| 1 | Heritable gene expression variability governs clonal heterogeneity in |
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| 2 | circadian period |
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| 9 | Short title: heritable basis of clonal circadian period heterogeneity |
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11 ABSTRACT

A ubiquitous feature of circadian clocks across life forms is its organization as a network of 12 coupled cellular oscillators. Individual cellular oscillators of the network often exhibit a 13 considerable degree of heterogeneity in their intrinsic periods. While the interaction of coupling 14 and heterogeneity in circadian clock networks is hypothesized to influence clock's entrainability, 15 our knowledge of mechanisms governing network heterogeneity remains elusive. In this study, 16 we aimed to explore the principles that underlie inter-cellular period variation in circadian clock 17 networks (clonal period-heterogeneity). To this end, we employed a laboratory selection 18 19 approach and derived a panel of 25 clonal cell populations exhibiting circadian periods ranging 20 from 22 h to 28 h. We report that while a single parent clone can produce progeny clones with a wide distribution of circadian periods, heterogeneity is not entirely stochastically driven but has 21 a strong heritable component. By quantifying the expression of 20 circadian clock and clock-22 23 associated genes across our panel, we found that inheritance of different expression patterns in 24 at least three clock genes might govern clonal period-heterogeneity in circadian clock networks. Furthermore, we provide preliminary evidence suggesting that epigenetic variation might 25 26 underlie such gene expression variation.

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28 INTRODUCTION

The majority of life forms on earth exhibit ~24 h (circadian) behavioural and physiological rhythms generated by endogenous time-keeping mechanisms - circadian clocks. In addition to driving such endogenous rhythms, circadian clocks facilitate synchronization of organisms' rhythms to daily and seasonal changes in the environment to enhance their survivability, thereby

functioning as an adaptive mechanism (Kumar, 2017). The fundamental basis of circadian 33 34 rhythm-generation across all life-forms are cell-autonomous molecular oscillations comprising evolutionarily conserved auto-regulatory transcription-translation feedback loops (TTFL) 35 (Dunlap, 1999). In higher organisms, such cell-autonomous clocks often function as a network of 36 37 coupled oscillators which in unison drive circadian rhythms (Bell-Pedersen et al., 2005). Welsh and co-workers first reported that neurons within the suprachiasmatic nucleus (SCN; the master 38 pacemaker in the hypothalamus of mammals) are surprisingly heterogeneous in their intrinsic 39 40 periods of circadian firing pattern (Welsh et al., 1995). Subsequent studies revealed that such period-heterogeneity is not restricted to the SCN alone, but is also characteristic of mammalian 41 peripheral clock cells (Nagoshi et al., 2004; Leise et al., 2012) as well as of clock cells in Drosophila 42 (Sabado et al., 2017) and plants (Yakir et al., 2011; Muranaka and Oyama, 2016). The ubiguity of 43 this network feature suggests that heterogeneity may be functionally relevant for circadian clocks 44 45 (Jagota et al., 2000; Schaap et al., 2003; Gonze et al., 2005; Bernard et al., 2007; Inagaki et al., 2007; VanderLeest et al., 2007; Gu et al., 2016, 2019), thus likely being a substrate for natural 46 selection. Interestingly, the observed period-heterogeneity among circadian clock cells within an 47 organism cannot be entirely attributed to functionally different cell types as cells of the same 48 subtype (clonal cells) also exhibit such variation (Nagoshi et al., 2004; Leise et al., 2016). Clonal-49 50 heterogeneity or clonal-phenotypic variability is common in biology and can stem from various 51 external factors such as stochastic changes in the microenvironment or internal factors like stochastic partitioning of cellular components during cell-division or stochasticity in gene 52 expression (Neildez-Nguyen et al., 2008; Brock, Chang and Huang, 2009; Huang, 2009; Altschuler 53 54 and Wu, 2010; Geiler-Samerotte et al., 2013; Roberfroid, Vanderleyden and Steenackers, 2016;

55 Evans et al., 2018). In this study, we aimed to explore the possible mechanisms underlying clonal-

56 heterogeneity of circadian period in human circadian oscillator cells.

57 We hypothesised that clonal period-heterogeneity in mammalian cells is due to a) stochastic 58 variation (Geva-Zatorsky et al., 2006; Chang et al., 2008; Brock, Chang and Huang, 2009; Frank 59 and Rosner, 2012) and/or b) heritable variation (Dubnau and Losick, 2006; Gordon et al., 2009, 2013). Since the term 'stochastic' is used in the context of both non-heritable (external noise and 60 gene expression noise) as well as heritable gene expression variation (epigenetic stochasticity), 61 62 for the rest of this manuscript we define 'stochasticity' as any non-heritable variation (both 63 internal and external). To test the two hypothesis outlined above, we employed a laboratory 64 selection approach and derived a panel of 25 clonal cell lines (from a common ancestral/founding 65 culture) exhibiting a range of periods between 22h and 28h. We observed that the periodheterogeneity among progeny clones stemming from a single parent cell is not entirely stochastic 66 67 but has a substantial heritable component. We then measured expression of 20 clock and clockassociated genes in our panel and observed that variation in gene expression levels of at least 68 three clock genes (transcription factors) might underlie clonal period-heterogeneity. 69 70 Furthermore, we provide preliminary evidence that epigenetic variation might govern the observed clonal-variation in gene expression. 71

