

303 Supplementary Figures:

Extended Data Fig. 1. Scheme of plasmids and experiment procedures of PerturbSci. a. The vector 305 306 system used in *PerturbSci* for dCas9 and sgRNA expression. The expression of the enhanced CRISPRi silencer dCas9-KRAB-MeCP2¹¹ was controlled by the tetracycline responsive (Tet-on) promoter. A GFP 307 308 sequence was added to the original CROP-seq-opti plasmid⁹ as an indicator of successful sgRNA 309 transduction and for the lentivirus titer measurement. **b**. The library preparation scheme and the final 310 library structures of PerturbSci, including a scalable combinatorial indexing strategy with direct sgRNA capture and enrichment that reduced the library preparation cost, enhanced the sensitivity of the sgRNA 311 capture compared to the original CROP-seq⁸, and avoided the extensive barcodes swapping detected in 312 313 Perturb-seq⁹.







319 P_R1, partial TruSeq read1 sequence. **b-c.** A 96-well plate was divided into 4 parts and RT was performed

320 using different combinations of sgRNA capture primers and shortdT primers. After ligation, cells were 321 mixed and redistributed for SSS. We tested the capture efficiency of sgRNA by different RT primers in 322 PerturbSci using "Direct PCR" and tested the efficiency of by-product removal by "sgRNA-only PCR" 323 (Scheme shown in b) followed by gel electrophoresis for analyzing the PCR product (c). Crosses in b, 324 potential Tn5 tagmentation sites. As shown in c, sgRNA primer 2 and 3 yielded strongest amplification 325 signals following PCR, while primer1 and 4 recovered weak signals. In addition, tagmentation removed 326 large by-products generated potentially from polyT priming (as shown in b). d. We tested different 327 conditions in post-multiplex PCR purification to obtain the input for the sgRNA enrichment PCR that 328 could maximize the recovery of the sgRNA library. Left lane: 0.7x-1.5x double-size AMPURE beads 329 purification followed by the sgRNA enrichment PCR reaction. Middle lane: 0.8x-1.2x AMPURE beads 330 purification followed by the sgRNA enrichment PCR reaction. Right lane: Gel extraction on multiplex PCR product within 175-275 bp range followed by the sgRNA enrichment PCR reaction. The recovered 331 332 sgRNA libraries generated from gRNA primer2 and 3 were marked on the gel image. Based on the result, 333 the sgRNA primer2 and the 0.8-1.2x AMPURE beads purification condition yielded the best performance. 334 e. A representative gel image of the final libraries of *PerturbSci*, including the sgRNA library (Lane 1) 335 and the whole transcriptome library (Lane 2). f-i. We tested different concentrations of sgRNA RT primers 336 in the PerturbSci experiment using 3T3-L1-CRISPRi cells transduced with either sgFto and sgNTC. The 337 box plots show the number of unique sgRNA transcripts (f) or mRNA transcripts (g) detected per cell, the 338 cell recovery rate (h) and sgRNA capture purity (i) across different sgRNA RT primer concentrations. j-339 k. We performed PerturbSci experiment with 3T3-L1-CRISPRi cells transduced with sgFto and sgNTC 340 in a pooled or separate manner. The box plots show the number of unique sgRNA transcripts detected per 341 cell (j) and sgRNA capture purity (k) across the two conditions. I. Scatter plot showing the correlation between log2-transformed aggregated gene expression profiled by PerturbSci and EasvSci¹⁰ in the mouse 342 343 3T3-L1-CRISPRi cell line.



347 Extended Data Fig. 3. Representative optimizations on fixation conditions of *PerturbSci-Kinetics*. 348 We aimed to search for an optimal fixation condition that can i) minimize the cell loss during the fixation 349 and chemical conversion, ii) reduce the RNA cross-contamination, iii) be compatible with in-situ 350 combinatorial indexing of cellular transcriptomes. a-c. We tested different cell fixation conditions on 351 HEK293-idCas9 cells followed by *PerturbSci* profiling and quantified the fraction of cells that were 352 assigned to different groups (a), the number of unique sgRNA (b) and mRNAs (c) detected per cell. PFA 353 fixation conditions at the room temperature (RT) were too strong to recover sufficient signals. FA fixation 354 at 4°C yielded higher total UMI counts but showed stronger cross-contamination, indicating that under 4°C it was a milder fixative compared to 4% PFA. d. Scatter plot showing the number of unique mRNA 355 356 transcripts recovered from human HEK293-idCas9 cells and mouse 3T3 cells in a *PerturbSci* experiment. 357 The human and mouse cell mixture was fixed by 4°C PFA+BS3 condition. Reads were aligned to a 358 combined human-mouse reference genome and the species origins of single cells were identified by the 359 fraction of species-specific read counts. The clear separation of cells from two species indicated the good

