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2	Multi-step genomics on single cells and live cultures
3	in sub-nanoliter capsules
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11	Abstract
12	Single-cell genomics encompasses a set of methods whereby hundreds to millions of cells are
13	individually subjected to multiplexed assays including sequencing DNA, chromatin accessibility
14	or modification, RNA, or combinations thereof <sup>1,2</sup> . These methods enable unbiased, systematic
15	discovery of cellular phenotypes and their dynamics <sup>1-3</sup> . Many functional genomic methods,
16 17	however, require multiple steps that cannot be easily scaled to high throughput, including assays
17 18	on hving cens. Here we develop capsules with ampliphing ger envelopes (CAGES), which selectively retain cells mRNA and gDNA while allowing free diffusion of media enzymes and
19	reagents. CAGEs enable carrying out high-throughput assays that require multiple steps.
20	including combining genomics with live-cell assays. We establish methods for barcoding CAGE
21	DNA and RNA libraries, and apply them to measure persistence of gene expression programs
22	by capturing the transcriptomes of tens of thousands of expanding clones in CAGEs. The
23	compatibility of CAGEs with diverse enzymatic reactions will facilitate the expansion of the

- current repertoire of single-cell, high-throughput measurements and extend them to live-cell 24 25 assays.
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#### Introduction 27

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Single cell genomic methods are currently implemented via three technological modalities: in wells 29 (e.g. SMART-Seq3)<sup>4</sup>, in micro-compartments (droplets or nano-wells)<sup>5-7</sup>, or by in-cell barcoding 30 (ICB) of cross-linked cells (sciRNA-Seq and SPLiT-Seq)<sup>8,9</sup>. These methods each offer different trade-31 32 offs between sensitivity and number of cells that can be analyzed, and they suffer different limitations 33 on complexity of assays that they enable. Well-based methods are typically the most sensitive,

34 possibly because each cell is processed in multiple steps in a manner resembling bulk methods. These 35 methods also enable carrying out functional or live-imaging assays on living cells prior to genomic 36 analysis. However, well-based methods scale poorly. Micro-compartment-based methods achieve increased throughput by physically isolating individual cells together with individual DNA-barcoded 37 beads, enabling cell-specific barcoding of material from thousands of cells together within one sample. 38 39 However, these methods are limited to a single reaction step once cells are compartmentalized. ICB 40 methods scale to exponentially large numbers of cells, but require cell cross-linking, which leads to material loss and reduced measurement sensitivity <sup>8,9</sup>. Neither droplets nor ICB methods allow 41 42 parallelizing functional live-cell assays.

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44 A technology that may unify advantages of these three modalities are semi-permeable capsules <sup>10,11</sup>. Capsules are sub-nanoliter spherical liquid compartments surrounded by a resilient shell. The chemical 45 46 composition of the shell can be chosen to be selectively permeable to small molecules including tissue 47 culture media, small proteins such as DNA polymerases and ligases, and oligonucleotides, while 48 selectively retaining larger macromolecules like DNA or mRNA (Fig. 1A). Like tissue-culture wells, 49 they have potential to allow culturing cells in isolation prior to analysis, with free exchange of media 50 and nutrients. They also allow carrying out optimized molecular biology reactions on 51 compartmentalized cells or analytes by enabling the repeated exchange of buffers and reagents. Like 52 droplets, capsules can be produced at scale and their resilient shell allows sorting to enrich for cells or colonies with desired features <sup>11</sup>. These properties expand the range of genomic assays that are feasible 53 54 for single cells and live cell cultures and present a versatile technological platform that may allow 55 parallelizing assays that until now have been difficult and costly to carry out at high throughput (Fig. 1B). Here we report the development of capsules with appropriate permeability and stability for 56 57 genomic assays, implement a split-pool barcoding-based approach to generate single-capsule genomic and transcriptomic libraries, and apply these developments to perform a massively-parallel live-cell 58 59 assay characterizing the diversity and persistence of transcriptome-wide expression fluctuations in clones. The utility of capsules for multi-step genomics is also shown in two other pre-prints (Baronas 60 61 et al. and Mullaney et al.), exploring different applications.

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63 Developing capsules with amphiphilic gel envelopes (CAGEs)

Capsules are generated by forming concentric layers of core and shell components<sup>12</sup>, with one 65 66 approach using liquid-liquid phase-separation (LLPS) between two polymers inside microfluidic 67 droplets<sup>11</sup>. The outer polymer can then be cross-linked to form a stable shell. For biological applications, several studies have reported production of capsules consisting of a poly-ethylene glycol 68 69 diacrylate (PEGDA) shell <sup>11,13–15</sup>, however PEGDA fails to form stable shells under changes in buffer pH, salinity, and concentration, thereby limiting the ability to control capsule permeability <sup>13,14</sup> 70 71 (recapitulated in Fig. S1A). Amphiphilic molecules should more reliably wet the water-oil interface of a droplet than PEG, so we speculated that such molecules would be more suitable for producing 72 stable concentric shells through spontaneous LLPS. We tested the addition of Pluronic F127, a 73 74 biocompatible and FDA approved amphiphilic block-copolymer, and found that it significantly 75 improves the production of PEGDA capsules in different conditions (Fig. S1B, C). By functionalizing Pluronic F127 with diacrylate (F127DA), it can serve as a shell building block on its own (Fig. 1C). 76 77 The production of pluronic diacrylate (PDA) capsules occurs through LLPS between PDA and dextran inside microfluidic droplets. Once formed, the PDA is cross-linked into a physical gel by use of a 78 79 photoinitiator and brief exposure to 405nm light (Fig. 1C). The resulting PDA capsules are optically 80 clear, can be reliably formed at scale (Fig. 1D) and are tunable by varying polymer concentrations (Fig. S1D). Additionally, the strategy is generalizable: capsule production is possible with other 81 amphiphilic copolymers of different lengths, including other Pluronics (P123DA, F68DA and 82 83 F108DA) (Fig. 1E), enabling the formation of capsules with varying shell properties. We refer to these 84 capsules as CAGEs: capsules with amphiphilic gel envelopes.

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86 We next optimized the selective permeability of CAGEs. We focused on using F127DA as Pluronic F127 undergoes micellization (radius 10-20 nm<sup>16</sup>), and F127DA hydrogels have been shown to form 87 88 a packed micellar array <sup>17</sup>. Genomic assays utilize small enzymes and oligonucleotide primers of up to  $\sim 100$  nt in length which are estimated to have a gyration radius < 10 nm<sup>-18</sup>, while the dsDNA 89 90 generated during library preparation are larger (300bp or longer, persistence length >50 nm for dsDNA <sup>19</sup>). Indeed, Cryo-SEM imaging shows that the F127DA shell has a foam-like structure, with evidence 91 92 of surface pores of typical diameter of ~10-50 nm (Fig. 1F). F127DA shells could therefore have 93 potential to achieve a sharp size cutoff. We generated CAGEs with a shell composed of F127DA and 94 other copolymers, and measured mean lifetime  $(T_{\text{Diff}})$  associated with the diffusion of fluorescently-95 labeled proteins, DNA and RNA through the CAGEs shell (Fig. 1G, S1E-G). We identified a starting

96 polymer composition for capsule formation (8% w/v:1% w/v F127DA:PPPDA shell, 13% w/v dextran 97 core) for which dsDNA of length >300 bp showed no diffusion through the CAGE shell (diffusion 98 lifetime  $T_{\text{Diff}} > 14$  days) in any buffer tested, while immunoglobulins and 100 nt ssDNA were able to diffuse into the CAGEs ( $T_{\text{Diff}} \sim 5 \text{ min}$ ) (Fig. 1H,I, Table S1). For those molecules which exhibited 99 100 diffusion, we further observed slower diffusion with decreasing salt concentration (Fig. 11), and with 101 increasing temperature (Fig. S1I). This makes PDA CAGEs particularly suitable for high temperature 102 reactions, such as PCR (Fig. S1E), where retention of molecules at high temperature is desirable. The 103 observed reduction in diffusion with increased salt concentration also suggested a strategy for modifying buffers for washing, storing or loading CAGEs. Further, F127DA offers a stable base for 104 105 capsule formation, meaning that diffusion rates can be easily tuned by altering polymer composition, 106 including core dextran concentration and introduction of short cross-linkers into the shell (Fig. S1H).

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Overall, the resilient shell of CAGEs allows them to be manipulated through multiple steps of analysis.
CAGEs can be handled with common lab equipment, can be analyzed by flow cytometry, and can be
sorted through a commercial FACS instrument to selectively fractionate them based on fluorescence
(Fig. 1J). Taken together, these results demonstrated that CAGEs offer a physically robust platform,
which possess a tunable permeability threshold enabling diffusion of primer-scale ssDNA and proteins
while retaining large macromolecules, making them suitable for multi-step molecular biology
reactions and thus high-throughput genomics.

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#### 116 Barcoding DNA in capsules

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We reasoned that CAGEs can enable massively-parallel analyses by first compartmentalizing live cells or macromolecules and subsequently performing sequential enzymatic reactions interposed with wash steps between each step to introduce new reaction conditions. This approach would require labeling the analytes in each compartment through DNA barcoding that later identifies their capsule-of-origin by sequencing.

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Using CAGEs, we developed a flexible split-and-pool barcoding <sup>8,9</sup> approach that allows indexing of double-stranded DNA molecules—the final form of all major analytical libraries analyzed by sequencing (**Fig. 2A**). The approach first amplifies the DNA derived from different assay reactions, 127 such as RT or Tagmentation, to overcome inefficiencies in subsequent barcoding. This amplification 128 is carried out by PCR with one of the two primers contain a deoxyuridine (dU) residue proximal to its 129 3' end, which can be efficiently cleaved by dU-excising enzyme to remove a PCR handle and generate a 4-nt 3' overhang and a 5' phosphate used subsequent barcoding (Fig. 2B, S2A). This process can be 130 131 iteratively repeated after each barcode addition to remove linker DNA sequences and to generate a 5'-132 P ligation site for the next round. In this work, CAGEs are subject to two rounds of split-pool ligation 133 and one round of PCR DNA barcoding (schematic in Fig. 2A) after which the prepared libraries are readily released by dissolving CAGEs (Fig. S2B,C). Additional barcodes can be added during initial 134 135 library construction (via PCR, RT, or Tagmentation) as well as indexing after release from CAGEs, 136 scaling the number of barcodes. The number of capsules that can be profiled scales exponentially with 137 the number of reaction steps (Fig. S2D, E). We refer to this method for indexing DNA libraries in 138 capsules as inC-seq.

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140 We tested five-step inC-seq barcoding on CAGEs. We encapsulated plasmid DNA encoding GFP or RFP proteins, and then barcoded the capsules with  $14 \times 48 \times 48 \times 48 \times 16 = 24.7 \times 10^6$  potential barcodes. 141 142 Applying this protocol to 350 µL of packed CAGEs, we obtained 355,418 capsule barcodes (1µL 143 corresponding to ~1000 capsules) with each of the possible barcodes elements uniformly represented 144 across all five round of barcode addition, yielding an an effective barcoding space (perplexity, or 145 Shannon diversity index) of 21.8 million barcodes (Fig. 2C). We next tested inC-seq in combination 146 with digital PCR on single-cell derived material by isolating individual cells carrying transgenes 147 encoding red or green fluorescent proteins (RFP or GFP) into CAGEs and then amplified these loci 148 from genomic DNA (gDNA) (Fig. 2D). The DNA libraries produced from cells demonstrated that the 149 cells and genomic material within each CAGE were effectively compartmentalized through the entire 150 multi-step barcoding protocol, with 99±5% (median±SD) of reads from each capsule mapping 151 uniquely only to single GFP or RFP sequences (Fig. 2D).

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#### 153 Single-cell genomic assays in CAGEs

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DNA barcoding in capsules enables diverse analytical approaches to study DNA and RNA. We implemented single capsule transcriptomics (inC-RNA-seq) and a single capsule assay for transposase-accessible chromatin<sup>20</sup> (inC-ATAC-seq) (**Fig. 3A,B; S2E**). We used a mixture of human

and mouse cells to again confirm the effective isolation of cellular material in each CAGE and a low

159 rate of cell doublets (Fig. 3C,D). For the inCAGE-ATAC-seq, we observed periodic peaks in the

160 fragment size distribution (**Fig. 3D**, **inset**) and a strong enrichment of fragments at transcription start

- 161 sites (**Fig. S3A**, 17-fold enrichment) with low mitochondrial reads (<3%), as expected for ATAC-seq
- 162 data.
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164 We then focused on optimizing methods for high quality single cell inC-RNA-seq. The flexibility of CAGEs allowed us to optimize sequential steps of lysis, reverse transcription and pre-amplification in 165 cell lines (HEK293T and NIH3t3), to define a protocol that captures as many transcripts and genes in 166 167 cell lines as a commercial droplet-microfluidic system (10X Genomics, GEMCode v3.1) (Fig. 3F, **S3B,C**). We observed high reproducibility between independently prepared and barcoded capsules 168 169 (Fig. S3D, log-correlation R > 0.99) and between CAGEs and GEMCode (Fig. S3E, log-correlation 170 R=0.95). Importantly, multi-step processing of CAGEs raises a question of whether smaller mRNA 171 transcripts might be under-represented, but we find no apparent bias in the length of detected mRNA 172 transcripts in capsules, in line with our diffusion assessment data (Fig. S3F). Further, we observed 173 similarly high UMI-counts and reproducibility across replicates, as well as similarly low length-bias 174 when performing inC-RNA-seq with: (i) PFA-fixed cells for which cross-linking was reverted in 175 CAGEs prior to reverse transcription (Fig. 3G, S3G), (ii) material cryopreserved after cell lysis in 176 CAGEs (Fig. 3H, S3H); and (iii) cells encapsulated while still in media—an inhibitor of RT—rather 177 than after washing in PBS (Fig. 3I, S3I). These results indicate the versatility of CAGEs for complex assay design, and suggest their utility for profiling difficult-to-process samples, such as microbes <sup>10,11</sup>, 178 cells from marine organisms<sup>21</sup> or clinical PFA fixed samples. 179

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181 To complete benchmarking inC-scRNA-seq, we profiled human peripheral blood mononuclear cells 182 (PBMCs), which have been frequently analyzed by other methods. inC-RNA-seq of 43,665 PBMCs 183 revealed the full landscape of PBMC states as seen by a UMAP representation (Fig. 3J-L), including 184 rare circulating CD34+ progenitors, plasmoblasts and a clear partitioning of subsets of T cells and 185 natural killer (NK) cells. Significantly, the method captured at least as many transcripts and genes as the commercial 10X Genomics GEMCode v3.1 and SMART-seq3 approach<sup>4</sup> (Fig. 3M,N) and 186 considerably more transcripts than reported with split-and-pool ICB methods <sup>9,22</sup>. Overall, inC-seq 187 approaches provide a versatile platform for high-throughput genome-wide measurements with the 188

performance matching or exceeding the established methods, and with the added flexibility ofconducting multi-step reactions.