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76 **RESULTS**

77 Clonal period-heterogeneity is not entirely stochastically driven but is largely inherited

Is the variation in period among individual circadian oscillator cells just due to intrinsic and/or 78 79 extrinsic stochastic noise? Or is there a heritable component? To test this, we single-cell cloned a 'founding culture' of U-2 OS cells (an established model of peripheral circadian clocks) harboring 80 a BMAL1-luciferase reporter construct (Maier et al., 2009). Upon reaching confluence, the period 81 of bioluminescence rhythms from these progeny cultures was determined by live-cell 82 83 bioluminescence recording. As expected, we observed a distribution of circadian periods (23.5 h - 27.5 h; Figure 1a top panel). We repeated this protocol for several 'assay-generations' by each 84 85 time selecting short and long period cultures as 'parents' for the next assay-generation (Study outline in Supplementary Figure S1). 86

Interestingly, by repeating this protocol for several assay-generations we observed a directional 87 divergence of the progeny period-distributions on either side of the 'founding culture's' 88 distribution (Figure 1a). The mean circadian periods of progeny cultures in every assay-89 generation were always very similar to those of their parental cultures (Figure 1a). Over the 90 91 course of the selection protocol, the periods of short and long period clonal lines (SCL and LCL) 92 significantly diverged from each other and from the 'founding culture'. The periods of both SCLs 93 and LCLs diverged significantly by assay generation-2 and this divergence reached saturation as the periods did not diverge further (p < 0.001; ANOVA followed by Unequal N HSD; Figure 1b). At 94 95 assay generation 4, the circadian periods of LCLs were ~3.4 h longer, and those of SCLs were ~1.7 96 shorter than the 'founding culture's' period (Figure 1b; Supplementary Figure S2).

As a measure of period-heritability, we regressed mean periods of the progeny cultures on parental cultures and observed that parental period is a very good predictor of the mean progeny period (R² = 0.96; Figure 1c). In addition, even though the divergence of period saturated over the last three assay generations (Figure 1b), we still observe a distribution of periods even after three assay generations. We reason that this distribution might be due to non-heritable stochasticity. Taken together, our results suggest that clonal period-heterogeneity might partly be stochastically driven but has a significant heritable component.

104 Inheritance of differential gene expression levels might underlie period heritability

We further aimed to explore the likely basis for heritability of the circadian period underlying heterogeneity. During the course of our experiments, we observed that the short and long period clones consistently exhibited low and high bioluminescence intensities/levels respectively (Supplementary Figure S2a). This encouraged us to test correlation of the period with circadian rhythm parameters such as amplitude, damping rate and bioluminescence intensity.

We observed a positive correlation of bioluminescence intensity (Pearson r = 0.65, p < 0.0001) 110 111 with clone-period; the correlation of relative amplitude with period was negative but not significant (Pearson r = -0.08, p = 0.19) and damping rate was not significantly correlated with 112 period either (Spearman r = 0.26, p = 0.06; Supplementary Figure S3a). We reasoned that mean 113 bioluminescence intensity can, in-principle serve as a proxy for the average expression level of 114 the underlying gene (BMAL1 in this case) and hypothesized that clonal inheritance of average 115 116 gene expression might underlie the observed period heritability. This was further supported by 117 the observation that parental bioluminescence intensity was the best predictor of the respective

| 118 | progeny values ($R^2 = 0.76$; Figure 2a), while relative amplitude ($R^2 = 0.04$; Supplementary Figure |
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| 119 | S3b) and damping rate (R ² = 0.40; Supplementary Figure S3c) were only poor predictors. |

120 Differential expression of E-Box associated factors may govern clonal period-heterogeneity

121 To test, whether gene expression correlates with clonal period-heterogeneity, we used the NanoString multiplex technology to measure the average expression levels of 20 clock and clock-122 associated genes (Supplementary Table S1) across our panel of 25 clones. Not surprisingly, we 123 124 observed a high degree of cross-correlation in expression of the measured genes (Figure 2b) likely due to the high interconnectivity in the circadian clock molecular loop. We subjected the dataset 125 126 to Principal Component Analysis (PCA) aiming to extract the major features/genes that might 127 underlie (or is a major contributor to) clonal-period heterogeneity. Based on the Broken-Stick 128 model (Jolliffe, 2011), we retained the first two Principal Components (PCs) which collectively explained 70.2% of the circadian period variance (Figure 2c). Interestingly, the first two PCs also 129 clustered the panel of clones into three categories of short (22.3-23h), intermediate (23.8-26.9h) 130 131 and long (27.6-28.2h) period clones (Figure 2d). PC1 clustered the clones into two groups: i) 132 intermediate periods and ii) the rest including both short and long period clones (nonintermediate). In contrast, PC2 appeared to be important for the three observed clusters (Figure 133 2d). Based on the cos² values (a measure of the quality of representation of the genes on a PC; 134 Figure 2e-f) and contributions of genes to PC2 (Supplementary Figure S4), we shortlisted the top 135 25% of the candidate genes (ARNTL2, BHLHE40, DBP, NR1D2, PER2) that we hypothesized to 136 137 largely account for the period-variation.