360 compatibility of this fixation condition with PerturbSci. e-f. Dot plots showing the relative recovery rate 361 (with standard error of the mean) of HEK293-idCas9 cells in different fixation conditions (n = 4) following 362 HCl permeabilization (d) and chemical conversion (e). All values were normalized by the standard condition used in sci-fate (PFA fixation)¹⁴. g. Box plot showing the number of unique transcripts detected 363 364 per cell with or without chemical conversion. Fixation conditions included in the plots: 4°C PFA+BS3: 365 cells were fixed with 4% PFA in PBS for 15 minutes, and were further fixed by 2mM BS3 during and 366 after Triton-X100 permeabilization (Methods). 4°C FA+BS3: cells were fixed with 1% Formaldehyde (FA) in PBS for 10 minutes, and were further fixed by 2mM BS3 during and after Triton-X100 367 368 permeabilization. 4°C FA: cells were only fixed once with 1% Formaldehyde (FA) in PBS for 10 minutes. 4°C PFA: cells were only fixed once with 4% PFA in PBS for 15 minutes as sci-fate¹⁴. 369

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375 Extended Data Fig. 4. Optimization of the computational pipeline for nascent reads calling. a-c. Bar plots showing the normalized mismatch rates of all 12 mismatch types detected in unconverted cells (a), 376 377 converted cells (b), and the original sci-fate A549 dataset¹⁴ (c) at different positions of the reads using the original sci-fate mutation calling pipeline¹⁴. **d-f.** Bar plots showing the normalized mismatch rates of all 378 12 mismatch types detected in unconverted cells (d), converted cells (e), and the original sci-fate A549 379 dataset¹⁴ (f) at different positions of the reads using the updated mutation calling pipeline. Considering 380 381 the different sequencing lengths between the present dataset and sci-fate, the Read2 from sci-fate were 382 trimmed to the same length as the present dataset before processing. Compared to the original pipeline, 383 the updated pipeline further filtered the mismatch based on the CIGAR string and only mismatches with 384 "CIGAR = M" were kept. As shown in the result, this optimized pipeline efficiently removed the unaligned 385 mismatches enriched at the 5' and 3' end of reads. Normalized mismatch rates in each bin, the percentage 386 of each type of mismatch in all sequencing bases within the bin.



Extended Data Fig. 5. Validation of the CRISPRi performance. Strongly reduced IGF-1R mRNA and protein levels in HEK293-idCas9 cells after Dox induction were further validated by a. RT-qPCR (n=4. ****, p-value < 1e-4, Tukey's test after ANOVA) and **b.** flow cytometry. Isotype, isotype control. αIGFIR, anti-IGF1R.



395 Extended Data Fig. 6. The changes in sgRNA abundance are consistent between replicates and 396 previously published data. a. Heatmap showing the overall Pearson correlations of normalized sgRNA read counts between the plasmid library and bulk screen replicates at different sampling times. For each 397 398 library, read counts of sgRNAs were normalized first by the sum of total counts and then by the counts of sgNTC. **b**. Box plot showing the reproducible trends of deletion upon CRISPRi between the present study 399 400 and a prior report²⁹. We calculated the fraction changes (After vs. before the CRISPRi induction) of sgRNAs for each gene, followed by log2 transformation. c. Bar plot showing the different extent of 401 402 deletion of cells receiving sgRNAs targeting genes in different categories in the bulk screen. The knockdown on genes with higher essentiality caused stronger cell growth arrest. 403

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Extended Data Fig. 7. Quality control and sgRNA filtering on the PerturbSci-Kinetics library. a. We 407 408 filtered out cells assigned to multiple gRNAs based on two criteria: the cell is defined as a sgRNA singlet 409 if the most abundant sgRNA in the cell took $\geq 60\%$ of total sgRNA counts and was at least 3-fold of the 410 second most abundant sgRNA. The histogram shows the fraction distribution of the most abundant sgRNA 411 in assigned singlets (78%) and doublet cells (22%). b-e. Dotplots showing the expression fold changes of 412 target genes upon CRISPRi induction compared to NTC. Each dot represents a sgRNA. Fold change < 413 0.6 was used for sgRNA filtering, and target genes with 3, 2, 1, 0 on-target sgRNA(s) were shown in b-e, 414 respectively. FC, fold change.

