

## RESEARCH ARTICLE SUMMARY

## CELL LINEAGE TRACING

# Whole-organism lineage tracing by combinatorial and cumulative genome editing

Aaron McKenna,\* Gregory M. Findlay,\* James A. Gagnon,\* Marshall S. Horwitz, Alexander F. Schier,† Jay Shendure†

**INTRODUCTION:** The developmental path by which a fertilized egg gives rise to the cells of a multicellular organism is termed the cell lineage. In 1983, John Sulston and colleagues documented the invariant cell lineage of the roundworm *Caenorhabditis elegans* as determined by visual observation. However, tracing cell lineage in nearly all other multicellular organisms is vastly more challenging. Contemporary methods rely on genetic markers or somatic mutations, but these approaches have limitations that preclude their application at the level of a whole, complex organism.

**RATIONALE:** For a technology to comprehensively trace cell lineages in a complex multicellular system, it must uniquely and incrementally mark cells and their descendants over many divisions and in a way that does not interfere with normal development. These unique marks must also accumulate irreversibly over time, allowing the reconstruction of lineage trees. Finally, the full set of marks must be read out from each of many single cells. We hypothesized that genome editing, which introduces diverse, irreversible edits in a highly programmable fashion, could be repurposed for cell

lineage tracing in a way that realizes these characteristics.

To this end, we developed a method termed genome editing of synthetic target arrays for lineage tracing (GESTALT). This method uses genome editing to generate a combinatorial diversity of mutations that accumulate over many cell divisions within a compact DNA barcode consisting of multiple clustered regularly interspaced short palindromic repeats (CRISPR)/Cas9 target sites. Lineage relationships can be readily queried by sequencing the edited barcodes and relating the patterns of edits observed.

**RESULTS:** We first developed this approach in cell culture, editing synthetic arrays of 9 to 12 CRISPR/Cas9 target sites to generate thousands of unique derivative barcodes. We show that edited barcodes can be read by targeted sequencing of either DNA or RNA. In addition, the rates and patterns of barcode editing are tunable and the diverse edits accumulate over successive divisions in a way that is informative of cell lineage.

We then applied GESTALT to the zebrafish *Danio rerio* by injecting fertilized eggs

with editing reagents that target a genomic barcode bearing 10 target sites. Across dozens of embryos, we demonstrate the accumulation of hundreds to thousands of uniquely edited barcodes per animal, from which lineage relationships can be inferred on the basis of shared mutations. In adult zebrafish, we evaluated the edited barcodes from ~200,000 cells and observed that the majority of cells in each organ are derived from a small number of progenitor cells. Furthermore, ancestral progenitors, inferred on the basis of shared mutations among subsets of cells, can contribute to different germ layers and organ systems.

**CONCLUSION:** Our proof-of-principle experiments show that combinatorial, cumulative genome editing of a compact barcode can be

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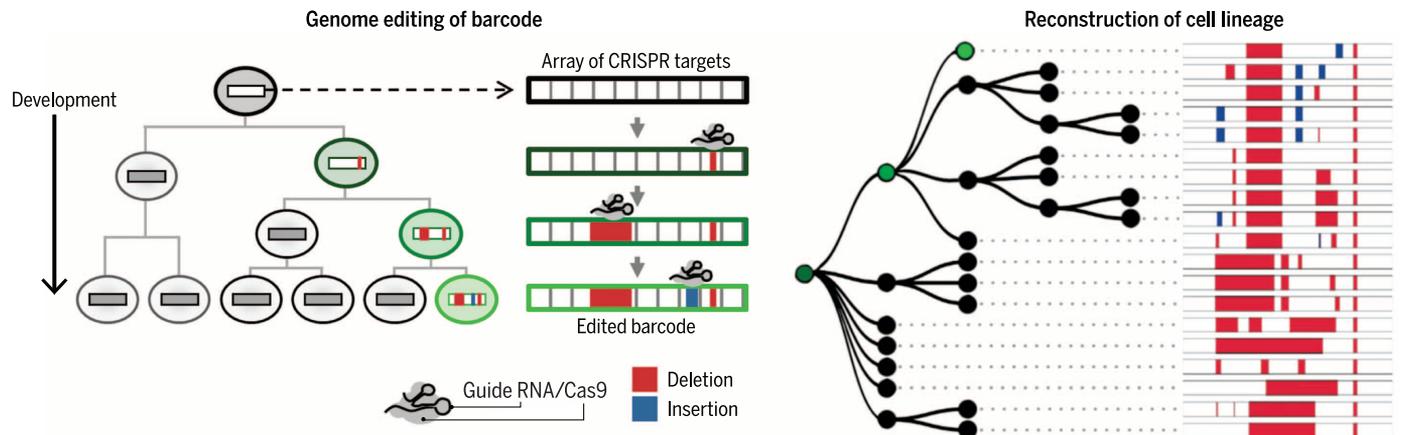
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used to record lineage information in multicellular systems. Further optimization of GESTALT will enable mapping of the complete cell lineage in