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#### 192 Massively-parallel live-cell assays in CAGEs

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Capsules have the potential to enable highly parallel functional assays in which cells are allowed to 194 195 grow and/or interact prior to molecular profiling. To enable cell culturing in CAGEs, we modified our protocol to buffer against reactive oxygen species (ROS) formed during shell photopolymerization <sup>23</sup>, 196 which otherwise led to large-scale death of encapsulated cells (Fig. S4A, B). With this modification, 197 198 cells captured in CAGEs are viable and clonally expand as demonstrated with several cell lines (L1210, K562, Jurkat, HEK293t, L929) (Fig. 4A). CAGEs also support viable growth cells derived 199 from primary mouse bone marrow-derived hematopoietic stem cells and human induced pluripotent 200 201 stem cells (hiPSC), with latter forming cyst-like structures (Fig. 4A) and maintaining expression of SOX2, a marker of pluripotency (Fig. S4D). Importantly, CAGEs enable high-throughput expansion 202 203 of isolated colonies at scale (Fig. 4B, S4C), which can then be analyzed with the established inC-204 RNA-seq.

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206 We utilized this ability to grow cells in capsules in order to measure persistent clonal heterogeneity in 207 gene expression. In several cancer types, cells occupy persistent epigenetic states, which are thought to underlie non-genetic heterogeneity in drug resistance <sup>24,25</sup>. Drugs targeting the inheritance of 208 epigenetic modifications (DNA methyltransferase (DNMT) inhibitors <sup>26</sup>; and histone deacetylase 209 (HDAC) inhibitors <sup>27</sup>) have been proposed as tools to activate tumor suppressor genes that are silenced, 210 and they are used in combination with more traditional chemotherapies  $^{28-30}$ . Whether these drugs 211 212 broadly reduce epigenetic persistence in gene expression, however, has not been explicitly tested. To 213 measure the duration of epigenetic persistence, other studies have used RNA-Seq to identify clonally-214 variable gene expression patterns – an approach so far carried out by culturing isolated cells in wells, with analysis restricted to a few dozen clones <sup>31,32</sup>. Using CAGEs, one can parallelize this live-cell 215 216 assay to carry out tens of thousands of parallel clonal growth experiments in parallel. We did so with 217 cell clones derived from a mixture of human erythroleukemia (K562) and mouse lymphoblastoma 218 (L1210) cells, and evaluated changes in clonal heterogeneity in the presence or absence of the DNMT

inhibitors [decitabine (Dec) and 5-aza-cytidine (Aza)], and the HDAC inhibitor vorinostat (Vor) (Figs.
4.5).

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222 As shown schematically in Fig. 4C, cells were pre-incubated with Dec, Aza, Vor or vehicle alone at 223 sub-lethal doses for two days (IC30 dosage, see Fig. S5A for cell survival curves), then encapsulated 224 and grown in CAGEs over a period of 6 days with continued drug treatment (Fig. 4C). At progressive 225 time points, the clones were sampled, lysed in CAGEs and then frozen prior to inC-RNA-seq. In total, 226 we analyzed transcriptomes from 134,805 CAGEs representing single cells sampled at day 0 227 (n=37,902) and expanded clones grown 2,4, or 6 days (n=96,903) in different treatment conditions. An equivalent analysis of this number of isolated colonies in wells would require 1,010 96-well plates. 228 229 In both K562 and L1210 clones, we identified genes with above-Poisson coefficients of variation in gene expression (CV, or standard deviation/mean; shown for untreated cells at days 4 and 6 in Figs. 230 231 **S5B,C**). The most variable genes between clones defined modules of gene expression that persisted over time, as seen from clustering gene-gene correlations and comparing the results to those from 232 233 mock clones generated by randomly combining single cell transcriptomes (Figs. 4D, S5D). Persistent 234 clonal heterogeneity can also be appreciated by UMAP embedding of the clones (Figs. S5E).

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236 To identify persistent gene expression programs varying between clones, we factorized their 237 expression by non-negative matrix factorization (NMF). Approximately 12-15 programs explained 238 variation in gene expression above random for both cell lines (eigenvalue crossover method<sup>5</sup>, Fig. S5F). Several of these were readily identifiable from their gene loadings, including cell cycle-239 240 associated programs (K562 programs 12,13 and L1210 program 14; Figs. 4E, S5G, Table S2), 241 erythroid differentiation (K562 program 3), putative epithelial (*KRT8/18*-enriched) and mesenchymal 242 (VIM-enriched) programs (K562 programs 4, 14) as well as myeloid programs expressing the transcription factors Irf8 and Myc, interleukin receptor Il7r (L1210 program 0); and myeloid 243 244 transcription factor Klf6, M-CSF (Csf1) and osteopontin (Spp1) (L1210 program 7). Significantly, 245 these programs remained variable after clonal expansion beyond that expected from mock clones 246 (Figs. 4F, S5H). Several programs also showed mutual exclusive patterns of expression: for example, 247 K562 day 6 colonies were either enriched in program 14 (VIM-hi) or program 3 (erythroid, 248 HBE1/HBA2/ALAS2-hi) but not both (p<10<sup>-50</sup>, Fisher exact test, adjusted to correct for false 249 discovery), while mock colonies showed mixing of the two programs (Figs. 4G, S5I,J).

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251 Next, we explored how Aza, Dec or Vor treatments alter gene expression dynamics. Drug treatment 252 may alter epigenetic inheritance to either bias the fraction of cells that express a program, or the rate 253 at which a program switches states (Fig. 5A). To quantify these two effects, we introduced a statistical 254 inference framework that fits the observed distribution of NMF program usages across clones over 255 time to a stochastic model of state switching, parameterized by the persistence times of cells in a 'low' 256 state  $(1/r_{01})$  and 'high' state  $(1/r_{10})$  for each program (Fig. 5B,C and Supplementary Text 1). From 257 these fits we obtained changes in program persistence times [the relaxation time-scale to steady-state, 258  $1/(r_{01}+r_{10})$ ] (Figs. 5D, S6A-C), and steady-state bias [the fraction of time that a program is active,  $r_{01}/(r_{01}+r_{10})$ ] (Fig. 5E, S6D). These analyses revealed that all three drugs triggered stereotyped 259 260 changes in program persistence and bias in K562 cells, with the dynamics of some programs slowing down (higher persistence) and others accelerating. In K562 cells, all three drugs triggered 261 262 differentiation towards the erythroid state (program 3 high state), with increased persistence in the 263 differentiated state (Figs. 5C-E). The changes in persistence times were correlated but distinct from 264 changes in mean expression of individual genes (Fig. 5F). In L1210 cells, the DNMT inhibitors (Aza, 265 Dec) showed distinct responses from the HDAC inhibitor (Fig. S6D), but again the drugs led to both 266 increases and decreases in state persistence times. The result is that the DNMT and HDAC inhibitors 267 do not reduce clonal heterogeneity over several cell divisions. These observations are consistent with changes in gene expression heritability seen after genetic ablation of DNA methyltransferases<sup>32</sup>, which 268 269 previously was done by analyzing individual clones in wells. The specific nature of the effects of these drugs, with a failure to globally reduce persistence, may explain why they sensitize 270 chemotherapy in some patients but not others<sup>33</sup>. More generally, the approaches taken here for live-271 272 cell genomic analysis following perturbations and growth may be generalizable to other colony assays, 273 including on gastruloids and tissue-derived organoids.

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#### 275 Discussion

In summary, we have established a versatile platform for high-throughput single cell- and single colony- genomic analysis through the development and use of capsules with amphiphilic gel envelopes—CAGEs. The small compartments are biocompatible, quick to produce and have a tunable chemistry. Alternative compositions can be evaluated through biophysical assays to define new permeability, mechanical, adhesive or other functional properties. The approaches reported here for

barcoding DNA libraries in capsules (inC-Seq) and to study living cells can be adapted to a range of
problems and may be further combined with sorting, fixing and staining steps, each demonstrated here.

284 As genomic assays become more complex, they face increasing limitations when carried out in droplet 285 emulsions and in fixed cells. CAGEs offer solutions to these limitations, enabling multi-step 286 processing that offers flexibility in developing genomic assays and, importantly, extends functional 287 genomic methods to live-cell assays. Here, we apply CAGEs to scale up an assay of gene expression persistence, which has so far required analysis of individual colonies grown in microtiter plates. We 288 289 use data from over 100,000 capsules to infer dynamic transition rates of gene expression programs in 290 cells in the presence and absence of treatment with DNMT or HDAC inhibitors. Capsules will likely 291 enable profiling difficult-to-process samples, and they may prove useful in studying perturbation outcomes that depend on cell-cell interactions, such as developmental or immune-cell interactions, 292 293 and for performing colony-forming assays or studies of organoids at scale. Capsules may also allow 294 evaluation of libraries of signaling molecules, or may be used as vehicles for clonal evolution or 295 selection followed by genomic profiling. These in turn may provide functional information that could 296 support developing predictive, data-driven models of cellular dynamics and interactions.

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carried out flow-sorting in capsules. AK carried out SEM imaging with support of the CNS core
facility. IM and AMK conceived and designed experiments and carried out data analysis. AMK
supervised the work. IM and AMK wrote the manuscript. All authors provided feedback on the

395 manuscript.

396 Competing interests. AMK is a co-founder of Somite Therapeutics, Ltd. IM and AMK are
397 inventors on patent application PCT/US2023/029364 filed by Harvard University.

398 Data availability. All sequencing data will be uploaded to GEO prior to publication, with accession399 numbers provided here.

400 Code availability. Python code for Capsule segmentation and pipeline for scRNA-seq read pre-

401 processing will be deposited at GitHub (github.com/AllonKleinLab/CAGEs).



#### 404 Fig. 1. Concept, development, and characterization of pluronic diacrylate capsules.

(A) Schematic of semi-permeable capsules and their relevant properties for high-throughput, single-405 406 cell profiling. (B) Schematic of potential massively-parallel, multi-step analyses in capsules including processing of single or cultured cells through iterative addition and removal of reagents, imaging, 407 sorting, and sequencing. (C) Bright-field micrograph (left) and schematic (right) showing generation 408 409 of CAGEs (compartments with amphiphilic gel envelopes) using a droplet generator co-flowing an amphiphilic functionalized shell polymer and a hydrophilic core polymer that undergo phase-410 separation upon droplet formation, and are subsequently converted to CAGEs by 405nm-dependent 411 412 cross-linking of the shell polymer. Scale bar= $100\mu m$ . (D) Bright-field micrographs of PDA CAGEs 413 in aqueous buffer (PBS). (E) Bright-field micrographs demonstrating that multiple amphiphilic PEG copolymers form capsules. (F) Cryo-SEM images of freeze-fractured F127DA capsules with 414 415 magnification of pores in the pluronic diacrylate shell membrane. Red arrows point to surface pores. (G) Illustrative composite micrographs of confocal and bright-field imaging of capsules from analyte 416 417 diffusion time-series. (H) Intensity time-series quantifying diffusion half-times through the CAGE

418 shell for analytes of different sizes and in the presence of different salt concentrations. (I) Diffusion 419 half-times showing a sharp size-dependent cut-off in CAGE permeability. Plot represents mean data 420 from ≥3 independent experiments with SD as error bars. Full data in **Table S1**. (J) Flow cytometry– 421 based enrichment of CAGEs. Composite fluorescence and bright-field micrographs of a sample 422 initially containing <10% labeled capsules (top-left) and sample after sorting (top-right), yielding 423 ~98% FITC-positive CAGEs (bottom). Scale bar = 100 µm.







427 (A) Schematic for split-and-pool barcoding of DNA libraries in capsules, showing an example of three 428 rounds of barcoding through ligation and PCR. Initial libraries are generated with an uracil residue in the common library end-sequence (red), which is cleaved by a uracil-specific excision reagent to 429 430 generate a sticky end with a 5'-phosphate. The sticky ends are ligated to an array of barcoding dsDNA oligos that contain a well-specific barcode. The process is repeated to introduce a second barcode, and 431 a third barcode is introduced through a PCR primer. (B) Demonstration of efficient sequential 432 enzymatic processing of DNA in CAGEs, realizing step (1) from panel (A). An initial unlabeled library 433 (left panel) is amplified by incubation of capsules in a PCR reaction mix, with a PCR primer containing 434 a uracil and a Cy5 label at its 3' terminus. Following PCR and washing (middle panel), the CAGEs 435 436 show retention of Cy5 fluorescence that now is attached to the DNA in the capsule. Uracil excision and washing cleaves the labeled primer generating an overhang and losing Cv5 fluorescence (right 437 panel). (C) Representation of barcodes in the DNA amplicon sequencing data after a 5-step barcoding 438 439 approach: 14 PCR barcodes (PCRb) were added during amplification, followed by 3-steps of 48 split-440 pool barcode addition and 16 indices following capsule solubilization. (D) Effective library partitioning by capsules with low cross-contamination seen by inC-Seq analysis of single-cell gDNA 441 transgenes loci encoding GFP or RFP sequences. The plot shows the number of reads from mapping 442 443 to GFP or RFP, with each point corresponding to a unique capsule barcode.



