show a simultaneous reduction 832 of Pol II counts at the enhancers. P-values are independent two-sample t-tests of the enhancer Pol 833 II densities between unconditioned and preconditioned cells.

834

835 Supplemental Figure S16 (related to Figure 2 and Supplemental Figure 5). Flow chart 836 showing identification of genes with faster heat-induction or slower heat-repression in 837 preconditioned MEFs. Heat shock versus non heat shock: Genes with significantly higher (heat-838 induced) or lower (heat-repressed) nascent transcription were identified upon 15-min, 25-min and 839 40-min heat shock, as compared to non-stressed cells. Genes that were called significantly heat-840 induced in any of the time points were counted in the 'all heat-induces genes' category. Genes with 841 significantly reduced transcription in any of the time points were counted in the 'all heat-repressed 842 genes' category. Preconditioned versus unconditioned: Nascent transcription in preconditioned 843 cells was compared to nascent transcription in unconditioned cells in all the heat shock time points. 844 Genes that showed higher transcription in preconditioned cells upon a 15-min heat shock (precond 845 15'/uncond 15') were intersected with all heat-induced genes. The intersection of 462 genes was 846 counted as genes with accelerated heat induction in preconditioned cells. To identity genes with 847 slower heat repression in preconditioned cells, the heat-repressed genes were intersected with genes

- 848 that showed lower transcription in preconditioned than in unconditioned cells upon a 15-min heat
- shock (precond 15'/uncond 15'). The intersection of 298 genes was counted as genes with slower
- 850 heat-repression in preconditioned cells. In all DESeq2 analyses: p-value <0.001, and fold change
- 851 >1.25 (induced) or <0.8 (repressed).

- 852 STAR METHODS
- 853

854 **Resource Availability**

855 Lead Contact

856 Further information and requests for resources and reagents should be directed and will be fulfilled

- 857 by the Lead Contact, Prof. Lea Sistonen (lea.sistonen@abo.fi).
- 858
- 859 *Materials Availability*
- 860 This study did not generate new unique reagents.
- 861
- 862 Data and Code Availability

863 The PRO-seq and ATAC-seq datasets generated in this study have been deposited to Gene

864 Expression Omnibus (<u>https://www.ncbi.nlm.nih.gov/geo/</u>), and are available as raw and processed

865 files through accession numbers GSE127844, GSE154746, GSE128160 and GSE154744.

866 Original figures for Western Blotting images presented in this paper are available in Mendeley

- 867 (doi: 10.17632/gycj6tnw6v.1).
- 868

869 Experimental Model and Subject Details

In this study, human K562 erythroleukemia cells and mouse embryonic fibroblasts (MEFs) we used. The K562 cell line originated from ATCC. The immortalized MEFs originate from wildtype mouse (McMillan *et al.*, 1998), and were obtained from Ivor Benjamin laboratory.

873

874 Method Details

875 Cell Culture, Heat Treatments and Cell Cycle Profiling

876 Cells were maintained at 37°C in a humidified 5% CO₂ atmosphere. MEFs (McMillan et al., 1998) 877 were cultured in Dulbecco's modified medium (Gibco), and K562 cells in RPMI (Sigma), 878 supplemented with 10% FCS, 2 mM L-glutamate, and streptomycin/penicillin (Mahat and Lis, 879 2017; Vihervaara et al., 2017). The 30-min and 60-min heat shock treatments were conducted by 880 submerging the cell culture into a 42°C water bath (Vihervaara et al., 2017). The 12.5-min, 25-881 min, and 40-min heat shock treatments were instantly provoked by replacing the 37°C media with 882 pre-warmed pre-conditioned media (Mahat and Lis 2017). In adherent MEFs, inducing or 883 terminating heat shock does not require pelleting the cells. In K562 suspension cells, the 37°C 884 media was removed after centrifugation (1000 rpm, 4 min), and the heat shock initiated by re885 suspending the cells in pre-warmed (42°C) pre-conditioned media. The heat shock in K562 cells 886 was terminated by placing the 10 ml of heat shock cell suspension into 35 ml of ice-cold PBS, 887 followed by centrifugation (1000 rpm, 4 min) at 4°C. The non-heat-shocked control cells were 888 retained in similar confluence, and subjected to same treatments, but only exposed to media and 889 conditions at 37°C. Recovery from the heat shock(s) was conducted by placing the cells at 37°C in 890 a humidified 5% CO₂ atmosphere. DNA content of the cells was determined by propidium iodide 891 (PI) staining (40 µg/ml; Sigma), and progression of the cell cycle monitored by fluorescence-892 mediated counting (FACSCalibur, BD Biosciences). The FACS histograms were generated using 893 Cell Quest Pro-6.0 (BD Biosciences) and Flowing Software 2.5 (Turku Bioscience Centre). The 894 error bars in statistical analyses indicate standard deviations.