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418 Extended Data Fig. 8. A systematic view of the effects of perturbations on global synthesis rates, 419 global degradation rates, exonic reads ratio, and mitochondrial turnover rates. For each gene 420 category, we calculated the fraction of genetic perturbations associated with significant changes in global 421 synthesis rates (a), global degradation rates (b), fractions of exonic reads in the nascent transcriptome (c), 422 and mitochondrial RNA turnover rates (d). Overall global transcription could be affected by more genes 423 than degradation. Perturbation on essential genes, such as DNA replication genes, could affect both global synthesis and degradation. Perturbations on chromatin remodelers only specifically impaired the global 424 425 synthesis rates but not the degradation rates, supporting the established theory that gene expression is

426 regulated by chromatin folding. In addition to the enrichment of genes in transcription, spliceosome and

427 mRNA surveillance, perturbation on OXPHOS genes and metabolism-related genes also affected the RNA

428 processing, consistent with the fact that 5' capping, 3' polyadenylation, and RNA splicing are highly

429 energy-dependent processes. That knockdown of OXPHOS genes and metabolism-related genes could

430 reduce the mitochondrial transcriptome dynamics and also supported the complex feedback mechanisms

431 between energy metabolism and mitochondrial transcription⁵⁵.

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435 Extended Data Fig. 9. PerturbSci-kinetics identified LRPPRC as the master regulator of 436 mitochondrial RNA dynamics. a. Heatmap showing the relative fold changes of gene expression, 437 synthesis and degradation rates of mitochondrial protein-coding genes upon NDUFS2, CYC1, BCS1L and LRPPRC knockdown compared to NTC cells. Perturbation on genes encoding electron transport chain 438 439 components resulted in stable steady-state expression with impaired turnover. However, LRPPRC knockdown significantly disrupted the mitochondrial transcriptome dynamics by inhibiting the synthesis 440 441 of almost all mitochondrial protein-coding genes and promoting the degradation of multiple genes 442 including MT-ND6, MT-CO1, MT-ATP8, MT-ND4, MT-CYB and MT-ATP6. b. The heatmap on the left showed the mitochondrial protein-coding gene expression changes between wild-type and LRPPRC-443 knockout mice heart tissue, as reported by Siira, S.J., et al. ³⁷. The heatmap on the right showed the extent 444 445 of the mRNA secondary structure increase upon *Lrpprc* knockdown observed in the published study³⁷, which positively correlated with the elevated degradation rates of genes detected in our study (Pearson 446 447 correlation r = 0.708, p-value = 6.8e-3). The result further validated the mRNA-stabilizing mechanism of 448 Lrpprc. c. Bar plot showing the fraction of genes regulated by synthesis, degradation or both in 449 mitochondrial-encoded and nuclear-encoded DEGs. d. Bar plot showing the enrichment of ATF4/CEBPG

450 motifs at promoter regions of DEGs with or without significant synthesis changes. Nc DEGs w/o synth 451 changes, Nuclear-encoded differentially expressed genes without synthesis changes. Nc DEGs w/ synth 452 changes, Nuclear-encoded differentially expressed genes with synthesis changes. A large part of 453 synthesis-regulated nuclear-encoded DEGs showed motif enrichment, suggesting the activation of an 454 integrated stress response transcriptional program mediated by ATF4/CEBPG upon LRPPRC 455 knockdown⁴¹. 5kb regions around transcription start sites of input genes were used for motif scanning and 456 enrichment calculation using RcisTarget⁵⁶. We identified two transcription factors (ATF4 and CEBPG) 457 that were i) significantly upregulated upon LRPPRC knockdown ii) significantly over-represented in the 458 surroundings of the transcription start site of the synthesis-regulated nuclear-encoded DEGs (Normalized motif enrichment score of 16 for ATF4 and 16.6 for CEBPG). e. The transcriptional regulatory network 459 460 in *LRPPRC* perturbation inferred from our analysis. Notably, it was consistent with the prior study⁴¹ that ATF4 was regulated at both transcriptional and post-transcriptional levels. 461



Extended Data Fig. 10. *PerturbSci-Kinetics* captured the synthesis/degradation rates of DEGs upon perturbations. a-d. Box plots showing the log2 transformed fold changes of synthesis or degradation rates between perturbations and NTC cells for DE genes in four categories: synth up (DEGs with significantly increased synthesis rates), synth down (DEGs with significantly decreased synthesis rates), deg up (DEGs with significantly increased degradation rates), deg down (DEGs with significantly decreased degradation rates).