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446 (A) Schematic of inC-RNA-seq and inC-ATAC-seq library preparation modalities. Additional barcodes and sequences are added during transcript (RTb and UMI) and accessible gDNA region 447 (Tn5b) capture via RT and Tagmentation steps. Captured and amplified dU bearing molecules are 448 subjected to split-pool barcoding and sequencing. (B) Micrographs showing cells at progressive stages 449 of single cell RNA-seq library preparation in CAGEs, from initial cell encapsulation through lysis, to 450 generation of amplified complementary DNA (cDNA) libraries prior to in CAGE barcoding. gDNA 451 452 is stained with SYBR Safe dye; cDNA stained with Cy5 fluorophores conjugated to the PCR 453 amplification primers. (C-D) Plots showing the number of reads corresponding to each CAGE mapping to human (y-axis) and mouse (x-axis) RNA-seq (left) or ATAC-Seq (right) libraries. For (D), 454

455 inset shows DNA library fragment size distribution. (E) UMI/read plots following downsampling 456 reads from CAGE scRNA-seq libraries (teal) in comparison to publicly available 10x Genomics 457 NextGem v3.1 data (black). (F, G, H) UMI/reads plots as in (E) for libraries generated from fresh or 458 PFA fixed K562 cells (F), fresh or frozen HEK293T cells (G) or capsules made using DPBS or media (H). (I) A two-dimensional UMAP embedding of inC-RNA-Seq data from PBMCs, (J) heatmaps of 459 460 gene expression showing coverage of low and high-abundance cell type-specific genes and (K) high 461 population structure of partitioning subsets of T and NK cells. (L) UMI/reads plots as in (f), now 462 generated for PBMC data and comparing inC-Seq to data from 10X Genomics GEMCode. (M) Comparison of number of genes detected per cell for inC-Seq data (teal), 10X Genomics NextGem 463 464 v3.1 (black) and SMARTseq3xpress data (gray).

465





468 Fig. 4. Live-cell clonal expansion in CAGEs reveals persistent gene expression programs. (A) 469 Micrographs showing growth in CAGEs of clones from cultured cell lines, primary mouse bone 470 marrow hematopoietic stem cells (mHSCs) and human induced pluripotent stem cells (hiPSCs). Scale 471 bars = 50µm.(B) Micrograph of encapsulated colonies concurrently cultured in a well. Scale bar = 472 100µm. The image shows high-density K562 (poly-clonal) colonies expanded in CAGEs. (C) Experimental schema for identifying persistent gene expression programs in cancer cell lines upon 473 474 treatment with vehicle (Ctrl) or DNMT and HDAC inhibitors [5-azacytidine (Aza); decitabine (Dec), 475 vorinostat (Vor)]. Micrographs show example capsules at different timepoints. (D-G) Evidence of

476 persistent gene expression programs in K562 cells; see Fig. S5 for L1210 cells. (D) Clustered inter-477 clonal gene-gene expression correlations in K562 cell control samples at days 4-6 show evidence of 478 structured programs, which are absent when randomly combining cells sampled at day 0 into 'mock' 479 clones. (E), Top genes contributing to gene expression programs identified by non-negative matrix factorization (NMF), identifying erythroid, cell cycle, vimentin- and keratin-associated programs. Full 480 481 program loadings in Table S2. (F) Box plots of variation in 15 NMF-derived programs between 482 control clones, showing persistent heterogeneity over time as compared to mock clones. (G) Some 483 gene expression programs remain mutually exclusive after clonal expansion, as seen from low 484 numbers of clones observed mixed NMF programs as compared to expectation (Observed/Expected = 485  $f_{XY}/f_Xf_Y$ ; p-value from Fisher's exact test).



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Fig. 5. Altered clonal memory upon treatment with DNMT or HDAC inhibitors. (A) A schematic 488 489 of possible effects of drug treatment on epigenetic memory. In untreated controls, cells occupy high 490 and low gene expression states for each observed program. Inhibitors of epigenetic modifying 491 enzymes may bias the relative stability of states (top scenario), and may also reduce persistence 492 (shallower wells, bottom scenario). From inC-RNA-Seq on growing clones one can infer state 493 transition rates (arrows). (B) Schema for statistical inference of transition rates from clonal inC-RNA-494 Seq data by fitting stochastic models of cell state-transitions to observed NMF program usage over 495 time. The model was used to infer rates of program induction  $(r_{01})$  and loss  $(r_{10})$  for each program in 496 each treatment condition (see Supplemental Text 1). (C) Fitted transition rates exemplified for one 497 program (program 3), with all drugs increasing persistence of the 'high' state while destabilizing the 498 'low' state. (D) Changes in K562 gene expression program persistence times from the fitted dynamic 499 transition rates, showing reduced clonal memory for some programs (blue) but not others (red). (E) Corresponding changes in steady-state bias (i.e. the fraction of cells in active state), showing distinct 500 501 changes from program persistence. (F) Changes in persistence are distinct from changes in mean 502 expression for single genes, shown for one drug (Aza) in K562 cells.

#### Figure S1.

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506 (A) Micrographs demonstrating common failures of hydrogel capsule synthesis using PEG diacrylate 507 as a shell (PEGDA). Capsules fail to form due to the lack of phase separation and form mixed

508 dextran:PEGDA beads, hindering the ability to vary the composition and thus properties of the 509 capsules.

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(B) Micrographs showing successful capsule formation upon addition of Pluronic F127, stabilizing
PEGDA:Dextran phase separation with an outer PEGDA phase.

- (C) Same as A, but with addition of 3% F127 to stabilize phase separation, resulting in robust capsule
  formation across all concentrations evaluated.
- (D) Micrographs showing F127DA capsules (CAGEs) formed using different concentrations of 500
   kDA Dextran solution, and quantifying shell thickness.

(E) Fluorescent confocal microscopy images showing DNA fragments ≥ 300bp selectively retained
(top) or excluded (bottom) by F127DA CAGEs. DNA fragments of different sizes were amplified for
16 cycles from a plasmid DNA template encapsulated inside the capsules (top) or added to the outside
of empty CAGEs (bottom). Top row samples were washed to remove background signal. Samples
were stained using SYBR Safe DNA dye.

(F) Experimental schematics for measuring transport rates of different analytes through the capsules
shell. Rapidly moving, small analytes (66nt, 100nt, IgG) were loaded into the capsules from the outside
buffer, followed by washing and imaging (left). dsDNA that's too large to quickly enter capsules was
loaded using PCR by amplifying 100, 300, 500, 1000bp DNA with labeled primers of an encapsulated
plasmid DNA, followed by washing and imaging (middle). 300/500/1000nt RNA molecules were
generated in CAGEs by carrying out an IVT reaction, using amplified DNA harboring T7 promoter as
template (right).

(G) Schematic of time-lapse data collection to measure diffusion rates. Images were processed by
 segmenting capsules from each field of view, obtaining average core fluorescence intensities over
 time, fitting with double exponential decay and extracting time-scales as time required to reach 1/e of
 the initial intensity.

**(H)** Diffusion half-times are tunable by generating CAGEs with different dextran concentrations, and with optional addition of 2% PEG4DA crosslinker (CL). Higher values = slower diffusion through the capsule shell. See legend for the three analytes evaluated. Plot represents mean data from  $\geq$ 3 independent experiments with SD as error bars.

- 544 (I) Diffusion half-times in different concentrations of salt and different temperatures. Increased buffer 545 temperature and lower salt concentration both slow diffusion. All scale bars = 50  $\mu$ m. Plot represents 546 mean data from  $\geq$ 3 independent experiments with SD as error bars.
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Fig. S2. Characterization of capsule library processing, scalability and library structure of inC-S51 Seq.

(A) Quantification of dU excision in CAGEs using USER enzyme. DNA, amplified in capsules using
Cy5 labeled dU harboring primer is retained inside the CAGEs as seen from fluorescent imaging (Post
PCR). Addition of USER enzyme efficiently excises dU (and thus Cy5) as quantified by Cy5 signal
loss (USER). Plot represents mean data from 3 independent experiments with SD as error bars.

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**(B)** Micrographs showing CAGEs dissolved in the presence of 1M NaOH

- 559 (C) DNA purified from dissolved CAGEs, analyzed using a BioAnalyzer. Each lane corresponds to capsules with PCR amplicons of a defined size.
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(D) Theoretical barcode space of inC-seq, giving realistic designs from ~110K to ~8B barcodes. A
baseline is to carry out 3 rounds of barcoding, with 48 barcodes per round (number barcodes = 48<sup>3</sup>).
This can be scaled by increasing the plate size format or including additional rounds of barcode
addition with a specific number of barcodes during RT, ATAC or pre-PCR steps (pre-barcoding) and
after dissolving capsules in batches (indexing).

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(E) The library structures for inC-seq, showing protocol specific barcodes incorporated during RT
(barcode and UMI), tagmentation and PCR. Usage of dU, enables barcode addition between Tn5 cut
site and Illumina read primer binding site.



572 Figure S3. Additional technical benchmarking for inC-ATAC-Seq and inC-RNA-Seq.

573 (A) Capsule inC-ATAC-seq data shows high Transcription Start Site (TSS) enrichment.

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(B) UMI/read plots following downsampling reads from scRNA-Seq libraries generated in capsules
(inC-RNA-seq) or using publicly available 10x Genomics NextGem v3.1 data, showing comparable
library complexity in HEK293t samples.

(C) Gene/read detection plots following downsampling reads from scRNA-Seq libraries generated in
 capsules (inC-RNA-seq) or using publicly available 10x Genomics NextGem v3.1 data, showing the
 same detection level in HEK293t and NIH3t3 samples.

(D-E) Gene expression comparisons, showing high technical reproducibility of inC-RNA-seq (D) and
agreement with publicly available 10x Genomics NextGem v3.1 data in HEK293t and NIH3t3 cells
(E).

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587 (F) Capsules do not show bias toward captured transcript length as depicted by gene-expression588 agreement with 10x Genomics NextGem v3.1 at different gene length cutoffs.

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590 (G, H, I) Comparison of mean gene expression of inC-Seq libraries between fresh vs. PFA-fixed cells 591 (G); immediate analysis vs in-capsules cell lysate cryopreservation (H); and following cell

592 encapsulation in tissue culture media vs PBS (I).





(A, B) Optimization of encapsulation conditions for live cell culturing. (A) Cells, encapsulated into
droplets (top left), readily die after CAGE polymerization (top right) due to ROS generation. Addition
of 8 mM DTT and BSA during CAGE generation protects the cells from ROS resulting in high
viability (bottom left) and enables colony formation (bottom right). (B) Quantification of cell

viabilities. Plot represents mean data from 3 independent experiments with SD as error bars.

602 (C) Micrograph of high-density K562 colonies expanded from 1-4 cells in CAGEs cultured in a culturing 12-well plate. Scale bar =  $100\mu m$ .

(D) Micrographs showing clones derived from single human induced pluripotent stem cells (hiPSCs)
 following 4 days in culture and in-capsule fixation and immunostaining for SOX2.

Figure S5



613

614 Figure S5. Analysis of gene expression persistence in clones by inC-Seq.

615 (A) Dose response curves for K562 and L1210 cells for the three drugs used to select dosages for 616 experiments in **Figs. 4-5**, showing growth rate normalized to control. Growth rate  $= \log[(\text{cell number})]$  at day 4)/(cell number at day 0)]/(4 days). Data shows mean values with SEM of n=6 (Dec, Aza) and n=4 (Vor) replicate experiments. IC50 values are indicated, and dashed lines indicate the drug concentrations selected for subsequent analysis (approximately IC30).

- (B,C) Gene coefficients of variation (CV)-mean plots for the two cell lines in control clones, averaged
  across 3 replicate samples and two time points (days 4,6), and overlaid with values from mock clones
  generated by randomly combining single cell transcriptomes from day 0 (see methods). CV values
  were calculated separately within each (sample, timepoint) pair and then averaged across samples,
  weighted by the number of clones per sample. Colorbar gives the corresponding weighted-average
  normalized variance (see methods).
- 628 (D) Gene-gene correlation for L1210 cells, corresponding to Figs. 4D.
- 630 (E) UMAP representation of gene expression heterogeneity between L1210 and K562 colonies.
- (F) Variance explained by top principal components in K562 cells, compared to randomized data with
   the same marginal gene expression distribution per gene. The cross-over occurs at 15 components.
- 635 (G,H) L1210 plots corresponding to Figs. 4E,F.
- 637 **(I,J)** Heatmaps showing multiple gene expression programs are mutually exclusive in (I) K562 and 638 (J) L1210 day 6 clones, as seen from low numbers of clones observed mixed NMF programs as 639 compared to expectation (Observed/Expected =  $f_{XY}/f_X f_Y$ ). Left panels: real data; right panels: plots 640 generated from mock clone data, showing loss of persistent clonal variation.

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# 643 Dec Dec Dec 644 Figure S6. DNMT and HDAC inhibitors alter persistence and bias in gene expression program 645 activation states for cells grown in CAGEs.

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647 (A) NMF Program mean usage dynamics in K562 and L1210 cells after drug treatment relative to controls.

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(B) An example of the fits used to infer state switching rates from the model defined in Fig. 5B and
Supplementary Text 1. Green bars show histograms of observed NMF usage, here for K562 NMF
program 3 (erythroid program). Black curves show the model fits.

(C,D) Changes in inferred L1210 NMF Program persistence time and bias relative to controls.
 Corresponding to Fig. 5D,E.

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# 659 Materials and Methods

# 660 EXPERIMENTAL METHODS

#### 661 <u>CAGE synthesis</u>

662 Capsules with amphiphilic gel envelopes (CAGEs) were prepared using a co-flow droplet microfluidic 663 PDMS device (Darwin Microfluidics, DG-MCN-C4) by flowing shell and core solution at 170µL/h into fluorinated HFE7500 carrier phase supplemented with 2.5% (w/v) 008-FluoroSurfactant (Ran 664 biotechnologies) infused at 580µL/h. Shell polymer solution consisted of 8% (v/w) F127DA (Creative 665 666 PEGWorks, PPO-121-5g), 1% (w/v) PPPDA (Sigma Aldrich, 929611-500MG) in 1x DPBS (Thermo Fisher Scientific, 14190136), unless stated otherwise. The core solution consisted of a 13% (w/v) 667 dextran (mW = 500,000Da) (Sigma Aldrich), 0.1% (v/v) of F68 (Thermo Fisher, 04196546SB) and 668 669 0.2% (w/v) of LAP (lithium phenyl-2,4,6-Trimethylbenzoyl phosphinate) (Sigma Aldrich, 900889-670 1G)] in 1x DPBS, unless stated otherwise. Generated droplets were collected on ice into 1.5mL 671 Eppendorf tube unless stated otherwise. After collection, the tube was incubated on ice for 5 min, 672 followed by incubation at 30°C for 3 mins and removal of bottom HFE7500, unless stated otherwise. 673 Next, the tube was hand shaken 5 times and incubated at 30°C for additional 2 mins. The tube was carefully transferred to a bottomless tube holder and exposed to 405 nm light from below for 35s, 674 675 unless stated otherwise. After polymerization, hydrogel capsules were purified by removing the bottom HFE7500 phase, adding 100µL 20% (v/v) PFO (Sigma Aldrich, 370533-25G) in HFE7500, 676 shaking, and spinning down for 5s. One additional wash with HFE7500 was performed after removal 677 678 of PFO/HFE7500 followed by three 5s spins to remove any remaining HFE7500 droplets. The 679 resulting hydrogel capsule pellet was resuspended in a wash buffer as described below. PEG-shell 680 capsules were generated as CAGEs, but using PEGDA instead. 681

# 682 <u>CAGE washing</u>

Capsules were washed by resuspending 100-300µL of packed capsules in 800-1000µL of wash buffer, 683 vortexing/pipetting and spinning down at 300g - 800g for 30-60s (depending on the application). The 684 685 supernatant is then aspirated leaving  $\sim 20\%$  of volume behind to not disturb the packed capsules. Different capsule wash buffers were used as described below with corresponding composition: TI (10 686 mM Tris, 0.1% Igepal CA-630 (Millipore Sigma, I8896-50ML)); TI10 (10 mM Tris, 10mM NaCl, 687 688 0.1% Igepal CA-630); TI100 (10 mM Tris, 100mM NaCl, 0.1% Igepal CA-630); TIbS (10 mM Tris, 0.1% Igepal CA-630, 0.05% SDS); TEIS (10 mM Tris, 0.1mM EDTA, 0.1% Igepal CA-630, 0.1% 689 690 SDS); HI10 (Nuclease free water, 10mM NaCl, 0.1% Igepal CA-630), 3xSSCI (3x Sodium saline 691 citrate buffer (pH 5.9) (Thermo Scientific), 0.1% Igepal CA-630).