We implemented hierarchical clustering on our dataset based on expression of the five shortlisted candidate genes and observed that clustering of clones was similar (with one exception) to that by the first two PCs (Figure 2g). The amalgamation schedule suggested a possibility of three clusters (red, blue and green dashed-rectangles, Figure 2g) which was also in agreement with the optimal cluster number reported by five different indices (Supplementary Figure S5).

Clustering-based heat map revealed that the expression of ARNTL2 and BHLHE40 correlated 144 145 positively with the circadian period, DBP and NR1D2 correlated negatively, while PER2 exhibited 146 a clear trend (Figure 2g, Supplementary Figure S6a). As a control measure, we also similarly 147 shortlisted top 25% genes from PC1 (NR1D1, CLOCK, CSNK1D, CIPC and NFIL3) and, as expected, 148 we observed that these genes were not sufficient to discriminate the short and long periods 149 thereby resulting in only two clusters – intermediate and non-intermediate (Figure 2h). 150 Interestingly, all five genes from PC1 have higher expression in 'intermediate' period clones and their expression reduces as the period deviates from 'intermediate' (Figure 2h, Supplementary 151 Figure S6b). Thus, we reasoned that changes in expression of PC2 genes are likely to drive period 152 heterogeneity while those from PC1 are likely to be a consequence of period heterogeneity. 153

We hypothesized that if differences in expression of the shortlisted PC2 genes governs period heterogeneity, then depletion of these genes should result in large period change while depletion of those from PC1 should not have a significant effect on period. Specifically, based on their expression patterns (Figure 2g) knockdown of *ARNTL2* and *BHLHE40* should shorten the circadian period while *DBP* and *NR1D2* knockdown should result in period lengthening. To test this, we used RNAi mediated silencing to individually knockdown the shortlisted genes in 3-short, 2-

intermediate and 3-long period clones (based on clustering in Figure 2g) and studied the effect 160 161 on circadian period. Indeed, we observed that knockdown of NR1D2 resulted in significant period lengthening across all clones while BHLHE40 and ARNTL2 knockdown resulted in significant 162 period shortening (Mixed model ANOVA followed by Tukey's HSD; p < 0.00001; Figure 3a-b). 163 164 NR1D2 knockdown had the largest effect on period, significantly higher compared to all other genes across both the PCs; followed by BHLHE40 that was similar to ARNTL2 and had a 165 166 significantly higher effect on period compared to all other genes. Knockdown of none of the other 167 genes across both PCs resulted in a period change significantly differing either from zero (one 168 sample t test, p > 0.05) or from each other (Mixed model ANOVA followed by Tukey's HSD; p >0.05; Figure 3a-b). Accordingly, we observed that the average absolute period change upon 169 170 knockdown of PC2 genes was significantly higher than that by PC1 genes (Figure 3c).

Taken together, these results suggest that differential expression of *NR1D2*, *BHLHE40* and
 ARNTL2 likely underlies heterogeneity in clonal circadian period.

Epigenetic regulation might underlie altered gene expression patterns associated with clonal period-heterogeneity

Having observed that clonal period-heterogeneity is associated with altered gene expression patterns, we next asked 'what causes such altered expression among clonal cells?' We ruled out the possibility of random mutation accumulation (see Discussion) and hypothesized that epigenetic variation might account for the observed differences in gene expression patterns among clonal lines. As a preliminary test, we treated all 25 clonal cell populations in our panel with the commonly used epigenetic modifier Suberoylanilide Hydroxamic Acid (SAHA) and studied the effect of the treatment on clone period. SAHA is a Class I and Class II Histone Deacetylase Inhibitor which upregulates gene expression by multiple mechanisms (Marks *et al.*, 2008). We reasoned that if reduction in expression of the identified subset of genes across our clonal panel is due to epigenetic suppression (in this case, acetylation status), treatment with SAHA should upregulate the expression of these genes thereby lengthening and shortening the circadian period in short and/or long period clones respectively.

Interestingly, we observed that treatment with SAHA differentially influenced the short, intermediate and long period clones. SAHA treatment resulted in a significant period shortening in the long period clones (ANOVA followed by Tukey's HSD, p < 0.05; Figure 3d) whereas, the magnitude of period change in short and intermediate period clones did not differ from each other (ANOVA followed by Tukey's HSD, p = 0.85) or from zero (one sample t test, p > 0.05; Figure 3d).

Although the possible reasons for the differential effects of SAHA treatment on short and long period clones will be discussed later, this provides preliminary evidence suggesting that epigenetically regulated gene expression differences might underlie clonal period-heterogeneity.

196 **DISCUSSION**

We used human U-2 OS cells to investigate whether period-heterogeneity in circadian clock network stems from intrinsic/extrinsic non-heritable stochasticity or whether it has a heritable component. We employed a laboratory selection protocol to select for clonal cell populations exhibiting short and long circadian periods through which we derived a panel of 25 clonal cell populations exhibiting circadian periods between 22 h to 28 h.