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471 Extended Data Fig. 11. The overview of the miRNA biogenesis pathway and perturbations on 472 pathway members. a. Illustration of the canonical miRNA biogenesis pathway. After the transcription of 473 miRNA host genes, the primary miRNA (pri-miRNA) forms into a hairpin and is processed by *Drosha*. Processed precursor miRNA (pre-miRNA) is transported to the cytoplasm by Exportin-5. The stem loop 474 is cleaved by *Dicer1*, and one strand of the double-stranded short RNA is selected and loaded into the 475 476 RISC for targeting mRNA⁴⁴. **b.** Venn diagram showing the overlap of upregulated DEGs across 477 perturbations on four genes encoding main members of the miRNA pathway. The knockdown of two critical RNases in this pathway (*i.e.*, *DROSHA* and *DICER1*) resulted in significantly overlapped DEGs 478 479 (p-value = 2.2e-16, Fisher's exact test). In contrast, AGO2 knockdown resulted in more unique 480 transcriptome features, and only 1 DEG (PRTG, identified to be mainly regulated by degradation and has 481 been reported as a miRNA target⁵⁷) overlapped with DEGs from DROSHA and DICER1 knockdown, 482 indicating the RNAi-independent roles of AGO2. Interestingly, XPO5 knockdown showed no upregulated DEGs, which is consistent with a previous report in which XPO5 silencing only minimally perturbed the 483 miRNA biogenesis, indicating the existence of an alternative miRNA transportation pathway⁴⁵. **c.** Bar plot 484 485 showing the fraction of upregulated DEGs driven by synthesis changes and degradation changes upon DROSHA, DICER1, and AGO2 perturbations. While DROSHA and DICER1 knockdown resulted in 486 487 increased synthesis and reduced degradation, AGO2 knockdown only affected gene expression transcriptionally, which was consistent with the previous finding that AGO2 knockdown resulted in a 488 489 global increase of synthesis rates (Fig 2e), and further supported its roles in nuclear transcription 490 regulation^{58–60}. As *Drosha* is upstream of *Dicer1* in the pathway, we indeed observed stronger effects of 491 DROSHA knockdown than DICER1 knockdown, which was supported by the previous study⁴⁵.

856 Supplementary Tables (provided as Microsoft Excel files)

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Supplementary Table 1: Genes and sgRNAs included in the study. Each gene ("gene_symbol") has 3
sgRNAs, and they were named in the format "Gene_number" ("names"). sgRNA sequences were included
in "sgRNA seq". The "gene class" is the functional category of each gene.

860 Supplementary Table 2: Raw sgRNA counts of the bulk screen samples collected at different time points.
861 Read counts of each sgRNA ("sgRNA name") from 4 replicates at day 0 and day 7 were included.

862 **Supplementary Table 3:** Relative sgRNA abundance fold changes between day 7 and day 0. The 863 "Day7 vs Day0 repX" is the fold changes of relative sgRNA abundance at the gene level (**Methods**).

864 Supplementary Table 4: Filtered differentially expressed genes between perturbations with cell 865 number ≥ 50 and NTC. For each gene ("Gene symbol"), the "perturbation" is the target gene in 866 perturbed cells. The "DEGs direction" is the direction of gene expression changes comparing perturbed cells to the NTC cells, and the "DEGs FC" is the fold change of the gene expression changes comparing 867 868 perturbed cells to the NTC cells. The "max.CPM.between.KD.NTC" and "min.CPM.between.KD.NTC" 869 are the pseudobulk expression levels of the gene that showed higher and lower expression in perturbed 870 cells or the NTC cells. The expression level was quantified by counts per million. The "qval" is the false 871 discovery rate (one-sided likelihood ratio test with adjustment for multiple comparisons).

872 Supplementary Table 5: Information about perturbations that showed significant global synthesis rate 873 changes. The "adj.p" is the false discovery rate adjusted for multiple comparisons. The "direction" is the 874 direction of the changes on the global synthesis rates distributions comparing perturbed cells to the NTC 875 cells, and the "KD_median/NTC_median" is the quantitative measurement of the changes. The 876 "gene_class" is the functional category of target genes ("Perturbations").

877 Supplementary Table 6: Information about perturbations that showed significant global degradation rate 878 changes. The "adj.p" is the false discovery rate adjusted for multiple comparisons. The "direction" is the 879 direction of the changes on the global degradation rates distributions comparing perturbed cells to the

NTC cells, and the "KD_median/NTC_median" is the quantitative measurement of the changes. The
"gene_class" is the functional category of target genes ("Perturbations").