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# 693 <u>Cryo-SEM imaging of CAGEs.</u>

694 CAGEs were stored in TI containing 10mM Tris pH8, 0.1% Igepal prior to imaging. A 10µl sample was loaded onto each of three gold planchets (Leica #16770132; Carrier, Dia. 3.0x0.8mm, Cu-Au, 695 dome) and rapidly frozen using slushy nitrogen (made using Edwards Plate Degasser PD3; Model 696 697 RV3, Serial No. 056188208, Code No. A652-01-903) and transferred to the Leica EM VCM loading station (SN 614252, #16771611104). The positioned frozen planchets were next transferred from the 698 699 Leica EM VCM loading station to the Leica ACE 600 sample preparation chamber (SN 601238, 700 #16771525) with the help of the Leica EM VCT 500 vacuum cryo-transfer system maintained at -150°C using liquid nitrogen. In the chamber, the samples were knife-fractured at -150°C, sublimated 701 702 at -105°C for 9 minutes and 10 seconds, then re-cooled to -150°C. The samples were sputter-coated 703 with a 10nm layer of Platinum/Palladium (80:20) and transferred to the Zeiss Gemini 360 Field

<u>Emission Scanning Electron Microscope</u> (FESEM) (GeminiSEM360 349599-9100-010, SN 8217010169), with the help of the VCT 500 vacuum cryo-transfer system. Imaging was performed at -150°C on a temperature-controlled FESEM stage at 3 keV using the Everhart Thornley detector.

707

# 708 Analyte cross-shell diffusion assays

709 Rates of analyte diffusion through the capsule shell were assessed using time-lapse confocal 710 microscopy (Fig. S1G). Fluorescent analytes, loaded into capsules as described below, generate a 711 bright signal in the capsules core that decreases over-time as molecules diffuse out into the non 712 fluorescent surrounding buffer. Capsules housing different analytes in different buffers were imaged 713 at 20x magnification in 96-well glass bottom plates (MatTek, P96G-1.5-5-F) until the fluorescence 714 signal from the core decreased below 1/e of initial value but no longer than 14 days. Acquired time-715 lapse movies were processed by segmenting capsules from each field of view using a custom PyTorch 716 convolutional neural network (will be available at github.com/AllonKleinLab/) and average core 717 fluorescence intensities were extracted. Average fluorescence time-series were fitted with double 718 exponential decay and time-scales were extracted as time required to reach 1/e of the initial intensity. 719 Values for analyzed buffers and analytes are provided in Table S1.

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# 721 Small analyte assay

Cross-shell diffusion half-lives of 63-100 nt ssDNA and IgG were measured by first incubating empty 722 capsules in a buffer containing the analytes (Fig. S1F left). For this step, empty hydrogel capsules 723 724 were washed 3 times with TI100 (pH 8.0) buffer and ~5µL of packed capsules were transferred to 725 1.5mL tubes. 1µL of fluorescently labeled analyte solution (10µM Cy5-63nt; 10µM FAM-100nt 726 [Table S3, diffusion], 5 mg/mL FITC Anti-mouse CD45 IgG (BioLegend, 110705) was added on to 5µL of packed capsules and left on ice for 2 hours. After incubation, capsules loaded with analytes 727 728 were washed with TI (pH 8.0) buffer twice followed by a single wash with a buffer containing different 729 salt concentrations (TI, TI10, TI100). Capsules were packed, transferred to a 96 well glass bottom 730 plate and resuspended to a final volume of 40µL in a buffer of interest.

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#### 732 *dsDNA diffusion assay*

733 dsDNA that is too large to quickly load into capsules by diffusion was generated within-capsules using a PCR reaction (Fig. S1F middle). First, capsules were generated following the normal procedure, 734 735 with a plasmid DNA added into the dextran core mix at a final concentration of 10pg/mL prior to encapsulation. Capsules were polymerized and washed three times with TI100 (pH 8.0), twice with 736 TI10 (pH 8.0) and twice with TI (pH 8.0). 12.5µL of packed capsules were used in a 25µL PCR 737 738 reaction consisting of 2.5µL of 10µM universal Cy3 labeled primer, 2.5µL of 10 µM of Xbp RV 739 primer [Table S3, diffusion], 1µL of 10mM of dNTPs (NEB, N0447L), 5µL of 5x Phusion HF reaction 740 buffer (NEB, E0553L), 1µL of 10% Igepcal CA-630 and 0.5µL of Phusion polymerase (NEB, 741 E0553L). Here, X=100, 300, 500 and 1000 corresponds to primers generating different size amplicons 742 (see Table S3, diffusion). DNA was amplified for 15 cycles using the different primers, to generate 743 dsDNA amplicons of length 100/300/500/1000bp. The reaction was carried out by first incubating the tubes on ice for 5 mins, followed by a PCR cycling program: 98°C for 30s; 15 cycles of 98°C for 10s, 744 745 65°C for 20s, 72°C for 10s (for 100bp and 300bp products) or 30s (for 300bp and 1000bp products); and a final extension of 72°C for 5 min and hold at 25°C. After PCR, capsules were washed twice with 746 747 TI100 (pH 8.0), twice with TIbS (pH 8.0), twice with TI10 (pH 8.0), twice with TI (pH 8.0) and once 748 with buffer of interest. Capsules were packed, transferred to a 96 well glass bottom plate and 749 resuspended to a final volume of 40µL in a buffer of interest.

750

#### 751 ssRNA diffusion assay

752 300/500/1000nt RNA molecules were generated in capsules by carrying out an IVT reaction (Fig. S1F 753 right). First, dsDNA of appropriate size was amplified in capsules of a plasmid DNA template as 754 described above by carrying the PCR reaction for 8 cycles with a primer housing a T7 promoter [Table S3, diffusion]. After PCR, capsules were washed twice with TI100 (pH 8.0), twice with TIbS (pH 8.0), 755 756 twice with TI10 (pH 8.0), twice with TI (pH 8.0). IVT was carried out in 21µL reactions, consisting 757 of 1X T7 reaction buffer (NEB, M0251S), 8mM of ATP, GTP, CTP (NEB, N0466L), 6 mM of UTP 758 (NEB, N0466L), 0.16mM of Cy3-UTP (APExBIO, B8330), 4U of T7 polymerase (NEB, M0251S) 759 and 1.06U RiboLock RNAse Inhibitor (ThermoFisher, EO0381) for 60 min. After IVT, capsules were 760 washed twice with TIbS (pH 8.0), twice with TI100 (pH 8.0), twice with TI (pH 8.0) and once with 761 the buffer of interest. Capsules were packed, transferred to a 96 well glass bottom plate and 762 resuspended to a final volume of 40µL in a buffer of interest. 763

#### 764 CAGE flow cytometry

765 FITC fluorescent capsules used for optimization of fluorescence-activated capsule sorting (FACS) 766 were synthesized as described above, except Fluorescein isothiocyanate-dextran (FITC-dextran) (ThermoFisher) was added in to the core mix at 169 µg/mL. Non-fluorescent capsules were 767 768 synthesized as above. After capsule polymerization and HFE7500 removal, capsules were washed 769 once with 300µL of hexane. The capsules were counted by pipetting 10 µL of a 1:10 dilution of stock 770 capsules into a 96-well plate to determine concentration of capsules prior sorting sample preparation. 771 FITC+ and FITC- capsules were mixed so that the final fraction of FITC+ was 0.05-0.1. Capsules 772 were transferred to a 15 mL conical tube and spun down at 800 g for 1 minute. Supernatant was 773 removed and capsules were resuspended in DPBS + 0.1% Igepal or TI to a final concentration of 500 774 -1,000 capsules/ $\mu$ L in the sample tube via pipetting. Capsules were sorted using a 200  $\mu$ m nozzle on the Beckman Coulter MoFlo Astrios EQ high speed cell sorter. "Enrich" or "Purify" sort modes were 775 776 used in addition to a "1-2 Drop" Drop Envelope. Drop Delay values were manually calibrated using FlowCheck beads (Beckman Coulter, 6605359). The Drop Delay value determined using the 777 778 FlowCheck beads was offset by +/- 0.5 units. To check Drop Delay calibration using capsules, 50 779 capsules were sorted onto a glass slide and quickly assessed for purity and recovery using fluorescence microscopy. Once calibrated, capsules were sorted into 1.5 mL Eppendorf tubes (Eppendorf). After 780 781 sorting, the collection tubes were rinsed with DPBS + 0.1% Igepal or TI buffer to dilute the sheath fluid and dislodge capsules from tube walls. Sorted sample purity and recovery were assessed by 782 sampling the capsules and imaging them on a Nikon Ti1000 wide-field fluorescent microscope. Purity 783 784 and recovery were estimated by counting the fluorescent and non-fluorescent capsules and estimating 785 the number of total capsules using the number of counted capsules and volume of the sorted sample.

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# 787 CAGE dU PCR and USER excision

A 50µL volume PCR reaction utilizing a dU-containing primer (dU PCR) was carried out as follows: 788 789 a reaction mix was assembled consisting of 10µL of 5X Q5U reaction buffer (NEB, M0515L), 2µL of 790 10mM dNTPs (NEB, N0447L), 5µL of 10µM FW primer (protocol specific), 5µL of 10µM dU universal RV primer [Table S3], 25µL of packed capsules, 1µL of Q5U High-Fidelity DNA 791 792 polymerase (NEB, M0515L), and 2µL of 10% Igepal CA-630 (Millipore Sigma, I8896-50ML) unless 793 stated otherwise. To set up the reaction, capsules were transferred to PCR tubes on ice and the rest of 794 PCR reagents were added ensuring proper mixing by pipetting. The reaction was carried out by first 795 incubating the tubes on ice for 5 mins, followed by a PCR cycling program: 98°C for 30s; 6 cycles of

796 98°C for 15s, 68°C for 20s, 72°C for 4 min; a final extension of 72°C for 2min and hold at 25°C, unless 797 stated otherwise. After the cDNA amplification, capsules were washed three times with TI100 (pH 798 8.0), twice with TIbS (pH 8.0), three times with TI100 (pH 8.0) and twice with TI10 (pH 8.0). Capsules 799 were imaged on a widefield microscope. For dU excision, a reaction was performed in TI10 (pH 8.0) buffer with 0.01U/µL of USER<sup>TM</sup> enzyme (NEB, M5505L) in a shaking heat block at 37°C for 20 min. 800 Following the reaction, capsules were washed twice with TI100 (pH 8.0), once with TIbS (pH 8.0) 801 802 and TI10 (pH 8.0). To fully remove the cleaved DNA sequence, capsules were washed in a 1 mL of 803 TI (pH 8.0) buffer with a 5 min incubation at 60°C, twice, with a room temperature TI (pH 8.0) wash 804 in between. Capsules were imaged on a widefield microscope.

#### 805

#### 806 <u>CAGE split-and-pool barcoding</u>

807 Barcoding is carried out through several steps:

#### 808 1. USER digestion and washes

dsDNA barcoding in capsules was carried after a dU PCR reaction as described above. All protocols
described in this paper utilized a 5'CGTGATGCTGTACTTACATGTGACdUG-'3 PCR handle.
Following dU PCR, the capsules were transferred to a 1.5mL tube and dU was excised and washed as
described above. The capsules were then washed twice with TI100 (pH 8.0), once with TIbS (pH 8.0)
and TI10 (pH 8.0). To fully remove the cleaved DNA sequence, capsules were washed as described
above, with one modification: in the final two washes using TI (pH 8.0), the buffer was supplemented
with 200mM MgCl2.

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#### 817 2. Preparation of barcoding plates

818 Work done in this paper used a 48-barcode format. Plates containing Ligation-1 and Ligation-2 819 barcodes were prepared in advance by mixing  $100\mu$ M forward and reverse oligos (**Table S3**, Ligation-820 1, Ligation-2) at 1:1 ratio. Barcodes were annealed by heating the plates at 95°C in a PCR machine for 821 5 min and then letting them plate cool at room temperature for 1 hour, followed by incubation on ice. 822 Annealed barcoding plates were kept frozen at -20°C. A third plate for PCR-3 barcoding was also 823 prepared in advance, with wells each containing 10 $\mu$ mM barcoding primers (**Table S3**, PCR-3). Plates 824 were kept frozen at -20°C.