We observed that parental clones always produced progeny with mean periods closely 202 203 resembling the former thus resulting in a directional response (divergence of short and long period clones from the founding culture) to our selection protocol (Figure 1a). Consistently, the 204 period of parental culture was a very good predictor ($R^2 = 0.96$) of the progeny's mean period 205 206 (Figure 1c). Taken together, these results suggest that clonal period-heterogeneity is unlikely to be stochastically driven and has a strong heritable component. This raises an interesting 207 question: why would natural selection favour the evolution of heritable mechanisms to drive 208 209 period-heterogeneity over entirely stochastically driven heterogeneity? We hypothesize that, 210 although period heterogeneity can be functionally beneficial (Jagota et al., 2000; Schaap et al., 2003; Gonze et al., 2005; Bernard et al., 2007; Inagaki et al., 2007; VanderLeest et al., 2007; Gu 211 et al., 2016, 2019), very large heterogeneity can negatively influence clock functionality as well 212 213 (Gonze et al., 2005; Bernard et al., 2007; Gu et al., 2016). Stochastic mechanisms can potentially 214 lead to very large variation in inter-cellular/oscillator period which would be detrimental, whereas heritable mechanisms may impose phenotypic constraints (Wagner, 2011) within which 215 216 period-heterogeneity can be maintained and thus being favoured by natural selection.

Over the course of our experiments, we observed that long-period clones often exhibited higher bioluminescence intensity compared to the short-period clones (Supplementary Figure S2a) and further analysis revealed that parent bioluminescence intensity was a good predictor of progeny bioluminescence intensity but this was not the case for either relative amplitude or the damping rate (Figure 2a, Supplementary Figure S3). We reasoned that bioluminescence intensity could serve as a proxy measure for *BMAL1* expression and thus hypothesised that period heritability is likely to be due to the inheritance of gene expression levels from parental clones. To further

explore this, we measured average expression of 20 circadian clock and clock-associated genes 224 225 (Supplementary Table S1) across all 25 clones in our panel. By employing principal component analysis, we identified five candidate genes (ARNTL2, BHLHE40, DBP, NR1D2 and PER2) that 226 227 grouped the clones into three distinct clusters – short, intermediate and long periods (Figure 2c-228 g, Supplementary Figures S4-5). Furthermore, we observed that knockdown of three of the shortlisted candidates - NR1D2, BHLHE40 and ARNTL2 had the largest influence on period across 229 230 while other genes including those from PC1 had little or no effect on period change (Figure 3a-231 c). It is noticeable that individual knockdown of the genes resulted in small magnitude period 232 changes that cannot entirely account or period differences between the short and long period clones (Figure 3a). These results suggest that that clonal period-heritability is a multi-gene trait 233 involving a consortium of multiple medium-effect genes. Notably, all three above-mentioned 234 235 genes are transcription factors that are either regulated by and/or act on E-boxes and are part of 236 both the core and auxiliary molecular clock loops (Ikeda et al., 2000; Okamura et al., 2002; Kawamoto et al., 2004; Guillaumond et al., 2005; Nakashima et al., 2008; Sasaki et al., 2009; 237 238 Takahashi, 2017). This reinforces the idea that while persistence of circadian oscillation requires a functional core clock loop involving negative feedback by the PER-CRY family, modulation of 239 clock period might be governed by interaction between multiple loops coupled by E-box 240 241 associated transcription factors (Zhang and Kay, 2010; Relógio et al., 2011). Another notable gene 242 that our analysis revealed happens to be one of the relatively less studied circadian clock genes ARNTL2 (BMAL2). While ARNTL2 is a functional paralog of the core clock gene ARNTL1 (BMAL1), 243 244 its precise role in the clock loop remains largely elusive (Ikeda et al., 2000; Sasaki et al., 2009; Shi *et al.*, 2010) thus highlighting a potential role of *ARNTL2* in circadian period-modulation, which
awaits further exploration.

247 Intriguingly, in contrast to the above-discussed genes, we find another category among the 248 assayed genes that exhibit an inverted-U shaped relationship with period. The expression of 249 these genes (*NR1D1*, *CSNK1D*, *NFIL3*, *CLOCK*, *CIPC*) is high in clones with intermediate periods 250 (23.8-26.9h) and is drastically reduced in clones with periods deviating from the intermediate range (Figure 3g). Furthermore, our knockdown studies also confirm that expression patterns of 251 252 these genes are not causal but likely to be a response/consequence to period variation (Figure 253 3b). Such inverted-U shaped responses (Hormesis) is observed in various biological systems and 254 is regarded as a regulatory/homeostatic mechanism to prevent very large deviations of 255 cellular/organismal phenotypes from their optimal range (Calabrese and Baldwin, 2001; Baldi 256 and Bucherelli, 2005; Zhang et al., 2008). As discussed earlier, since a higher degree of period-257 heterogeneity can be detrimental to the circadian clock network, we hypothesize that while there are mechanisms within the clock circuitry that promote period-heterogeneity, the network might 258 also harbour hormesis-based mechanisms which impose constraints on the range of period that 259 the circadian clock can exhibit (Baldi and Bucherelli, 2005; Zhang et al., 2008). Such mechanisms 260 may also explain why we observe a saturation of period divergence after assay generation 2 261 262 (Figure 1b).