diverse organisms. This method could also be adapted to link cell lineage information to molecular profiles of the same cells. In the long term, we envision that rich, systematically generated maps of organismal development—wherein lineage, epigenetic, transcriptional, and positional information are concurrently captured at single-cell resolution—will advance our understanding of development in both healthy and disease states. More broadly, cumulative and combinatorial genome editing could stably record other types of biological information and history in living cells. ■

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**GESTALT.** (Left) A barcode of CRISPR/Cas9 target sites is progressively edited over many cell divisions. (Right) Edited barcode sequences are related to one another on the basis of shared mutations in order to reconstruct lineage trees.



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# Whole-organism lineage tracing by combinatorial and cumulative genome editing

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Multicellular systems develop from single cells through distinct lineages. However, current lineage-tracing approaches scale poorly to whole, complex organisms. Here, we use genome editing to progressively introduce and accumulate diverse mutations in a DNA barcode over multiple rounds of cell division. The barcode, an array of clustered regularly interspaced short palindromic repeats (CRISPR)/Cas9 target sites, marks cells and enables the elucidation of lineage relationships via the patterns of mutations shared between cells. In cell culture and zebrafish, we show that rates and patterns of editing are tunable and that thousands of lineage-informative barcode alleles can be generated. By sampling hundreds of thousands of cells from individual zebrafish, we find that most cells in adult organs derive from relatively few embryonic progenitors. In future analyses, genome editing of synthetic target arrays for lineage tracing (GESTALT) can be used to generate large-scale maps of cell lineage in multicellular systems for normal development and disease.

The tracing of cell lineages was pioneered in nematodes by Whitman in the 1870s, at a time of controversy surrounding Haeckel's theory of recapitulation, which argued that embryological development paralleled evolutionary history (1). This line of work culminated a century later in the complete description of mitotic divisions in the roundworm *Caenorhabditis elegans*—a tour de force facilitated by its visual transparency as well as the modest size and invariant nature of this nematode's cell lineage (2).

Over the past century, a variety of creative methods have been developed for tracing cell lineage in developmentally complex organisms (3). In general, subsets of cells are marked and their descendants followed as development progresses. The ways in which cell marking has been achieved include dyes and enzymes (4–6), cross-species transplantation (7), recombinase-mediated activation of reporter gene expression (8, 9), insertion of foreign DNA (10–12), and naturally occurring somatic mutations (13–15). However, despite many powerful applications, these methods have limitations for the large-scale reconstruction of cell lineages in multicellular systems. For example, dye and

reporter gene-based cell marking are uninformative with respect to the lineage relationships between descendant cells. Furthermore, when two or more cells are independently but equivalently marked, the resulting multitude of clades cannot be readily distinguished from one another. Although these limitations can be overcome in part with combinatorial labeling systems (16, 17) or through the introduction of diverse DNA barcodes (10–12), these strategies fall short of a system for inferring lineage relationships throughout an organism and across developmental time. In contrast, methods based on somatic mutations have this potential, as they can identify lineages and sublineages within single organisms (13, 18). However, somatic mutations are distributed throughout the genome, necessitating whole-genome sequencing (14, 15), which is expensive to scale beyond small numbers of cells and not readily compatible with in situ readouts (19, 20).

What are the requirements for a system for comprehensively tracing cell lineages in a complex multicellular system? First, it must uniquely and incrementally mark cells and their descendants over many divisions and in a way that does not interfere with normal development. Second, these unique marks must accumulate irreversibly over time, allowing the reconstruction of lineage trees. Finally, the full set of marks must be easily read out in each of many single cells.

We hypothesized that genome editing, which introduces diverse, irreversible edits in a highly programmable fashion (21), could be repurposed for cell lineage tracing in a way that realizes these requirements. To this end, we developed genome editing of synthetic target arrays for lineage

tracing (GESTALT), a method that uses clustered regularly interspaced short palindromic repeats (CRISPR)/Cas9 genome editing to accumulate combinatorial sequence diversity to a compact, multitarget, densely informative barcode. Edited barcodes can be efficiently queried by a single sequencing read from each of many single cells (Fig. 1A). In both cell culture and in the zebrafish *Danio rerio*, we demonstrate the generation of thousands of uniquely edited barcodes that can be related to one another to reconstruct cell lineage relationships. In adult zebrafish, we observe that the majority of cells of each organ are derived from a small number of progenitor cells. Furthermore, ancestral progenitors, inferred on the basis of shared edits among subsets of derived alleles, make highly nonuniform contributions to germ layers and organ systems.