895

896 Depletion of HSF1 with Short Hairpin RNA

HSF1 was depleted from K562 cells as previously described (Östling *et al.*, 2007; Vihervaara *et al.*, 2013) using shRNA constructs ligated into pSUPER vectors (Oligoengine). The vectorencoded oligonucleotides recognized HSF1 mRNA (GCT CAT TCA GTT CCT GAT C), or contained a scrambled sequence (GCG CGC TTT GTA GGA TTC G) that is not predicted to bind any sequence encoded by the human genome. The shRNA constructs were transfected into cells by electroporation (970 μ F, 220 mV) 24 h prior to the first heat treatment.

903

904 MNase-coupled quantitative ChIP

905 ChIP was performed as previously described (Östling et al., 2007; Vihervaara et al., 2013), with 906 the following modifications to digest the unshielded chromatin with endo- and exonuclease MNase 907 (Skene and Henikoff, 2015). After cross-linking protein-DNA interactions with 1% formaldehyde 908 for 5 min on ice, the samples were quenched with 0.125 M glycine and washed with PBS. The 909 pellets were resuspended in TM2 buffer (10 mM Tris, pH 7.5, 2 mM MgCl₂, 1x proteinase 910 inhibitors cocktail from Roche, 1 mM DTT), and supplemented with 1.5% NP-40 to permeabilize 911 the cells. The chromatin was fragmented using 6.3 U/µl MNase (New England Biolabs, NEB) for 912 10 min at 37°C in MNase buffer (10 mM Tris, pH 7.5, 2 mM MgCl₂, 2 mM CaCl₂, 1x proteinase 913 inhibitors cocktail from Roche, 1 mM DTT). The reaction was terminated in final concentration of 914 1% SDS and 10 mM EGTA. The digested chromatin was diluted in ChIP buffer (150 mM NaCl, 915 20 mM Tris-HCl pH 8.0, 1% Triton-X, 1x protease inhibitors from Roche), and pre-cleared with 916 uncoupled protein G coated sepharose beads (GE Heathcare). Immunoprecipitation was carried 917 over night at 4°C using the following ChIP-verified antibodies: HSF1 (Spa-901, Enzo), H2.AZ

918 (Abcam, ab4174), H3 (Merck Millipore, 06-755), H4 (Merck Millipore, 05-858) and AcH4 (06-919 866, Upstate). Proteins were degraded with proteinase K (Thermo Fisher) and RNA with RNase A 920 (Invitrogen), and the cross-links reversed at 65°C overnight. The DNA was purified with phenol:chloroform extraction and ethanol precipitation, and amplified with primers and probes 921 922 designed to match the exact +1 nucleosomes and promoters of HSPA1A and HSPH1. The primers 923 S1) as follows. *HSPA1A* and probes (Table were promoter: forward: 924 CTGGCCTCTGATTGGTCCAA; reverse: CACGGAGACCCGCCTTTT; probe: 5'-FAM-925 CGGGAGGCGAAACCCCTGGAA-BHQ-3'. *HSPA1A* +1nucleosome: forward: 926 CGGAAGGACCGAGCTCTT; reverse: GGCTCCGCTCTGAGATTG; probe: #47 (universal 927 probe library, Roche). HSPH1 promoter: forward: GAGGCAGGTTTGAGCCAAT; reverse: 928 CGAGCCTTCTGGAAAGATTC; probe: #44 (universal probe library, Roche). HSPH1 +1 929 GGAAAGTTCTGATCAGTGCGATA; nucleosome: forward: reverse: 930 TGAACTACCGACCCAAAAGG; probe #73 (universal probe library, Roche). The enriched 931 chromatin was quantified using TaqMan chemistry (Applied Biosystems), and the signal intensity 932 in each sample was normalized against the respective total MNase-digested DNA (input).