While evidence thus far strongly suggests that clonal period-heterogeneity is driven by differences in clock gene expressions, we then asked 'what is the source of these expression differences?' One possibility is that the short and long period clones might have accumulated random mutations resulting in period change and subsequently selected by us. However, we

reason that this is highly unlikely because – a) With a mutation rate of $\sim 2.5 \times 10^{-8}$ /nucleotide in 267 268 human cells (Nachman and Crowell, 2000), the probability of occurrence of at least two kinds of mutations within a small fraction of the genome (comprising clock genes) driving short and long 269 periods is extremely low. b) We see significant trends in expression of the same subset of genes 270 271 across both short and long period clones (Figure 2g; Supplementary Figure S6). This presupposes 272 that mutations driving short and long periods have occurred within the same genes, which 273 further drastically reduces the probability that the observed period differences stem from 274 random mutations. c) Even if the mutation rate is higher than we estimate, the saturation of divergence in period over the last three assay generations (Figure 1b) cannot be entirely 275 accounted by mutations since the periods could continue to diverge due to further accumulation 276 of mutations. Therefore, we argue that the observed period-heterogeneity is unlikely to be due 277 278 to random mutations, which leaves us with another alternative – epimutations. Epimutations are 279 heritable changes in expression of genes and are not associated with DNA mutations. Epimutations are often associated with changes in methylation states of genes or other heritable 280 281 chromatin modifications (Holliday, 2006). The rates of epimutations are observed to be order of magnitude higher than DNA mutation rates (Van Der Graaf et al., 2015) and successfully explains 282 phenotypic heterogeneity in many life forms including clonal populations (Kaufmann et al., 2007; 283 284 Stockholm et al., 2007; Neildez-Nguyen et al., 2008; Taudt et al., 2016; Springer and Schmitz, 285 2017). Therefore, we hypothesized that epimutations-driven gene expression differences may underlie clonal heterogeneity in circadian period. As a preliminary test of this hypothesis, we 286 studied the effect of a Histone Deacetylase Inhibitor Suberoylanilide Hydroxamic Acid (SAHA) 287 288 treatment on the circadian period across our clones. Interestingly, we find that treatment with

SAHA significantly shortens (albeit by a small magnitude) the period in long-period clones with 289 290 little or no effect on the short and intermediate clones (Figure 3d). The small magnitude effect of SAHA treatment might be due to one or all of the following reasons. SAHA is broad spectrum 291 Histone Deacetylase (HDAC) inhibitor and promotes upregulation of genes by acetylation, 292 293 whereas other epigenetic mechanisms that might contribute to the gene expression in our clones are not targeted by this treatment. Alternatively, off-target effects of SAHA might also upregulate 294 295 other genes that in turn negatively influence the change in period. In addition, as discussed 296 previously, if period heterogeneity is indeed a multi-gene trait relying on combined upregulation 297 and downregulation of two or more genes, mere treatment with epigenetic modifiers that leads to genome-wide changes in gene expression may not be a good strategy. Nevertheless, the 298 299 differential effects of SAHA on short and long period clones is promising and provides preliminary 300 support to the idea that epigenetic modulation of gene expression might underlie clonal period-301 heterogeneity. Future targeted studies along these lines may shed more light on this aspect.

In conclusion, our study reports that the heterogeneity in periods observed within circadian clock 302 networks in mammals is not stochastically driven but has a heritable basis and that this is likely 303 304 to be a multi-gene trait. We identified that differential regulation of three E-box associated transcription factors might govern period-heterogeneity in circadian clock networks and provide 305 306 preliminary evidence that epigenetically regulated gene expression differences may underlie 307 clonal period-heterogeneity. In addition, we also observed a subset of genes that exhibit which we hypothesize are part of homeostatic mechanisms that may constrain circadian clocks from 308 309 deviating largely from their optimal period range. Future studies will help further explore the 310 phenomenon of period-heterogeneity and its regulation.

311 MATERIALS AND METHODS

312 Clone selection protocol

313 All clones used in this study were U-2 OS cells (human, ATCC # HTB-96) stably expressing firefly 314 luciferase from a 0.9-kb BMAL1 promoter (Maier et al., 2009), cultured and maintained in DMEM 315 containing 10% fetal bovine serum, antibiotics (100 U/ml penicillin and 100 µg/ml streptomycin). See Supplementary Figure S1 for a pictorial description of the selection protocol. Briefly, cells 316 from 'founding culture' expressing a circadian period of 24.6 ± 0.16 h (mean ± SD) were plated as 317 318 single-cell clones in 96-well 'parent plates' and grown to confluency. Upon reaching confluency, 319 an 'assay plate' was established for every 'parent plate' by splitting cells. The period of bioluminescence rhythms from cells in 'assay plates' was recorded (see below for recording 320 protocol) and clones exhibiting short or long periods (tails of the period-distribution) were 321 selected. Bioluminescence rhythms of every clone was recorded 2-3 times and only clones that 322 323 consistently exhibited shot/long periods were selected. Following the selection of clones, corresponding clones from the 'parent plate' were single-cell cloned in 96-well plates, and the 324 procedure was repeated for four assay generations by selecting short and long period clones 325 326 every generation.