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# 826 3. Ligation-1 barcode addition

827 Capsule barcode-1 ligation was performed in a 96-well plate. Reaction volumes were scaled based on the volume of capsules being barcoded as follows. For every 2µL of capsules/well, a reaction is carried 828 out in 10 µL volume with: 5 µL of 2x StickTogether<sup>™</sup> DNA Ligase Buffer (NEB, M0318L), 2 µL of 829 830 capsules in TI with 200mM MgCl2, 2 µL of 50µM annealed barcode duplex and 1µL of T7 DNA 831 ligase. (NEB, M0318L). Before setting up the reaction, capsules were pelleted in TI (pH 8.0) with 832 200mM MgCl2 and ~80% of the buffer was aspirated. The amount of buffer to leave behind is 833 determined by rounding the packed capsule volume to a convenient to work volume (for example, 834  $170\mu$ L of packed capsules would be aspirated to  $200\mu$ L using another 1.5mL tube loaded with buffer 835 as visual standard). Packed capsules were left on ice for at least 5 min. A fresh Multiplate<sup>TM</sup> 96-well PCR plate (BioRad, M0318L) was placed on ice and 1/50th of total capsule volume was transferred 836 to each well using a pipette (in the case of 200µL, 4µL would be added to each well). Next, a ligation 837 master mix composed out of 2x StickTogether<sup>™</sup> DNA Ligase Buffer (NEB, M0318L) and T7 DNA 838 ligase (NEB, M0318L) was prepared for 50 reactions in the same tube that housed the aliquoted 839 840 capsules and 1/50th of the volume was added directly to capsules in each well without pipetting. Finally, thawed and vortexed ligation-1 DNA barcodes were added to wells housing capsules and 841

ligation mastermix using a 12-tip multichannel pipette (volume defined above), followed by pipetting
with the same tip to mix the reagents within each well. The barcoding plate was spun down, covered
with a silicone mat (Millipore Sigma, Z374938-10EA) and incubated on a heat block at 25°C for 30
min.

After incubation, the reaction was stopped and capsules were pooled by adding 100µL of TIbS (pH
8.0) into each well and then transferring the volume from all wells into a 15mL falcon tube. Each well
was washed twice and the plate was inspected under the inverted microscope to make sure no capsules
are left behind. Capsules were transferred to a 1.5mL tube and were washed four times with TI10 (pH
8.0).

# 853 4. Overhang generation by dU excision

Next, DNA overhangs for Ligation-2 barcode addition were generated by performing a dU excision
reaction for 20 min in TI10 (pH 8.0) at 37°C in the presence of 0.01U/µL of USER (NEB, M5505L).
After the reaction, capsules were washed twice with TI10 (pH 8.0) and twice using TI (pH 8.0) with
200mM MgCl2.

# 859 5. Ligation-2 barcode addition

Capsule Ligation-2 barcode addition was performed in a 96-well plate by repeating the steps describedin *Step 3* above.

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# 863 6. PCR-3 barcode addition

864 Capsule PCR-3 barcode addition was performed in a 96-well plate. Reaction volume scales with the 865 volume of capsules being barcoded. For 1-2.6µL of capsules, a standard 10 µL reaction houses 5 µL 866 of 2x NEBNext® High-Fidelity 2X PCR Master Mix (NEB, M0543L), 0.4µL of 10% Igepal CA-630 867 (Millipore Sigma, I8896-50ML), 1-2.6 µL of capsules in TI (pH 8.0), 1µL of 10µM universal PCR primer, targeting the other end of DNA molecule, 1 µL of 10µM PCR barcode (Table S3, PCR-3) and 868 869 water up to 10  $\mu$ L. Before setting up the reaction, capsules were pelleted, resuspended and distributed 870 over the wells of the barcoding plate as described in Step 3. Next, a PCR master mix, composed out 871 of 2x NEBNext® High-Fidelity 2X PCR Master Mix (NEB, M0543L), Igepal CA-630 (Millipore 872 Sigma, I8896-50ML), universal PCR primer and water (if used). was prepared for 50 reactions in the 873 same tube that housed the aliquoted capsules and 1/50th of the volume was added directly to capsules in each well without pipetting. Finally, thawed and vortexed PCR-3 DNA barcodes were added to 874 wells housing capsules and PCR master mix as described in Step 3, using a 12-tip multichannel pipette 875 876 (volume defined above). The reaction plate was spun down, covered with adhesive PCR film 877 (ThermoFisher, AB0558), incubated on ice for 5 min and followed by a PCR cycling program: 98°C 878 for 45s; 5 cycles of 98°C for 10s, 68°C for 20s, 72°C for 4 min; a final extension of 72°C for 2min and 879 hold at 25°C.

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After the PCR-3 barcode addition, capsules were pooled by adding 100µL of TIbS (pH 8.0) into each well and transferring all the volume into a 15mL falcon tube. Each well was washed twice and the plate was inspected under the inverted microscope to make sure no capsules are left behind. Capsules were transferred to a 1.5mL tube and were washed three times with TI100 (pH 8.0), three times with TI10 (pH 8.0) and twice with TI (pH 8.0). At this point, capsules were split into 1.5mL tubes for DNA purification and further downstream processing.

#### 888 CAGE dissolution and DNA purification

889 Capsules were dissolved in the presence of 0.5M NaOH, 0.5% Triton X-100 and 0.5% SDS in a 890 shaking heat block set to 40°C for 20min in 1.5mL tubes. The solution was neutralized by adding an 891 equimolar amount of HCl and 200mM Tris (pH 8.0) buffer to a final volume of  $100\mu$ L. DNA from 892 solubilized capsules was extracted using Qiagen MinElute DNA purification kit (Qiagen, 28004) or 893 AMPure XP magnetic beads (Beckman Coulter, A63881).

# 895 **Post-purification barcoded DNA amplification**

Barcoded and purified DNA was amplified using PCR. A standard 50µL reaction was composed out of 25µL 2x NEBNext® High-Fidelity 2X PCR Master Mix (NEB, M0543L), 2.5µL of 10µM P7\_rv
primer (Table S3), 2.5µL of 10µM FW primer (protocol depended), 20µL of purified barcoded
DNA. Reactions were performed using a PCR cycling program: 98°C for 30s; 10 cycles of 98°C for 15s, 68°C for 20s, 72°C for 2min; a final extension of 72°C for 2min and hold at 4°C unless stated otherwise.

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# 903 Library indexing PCR

Indexing PCR was carried out by mixing purified DNA with 25 μL of 2x NEBNext® High-Fidelity
2X PCR Master Mix (NEB, M0543L) and 2.5 μL of 20μM P7\_rv, 2.5μL of 20μM indexing primer
that houses an 8bp library index (Table S3, indexing) and water to 50μL. PCR cycling program: 98
°C, 2 min; 3 cycles of 98 °C, 20 s; 55 °C, 30 s; 72 °C, 20 s and 9 cycles 98 °C, 20 s; 65 °C, 30 s; 72
°C, 20 s; with a 1 min final extension at 72 °C, and 4 °C, hold at the end.

# 910 Plasmid DNA sequencing.

911 Hydrogel capsules containing plasmid DNA were generated as described in Hydrogel Capsule 912 synthesis, except the core solution contained 1ng/µL of plasmid DNA. Capsules were polymerized 913 and washed three times with TI100 (pH 8.0), twice with TI10 (pH 8.0) and twice with TI (pH 8.0). 914 Next, 14 reactions of capsule PCR were performed in a 50  $\mu$ L volume [10 $\mu$ L 5X Q5U reaction buffer 915 (NEB, M0515L), 2uL of 10mM dNTPs (NEB, N0447L), 2.5uL of 20uM GFP/RFP FW primer (Table 916 S3), 2.5µL of 20µM dU barcoded CMV [1-14] RV primer (Table S3, PCR), 27.5µL of packed 917 capsules, 1µL of Q5U High-Fidelity DNA polymerase (NEB, M0515L), 2µL of 10% Igepal CA-630 (Millipore Sigma, I8896-50ML), 2.5µL of water]. The reaction was carried out by first incubating the 918 919 tubes on ice for 5 mins, followed by cycling: 98°C for 30s; 14 cycles of 98°C for 15s, 68°C for 20s, 920 72°C for 4 min; a final extension of 72°C for 2min and hold at 25°C. After PCR, capsules were washed 921 once with TIbS (pH 8.0), three times with TI100 (pH 8.0) and three times with TI10 (pH 8.0). The 922 capsules were then subject to a second PCR reaction performed in 50uL volume as described above, 923 except 2.5µL of 20µM GFP/RFP FW, 2.5µL of labeled dU universal RV primer and 30µL of packed 924 capsules with no extra water were used using the same cycling conditions for 8 cycles. After the DNA 925 amplification, capsules were washed three times with TI100 (pH 8.0), twice with TIbS (pH 8.0), three 926 times with TI100 (pH 8.0) and twice with TI10 (pH 8.0). Washed capsules were subjected to split-927 and-pool barcoding as described above.

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Following split-and-pool barcoding, capsules were split into 16 multiple 1.5mL tubes and were
dissolved as described above. DNA was purified using MinElute PCR purification kit (Qiagen, 28004)
and barcoded DNA was eluted into 20µL of the elution buffer. Barcoded and purified DNA was
amplified using PCR as described in *Post-purification barcoded DNA amplification*, using 2.5µL of
TruSeq R1 GFP/TruSeq R1 RFP or TruSeq R1x GFP/TruSeq R1x RFP primer mix (Table S3)

to increase library diversity. After the reaction, amplified barcoded DNA was purified using 0.8X AMPure XP beads (Beckman Coulter, A63881) and was eluted into a 15 $\mu$ L Elution Buffer. DNA concentration was measured using a Qubit<sup>TM</sup> dsDNA HS Assay (Thermo FIsher, Q32854). Final sequencing library index PCR was carried out using 20 ng of purified DNA product 2.5 $\mu$ L of 20 $\mu$ M TruR1\_x\_p5 primer as described in *Library indexing PCR* step. Following final library indexing, DNA was double-side purified using 0.6x-0.8x SPRIselect magnetic beads (Beckman Coulter, B23318) and eluted into 15 $\mu$ L of water.

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# 942 <u>CAGE reverse-transcription reaction</u>

943 Reverse-transcription reaction was set on ice and performed in PCR strip tubes. A standard 100µL 944 reaction was composed out of 60.5µL of packed capsules, 2.5µL of 10µM RT poly(T) primer housing 945 a 10nt UMI and 6nt barcode (Table S3, RT), 3µL of 10% Igepal CA-630 (Millipore Sigma, I8896-946 50ML), 20µL of 5X SMARTseq3 RT buffer (100mM Tris pH 8.3, 150mM NaCl, 12.5mM MgCl2, 947 5mM GTP, 40mM DTT), 0.5µL of 10mM dNTPs (NEB, N0447L), 2.5µL of 40U/µL Recombinant 948 RNase Inhibitor (Takara Bio, 2313A), 1.5µL of 50µM TSO, 5µL of Maxima H- reverse transcriptase 949 (ThermoFisher, EP0753), unless stated otherwise. Reaction volumes were scaled according to the 950 amount of capsules used and number of reactions performed. To set up the reaction, capsules, RT primer and Igepal CA-630 (Millipore Sigma, I8896-50ML) were mixed on ice in a PCR tube, with 951 952 each housing a different RT barcode. Capsules were incubated on ice for 10 min to allow the RT primer to diffuse in, followed by heating at 70°C for 5 min and cooling down on ice. Next, RT master 953 954 mix, composed out of the remaining reagents was added to each tube, ensuring a thought mixing of 955 capsules with pipetting. Tubes were incubated on ice for 5 min and the reaction was carried out at 956 42°C for 90 min, followed by cycling between 50°C and 42°C incubation of 2 mins for 15 cycles. 957 Reactions were left at room temperature overnight and processed the next day.

# 959 CAGE single-cell gDNA amplicon-Seq

K562-RFP and L1210-GFP (kindly donated by Sean McGeary and Yuyang Chen) cell suspension was
 mixed at a ratio of 1:1. Capsules housing single-cells were prepared as described in *Hydrogel Capsule synthesis*, except core solution contained cell suspension at a final concentration of 1.4e6 cells/mL in
 1x DPBS. Resulting hydrogel capsules were resuspended in ice-cold 3x SSCI (pH 5.9). The
 subsequent steps were performed on ice: capsules were washed 6 times with 3x SSCI, once with TEIS
 (pH 7.5), three times with 3x SSCI and three times with HI10.

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While the paper analyzes only gDNA amplicons, the experiment reported in the paper was
simultaneously processed for joint amplicon-seq and scRNA-Seq. To this end, two 50µL reversetranscription reactions were set on ice in two PCR strip tubes as described in *Capsule reverse- transcription reaction*.

After the RT reaction, capsules were washed three times with TI100 (pH 8.0), twice with TIbS (pH 8.0), three times with ice-cold TI100 (pH 8.0) with 2 min incubations on ice. Finally Capsules were
washed twice with TI10 (pH 8.0).

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The capsules containing gDNA and cDNA were then processed to amplify target gDNA regions by

- 977 carrying out 16 cycles of capsule gDNA amplicon PCR. The PCR reactions were performed in 50µL
- volume 10μL 5X Q5U reaction buffer (NEB, M0515L), 2μL of 10mM dNTPs (NEB, N0447L), 5μL
- 979 of 10μM RFP\_R1 FW primer, 5μL of 10μM GFP\_R1 FW primer, 5μL of 10μM universal dU CMV

980 RV primer (Table S3), 20µL of packed capsules, 1µL of O5U High-Fidelity DNA polymerase (NEB, 981 M0515L), 2µL of 10% Igepal CA-630 (Millipore Sigma, I8896-50ML)]. The reaction was carried out 982 by first incubating the tubes on ice for 5 mins, followed by a PCR cycling program: 98°C for 30s; 16 983 cycles of 98°C for 15s, 70°C for 20s, 72°C for 2 min; a final extension of 72°C for 2min and hold at 984 25°C. After PCR, capsules were washed once with TIbS (pH 8.0), three times with TI100 (pH 8.0) and 985 three times with TI10 (pH 8.0). A second PCR reaction was then performed in a 50µL volume as 986 described in Capsule dU PCR using 2.5µL of 10µM Read1 Biotin FW primer (Table S3), 2.5µL of 987 10µM universal dU CMV RV primer, 2.5µL of 10µM universal dU RV primer, 2.5µL of 10µM of 988 TSO FW primer with 25uL of packed capsules. After the DNA amplification, capsules were washed 989 three times with TI100 (pH 8.0), twice with TIbS (pH 8.0), three times with TI100 (pH 8.0) and twice 990 with TI10 (pH 8.0). Washed capsules were subjected to split-and-pool barcoding as described above, 991 with Read1 Biotin FW and TSO FW primer used in the PCR-3 barcode additions. 992

993 Following split-and-pool barcoding, capsules were split into multiple 1.5mL tubes and were dissolved 994 as described above. DNA was purified using MinElute PCR purification kit and barcoded cDNA was 995 eluted into 20µL of the elution buffer. Barcoded and purified DNA was amplified using PCR as 996 described in Post-purification barcoded DNA amplification, using 2.5µL of TSO fw and 997 Read1 Biotin FW primers. After the reaction, amplified barcoded DNA was purified using 0.8X 998 AMPure XP beads (Beckman Coulter, A63881) and was eluted into a 20µL Elution Buffer. Next, 999 biotin pulldown using Pierce<sup>™</sup> Streptavidin Magnetic Beads (ThermoFisher, 88816) was performed 1000 to purify amplified and barcoded biotinylated gDNA GFP/RFP amplicons. 25µL of magnetic beads 1001 were washed three times using 30µL of 5mM Tris (pH 7.4) with 0.5mM EDTA and 1M NaCl while 1002 placed on a magnetic rack. After washing, beads were resuspended in 60uL of 10mM Tris (pH 7.4) 1003 with 1mM EDTA and 2M NaCl and mixed with cDNA sample diluted to 60µL using water. Beads 1004 were incubated at room temperature for 30 min, placed on a magnetic rack. Supernatant was 1005 transferred to a new tube and was used to purify non-biotnylated DNA. Remaining beads were washed three times with 50µL of 5mM Tris (pH 7.4) with 0.5mM EDTA and 1M NaCl and biotinylated DNA 1006 1007 was eluted by resuspending 20µL of 95% formamide with 10mM EDTA (pH 8.2) and heating av 65°C 1008 for 5 min. Eluted DNA was purified using 1X AMPure XP beads (Beckman Coulter, A63881) and 1009 eluted into 20µL of water. Final amplicon library amplification and indexing PCR was carried using 1010 20 µL of the purified DNA as described previously with 2.5µL of 20µM truR1 x p5 primer that 1011 houses an 8bp library index. Following final library indexing, DNA was purified using 0.8x SPRIselect 1012 magnetic beads (Beckman Coulter, B23318) and eluted into 15µL.