933

934 *Quantitative Reverse Transcription PCR*

935 For analyzing polyadenylated mRNA, RNA over 200 nt was isolated using RNeasy kit (Qiagen). 936 Subsequently, 1 µg of RNA was treated with DNase I (Promega) and reverse transcribed with 937 Moloney murine leukemia virus reverse transcriptase RNase H(-) (Promega) using oligoT primer. 938 Quantitative PCR (qPCR) reactions were run using ABI Prism 7900 (Applied Biosystems) with 939 HSPA1A, HSPH1 and GAPDH primers (Oligomer) and probes (Oligomer or Roche Applied 940 Science) reported in Table S1, and in Vihervaara et al. (2013) and Elsing et al. (2014). The forward 941 primer for HSF1 mRNA is CAAGCTGTGGACCCTCGT, the reverse 942 TCGAACACGTGGAAGCTGT, and the probe #67 (universal probe library, Roche). HSP and 943 HSF1 mRNA levels were normalized to mRNA of GAPDH, and fold inductions calculated against 944 non-treated (unCond 0') cells. All reactions were made in triplicate for samples derived from at 945 least three biological replicates. Standard deviations were calculated and are shown in the graphs. 946

947 Western Blotting

Cells were lysed in buffer C (25% glycerol, 20 mM Hepes pH 7.4, 1.5 mM MgCl₂, 0.42 M NaCl,
0.2 mM EDTA, 0.5 mM PMSF, 0.5 mM DTT), and protein concentration in the soluble fraction

950 was measured using Bradford analysis. 20 µg of total soluble protein was boiled in Laemmli sample

951 buffer, subjected to SDS-PAGE and transferred to nitrocellulose membrane (Protran nitrocellulose;

- 952 Schleicher & Schuell). Proteins were analyzed with primary antibodies against HSF1 (Spa-901,
- 953 Enzo), Pol II (Abcam, 8WG16) and β-tubulin (Abcam, ab6046). The secondary antibodies were

954 HRP conjugated (GE Healthcare), and the blots were developed using an enhanced

- 955 chemiluminescence method (ECL kit; GE Healthcare).
- 956
- 957 PRO-seq

958 PRO-seq was performed as previously described (Kwak et al., 2013; Mahat et al., 2016; Vihervaara 959 et al., 2017) with minor modifications. Nuclei of K562 cells were isolated in buffer A (10 mM 960 Tris-Cl pH 8.0, 300 mM sucrose, 3 mM CaCl₂ 2 mM MgAc₂ 0.1% TritonX-100, 0.5 mM DTT) 961 using Wheaton homogeniser (#357546, loose pestle). MEFs were incubated in permeabilization 962 buffer (10 mM Tris-Cl, pH 7.5, 10 mM KCl, 250 mM sucrose, 5 mM MgCl₂, 1 mM EGTA, 0.05% 963 Tween-20, 0.5 mM DTT, 1x protease inhibitors from Roche, 0.4 u/µl RNase inhibitor Superase In, 964 Thermo Fisher). The nuclei or permeabilized cells were flash-frozen and stored at -80°C (10 mM 965 Tris-HCl pH 8.0, 25% glycerol, 5 mM MgAc₂, 0.1 mM EDTA, 5 mM DTT). Before run-on 966 reaction, an equal amount of untreated Drosophila S2 cells was spiked into each sample, counted 967 to account for 1% of the total DNA in each run-on reaction. The following run-on reaction was 968 performed at 37°C for 3 min in the presence of biotinylated nucleotides (5 mM Tris-HCl pH 8.0, 969 150 mM KCl, 0.5% Sarkosyl, 2.5 mM MgCl₂, 0.5 mM DTT, 0.05 mM biotin-A/C/G/UTP from 970 Perkin Elmer, 0.4 u/ul RNase inhibitor). The total RNA was isolated with Trizol LS (Invitrogen). 971 After EtOH-precipitation, the RNA was air-dried, base hydrolyzed with 0.1 N NaOH for 5 min on 972 ice, and the NaOH was neutralized with Tris-HCl (pH 6.8). Unincorporated nucleotides were 973 removed using P-30 columns (Bio-Rad), and the biotinylated nascent transcripts were isolated in a 974 total of three rounds of streptavidin-coated magnetic bead (M-280, Invitrogen) purifications. Each 975 bead binding was followed by Trizol extraction and EtOH-precipitation of the transcripts. The 5'-976 cap was removed with RNA 5' Pyrophosphohydrolase (Rpph, NEB), and the 5'-hydroxyl group 977 was repaired with T4 polynucleotide kinase (NEB). The libraries were generated using TruSeq 978 small-RNA adaptors and sequenced using NextSeq500 (Illumina).