327 Bioluminescence recording

328 Cells were plated in white 96-well plate at a density of 20×10^3 cells/well and after 72 hours, cells 329 were synchronized with dexamethasone (1 μ M) for 30 minutes, washed twice with PBS and 330 cultured in Phenol-Red-free DMEM containing 10% fetal bovine serum, antibiotics (100 U/ml 331 penicillin and 100 μ g/ml streptomycin) and 250 μ M D-luciferin (Biothema, Darmstadt, Germany). Bioluminescence was recorded at 37°C in a 96-well plate luminescence counter (TopCount, PerkinElmer, Rodgau, Germany) for up to 7-days. ChronoStar software (Maier *et al., in press*) was used for data analysis and estimation of rhythms parameters including period, decay constant (damping), relative amplitude and average bioluminescence (MESOR) of the oscillation as described previously (Abraham *et al.,* 2010).

337 RNA preparation and NanoString based gene expression analysis

Five days before the RNA extraction, cells were plated at a density of ~20×10³ cells/well in 24-338 well plate with DMEM containing 10% fetal bovine serum, antibiotics (100 U/ml penicillin and 339 100 μ g/ml streptomycin). Since we intended to measure average gene expression levels, the 340 341 culture medium was not replaced for five days to prevent accidental synchronization of cells. On day-5 the medium was removed, 100 µl/well iScript[™] RT-qPCR Sample Preparation Reagent 342 (Biorad) was added on top of the cell-layer and incubated at 37 0 C for 5 min. 3µl of the sample 343 344 was withdrawn without disturbing the cell-layer and used for further downstream analysis as per manufacturer's instructions. 345

A previous study of ours combined whole-genome transcriptomics with machine learning and identified genes that could serve as reliable circadian time-telling markers (Wittenbrink *et al.*, 2018). Based on this, we designed a 24-plex NanoString probe panel comprising 20 circadian clock and clock associated genes and 4 housekeeping genes (Supplementary Table S1). The customdesigned probes included a 3'-end biotinylated capture probe and a 5'-fluorescence-barcoded reporter probe for each gene target. Hybridization of probes and gene expression-count reading was according to the manufacturer's instructions. Raw expression data was acquired by a NanoString nCounter Digital Analyzer (NanoString Technologies), QC processed and analysed by
nSolver[™]. QC analysis flagged reads from one (*CIART*) of the 24 genes in the panel as unsuitable
for analysis and was not considered. Data normalization involved three steps: (a) normalization
by the arithmetic mean of the positive spike-in controls, (b) subtraction of the mean of the
negative controls, and (c) normalization by the geometric mean of the four housekeeping genes.

358 Principal Component Analysis and Clustering

Log₂-transformed gene expression data were first subjected to Bartlett's Test of Sphericity to 359 validate its adequacy for Principal Component Analysis (PCA) following which correlation-based 360 PCA was implemented in R (R Core Development Team, 2013) using factoextra and FactoMineR 361 362 packages (Kassambara, 2016). Broken-Stick model (Jolliffe, 2011) was used to determine the number of retainable Principal Components (PCs). Determining the optimal cluster-number is 363 often a complication in unsupervised exploratory data analysis. Unlike many studies in biology 364 that employ PCA to identify genes based on expression differences between known cell-types 365 366 (which can be used to estimate the optimal number of clusters), our study employs a panel of 367 clones with a continuous distribution of phenotypes (period) and thus cannot be categorized trivially. Hence, we adopted two schemes for optimal cluster-number determination. (a) For 368 agglomerative hierarchical clustering, we assessed the agglomeration schedule to identify the 369 possible number of clusters (Yim and Ramdeen, 2015). (b) In addition, we also performed k-370 means clustering for different values of cluster (k = 1-10) and used 5 different indexes -371 372 'silhouette method' (Rousseeuw, 1987), 'elbow method' (Thorndike, 1953), 'gap-statistic' 373 (Tibshirani et al., 2001), 'Calinski-Harabasz criterion value (variance-ratio method)' (Caliñski and Harabasz, 1974) and Bayesian Information Criterion (BIC; Fraley and Raftery, 2002) to assess the 374

optimal cluster-number. We selected the optimal cluster number based on agreement between (a) and (b). Heatmapper (Babicki *et al.*, 2016) and 'dendextend' (Galili, 2015) were used for hierarchical clustering analysis based on 'euclidean-distance' and 'complete-linkage' measures (D, 2005). 'Nbclust' (Charrad *et al.*, 2014) and 'mclust' (Scrucca *et al.*, 2016) were used for kmeans based clustering analysis while for all other statistical analysis and graphing was performed using R and Prism version 8.00 for Windows (GraphPad Software, La Jolla California USA, www.graphpad.com).

382 RNAi mediated gene knockdown

The GIPZ microRNA-adapted shRNA constructs used for the study were purchased from Open Biosystems and packaged into lentiviral vectors in HEK293T cells in a 96-well plate format (Maier *et al.*, 2009). Virus-containing supernatants were then filtered and reporter cells (clonal cell populations used in the study) were transduced with 150 μ L of the filtrate containing 8 ng/ μ L protamine sulfate. After at least 24h, the filtrate was replaced with fresh medium containing puromycin (10 μ g/mL). After 3 days, the transduced reporter cells were synchronized and bioluminescence rhythms were recorded as described above.