## Results

### Combinatorial and cumulative editing of a compact genomic barcode in cultured cells

To investigate whether genome editing can be used to generate a combinatorial diversity of mutations within a compact region, we synthesized a contiguous array of 10 CRISPR/Cas9 targets separated by three base-pair (bp) linkers (total length of 257 bp). The first target perfectly matched one single-guide RNA (sgRNA), whereas the remainder were off-target sites for the same sgRNA, ordered from highest to lowest activity (22). This array of targets (v1 barcode) was cloned downstream of an enhanced green fluorescent protein (EGFP) reporter in a lentiviral construct (23). We then transduced human embryonic kidney (HEK) 293T cells with lentivirus and used fluorescence-activated cell sorting (FACS) to purify an EGFP-v1-positive population. To edit the barcode, we cotransfected these cells with a plasmid expressing Cas9 and the sgRNA and a vector expressing Discosoma red fluorescent protein (DsRed). Cells were sorted 3 days after transfection for high DsRed expression, and genomic DNA (gDNA) was harvested on day 7. The v1 barcode was polymerase chain reaction (PCR) amplified, and the resulting amplicons were subjected to deep sequencing.

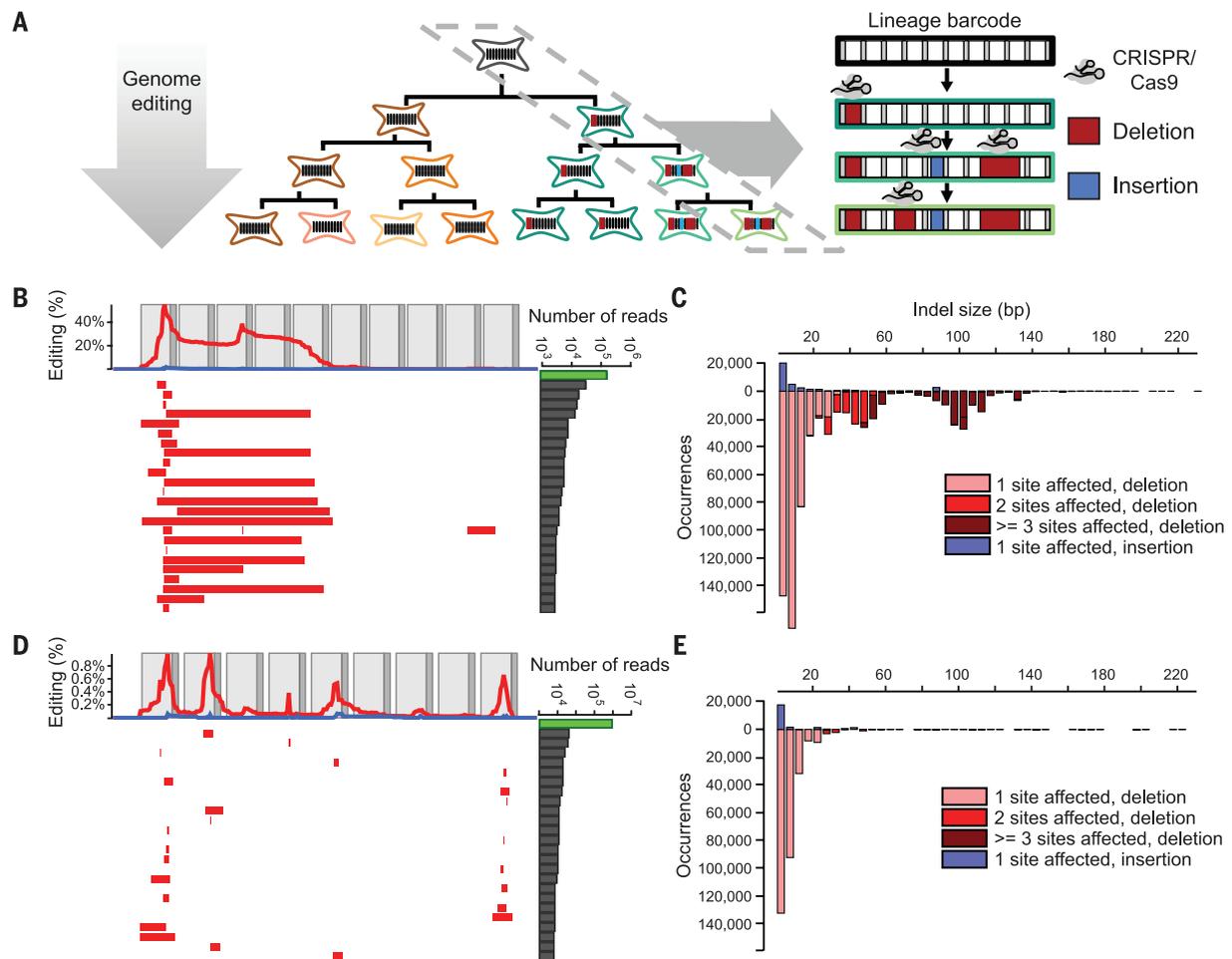
To minimize confounding sequencing errors, which are primarily substitutions, we analyzed edited barcodes for only insertion-deletion changes relative to the wild-type v1 barcode. In this first experiment, we observed 1650 uniquely edited barcodes (each observed in  $\geq 25$  reads), with diverse edits concentrated at the expected Cas9 cleavage sites, predominantly intertarget deletions involving sites 1, 3, and 5 or focal edits of sites 1 and 3 (Fig. 1, B and C, and table S1). These results show that combinatorial editing of the barcode can give rise to a large number of unique sequences, i.e., alleles.