979

980 PRO-qPCR

To quantify nascent RNA synthesis from selected heat-responsive genes, we modified PRO-seq to perform qPCR after the 3'-adaptor ligation. In brief, run-on reactions were conducted in the presence of both unlabeled (200 μ M A/C/G/UTP) and biotinylated (50 μ M biotin-A/C/G/UTP) 984 nucleotides during a 5-minute run-on reaction at 37°C. Total RNA isolation, base hydrolysis, and 985 3' adaptor ligation were conducted as described for PRO-seq. After the second bead binding, 986 reverse transcription was performed using a primer against the 3' adaptor, and qPCR reactions run 987 with ABI Prism 7900 (Applied Biosystems). Primers (Oligomer) and probes (Oligomer and Roche 988 Applied Sciences) were (Table S1): HSPH1 forward: AGCAGGCGGATTGTTGTTAG; HSPH1 reverse: AAAGAGGTGGGCTAATCTTTCA; HSPH1 probe: #38 (universal probe library, 989 990 GCCGAGAAGGACGAGTTTGA; HSPA1A Roche): *HSPA1A* forward: reverse: 991 CCTGGTACAGTCCGCTGATGA; *HSPA1A* probe: FAM-992 TTACACACCTGCTCCAGCTCCTTCCTCTT-BHQ1; MED26 forward: 993 ATTCCAGATGACCCGCTAAG; MED26 reverse: CGGATCACTACCACACCAGA; MED26 994 probe: #21 (universal probe library, Roche). The nascent transcription of HSPA1A and HSPH1 was 995 compared against nascent transcription of Mediator subunit 26 (MED26), a gene and a region in 996 the gene that was actively transcribed and unchanged upon heat shock (Vihervaara et al., 2017). 997

998 Omni-ATAC-seq

999 ATAC-seq was performed as previously described (Corces et al., 2017; Spector et al., 2019) using 100.000 human K562 cells as starting material. Instantly after the treatments, the cells were washed 1000 1001 with ice-cold PBS, and incubated 3 min in 100 µl ice-cold lysis buffer [10 mM Tris-Cl, pH 7.4, 10 1002 mM NaCl, 3 mM MgCl₂, 0.1% (vol/vol) NP-40, 1x protease inhibitor cocktail, Roche]. After 1003 centrifugation (600 g, 10 min, 4°C), the samples were re-suspended in 50 µl tagmentation buffer 1004 [10 mM Tris-Cl, pH 7.4, 10% (vol/vol) dimethyl formamide, 5 mM MgCl₂], and tagmentation 1005 performed with 1 µl Tn5 transposase (described in Spector et al., 2019) for 30 min at 37°C. DNA 1006 was isolated with phonol:chloroform extraction and ethanol precipitation using GlycoBlue 1007 (Invitrogen #AM9516) as a carrier. The correct size distribution in each library was verified by test 1008 amplifying 1/10 of the material in a dilution series, followed by visualization of the DNA in a 5% 1009 polyacrylamide gel using SYBR Gold (ThermoFisher). Half of each library was amplified 12 1010 cycles with barcoded Nextera primers (Illumina) and Q5 DNA polymerase (NEB). After 1011 amplification, the DNA fragments were size selected with Ampure XP beads (Beckman Coulter 1012 #A63880), incubating the samples first in 0.5X beads, and subsequently, in 1.8X beads. The 1013 barcoded samples were pooled, verified with Bioanalyzer, and sequenced using Illumina 1014 NexSeq500. The sequenced reads were trimmed with fastx toolkit 1015 (http://hannonlab.cshl.edu/fastx toolkit/) and aligned to the human genome (GRCh37/hg19). 1016 Each dataset was density-normalized (fragments per million mapped fragments, FPM). 1017 Correlation of replicate pairs was assessed by first calling ATAC-seq peaks (enriched loci of 1018 chromatin accessibility) with MACS2 (Feng et al., 2012) using a combined bam file from all 1019 the samples in this study. Next, the count of fragments at every MACS2-called peak was 1020 measured in each sample, and replicate correlation analyzed with Spearman's rank correlation. After ensuring accurate correlation, the replicates were combined, and three types of FPM-1021 1022 normalized bigwig files generated, reporting the whole released fragment, the middle 20 nt of 1023 each fragment, and 10 nt at both ends of each fragment, respectively (Figure S11A). The complete raw ATAC-seq datasets (GSE154744) are available through Gene Expression 1024 1025 Omnibus database (<u>https://www.ncbi.nlm.nih.gov/geo/</u>).