390 SAHA treatment and dose response analysis

391 10³cells were plated in a 96-well plate on day-0. After 24h, the culture media was replaced with 392 media containing 1.6 µM Suberanilo Hydroxamic Acid (SAHA) or DMSO vehicle control. The drug 393 was replaced every day for three consecutive days. On day-4, the cells were rinsed thrice with 394 PBS and fresh (no drug) culture media was added. The cells were untreated for next 48h and 395 bioluminescence rhythms were recorded from day-6. The above-described protocol was followed for estimating the IC₅₀ value as well. Cells were treated with varying concentrations (0-100 μ M) of SAHA from day-1, and cell proliferation was assayed on day-6 using the Vybrant[®] MTT Cell Proliferation Assay Kit (Thermo Fischer Scientific, catalog #V13154) as per manufacturer's protocol. IC₅₀ was calculated from the resulting dose response curve using Prism version 8.00 for Windows (GraphPad Software, La Jolla California USA, <u>www.graphpad.com</u>; Supplementary Figure S7).

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410

411 AUTHOR CONTRIBUTIONS

412 Conceptualization: NKL, SK and AK; Experiments and data acquisition: NKL and SK. Data curation

413 and formal analysis: NKL and SK; Manuscript preparation: NKL and AK.

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415 **COMPETING INTERESTS**

416 The authors declare no conflict of interest.

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600 **FIGURE LEGENDS**

601 Figure 1: Clonal period-heterogeneity is not stochastically driven but largely inherited

(a) Divergence of the period-distributions of short (red) and long (blue) period clones from a 602 603 common founding culture (green) across multiple assay generations. Dashed black lines depict the mean of respective period distributions. The grey dashed line extended from assay 604 generation-1 depicts mean period of the founding culture (assay generation 0) for visual 605 assessment of the period divergence. Red (short period clone) and blue (long period clone) 606 arrows indicate the means periods of representative clones selected for the successive 607 608 generation (b) Divergence of the mean period among three representative clonal lines each for long-period clonal line (LCL) 1-3 and short-period clonal line (SCL) 1-3. Error bars are SD (n = 3-5 609 experiments). x indicates that the period of all three SCLs differs significantly from all three LCLs 610 for the given assay generation. Asterisks (*) on top represent LCLs and those at the bottom 611 612 represent SCLs. Asterisks of different colours indicate that the period of the three clones in that generation is significantly different (p < 0.001; n = 3-5) from the periods in other generations, 613 614 while those with the same colour do not differ significantly. For example, the periods of SCLs 1-3 in assay generation-2 differ significantly from their periods in assay generation-1 and from the 615 founding culture in assay generation-0, but not from assay generations 3 and 4. (c) Regression of 616 617 progeny cultures' periods on mean periods of their parental cultures' periods as a proxy-estimate of heritability. Each data point is an average of 3-5 experiments. Blue solid line is the linear 618 regression fit with its 95% CI (blue dotted line). 619

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Figure 2: Inheritance of clock-gene expression patterns might govern clonal periodheterogeneity

(a) Linear regression of progeny mean bioluminescence intensity on parental values suggests a 623 strong heritability of mean bioluminescence intensity ($R^2 = 0.76$). Each data point is an average 624 of 3-5 experiments. Blue solid line is the linear regression fit with its 95% CI (blue dotted line). (b) 625 Cross-correlation of average expression values between the 19 analysed genes across all 25 626 clones indicates a high degree of inter-gene correlation. The colour and size of the circles 627 628 represent the strength of correlation (Pearson r). (c) Scree plot depicting the percentage of variance explained by the 19 principal components (black bars) and the expected values based 629 630 on the Broken-Stick model (red line). (d) Factor map of individual clones plotted across the principal components (PCs) 1 and 2 reveals that the first two PCs clusters the clones in three 631 clusters of short (red), intermediate (green) and long (blue) period clones. (e) Correlation circle 632 depicting the loading of 19 genes across PCs 1 and 2. (f) Cos² values (squared loadings as a 633 measure of the quality of representation of a gene on a PC) of the 19 genes for PCs 1-5. The 634 colour and size of circles represent the magnitude of Cos² value. (g) Hierarchical clustering based 635 on the expression of 5 genes selected from PC2. With the exception of one clone, all others 636 clustered into 3 groups of short, intermediate and long clones (red, green and blue dashed 637 rectangles respectively). (h) Hierarchical clustering based on the expression of 5 genes from PC1 638 639 resulted in 2 clusters – i) intermediate period (green dashed rectangle) and ii) short and long period (blue dashed rectangle). The colour coding of clones in (g) and (h) is the same as in (d). 640

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Figure 3: Epigenetically regulated expression of E-Box associated factors may govern clonal period-heterogeneity