To evaluate reproducibility, we transfected the same editing reagents to cultures expanded from three independent EGFP-v1-positive clones. Targeted reverse transcription PCR (RT-PCR) and sequencing of EGFP-v1 RNA showed similar distributions of edits to the v1 barcode in the transcript pool, between replicates as well as in comparison to

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**Fig. 1. GESTALT.** (A) An unmodified array of CRISPR/Cas9 target sites (i.e., a barcode) is engineered into a genome (gray cell). Editing reagents are introduced during expansion of cell culture or in vivo development of an organism, resulting in a unique pattern of insertions and deletions (right) that are stably accumulated in specific lineages (green cell lineage). The lineage relationships of alleles that differ in sequence can often be inferred on the basis of these accumulated edits. (B) The 25 most frequent alleles from the edited v1 barcode are shown. Each row corresponds to a unique sequence, with red bars indicating deleted regions and blue bars indicating insertion positions. Blue bars begin at the insertion site, with their width proportional to the size of the insertion, which will rarely obscure immediately adjacent deletions. The number of reads observed for each allele is plotted at the right (log10 scale; the green bar corresponds to the unedited allele). The frequency at which each base is deleted (red) or flanks an insertion (blue) is plotted at the top. Light gray boxes indicate the location of

CRISPR protospacers, and dark gray boxes indicate protospacer adjacent motif (PAM) sites. For the v1 array, intertarget deletions involving sites 1, 3, and 5 or focal (single target) edits of sites 1 and 3 were observed predominantly. (C) A histogram of the size distribution of insertion (top) and deletion (bottom) edits to the v1 array is shown. The colors indicate the number of target sites affected. Although most edits are short and affect a single target, a substantial proportion of edits are intertarget deletions. (D) We tested three array designs in addition to v1, each comprising 9 to 10 weaker off-target sites for the same sgRNA (v2 to v4) (22). Editing of the v2 array is shown with layout as described in (B). Editing of the v3 and v4 arrays is shown in fig. S3, A and B. The weaker sites within these alternative designs exhibit lower rates of editing than the v1 array but also a much lower proportion of intertarget deletions. (E) A histogram of the size distribution of insertion (top) and deletion (bottom) edits to the v2 array is shown. In contrast with the v1 array, almost all edits affect only a single target.

the previous experiment (fig. S1). These results show that the observed editing patterns are largely independent of the site of integration and that edited barcodes can be queried from either RNA or DNA.

To evaluate how editing outcomes vary as a function of Cas9 expression, we cotransfected EGFP-v1-positive cells with a plasmid expressing Cas9 and the sgRNA, as well as a DsRed vector, and after 4 days we sorted cells into low, medium, and high DsRed bins and harvested gDNA. Overall editing rates matched DsRed expression (frequency of non-wild-type barcodes: low DsRed = 40%; medium DsRed = 69%; high DsRed = 91%). The

profile of edits observed remained similar, but there were fewer intertarget deletions in the lower DsRed bins (fig. S2). These results show that adjusting expression levels of editing reagents can be used to modify the rates and patterns of barcode editing.