Supplementary Table 7: Information about perturbations that showed significant nascent exonic reads ratio changes. The "adj.p" is the false discovery rate adjusted for multiple comparisons. The "direction" is the direction of the changes on the nascent exonic reads ratio distributions comparing perturbed cells to the NTC cells, and the "KD_median/NTC_median" is the quantitative measurement of the changes. The "gene_class" is the functional category of target genes ("Perturbations").

Supplementary Table 8: Information about perturbations that showed significant mitochondrial RNA turnover changes. The "adj.p" is the false discovery rate adjusted for multiple comparisons. The "direction" is the direction of the changes in the distributions of mitochondrial nascent/total reads ratio comparing perturbed cells to the NTC cells, and the "KD_median/NTC_median" is the quantitative measurement of the changes. The "gene_class" is the functional category of target genes ("Perturbations").

892 Supplementary Table 9: Steady-state expression and synthesis/degradation dynamics of mitochondrial 893 genes upon LRPPRC, NDUFS2, CYC1, BCS1L perturbations. The "synth rate", "synth FC", 894 "synth pval", "synth direction" are the synthesis rate of the gene in the perturbed cells, the fold change 895 of the synthesis rate of the gene in the perturbed cells compared to the NTC cells, the significance of the 896 synthesis rate change, and the direction of the synthesis rate changes. The "deg rate", "deg FC", 897 "deg pval", "deg direction" are the degradation rate of the gene in the perturbed cells, the fold change of 898 the degradation rate of the gene in the perturbed cells compared to the NTC cells, the significance of the 899 degradation rate change, and the direction of the degradation rate changes. The "DEG qval" and 900 "DEG fold.change" are the multiple comparison-corrected FDR and the fold change of the steady-state 901 gene expression change in perturbed cells compared to the NTC cells.

902 Supplementary Table 10: Differentially expressed genes with significant synthesis and/or degradation 903 changes. The "perturbations" is the target gene of the perturbed cells, and the "Gene_symbols" is the 904 symbols of DEGs with significant synthesis and/or degradation rate changes in corresponding 905 perturbations. The type of significant rate change of each gene is included in the "Regulation_type". The 906 "Synth_deg_FC", the "Synth_deg_direction", and the "Synth_deg_pval" reflect the fold change, the 907 direction of the change, and the randomization test p-value of the rate indicated in the "Regulation type".

"DEGs_FC", "DEGs_direction", and "max.expr.between.KD.NTC" are the fold changes of gene
expression, the direction of the change, and the maximum pseudobulk CPM between the corresponding
perturbation and the NTC cells.

911 Supplementary Table 11: Steady-state expression and synthesis/degradation dynamics of merged DEGs 912 upon DROSHA and DICER1 perturbations. The "synth rate", "synth FC", "synth pval", 913 "synth direction" are the synthesis rate of the gene in the perturbed cells, the fold change of the synthesis 914 rate of the gene in the perturbed cells compared to the NTC cells, the significance of the synthesis rate 915 change, and the direction of the synthesis rate changes. The "deg rate", "deg FC", "deg pval", 916 "deg direction" are the degradation rate of the gene in the perturbed cells, the fold change of the 917 degradation rate of the gene in the perturbed cells compared to the NTC cells, the significance of the 918 degradation rate change, and the direction of the degradation rate changes. The "DEG fold.change" and 919 "DEG qval" are the fold change of the steady-state gene expression change in perturbed cells compared 920 to the NTC cells and the multiple comparison-corrected FDR.

921 Supplementary files

922 Supplementary file 1: Detailed experiment protocols for *PerturbSci-Kinetics*, including all materials and
923 equipment needed, step-by-step descriptions, and representative gel images.

924 Supplementary file 2: Primer sequences used in the *PerturbSci-Kinetics* experiment. The design 925 principles and sequences of the oligo pool library, bulk screen sequencing primer, shortdT RT primers, 926 sgRNA capture primers, ligation primers, sgRNA inner i7 primers, and P5/P7 primers were included. The 927 columns indicate the positions on the 96-well plate (Well positions), an identifier of the sequence (Names), 928 the full primer sequence (Sequences), and the barcode sequence (Barcodes).

- 929 Supplementary file 3: The overall costs for *PerturbSci-Kinetics* library preparation. Reagents used in
 930 each step were included, and the costs were calculated based on the scale of the real experiment.
- 931 Supplementary file 4: Computational pipeline scripts and notes for processing *PerturbSci-Kinetics* data,
 932 from sequencer-generated files to single-cell gene count matrix.
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