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#### 1014 Imaging lysed cells and cDNA libraries in CAGEs

After lysis, capsules were resuspended in 3X SSCI buffer with 1X SYBR Safe DNA Gel Stain
(Thermofisher, S33102). 2-5µL of packed capsules were transferred to a hemocytometer or a well of
96-well glass bottom plate and were topped with 3X SSCI buffer with 1X stain and imaged on a wide
field or confocal microscopes.

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# 1020 Dextran digestion reaction

1021 Core dextran digestion reaction was performed in 1mL IMDM with 1% BSA, 0.1% F127 and 0.1%1022 L31 pluronics unless stated otherwise in the presence of 0.5% (v/v) dextranase from *Chaetomium* 

1023 *erraticum* (Sigma Aldrich, D0443-50ML) at 37°C for 1 min with 500 rpm shaking. Immediately after,

- $50\mu$ L of HFE7500 was added and capsules were spun down 300g for 1 min. All supernatant was
- 1025 removed and capsules were slowly resuspended in  $500\mu$ L of media and transferred to a new tube

without disturbing the bottom HFE7500 phase. Capsules were washed once with 1mL IMDM with
1% BSA, 0.1% F127 and 0.1% L31 pluronics.

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#### 1029 CAGE single cell RNA-Seq

In the optimized protocol, Capsules housing single-cells were prepared as described in Hvdrogel 1030 1031 Capsule synthesis, except the core solution was prepared in DPBS and contained 8mM DTT, 1% BSA 1032 and a final concentration of 1.4e6 cells/mL. Resulting hydrogel capsule pellet was resuspended in 1033 room temperature 1mL IMDM with 1% BSA, 0.1% F127 and 0.1% L31 pluronics and was washed 1034 twice with 300g spins for 1 min. Next, core dextran was removed as described in Dextran digestion 1035 reaction. Following this, all steps were performed on ice. First, capsules were washed three times with 1036 an ice-cold 3X SSCI buffer with 800g spins for 1 min. Cells were lysed by washing with ice-cold 1037 7.5pH TEIS with 5 min incubations on ice. After lysis, capsules were imaged (check above), washed 1038 three times with 3X SSCI and three times with HI10, packed at 800g for 1 min and stored on ice.

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Reverse-transcription reaction was set on ice and performed in PCR strip tubes as described in *Capsule reverse-transcription reaction*. After the RT reaction, capsules were washed three times with TI100
(pH 8.0), twice with TIbS (pH 8.0), three times with ice-cold TI100 (pH 8.0) with 2 min incubations
on ice. Finally capsules were washed twice with TI10 (pH 8.0).

1045Next, Capsule dU PCR was performed to carry out cDNA amplification as described previously, using,1046 $5\mu$ L of  $10\mu$ M TSO FW primer,  $5\mu$ L of  $10\mu$ M dU universal RV primer (**Table S3**), After the cDNA1047amplification, capsules were washed three times with TI100 (pH 8.0), twice with TIbS (pH 8.0), three1048times with TI100 (pH 8.0), twice with TI10 (pH 8.0). Capsules were imaged on a confocal microscope1049to inspect the cDNA signal (from labeled dU primer). Washed capsules are subjected to split-and-pool1050barcoding as described above with TSO FW primer used in the PCR-3 barcode additions.

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Following split-and-pool barcoding, capsules were split into multiple 1.5mL tubes and were dissolved 1052 as described above. DNA was purified using MinElute PCR purification kit and barcoded cDNA was 1053 1054 eluted into 20µL of the elution buffer. Barcoded and purified DNA was amplified using PCR as described in Post-purification barcoded DNA amplification, using 2.5µL of TSO FW primer. After 1055 1056 the reaction, amplified barcoded cDNA was purified using 0.8X AMPure XP beads (Beckman Coulter, 1057 A63881) and was eluted into a 15µL Elution Buffer. DNA concentration was measured using QuBit 1058 fluorometer and cDNA fragment length profile was assessed using Agilent Tapestation D5000 kits 1059 (Agilent, 5067).

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To construct Illumina sequencing libraries, 50 ng of barcoded and amplified cDNA was fragmented, 1061 blunted and dA-tailed by mixing it with 3.5 µL of NEBNext Ultra II FS Reaction buffer (NEB), 1 µL 1062 1063 of fully mixed NEBNext Ultra II FS Enzyme mix (NEB) and nuclease free water to a final volume of 1064 17.5  $\mu$ L. The reaction mix was vortexed for 10 s, spanned down and placed into a preheated PCR machine for incubation at 37°C for 10 min; 65°C for 30 min; hold 4°C (lid at 75°C). Fragmented DNA 1065 1066 was purified using 0.8X AMPure XP beads (Beckman Coulter, A63881) and eluted into 16µL of water. Single-stranded DNA adapter, containing Illumina's TruSeq read 1 (Adp. TruSeq R1 FW and 1067 1068 RV) sequences were annealed together at the final concentration of 1.5 µM by mixing 1.5 µL of 1069 forward ligation primer and reverse ligation primer (each at 100 µM) with 97 µL of nuclease-free 1070 water and heating the solution to 95°C for 2 min and cooling it at room temperature for 5 min. 16 µL 1071 of the purified fragmented DNA was mixed with 1.25 µL of 1.5 µM annealed adapters, 1.5µL of 10X

1072 T4 DNA ligase buffer, 15  $\mu$ L of NEBNext Ultra II Ligation Master Mix (NEB, E7805S kit) and 0.5 1073  $\mu$ L of NEBNext Ultra II Ligation Master Enhancer (NEB, E7805S kit). The ligation reaction was 1074 carried out by incubating in the thermocycler for 15 min at 20°C (lid at 30°C). After ligation, the 1075 reaction mix was diluted to 100  $\mu$ L and was purified using AMPure XP beads (Beckman Coulter, 1076 A63881) with 0.8X volume ratio and eluted into 40  $\mu$ L nuclease-free water.

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- 1078 Final sequencing library indexing PCR was carried out as described previously with  $2.5\mu$ L of  $20\mu$ M 1079 truR1 x p5 primer that houses an 8bp library index.
- 1080 Following final library indexing, DNA was double-side purified using 0.6x-0.8x SPRIselect (Beckman
- 1081 Coulter, B23318) magnetic beads and eluted into  $15\mu$ L 1082

# 1083 Capsule ATAC-Seq

- 1084 While the paper analyzes only the accessible gDNA amplicons, the experiment reported in the paper 1085 was simultaneously processed for joint ATAC-seq and RNA-Seq in single cells. To this end, a K562, 1086 L929 (kindly donated by Sean McGeary) and L1210 cell suspension was prepared by mixing cells at 1087 a ratio of 1:1:1. Capsules housing single-cells were prepared as described in Hydrogel Capsule synthesis, except the core solution contained 8mM DTT, 1% BSA and final concentration of 1.4e6 1088 1089 cells/mL in 1x IMDM. After 45 photopolymerization hydrogel capsules were purified as described previously and the resulting hydrogel capsule pellet was resuspended in room temperature 1mL IMDM 1090 with 1% BSA, 0.1% F127 and 0.1% L31 and washed twice with 300g spins for 1 min. Next, core 1091 1092 dextran was removed as described in Dextran digestion reaction.. Following this, all steps were 1093 performed on ice.
- 1094 Unloaded Tn5 transposase (Diagenode, C01070010-20) was loaded with adapter sequences carrying
- a barcode (Table S3, Tn5). First, the oligos were resuspended to  $100\mu$ M in 40mM Tris (pH 8.0) with
- 1096 50mM NaCl, universal Tn5\_rev oligo was mixed with oligo Tn5\_B0\_x or Tn5\_oligoB at 1:1 ratio and
- annealed by in a thermocycler: 95°C, 5min; cool to 65°C (-0.1°C/s); 65°C, 5min; cool to 4°C (-0.1°C/s).
   Annealed adapters were mixed at ratio 1:1 and 10uL were gently added to 10uL of unloaded Tn5. The
- 1098 Annealed adapters were mixed at ratio 1:1 and  $10\mu$ L were gently added to  $10\mu$ L of unloaded Tn5. The 1099 solution was incubated at 23°C for 30 min in a thermocycler and  $10\mu$ l of 99% glycerol was added to 1100 enable the sorting of loaded Tn5 at -20°C.
- 1101 To perform gDNA tagmentation, 21.6µL of packed capsules were mixed with 30µL of 2x TD buffer
- 1102 (20 mM Tris 10 mM MgCl2; 20% (vol/vol) DMF, pH 7.6), 2.4µL of loaded Tn5 and 6µL of 10X
- 1103 Lysis additive (5% Tween20, 0.05% Digitonin in DPBS). The solution was incubated on ice for 5 min,
- followed by incubation at  $37^{\circ}$ C for 30 min. After the reaction, capsules were washed three times with
- 1105 TEIS (pH 7.5) and then Proteinase K treated in 200 $\mu$ L of TEIS (pH 7.5) with 10 $\mu$ L of Proteinase K (NEB, P8107S) for 15 min at 55°C. After the reaction, capsules were washed three times with TI100
- 1107 (pH 7.5) and twice with TI (pH 7.5).
- 1108
- Next, Reverse-transcription reaction was set on ice and performed in PCR strip tubes as described in *Capsule reverse-transcription reaction*. After the RT reaction, capsules were washed three times with
  TI100 (pH 8.0), twice with TIbS (pH 8.0), three times with ice-cold TI100 (pH 8.0) with 2 min
  incubations on ice. Finally capsules were washed twice with TI10 (pH 8.0).
- 1113
- 1114 Next, Capsule dU PCR was performed as described before, using 2.5µL of 20µM NexteraR1\_x\_p5,
- 1115 2.5µL of 20µM TSO FW (Table S3), 5µL of 10µM dU universal RV primer with 25µL of packed
- 1116 capsules. After the PCR, capsules were washed twice with TI100 (pH 8.0), twice with TIbS (pH 8.0)
- 1117 and twice with TI10 (pH 8.0). Resulting tagmented and amplified DNA was barcoded by using the

split-and-pool approach as described previously with P5 Biotin FW and TSO FW primer used in thePCR-3 barcode additions.

1120

1121 Following split-and-pool barcoding, capsules were dissolved in 1.5mL tubes as described above. DNA was purified using MinElute PCR purification kit and barcoded DNA was eluted into 20µL of the 1122 1123 elution buffer. Barcoded and purified DNA was amplified using PCR as described in Post-purification 1124 barcoded DNA amplification, using 1.25µL of 20µM P5 Biotin FW and 1.25µL of 20µM TSO FW 1125 primer. DNA was purified using AMPure XP beads (Beckman Coulter, A63881) with 1.8X ratio and eluted into 20µL. Next, biotin pulldown using Pierce<sup>™</sup> Streptavidin Magnetic Beads (ThermoFisher, 1126 1127 88816) was performed to purify amplified and barcoded biotinylated gDNA fragments from non-1128 biotnylated cDNA libraries as described previously.

1129

1130 Next, indexing with qPCR quantification was run using 25µL 2x NEBNext® High-Fidelity 2X PCR 1131 Master Mix (NEB, M0543L), 2.5µL of 20µM P7 rv primer, 2.5µL of 20µM p5 FW primer and 20µL 1132 of purified barcoded DNA. Reactions were performed using a PCR cycling program: 98°C for 50s; 6 1133 cycles of 98°C for 10s, 68°C for 20s, 72°C for 1min; a final extension of 72°C for 4min and hold at 4°C and the reaction was transferred on ice. Next, 5µL of partially amplified DNA was mixed with 1134 0.25µL of 20µM of each primer, 0.1µL of 100X SYBRgreen, 5µL of 2x NEBNext® High-Fidelity 1135 2X PCR Master Mix (NEB, M0543L) and 4.4µL of water. The reaction was carried out on a qPCR 1136 machine using the same PCR program as for the initial 6 cycles, except imaging the samples after 1137 1138 every extension step. RFU vs cycle plot was used to determine the number of cycles needed to reach 1139  $\frac{1}{3}$  of maximum intensity. This number of cycles was used to amplify the remaining 45µL of partially 1140 amplified DNA. After the reaction, DNA was purified using double sided size AMPure XP (Beckman 1141 Coulter, A63881) size selection with a bead ratio of 0.5X-1.3X. Final library DNA was eluted to 15µL 1142 of EB, quantified using Qubit and qPCR before sequencing

1143

# 1144 **<u>Fixation of cells in suspension</u>**

1145 Cell suspensions were centrifuged at 400g for 3 mins and the pellet was resuspended in 1mL of 4% 1146 PFA in DPBS. The solution was incubated at room temperature for 15 mins, followed by 3 washes 1147 with 1x DPBS + 0.1% BSA. The fixed cells were encapsulated into capsules by adding the cells to 1148 ~1.4e6 cells/mL into the core solution.