We also synthesized and tested three barcodes (v2 to v4) with nine or ten weaker off-target sites for the same sgRNA as used for v1 (22). Genome editing resulted in derivative barcodes with substantially fewer edits than seen with the v1 barcode, but a much greater proportion of these edits were to a single target site—i.e., fewer intertarget deletions were observed (Fig. 1, D and E, and fig.

S3, A and B). As only a few targets were substantially edited in designs v1 to v4, we combined the most highly active targets to a new, 12-target barcode (v5). This barcode exhibited more uniform usage of constituent targets, but with relative activities still ranging over two orders of magnitude (fig. S3C and table S1). These results illustrate the potential value of iterative barcode design.

To determine whether the means of editing reagent delivery influences patterns of barcode editing, we introduced a lentiviral vector expressing Cas9 and the same sgRNA to cells containing the v5 barcode (24). After 2 weeks of culturing a population

bottlenecked to 200 cells by FACS, we observed diverse barcode alleles, but with substantially fewer intertarget deletions than with episomal delivery of editing reagents (fig. S3D). This finding demonstrates that the allelic spectrum can also be modulated by the delivery mode of editing reagents.

Taken together, these results show that editing multiple target sites within a compact barcode can generate a combinatorial diversity of alleles, and also that these alleles can be read out by single sequencing reads derived from either DNA or RNA. Rates and patterns of barcode editing are tunable by using targets with different activities, and/or off-target sequences, by iteratively recombining targets to new barcode designs and by modulating the concentration and means of delivery of editing reagents.

### Reconstruction of lineage relationships in cultured cells

To determine whether GESTALT could be used to reconstruct lineage relationships, we applied it to a designed lineage in cell culture (Fig. 2). A monoclonal population of EGFP-v1-positive cells was transfected with editing reagents to induce a first round of mutations in the v1 barcode. Clones derived from single cells were expanded, sampled, split, and retransfected with editing reagents to induce a second round of mutations of the v1 barcode. For each clonal population, two 100-cell samples of the re-edited populations were expanded and harvested for gDNA. In these experiments, we began incorporating unique molecular identifiers (UMIs) (10 bp) during amplification of barcodes by a single round of polymerase extension (fig. S4A). Each UMI tags the single barcode present within each single cell, thereby allowing for correction of subsequent PCR amplification bias and enabling each UMI-barcode combination to be interpreted as deriving from a single cell (25).

Seven of 12 clonal populations we isolated contained mutations in the v1 barcode that were unambiguously introduced during the first round of editing (Fig. 2A). Additional edits accumulated in re-edited cells but generally did not disrupt the early edits (Fig. 2B and fig. S5). We next sought to reconstruct the lineage relationships between all alleles observed in the experiment using a maximum parsimony approach (fig. S4B) (26). The resultant tree contained major clades that were defined by the early edits present in each lineage (Fig. 2C). Four clonal populations (nos. 3, 5, 7, and 8) were cleanly separated upon lineage reconstruction, with >99.7% of cells accurately placed into each lineage's major clade. Two lineages (nos. 1 and 6) were mixed because they shared identical mutations from the first round of editing. These most likely represent the recurrence of the same editing event across multiple lineages but could also have been daughter cells subsequent to a single, early editing event prior to isolating clones. Consequently, 99.9% of cells of these two lineages were assigned to a single clade (Fig. 2C, blue). One clonal population (no. 4) appears to have derived from two independent cells, one of which harbored an unedited bar-

code. Later editing of these barcodes confounded the assignment of this lineage on the tree. Overall, however, these results demonstrate that GESTALT can be used to capture and reconstruct cell lineage relationships in cultured cells.

### Combinatorial and cumulative editing of a compact genomic barcode in zebrafish

To determine the potential of GESTALT for in vivo lineage tracing in a complex multicellular organism, we turned to the zebrafish *D. rerio*. We designed two new barcodes, v6 and v7, each with 10 sgRNA target sites that are absent from the zebrafish genome and predicted to be highly editable (see the supplementary materials). In contrast to v1 to v5, in which the target sites are variably editable by one sgRNA, the targets within v6 or v7 are designed to be edited by distinct sgRNAs. We generated transgenic zebrafish that harbor each barcode in the 3' UTR of DsRed driven by the ubiquitin promoter (27, 28) and a GFP marker that is expressed in the cardiomyocytes of the heart (fig. S6) (29). To evaluate whether diverse alleles could be generated by in vivo genome editing, we injected Cas9 and 10 different sgRNAs with perfect complementarity to the barcode target sites into single-cell v6 embryos (Fig. 3A). Editing of integrated barcodes had no noticeable effects on development (fig. S7). To characterize barcode editing in vivo, we extracted gDNA from a series of single 30-hours-post-fertilization (hpf) embryos, and UMI-tagged, amplified, and sequenced the v6 barcode. In control embryos (Cas9<sup>-</sup>) ( $n = 2$ ), all 4488 captured barcodes were unedited. In contrast, in edited embryos (Cas9<sup>+</sup>) ( $n = 8$ ), fewer than 1% of captured barcodes were unedited. We recovered barcodes from hundreds of cells per embryo (median 943; range 257 to 2832) and identified dozens to hundreds of alleles per embryo (median 225; range 86 to 1323). Within single embryos 41 ± 10% of alleles were observed recurrently, most likely reflecting alleles that were generated in a progenitor of two or more cells. Fewer than 0.01% of alleles were shared in pairwise comparisons of embryos, revealing the highly stochastic nature of editing in different embryos. These results demonstrate that GESTALT can generate very high allelic diversity in vivo.