- 644 Period change (compared to non-silenced control) upon knockdown of the (a) five PC2 genes and
- (b) three PC1 genes for the short (red), intermediate (green) and long (blue) period clones. Bars
- 646 with different symbols indicate significant differences (p < 0.05) while bars with same symbols
- are not significantly different from each other (Mixed model ANOVA followed by Tukey's HSD).
- 648 (c) Averaged absolute period change across all clones upon knockdown of genes from PC2 (black)
- and PC1 (grey). (d) Period change (compared to vehicle control) upon treatment of short (red),
- 650 intermediate (green) and long (blue) period clones with HDAC (Histone Deacetylase) inhibitor
- SAHA (1.6 μ M). For all panels in this figure, n = 3-4 experiments and error bars are SD. *: *p* < 0.05;
- 652 ****: *p* < 0.0001.
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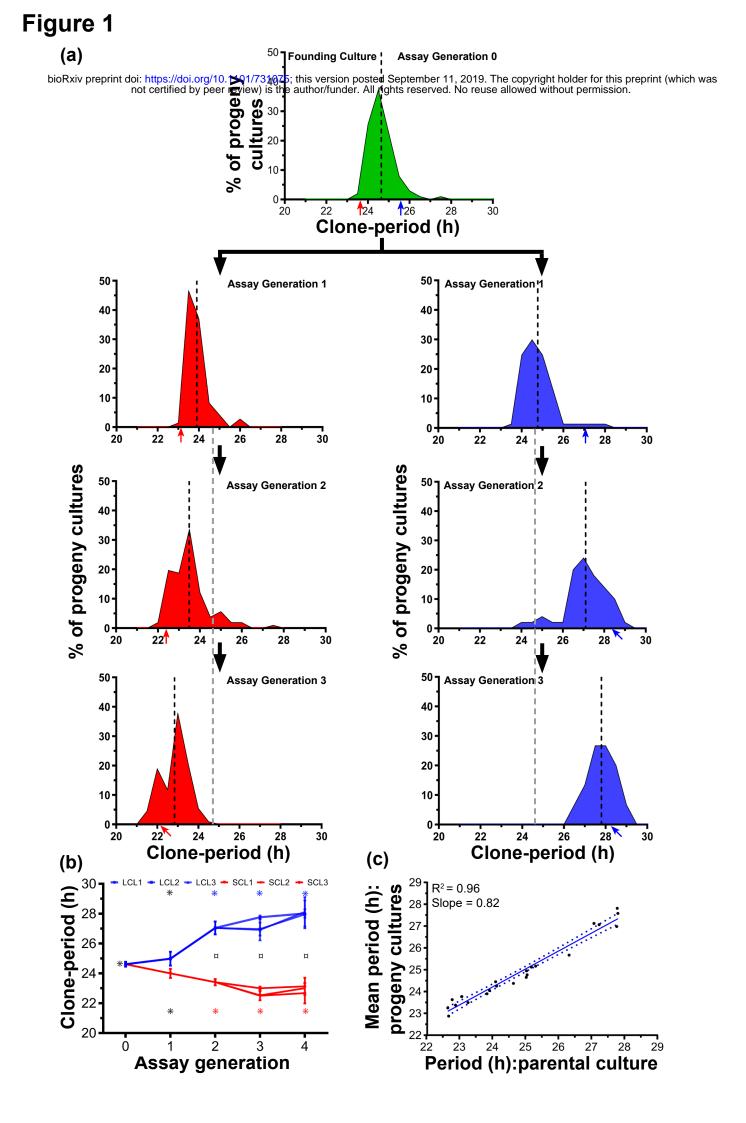


Figure 2

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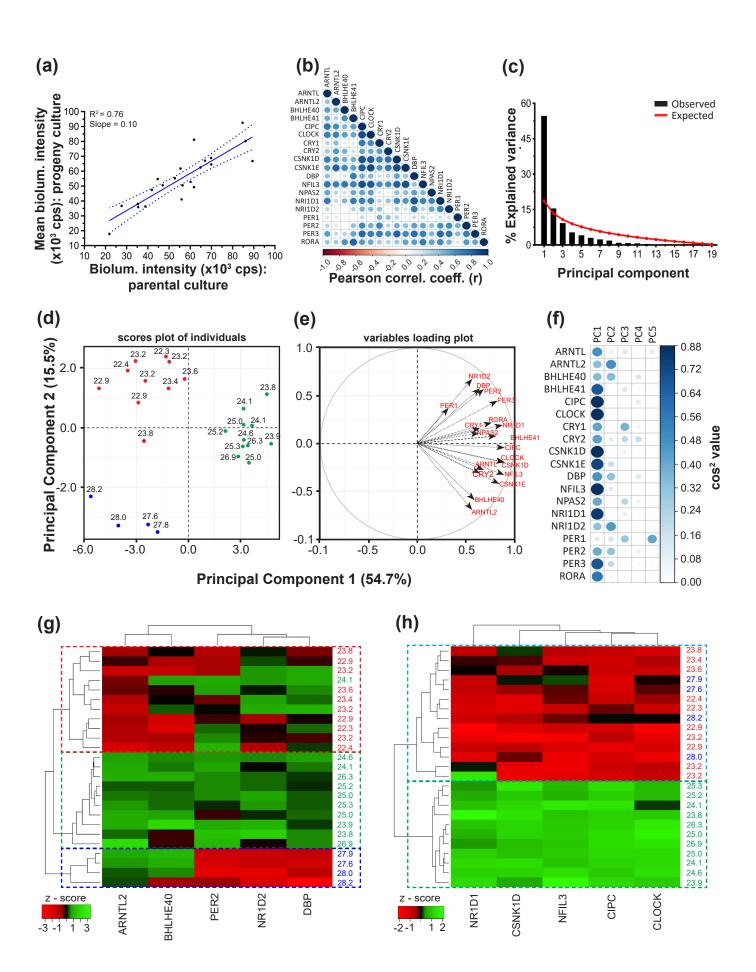


Figure 3

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