1149

# 1150 <u>Reverse cross-linking cells in capsules</u>

1151Fixed cells were reverse cross-linked in capsules by washing the capsules twice with 3x SSCI +1152 $0.01U/\mu L$  RiboLock RNAse Inhibitor (ThermoFisher, EO0381). Next, Capsules were washed three1153times with 100mM Tris (pH 7.5) with 10mM EDTA, 0.1% Igepal CA-630 (Millipore Sigma, I8896-115450ML), 0.1% SDS. Finally, capsules were resuspended in the same solution to a volume of 1 mL and1155 $50 \ \mu L$  of proteinase K (NEB, P8107S) was added followed by incubation at 56°C for 30 min. After1156the reverse crosslinking, capsules were washed three times with 3X SSCI, three times with HI10 and1157were used in a reverse transcription reaction as described above (*Capsule single-cell RNA-seq*).

1158

# 1159 <u>Freezing capsules</u>

1160 Capsules were frozen at -80°C in the presence of 10% DMSO. Capsules containing cell lysates were

- 1161 frozen in a 3X SSCI buffer with  $0.05U/\mu L$  of RNAse inhibitor (NEB, M0314S). Capsules containing
- 1162 DNA only were frozen in TI (pH 8.0) with 10% DMSO.
- 1163

#### 1164 **<u>Preparation of PBMCs</u>**

1165 Human Peripheral Blood Mononuclear Cells were obtained from Lonza (CC-2704). The cryo-1166 preserved cell vials were stored in liquid Nitrogen until use, and then thawed in a 37°C metal bead 1167 bath for 7 minutes. The thawed cell suspension was transferred into a 15 mL falcon tube. 1 mL of 1168 37°C pre-warmed DMEM (ThermoFisher, 10566016) with 10% FBS (ATCC, 30-2020) and 1x 1169 Penicillin/Streptomycin (ThermoFisher, 10378016) was slowly added into the original 1170 cryopreservation tube. This media was then added one drop at a time into the falcon tube. Additional 1171 8 mL of pre-warmed media were added slowly onto the cell suspension. Cells were resuspended gently and centrifuged at room temperature at 300g for 4 mins. All of the media was aspirated from the cell 1172 1173 pellet and cells were suspended in 5 mL of fresh, 37°C appropriate media with 10% FBS and 1x Penicillin/Streptomycin and transferred into 25 cm<sup>2</sup> culture flask with a filter cap (Corning). Cells 1174 1175 were cultured in a 37°C incubator with 5% CO2. In the case of PBMCs, cells were washed one more 1176 time with IMDM + 10% FPBS +1x Pen/Strep and were passed through a 40 $\mu$ m strainer. Following 1177 this, cells were washed with ice cold plain IMDM with 0.5% BSA. PBMC were encapsulated at a final 1178 concentration of 1.4e6 cells/mL in the core mix and then processed for scRNA-Seq as described above.

1179

#### 1180 Mammalian cell line culture

1181 K562, L1210 and L929, Jurkat cell lines were cultured and used in experiments described in this work. Unless otherwise stated, K562 and L1210 cells were cultured in IMDM (Thermo Fisher, 10566016) + 1182 1183 10% FBS (ATCC, 30-2020) + 1x penicillin/streptomycin (Thermo Fisher, 10378016) in T25 flasks 1184 (Corning). L929 cells were cultured in EMEM (ATCC, 30-2003) + 10% horse serum (Thermo Fisher, 1185 A5669502) + 1x penicillin/streptomycin (Thermo Fisher, 10378016) in T25 flasks (Corning). Jurkat 1186 and HEK293T cells were cultured in RPMI1640 (Thermo Fisher, 61870036) + 10% FBS (ATCC, 30-1187 2020) + 1x penicillin/streptomycin (Thermo Fisher, 10378016) in T25 flasks (Corning). Cell lines 1188 were cultured until they reached ~80-90% confluency. For passaging, suspension cells (K562, L1210, Jurkat) were resuspended gently and collected into a 15 mL tube. 5 mL of 37°C pre-warmed complete 1189 media was used to wash the flask and was added into the same 15 mL tube. Adherent cells (HEK293T, 1190 1191 L929) cells were passaged by aspirating the used media and washing 2 times with 2 mL of 37°C pre-1192 warmed 1x DPBS buffer. Cells were detached by adding 1 mL of TrypLE reagent (Thermofisher 1193 Scientific, 12605010), waiting 10s and quickly aspirating all of the TrypLE. Cells were incubated in 1194 37°C for 2 minutes and were resuspended in 5 mL of 37°C pre-warmed complete media. Cells were 1195 centrifuged at 300g for 4 min, followed by media aspiration and resuspension in 5 mL of fresh pre-1196 warmed complete media. Cells were counted using an automatic cell counter and 500,000 cells were 1197 seeded into 5 mL of 37°C pre-warmed complete media in a 25cm2 flask. For encapsulation 1198 experiments, cells were washed twice with ice cold DPBS with 0.1% BSA or room temperature IMDM 1199 with 0.1% BSA and were encapsulated at a final concentration of 1.4e6 cells/mL in core mix and then 1200 processed immediately for scDNA-seq/scRNA-Seq/scATAC-seq as described previously or grown 1201 into colonies as described below. 1202

#### 1203 iPSC culturing

Induced pluripotent cells were cultured in a 6-well plate on a layer of Matrigel (Corning) in mTeSR
media (STEMCELL Technologies, 100-0276). To passage the culture, cells were detached by
removing media, rinsing twice with DPBS, adding 1mL of Accutase (STEMCELL Technologies,
07920) and incubating at 37°C for 7 min. Next, cells were resuspended in 5mL of plain DMEM and
centrifuged in a swinging bucket centrifuge for 4 min at 300g. Supernatant was aspirated and the cell
pellet was resuspended in 1mL of DMEM. 2mL of Matrigel in DMEM solution was added to a single
6-well plate well. The plate was incubated in 37°C for 30 min. Any remaining solution was aspirated

and 500K of iPSC cells in DMEM were seeded into 2mL of mTeSR (STEMCELL Technologies, 100-0276) with  $10\mu$ g/mL Y-27632 (Dihydrochloride) (STEMCELL Technologies, 72302). After a day of culturing, media was changed with fresh mTeSR without Y-27632. Media changes were performed daily for 3-4 days, till cells reached 80-90% confluency.

1215

# 1216 <u>Cell-line culturing in CAGEs</u>

1217 Capsules housing single cells were prepared as described in *Hydrogel Capsule synthesis*, except the 1218 core solution was prepared in 1x IMDM and contained 8mM DTT, 1% BSA, and a final concentration 1219 of 1.4e6 cells/mL. Emulsion was polymerized for 45s and capsules were purified as described 1220 previously. Resulting hydrogel capsule pellet was resuspended in 37°C temperature 1mL IMDM with 1221 10% FBS, 0.1% F127 and 0.1% L31 pluronics, washed twice with 300g spins for 1 min and core 1222 dextran was removed as described previously. Capsules were washed once with 1mL IMDM with 1223 10% FBS, 0.1% F127 and 0.1% L31 pluronics. Packed capsules were transferred to wells of 24-well 1224 plate and cultured in 1mL of complete media as described in mammalian cell line culturing part above. 1225 To change media, capsules were resuspended in the growth medium and were transferred to a 1226 reverstable 37µm strainer (STEMCELL technologies, 27215). Capsules were washed in the strainer with 3mL of complete growth medium. Next, the strainer was inverted and the capsules were eluted 1227 back into a well of a 24-well plate using 1mL of complete growth medium. Any manipulation of 1228 capsules was done in complete growth media with 0.1% F127 and 0.1% L31. 1229

1230

# 1231 <u>iPSC culturing in CAGEs</u>

1232 Capsules housing single iPSCs were generated using the protocol described above with a final 1233 concentration of 1.4e6 cells/mL in the core mix. Capsule clean-up and dextran removal were done as 1234 described above. After clean-up, capsules were washed twice with mTeSR 3D + 0.1% F127, 0.1% 1235 L31 + 0.1% BSA. Packed capsules were transferred to wells of 24-well plate and cultured in 1mL of mTeSR 3D media (STEMCELL Technologies, #03950) with 1X CloneR<sup>TM</sup>2 cloning supplement 1236 1237 (STEMCELL Technologies, 100-0691). To change media, capsules were resuspended in the surrounding growth medium and were transferred to a reverstable 37µm strainer (STEMCELL 1238 1239 Technologies, 27215). Capsules were washed in the strainer with 3mL of IMDM with 0.1% F127 + 1240 0.1% L31. Next, the strainer was inverted and the capsules were eluted back into a well of a 24-well 1241 plate using 1mL of mTeSR 3D media. Any manipulation of capsules was done in complete growth 1242 media with 0.1% F127 and 0.1% L31.

1243

# 1244 <u>mHPC culturing in capsules</u>

1245 LSK mHPCs were gifted by the lab of Fernando Camargo (Harvard). Capsules housing single mHPCs were generated using the protocol described above with a final concentration of 0.8e6 cells/mL in the 1246 1247 core mix and no BSA. Capsule clean-up and dextran removal were done as described above, except 1248 all washes were performed in plain IMDM + 0.1% F127 and 0.1% L31. After clean-up, capsules were 1249 washed twice F12 media (Thermo Fisher, 11765054) supplemented with 10mM HEPES, 1X P/S/G, 1 1250 mg/ml PVA, 100 ng/ml TPO (ThermoFisher, 300-18-10UG), 10 ng/ml SCF (Thermo Fisher, 300-07-10UG), 1x ITSX (Thermo Fisher, 51500056), 0.1% F127, 0.1% L31. Packed capsules were transferred 1251 1252 to wells of 24-well plate and cultured in 1mL F12 expansion media. Media was exchanged every two 1253 days by collecting all the capsules into a 1.5mL tube, spinning down at 300g for 1 min and 1254 resuspending in fresh media.

- 1255
- 1256 **Fixing and staining clones in CAGEs**

1257 Colonies in capsules were fixed by resuspending packed capsules in 4% PFA solution in DPBS and 1258 incubating at room temperature for 20 min. Capsules were washed twice and stored in ice-cold DPBS 1259 with 0.1% BSA, 0.1% F127, 0.1% L31. Cells were permeabilized by adding Triton X-100 to a final 1260 concentration of 0.1% and incubating for 10 min. Capsules were washed twice and stored in a fridge. For iPSC colonies, immunostaining was performed against SOX2 by adding 2µL of Alexa Fluor® 1261 1262 488 anti-SOX2 Antibody (BioLegend, 656109) (0.5mg/mL) to 600µL of capsules solution in DPBS 1263 with 0.1% B/F/L. As a control, 2µL of 0.5mg/mL FITC anti-mouse CD45.1 Antibody (BioLegend, 1264 110705) was used. Capsules were stained on ice for 15 min, followed by 3 washes with DPBS + 0.1%BSA/F127/L31 with 5 min incubation on ice between washes. Stained capsules were imaged on a 1265 1266 confocal microscope.

1267

#### 1268 <u>Treatment with HDAC and DNMT1 inhibitors</u>

1269 Survival curves for DNMT inhibitors [Decitabine (Dec) and 5-aza-cytidine (Aza)], and the HDAC 1270 inhibitor Vorinostat (Vor) (MedChemExpress, HY-A0004, HY-10586, HY-10221) were generated by 1271 seeding 15,000 (L1210) and 20,000 (K562) into 96-well plates and growing the cells in 100µL of 1272 IMDM + 10% FBS, 1X Pen/Strep in the presence of 0, 0.001, 0.003, 0.01, 0.03, 0.1, 0.3, 1, 3, 10 µM 1273 of each drug. Cells were passaged every two days by transferring  $15\mu$ L of cells into a fresh  $85\mu$ L of 1274 media loaded with the same concentration of drugs. Cell viability and number was evaluated every two days using a confocal microscope by mixing 7.5µL of cell culture with 42.5µL of DPBs with 1X 1275 DAPI stain. 1276 1277

#### 1278 CAGE clonal expansion and inC-RNA-seq

Cells were pre-treated with drugs by seeding 150,000 (L1210) and 200,000 (K562) cells into 6-well 1279 plate wells (Corning). Cells were grown in 2mL of IMDM with 10% FBS, 1X Pen/Strep in the 1280 1281 presence of 0.05 µM Dec, 0.7µM Aza, 0.4µM Vor (MedChemExpress) or no drugs for 48 hours. Next, cells were collected and K562 and L1210 cell-lines were pooled based on the drug condition at a 1:1 1282 ratio. Cell suspension was encapsulated into hydrogel capsules as described above. Each drug 1283 condition was encapsulated for 2 hours, collecting the droplets into four 30 min fractions. Hydrogel 1284 1285 capsules were polymerized, washed and dextranase treated as described above. One fraction of each condition was sampled instantly by lysing the cells inside the capsules - capsules were washed three 1286 1287 times with ice-cold 3X SSCI buffer with 800g spins for 1 min. Cells were lysed by washing twice with 1288 ice-cold TEIS (7.5pH) with 5 min incubations on ice. After cell lysis, capsules were frozen down at -80°C in 3X SSCI with 10% DMSO and 0.05U/µL Murine RNAse Inhibitor (NEB, M0314S). 1289 1290 Remaining fractions of packed hydrogel capsules were seeded into a different 24-well plate well into 1291 1mL of IMDM with 10% FBS and 1x Pen/Strep, 0.1% F127 and 0.1% L31 with appropriate drug. 1292 10,000 K562 and L1210 cells from appropriate drug conditions were seeded outside the capsules for 1293 the first two days. Every two days, media was exchanged by collecting the capsules using an reversable 1294 a 40µm strainer (STEMCELL Technologies) as described above and eluting into fresh IMDM with 10% FBS and 1x Pen/Strep, 0.1% F127 and 0.1% L31 with appreciate drug. Every 2 days, one well 1295 1296 of each condition was sampled for Capsule RNA-seq by lysing the cells and freezing at -80°C as described above. After all the time points were collected, hydrogel capsules were thawed, washed once 1297 with 3X SSCI, once with TI10 (pH 7.5), once with TI (pH 7.5). Next, capsules were treated with Turbo 1298 1299 DNAse I (Thermo Fisher) by adding 8µL of 2U/µL enzyme to 300µL of capsules in a 1X reaction 1300 buffer and incubating at 37°C for 10 min. Capsules were then washed once with 3X SSCI and TEIS 1301 (pH 7.5) and resuspended in 500µL of TEIS (pH 7.5). Next, 8µL of Proteinase K (NEB, P8107S) were 1302 added to each tube, followed by 15 min incubation at 37°C. Finally, capsules were washed three times

with 3X SSCI buffer and three times with HI10. Resulting capsules were used in a capsule RNA-seq
protocol as described above. Resulting barcoded cDNA libraries were purified, fragmented and
indexed with 48 indices as described above.