### Reconstruction of lineage relationships in embryos

To evaluate whether lineage relationships can be reconstructed using edited barcodes, we focused on the v6 embryo with the lowest rates of intertarget deletions and edited target sites (Fig. 3B; avg. 58% ± 27% of target sites no longer a perfect match to the unedited target, compared to 87% ± 21% for all other 30 hpf v6 embryos). Application of our parsimony approach (fig. S4B) to the 1,961 cells in which we observed 1,323 distinct alleles generated the large tree shown in Fig. 4. 1,307 of the 1,323 (98%) alleles could be related to at least one other allele by one or more shared edits, 85% by two or more shared edits, and 56% by three or more shared edits. These results illustrate the principle of using patterns

of shared edits between distinct barcode alleles to reconstruct their lineage relationships in vivo.

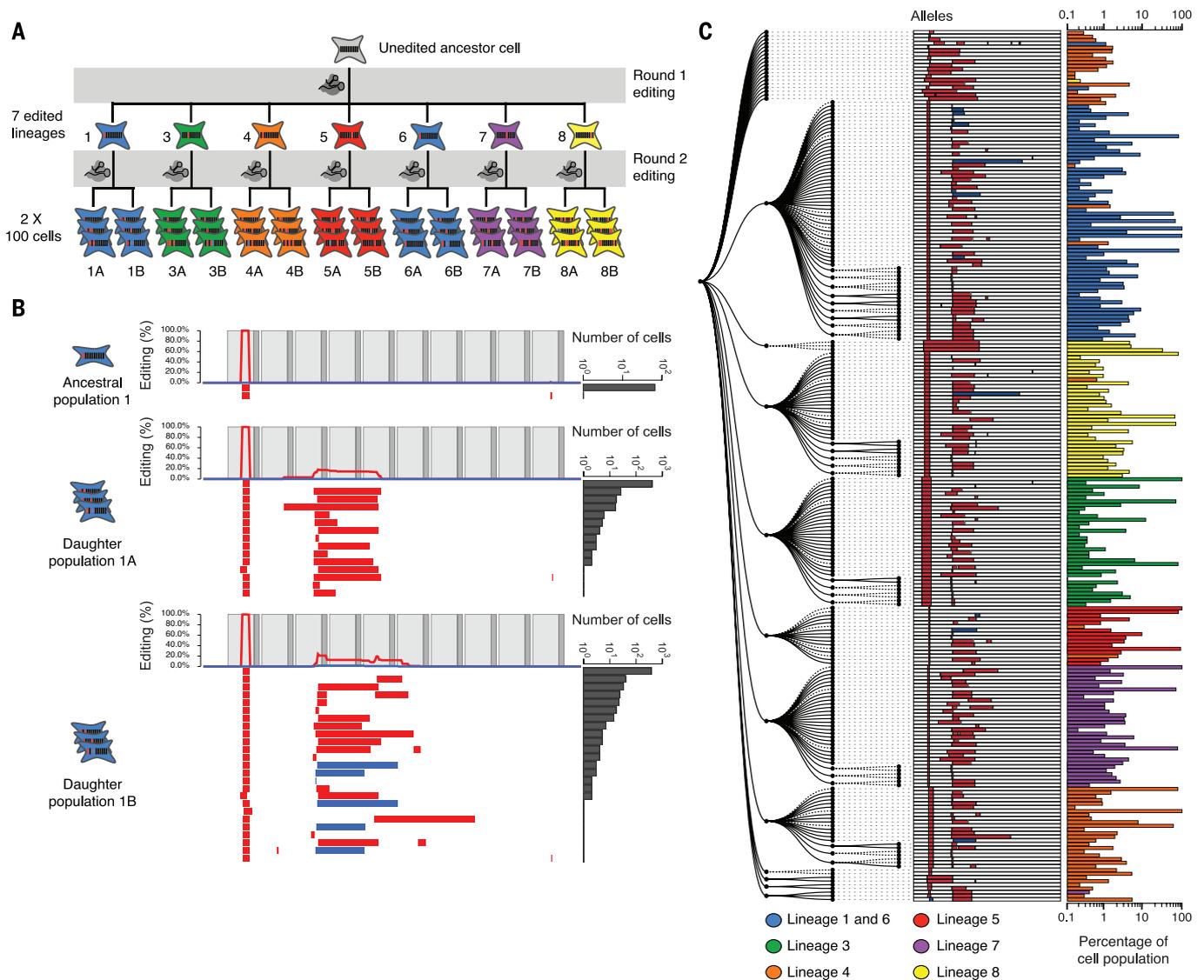
### Developmental timing of barcode editing