1026

1027 Quantification and Statistical Analyses

1028 Computational Analyses of PRO-seq Data

1029 The PRO-seq reads were adapter-clipped using cutadapt (Martin, 2011) and trimmed and filtered 1030 with fastx toolkit (http://hannonlab.cshl.edu/fastx toolkit/). Due to usage of external spike-in 1031 material from Drosophila S2 cells, we combined the human (GRCh37/hg19) and Drosophila 1032 (dm3) genomes into a single genome file (hg19-dm3). Likewise, the mouse genome (mm10) 1033 was combined with the *Drosophila* genome (dm3) into a distinct genome file (mm10-dm3). In 1034 both cases, chromosomes of the dm3 were renamed. Reads from K562 cells were aligned to the hg19-dm3 genome and reads from MEFs to the mm10-dm3 genome, using Bowtie 2 (Langmead 1035 1036 and Salzberg, 2012). Reads that uniquely mapped to the chromosomes of the human (hg19) or, respectively, the mouse (mm10) genome, were retained. The reads that uniquely mapped to the 1037 1038 dm3 chromosomes provided a count of reads for spike-in derived normalization factors. The 1039 complete raw PRO-seq datasets in K562 cells (GSE127844 and GSE154746), and MEFs 1040 (GSE128160) are available through Gene Expression Omnibus database 1041 (https://www.ncbi.nlm.nih.gov/geo/).

1042

1043 Normalization of PRO-seq Data

Mapped reads were processed from bed files to coverage files, retaining only the 3'-end nucleotide (active sites of transcription), or the 5'-end nucleotide (for analyses of initiation and cleavage), of each read. Density normalized bedgraph files were adjusted by sample-specific normalization factors that were derived either from the spike-in read count (Booth *et al.*, 2018) or the count of reads at the ends (+120,000 nt from TSS to -500 nt from CPS) of long (>150 kb) genes (Mahat *et al.*, 2016; Vihervaara *et al.*, 2017). For samples measuring transcription during 1050 recovery from the heat shock, or the effect of multiple heat shocks, only spike-in control was 1051 utilized for normalization. When comparing transcription upon short heat shocks (12.5 min, 25 1052 min, and 40 min), we first ensured correct normalization between the unconditioned 0 min and 1053 preconditioned 0 min time points with the spike-in-derived normalization factors. Then, the 3'-1054 ends of over 150 kb long genes were utilized to normalize samples of the rapid heat shock 1055 kinetics (unconditioned 12.5 min, 25 min and 40 min normalized against the unconditioned 0 1056 min; preconditioned 12.5 min, 25 min and 40 min against the preconditioned 0 min). This 1057 strategy allows for highly sensitive sample normalization between short heat shock time points, 1058 and usage of an extrinsic control when normalization regions within samples are not available.