# 1307 <u>Sequencing</u>

DNA library fragment size was assessed using Agilent Bioanalyzer hsDNA or Tapsestation D5000
kits (Agilent). Sequencing libraries, housing different P5 indices were pooled, and concentration was
assessed using a qPCR using KAPA SYBR® FAST Universal qPCR Kit (KAPA Biosystems)
according to manufacturer's guidelines. All libraries were sequenced on a Paired-end Illumina NextGeneration sequencing platform. See Table S4 for sequencing kit and parameters

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# 1314 DATA ANALYSIS

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#### 1316 Software packages.

Except as stated otherwise below, all data analysis was carried out in Python (3.10) with the packages
scanpy (1.10.4), numpy (1.26.4), pytorch (2.2.2), pymc (5.20.0), scikit-learn (1.6.1).

1319

#### 1320 Sequencing read demultiplexing and pre-processing

1321 BCL sequencing files received from Illumina BaseSpace portal were converted to raw FASTO files 1322 for each of the 4 (R1, R2, R3, R4) sequencing reads without read trimming or masking by using 1323 bcl2fastq software (Illumina, v2.20.0.422). Raw FASTQ files were processed using a custom pipeline 1324 adapted from inDrops.py (Zilionis et al., 2017). The new code, inCaps.py will be available at 1325 github.com/AllonKleinLab/. In brief, sequencing reads were demultiplexed based on Read1 index sequence, and were filtered based on expected structure (all barcodes matching a barcode whitelist 1326 1327 with hamming distance of 1). The demultiplexed reads were then processed using Trimmomatic (1)1328 (with parameters: LEADING 28; SLIDINGWINDOW 4:20; MINLEN 20), followed by Poly-A length 1329 trim to 4 nt and selecting reads that are longer than MINLEN. For surviving reads, the fraction of length composed out of same base repeats (only considering > 5) was determined, rejecting reads 1330 1331 whose fraction is greater than 0.5. As output, for every input run part (sequencing lane), this produces 1332 a filtered FASTQ file for every library index contained in that run. Next, all filtering results were 1333 combined to identify abundant cell barcodes and create a summary filtering table for each library 1334 processed. An index is created to sort the reads according to the name of their barcode of origin. Barcodes with less than 250 total reads (across all library-run-parts) are ignored, and placed at the end 1335 of the file, creating gzipped and sorted FASTQ files with headers containing capsules barcodes (and 1336 1337 UMI if applicable) and an index of the byte offsets for every barcode with more than 250 reads. 1338 Demultiplexed, filtered and sorted FASTQ files were used for mapping and counting as described in 1339 the following sections.

1340

# 1341 Read mapping for amplicon sequencing

Sequencing reads were first processed as described above to generate demultiplexed, filtered and
sorted FASTQ files. Sequencing reads were aligned to a GFP or RFP reference using STARSolo (2)
counting the number of reads aligning to each reference for each detected barcode.

- 1345
- 1346 <u>Capsule RNA-Seq count matrix generation</u>

1347 Sequencing reads were first processed as described above to generate demultiplexed, filtered and 1348 sorted FASTQ files. Count matrices were generated using STARsolo pipeline (2) (STAR 2.7.9a) with 1349 the with parameters (--soloFeatures Gene, GeneFull, --genomeSAsparseD 3, --outSAMtype BAM 1350 SortedBvCoordinate, --outSAMattributes CB CR UR UB UY GN GX, --outFilterScoreMinOverLread 1351 0.3, --outFilterMatchNminOverLread 0.3, --soloCBmatchWLtype 1MM multi Nbase pseudocounts, 1352 --soloUMIfiltering MultiGeneUMI CR, --soloUMIdedup 1MM CR, --soloMultiMappers EM, --1353 soloCellFilter EmptyDrops CR, --quantMode TranscriptomeSAM GeneCounts) or InDrops pipeline 1354 with Bowtie 1.2.2 (m = 200; n = 1; 1 = 30; e = 70) unless stated otherwise. Human GRCh38.101 and mouse GRCm.101 genome assemblies were used. 1355 1356

#### 1357 <u>Cell-line Capsule scRNA-seq of data analysis</u>

Count matrices were generated as described above using the STARsolo pipeline. Count matrices were
filtered by selecting barcodes with >3000 UMIs and fraction of mitochondrial counts being below 0.2.
Counts were quantile-quantile (Q-Q) downsampled among all samples. Gene-expression correlation
analysis was performed after transcript per million (TPM) normalization and log10(1+TPM) scaling.

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#### 1363 PBMC Capsule scRNA-seq data analysis

Count matrices were generated using the STARsolo pipeline with intronic reads as described above.
Count matrices were filtered by selecting barcodes with >2000 UMIs and fraction of mitochondrial
counts being below 0.2. Counts were normalized to CP10K, and z-scored. Scanpy was used to identify
high variable genes (sc.pp.highly\_variable\_genes with flavor='seurat', min\_mean=0.0125,
max\_mean=3, min\_disp=0.2) and to perform PCA, UMAP and Leiden clustering.

#### 1370 Data comparison to 10x Genomics

1371 Capsule scRNA-seq HEK293t, NIH 3t3 and PBMC data was compared to an equivalent sample of 1372 10X Genomics scRNA-seq data downloaded from the companies website in raw FASTQ format. Count matrices for Capsule and 10X Genomics data were generated using STARsolo pipeline with 1373 1374 the same parameters (--soloType CB UMI Simple, --soloUMIlen 12, --soloFeatures Gene, --1375 genomeSAsparseD 3, --outSAMtype BAM SortedByCoordinate, --outSAMattributes CB CR UR UB UY GN GX, --outFilterScoreMinOverLread 0.3, --outFilterMatchNminOverLread 0.3, --1376 1377 soloCBmatchWLtype 1MM multi Nbase pseudocounts, --soloUMIfiltering MultiGeneUMI CR, -soloUMIdedup 1MM CR, --soloMultiMappers EM, --soloCellFilter EmptyDrops CR, --quantMode 1378 1379 TranscriptomeSAM GeneCounts). Human GRCh38.101 and mouse GRCm.101 assemblies were used. 1380 Count matrices were filtered by selecting barcodes with >3000 UMIs and fraction of mitochondrial 1381 counts being below 0.2. Total counts were quantile-quantile (O-O) downsampled among all samples. Gene-expression correlation analysis was performed after transcript per million (TPM) normalization 1382 1383 and log10(1+TPM) scaling. To compare gene-expression for different transcript length, gffutils was 1384 used to extract transcripts length from GTF files used to make the genome reference. Gene expression 1385 was compared between platforms at different length cutoffs. To generate UMI saturation curves, 1386 random sampling was used to sample barcode-umi-gene combinations from output aligned and sorted bam files to generate a table of number of UMIs and reads for each barcode at different sequencing 1387 1388 read depths.

1389

# 1390 Capsule ATAC-Seq data processing

Capsule ATAC-seq approach used pair-end sequencing to map out gDNA fragment length. WhileRead1 sequencing reads contain only the gDNA fragment, Read4 contains capsule barcodes followed

by a gDNA fragment. First, parts of Read4 sequencing reads corresponding to gDNA fragments were 1393 1394 extracted using *seqtk trimfq* command with a parameter -b 50. Sequencing reads were then processed 1395 as described above to generate demultiplexed, filtered and sorted FASTQ files twice, once for each 1396 gDNA read (Read1 and Read4). Next, fastq-pair was used to pair the two demultiplexed and filtered gDNA fragment FASTO files, which were then merged using NGmerge. Merged FASTO files were 1397 1398 aligned to merged human GRCh38.101 and mouse GRCm.101 index using bowtie2 (with parameter 1399 --very-sensitive, -p 4) and bam files were sorted using samtools sort function. Mitochondrial reads 1400 were counted and removed, followed by BAM file deduplication, sorting and indexing using samtools. Next a pysam script was used to move barcode sequences from BAM read headers to bam CB tag and 1401 1402 a string tag was appended to each barcode to label runs corresponding to different indices. Following 1403 this, bam files were merged for all the runs and Macs3 was used to call peaks (--nomodel, --shift "-1404 100", --extsize "200", -B, --SPMR, --keep-dup "all"). HTSeq and SnapATAC python package was 1405 used to analyze the processed Capsule ATAC-seq data.

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#### 1407 <u>Capsule colony RNA sequencing</u>

*Preprocessing.* Read mapping and cell filtering based on counts and mitochondrial fraction were carried out as described above. Raw counts were then normalized to 10,000 counts per cell (CP10K).
Highly variable genes were selected using Scanpy's implementation of the Seurat v3 approach (sc.pp.highly\_variable\_genes with flavor='seurat\_v3'; 4,000 genes for K562 cells and 5,000 genes for L1210 cells; using unnormalized counts for variance calculations).

1413

1414 Mock colony generation. Mock-colony size-matched controls were generated using a count-based 1415 resampling approach. Let  $\{n_1, \ldots, n_M\}$  be the total counts for the M cells sampled for a given timepoint 1416 and condition in the real data. For each value of  $n_k$ , we generated a mock cell with the same total counts by (1) randomly sampling single cells (time point 0 transcriptomes) from the corresponding 1417 1418 condition, (2) combining raw unnormalized counts to match or exceed target colony sizes, with a minimum of  $2^{t/days}$  cells from time point 0 combined for mock colonies at time t, and enough cells such 1419 1420 that that the total counts equal or exceed  $n_k$ ; then (3) downsampling the counts to  $n_k$ . The mock colonies were then processed as the real colonies, except where stated otherwise below. 1421

1422

1423 Visualizing variable genes in colonies. Gene coefficient of variation (CV) vs mean plots were generated by first calling scanpy's sc.pp.highly variable genes as described above to obtain means, 1424 1425 variance and normalized variances for every time point and replicate in for control (untreated samples), 1426 for real data and mock clones. The values for each gene were then weighted averaged over the three control replicate samples for colonies from days 4 and 6, weighted by the number of colonies sampled 1427 1428 per library. Gene-gene correlation maps were similarly generated for the real data by first calculating 1429 pairwise gene correlations within each sample, and then obtaining the weighted average correlation 1430 across the three untreated replicates. The top 150 variable genes were selected after filtering out 1431 mitochondrial, ribosomal and other predefined gene sets using exclusion lists. For the heatmap of the 1432 mean correlations, the genes were hierarchically clustered using average linkage clustering.

1433

Dimensionality reduction. Non-negative matrix factorization (NMF) was performed on the highly
 variable genes using scikit-learn's NMF implementation with the following parameters: init='nndsvd',
 random\_state=0, n\_iter=400, alpha\_W=0, alpha\_H=0, 11\_ratio=1.0, and tol=1e-3. The solver was set
 to 'cd' (coordinate descent). NMF was carried out on log10(1+CP10k)-transformed counts. To
 determine the optimal number of factors, we compared explained variance ratios between real and

permuted data across 1-20 components (3), with 5 permutations and sampling 10% of cells for
computational efficiency. This procedure identified the top 15 components as explaining variance
above-random and this number of NMF programs was used for both cell lines.

*Visualization by UMAP embedding.* For visualization only, batch effects from library preparation and
cell seeding were corrected using Harmony (Korsunsky et al., 2019) using the scanpy implementation,
with the following non-default parameters: theta=4.0, lambda=10.0, and sigma=0.05. Harmony was
applied to the 15 NMF program usages per cell. A nearest neighbor graph was constructed using the
Harmony-corrected program usages with n\_neighbors=10, and scanpy's UMAP was then applied to
the batch-corrected embedding with default parameters.

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*Heatmaps of NMF gene loadings.* For heatmaps of gene contributions to NMF programs, the NMF
loading matrix ("H" matrix in scikit-learn) was normalized by dividing each gene's loading by its mean
non-zero expression level (calculated as mean expression when expressed / fraction of cells
expressing). The genes shown in the final heatmaps were filtered to remove mitochondrial genes and
non-coding genes to improve interpretability, and ordered by descending normalized loading values.

1455

*NMF usage means, CVs and Fano Factors.* NMF program usage values were first normalized for each
cell such that the sum of usages across all programs equaled 1. The mean, CV, and Fano factor of each
program's usage across colonies was then calculated at each timepoint. To calculate mock colony CV
and Fano factors, we corrected for systematic differences in means over time by regressing the CVs
using the power law relationship observed between mean and CV. For comparisons across conditions,
each metric was normalized to its value in control colonies at the same timepoint.

1462

1463 Machine learning program ON/OFF switching rates. A model of stochastic state transitions within 1464 cells of an expanding clone was fit to the distribution of usages for each NMF program over time, in each condition. Referring to Supplemental Text for details on the model, the parameters are: the on 1465 rate ( $r_{01}$  / cell cycle), the off rate ( $r_{10}$  / cell cycle), the initial state probability ( $p_0$ ), the NMF program 1466 usage background level ( $\epsilon$ ), and the NMF program usage expression scale and noise parameters 1467  $(a, b, \sigma, \sigma_0)$ . These parameters were inferred by Markov Chain Monte Carlo (MCMC) sampling using 1468 PyMC, with a prior distribution and likelihood as defined in Supplemental Text 1. To generate the 1469 likelihood, we carried out  $1.6 \cdot 10^6$  simulations of stochastic cell state switching with different rates 1470 1471  $(r_{01}, r_{10})$  and then trained a surrogate neural network model (2 hidden layers: 64, 32 nodes) to predict the number of cells in states (0,1) in each clone over time t, enabling rapid likelihood computation 1472 1473 during MCMC inference. Parameters were inferred using 8 parallel MCMC chains of 2,000 samples 1474 each after 2,000 tuning steps. Convergence was assessed using the Gelman-Rubin statistic. Rates  $(r_{10}, r_{10})$  increasing following drug treatment imply shorter persistence time for a given NMF program, 1475 while the opposite implies longer persistence. Code implementing simulations, surrogate model 1476 training and MCMC inference will be available at github.com/AllonKleinLab/ 1477