To determine the developmental timing of barcode editing, we injected Cas9 and 10 sgRNAs into one-cell stage v7 transgenic embryos and harvested genomic DNA before gastrulation (dome stage, 4.3 hpf;  $n = 10$  embryos), after gastrulation (90% epiboly/bud stage, 9 hpf;  $n = 11$  embryos), at pharyngula stage (30 hpf;  $n = 12$  embryos), and from early larvae (72 hpf;  $n = 12$  embryos) (Fig. 3A). We recovered barcode sequences from a median of 8785 cells per embryo (range 461 to 31,640; total of 45 embryos), comprising a median of 1223 alleles per embryo (range 15 to 4195) (Fig. 3C). Within single embryos, 65 ± 6% of alleles were observed recurrently, whereas in pairwise comparisons of embryos only 2 ± 5% of alleles were observed recurrently. The abundances of alleles were well correlated between technical replicates for each of two 72-hpf embryos (fig. S8, A and B), and alleles containing many edits were more likely to be unique to an embryo than those with few edits (fig. S8C). To assess when editing begins, we analyzed the proportions of the most common editing events across all barcodes sequenced in a given embryo, reasoning that the earliest edits would be the most frequent. Across 8 v6 and 45 v7 embryos, we never observed an edit that was present in 100% of cells. This observation indicates that no permanent edits were introduced at the one-cell stage. In nearly all embryos, we observed that the most common edit is present in >10% of cells, and in some cases in ~50% of cells (Fig. 3D and fig. S9). This observation also holds in ~4000-cell dome-stage embryos, which result from ~12 rounds of largely synchronous division unaccompanied by cell death. Most of these edits are rare or absent in other embryos, suggesting that they are unlikely to have arisen recurrently within each lineage. These results suggest that the edits present in ~50% of cells were introduced at the two-cell stage and that the edits present in >10% of cells were introduced before the 16-cell stage.

How long does barcode editing persist? Two aspects of the data suggest that it tapers relatively early in development. First, in dome-stage embryos (4.3 hpf), we captured barcodes from a median of 2086 cells, in which a median of 4.8 targets were edited. Although the number of cells and alleles that we were able to sample increased at the later developmental stages, the proportion of edited sites appeared relatively stable (Fig. 3C). If editing were occurring throughout this time course, we would instead expect the proportion of edited sites to increase substantially. Second, the number of unique alleles appears to saturate early, never exceeding 4200 (Fig. 3E). For example, only 4195 alleles were observed in a 72-hpf embryo in which we sampled the highest number of cells ( $n = 31,639$ ). These results suggest that the majority of editing events occurred before dome stage.

### Editing diversity in adult organs

To evaluate whether barcodes edited during embryogenesis can be recovered in adults, we dissected



**Fig. 2. Reconstruction of a synthetic lineage based on genome editing and targeted sequencing of edited barcodes.** (A) A monoclonal population of cells was subjected to editing of the v1 array. Single cells were expanded, sampled (nos. 1 to 12), retransfected to induce a second round of barcode editing, and then expanded and sampled from 100-cell subpopulations (1a and 1b to 12a and 12b). For clarity, the five clones where the original population was unedited are not shown. (B) Alleles observed in the synthetic lineage experiment are shown, with layout as described in the Fig. 1B legend. Cell population 1 represents sampling of cells that had been subjected to only the first round of editing; virtually all cells contain a shared edit to the first target. Populations 1a and 1b are derived from 1 but are subjected to a second

round of editing prior to sampling. These retain the edit to the first target, but subpopulations bear additional edits to other targets. (C) Maximum parsimony reconstruction using PHYLIP Mix (see Materials and Methods and fig. S4B) from alleles seen two or more times in the seven cell lineages represented in (A). Lineage membership and abundance of each allele are shown on the right. Progenitor cell lineage 4 (orange) appears to be derived from two cells, one edited and the other wild-type. Only 62% of lineage 4 falls into a single clade, consistent with the proportion (64%) of the lineage edited after the first round. We assume that cells unedited in the first round either accrued edits matching other lineages (thus causing mixing) or accrued different edits (thus remaining outside the major clades).