1059

1060 Quantifying Gene Transcription

1061 Actively transcribed genes and their primarily used isoforms were identified by mapping 1062 transcription initiation sites genome-wide using discriminative regulatory elements 1063 identification from global run-on data (dREG; https://dreg.dnasequence.org). The most updated 1064 version of dREG (Wang et al., 2019) is trained to call transcription initiation sites of genes and 1065 enhancers with high sensitivity using their characteristic pattern of divergent transcription (Core 1066 et al., 2014; Tome et al., 2018). To identify gene isoforms with active transcription initiation, 1067 TSSs of RefSeq-annotated transcripts were intersected (bedtools, Quinlan and Hall, 2010) with dREG-called active regulatory elements. Subsequently, transcripts that harbored dREG-called 1068 1069 initiation at the TSS were retained. The level of transcription per each annotated transcript was 1070 measured from the gene body (+500 nt from TSS to -500 nt from CPS), as described previously 1071 (Mahat et al., 2016; Vihervaara et al., 2017). In the downstream analyses, we retained a single 1072 transcript *per* gene by selecting the isoform that showed the largest fold change to heat shock, 1073 or if called unresponsive to heat stress, had the highest level of transcription in non-stress 1074 condition. The analyses of enriched gene annotation categories were performed with Database 1075 for Annotation, Visualization and Integrated Discovery (DAVID; Dennis et al., 2003).

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1077 Identification of Transcribed Enhancers

1078 Transcribed enhancers were identified across the genome *de novo* using dREG (Wang *et al.*, 1079 2019; <u>https://dreg.dnasequence.org</u>) that recognizes patterns of transcription at genes and 1080 enhancers. Since heat shock changes Pol II progression at regulatory elements (Vihervaara *et* 1081 *al.*, 2017), we identified transcribed regulatory elements individually in each sample, and then

1082 unified the coordinates obtained from all samples using bedtools merge with d -100 (Quinlan

1083 and Hall, 2010). Subsequently, the dREG-called regulatory elements were intersected with 1084 RefSeq-annotated TSSs of genes, and only elements that did not occur at any gene promoter 1085 were retained for enhancer analyses. We confirmed that this class of distal regulatory elements 1086 robustly captured functionally verified enhancers of MYC (described by Fulco and co-workers, 1087 2016), and of LCR at the beta-globin locus (Li et al., 2002, Song et al., 2007). The occurrence 1088 of putative enhancers at sites of physical chromatin connections was investigated from existing 1089 Pol II ChIA-PET data (EGSM970213). First, the ChIA-PET-enriched sites of chromatin 1090 connections (blocks) were intersected (bedtools, Quinlan and Hall, 2010) with our putative 1091 enhancer calls, as well as with annotated TSSs of genes. Subsequently, the chromatin 1092 connections from an enhancer to an enhancer, from an enhancer to a promoter, or from an 1093 enhancer to any Pol II ChIA-PET enriched region were identified. The percentage of putative 1094 enhancers in each of these chromatin connection classes is indicated.

1095

1096 Identifying Gene-Enhancer Loops

To annotate enhancers to their target genes, we first utilized Pol II ChIA-PET data (EGSM970213) as indicated above, identifying the set of enhancers that connected to each gene's TSS. Since chromatin capture techniques negatively select for short-range interactions, we additionally annotated enhancers within 25 kb from the gene's TSS. Pol II densities were measured at a 1,000 nt span from the dREG-called enhancer midpoint, and the average Pol II densities at connected enhancers are shown for each indicated gene group.

1103

1104 Analyses of Differential Gene and Enhancer Transcription

1105 To call significant changes in gene and enhancer transcription, we utilized DESeq2 (Love *et al.*, 1106 2014), which uses the variance in biological replicates to assess significant changes between 1107 conditions. Differential gene expression was quantified from gene body transcription (+500 nt 1108 from TSS to -500 nt from CPS) of each gene. In this gene body window, Pol II has passed the 1109 initiation and pause regions and is undergoing productive elongation. Enhancer transcription was 1110 quantified along the whole enhancer length, individually for minus and plus strands (Vihervaara et al., 2017). For significantly changed transcription, we required p-value <0.05 (K562) or 1111 1112 <0.001 (MEFs), and fold enrichment >1.25. The less stringent criterion for K562 cells used in 1113 this study, as compared to MEFs and our earlier data on K562 cells (Vihervaara et al., 2017), is 1114 due to lower sequencing depth. The heat-induced changes in transcription, as well as the sets of 1115 differentially transcribed genes and enhancers are highly similar in our distinct studies of the

1116 same cell type. The identification of genes with faster heat-induction or slower heat-repression

- in preconditioned MEFs is depicted in Figure S16. Highly heat-induced genes displayed FC >
 2 in gene body transcription (heat shock / non-heat shock) and dRPK >200 (heat shock non
- 1110 2 in gene body transcription (near shock / non near shock) and drift 200 (near shock nor
- 1119 heat shock) at least in one of the heat shock time points as compared to non-heat shock condition.
- 1120

1121 Analyses of HSF1-Dependent Transcription at Genes and Enhancers

1122 Nascent transcription upon HSF1-knockdown was inferred from a single replicate, chosen by 1123 the most prominent down-regulation of HSF1 throughout the length of the experiment (Figure 1124 5B). To identify HSF1-dependent genes, we used two approaches. First, we measured the heat-1125 induced gene body transcription for each gene in the presence and absence of HSF1. This 1126 comparison of transcription level identified 186 genes whose heat induction in K562 cells 1127 depleted of HSF1 remained under 50% of the respective induction in cells expressing intact 1128 levels of HSF1. Second, we used the fact that unconditioned and preconditioned cells correlated 1129 to the same extent as biological replicates (rho=0.98) and contained similar levels of gene body 1130 transcription (Figure S15B), conducting DESeq2 using the same time point from unconditioned 1131 and preconditioned cells as a replicate pair. These analyses showed 227 genes and 496 enhancers 1132 to be HSF1 dependent in both unconditioned and preconditioned K562 cells (Figure S13F). To 1133 account for a subset of genes changing basal or heat-inducible transcription due to preconditioning, we complemented the DESeq2-analysis to also find genes that showed HSF1-1134 1135 dependency only in unconditioned or preconditioned cells, or that were called insignificant due to changes in basal transcription. Since HSF1-dependency of the 227 DESeq2-called genes 1136 1137 ranged from 64.1% to 99.9% (Figure S13F), we queried genes that in either unconditioned or 1138 preconditioned cells were HSF1-dependent at least to 64.1%, gained at least two-fold heat-1139 induction, and had a minimum gene body transcription of 50 RPK in any condition. This analysis 1140 identified 18 additional HSF1-dependent genes, including PPP1R15A that had lost heat-1141 inducibility, and HSPA8 that had gained higher basal transcription, upon preconditioning. All 1142 of the 18 genes were individually verified to be HSF1-dependent by browsing.

1143

1144 Visualizing Transcriptionally Engaged Pol II in Genome Browsers and as Composite Profiles

1145 Pol II densities as bigWig and bedgraph files were visualized with Integrative Genomics Viewer

1146 (IGV; Thorvaldsdóttir *et al.*, 2013) and an in-house browser (Hojoong Kwak, Cornell 1147 University, Ithaca, NY, USA). The scale of y-axis is equal and linear for tracks across different

- interesting, function, feft, estig. The searce of y units is equal and interest deress different
- 1148 conditions for an indicated genomic region. To generate composite profiles, the read counts in

1149 defined genomic regions were obtained, and composite profiles generated using bigWig package

- 1150 (https://github.com/andrelmartins/bigWig/). The average intensities in composite profiles were
- 1151 queried in 20-nt, 10-nt or 1-nt bins. The shaded areas display 12.5-87.5% fractions of the data
- in each queried window. To generate an average profile of gene bodies with different lengths,
- 1153 1/500 of the gene body length was set to the bin size, after filtering out short genes where the
- 1154 bin would have been less than 1 nt.
- 1155
- 1156 Identification of Genes with Compromised Pol II Progression

1157 To identify genes with decreased Pol II density in 5'- and increased density in 3'-region, genes 1158 were first divided into three distinct regions: 1) 5'-coding region comprising 1000 nt 1159 downstream of the mid coordinate between Pol II pause sites of divergent transcription, 2) gene 1160 body, measured from +1000 nt from the mid of the pause sites to -1000 nt from the CPS, and 3) 1161 downstream, +100 nt to +6000 nt, of the CPS. PRO-seq reads in each region were measured, 1162 after which the read count in the preconditioned 60-min heat shock sample was deduced from 1163 the respective read count in the unconditioned 60-min heat shock sample. Since gene body 1164 transcription varies from gene to gene, we compared the change in Pol II progression within 1165 each gene. To identify genes with reduced 5'- and increased 3'- Pol II density, we required the 1166 reduction at 5'-coding region to be three times larger than the absolute change in the gene body read count. Simultaneously, the increase in read counts downstream of the CPS was required to 1167 1168 be three times higher than the absolute change in the gene body read count.

1169

1170 Quantifying Engaged Pol II Molecules in Distinct Genomic Regions

1171 The mapped reads were sorted to distinct genomic regions by intersecting the 3'-coordinate of 1172 the read with the genomic coordinates described in Figure S15A. To avoid double mapping, 1173 gene body reads that overlapped with enhancers or pause regions were omitted. Subsequently, 1174 the number of reads in a given region was counted as fraction of total uniquely mapping reads 1175 in the PRO-seq data.

1176

1177 Additional Datasets Used

Besides the PRO-seq (GSE127844, GSE128160 and GSE154746) and ATAC-seq (GSE154744)
datasets generated in this study, the following datasets have been utilized: HSF1-binding sites
in non-stressed and 30-min heat-shocked K562 cells (GSE43579; Vihervaara *et al.*, 2013),
binding sites of TBP (GSM935495), GATA1 (GSM935540) and GATA2 (GSM935373) in non-

- 1182 stressed K562 cells (Consortium EP, 2011); DNase I hypersensitive (GSM736629), MNase
- 1183 resistant (GSM920557), as well as H3K9me1 (GSM733777), H3K27ac (GSM733656),
- 1184 H3K4me1 (GSM733692) and H3K4me3 (GSM733680) enriched loci in non-stressed K562 cells
- 1185 (Consortium EP, 2011); Pol II ChIA-PET in non-stressed K562 cells (GSM970213); PRO-seq
- 1186 data in non-stressed and 30-min heat-shocked K562 cells for verification purposes (GSE89230;
- 1187 Vihervaara et al., 2017); PRO-seq data in non-stressed and 12.5-min heat-shocked MEFs
- 1188 (GSE71708; Mahat *et al.*, 2016).
- 1189
- 1190 Code Availability
- 1191 Computational analyses have been performed using Unix, R and Python languages. Custom1192 made scripts can be made available upon request.
- 1193
- 1194

1195 Supplemental Material

1196 The supplemental material contains sixteen (S1-16) figures, two tables (Supplemental Table 1 and 1197 Key Resource Table) and two datasets (Supplemental Datasets 1-2). The Supplemental Table 1 1198 contains primer and probe sequences used in this study. The Supplemental Dataset 1 lists gene 1199 transcripts in human K562 cells that show transcription initiation at the TSS, identified from PRO-1200 seq data using dREG gateway. The Supplemental Dataset 2 lists HSF1-dependently heat-induced 1201 genes in unconditioned and preconditioned K562 cells. The abbreviations in the Supplemental 1202 Datasets are as follows. chr: chromosome. txStart: the first coordinate of the transcript (RefSeq). 1203 txEnd: the last coordinate of the transcript (RefSeq). Please note that txStart \leq txEnd, regardless 1204 whether the gene is on plus or minus strand. Strand: strand encoding the transcript. geneName: the 1205 name of the gene. txID: transcript specification. uC30 to uC0: DESeq2-called regulation of 1206 transcription in unCond 30' versus unCond 0'. pC0 to uC0: DESeq2-called regulation of 1207 transcription in preCond 0' versus unCond 0'. pC30 to uC0: DESeq2-called regulation of 1208 transcription in preCond 30' versus unCond 0'. UnExp: unexpressed genes (initiation of 1209 transcription is detected, but the level of engaged Pol II molecules on the gene body is very low). 1210 UnReg: unregulated. DownHC: down-regulated with high confidence (counted as down-regulated 1211 in this study). DownLC: down-regulated with low confidence. UpHC: up-regulated with high 1212 confidence (counted as up-regulated in this study). UpLC: up-regulated with low confidence. 1213 Please note that in the manuscript, only one transcript per gene is included in the downstream 1214 analyses.

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