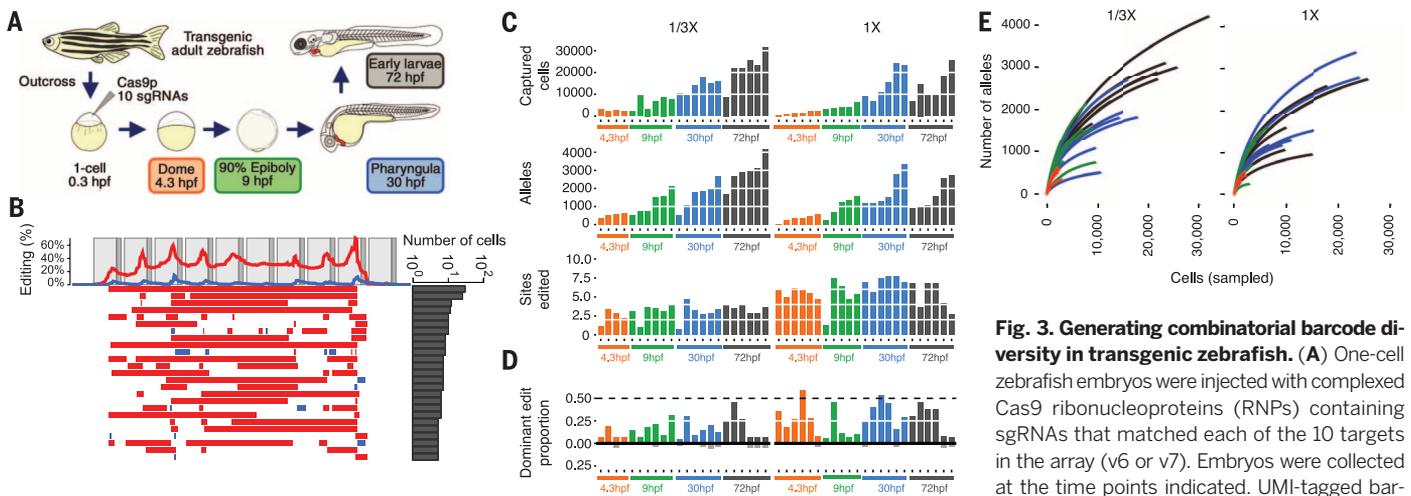
two edited 4-month-old v7 transgenic zebrafish (ADR1 and ADR2) (Fig. 5A). We collected organs representing all germ layers: the brain and both eyes (ectodermal), the intestinal bulb and posterior intestine (endodermal), the heart and blood (mesodermal), and the gills (neural crest, with contributions from other germ layers). We further divided the heart into four samples: a piece of heart tissue, dissociated unsorted cells (DHCs), FACS-sorted GFP<sup>+</sup> cardiomyocytes, and noncardiomyocyte heart cells (NCs) (fig. S10). We isolated genomic DNA

from each sample, amplified and sequenced edited barcodes with high technical reproducibility (fig. S11), and observed barcode editing rates akin to those in embryos (fig. S12). For zebrafish ADR1, we captured barcodes from between 776 and 44,239 cells from each tissue sample (median 17,335), corresponding to a total of 197,461 cells and 1138 alleles. For zebrafish ADR2, we captured barcodes from between 84 and 52,984 cells from each tissue sample (median 20,973), corresponding to a total of 217,763 cells and 2016 alleles. These results

show that edits introduced to the barcode during embryogenesis are inherited through development and tissue homeostasis and can be detected in adult organs.

#### Differential contribution of embryonic progenitors to adult organs

To analyze the contribution of diverse alleles to different organs, we compared the frequency of edited barcodes within and between organs. We first examined blood [of note, zebrafish erythrocytes



**Fig. 3. Generating combinatorial barcode diversity in transgenic zebrafish.** (A) One-cell zebrafish embryos were injected with complexed Cas9 ribonucleoproteins (RNPs) containing sgRNAs that matched each of the 10 targets in the array (v6 or v7). Embryos were collected at the time points indicated. UMI-tagged barcodes were amplified and sequenced from the

genomic DNA. (B) Patterns of editing in alleles recovered from a 30-hpf v6 embryo, with layout as described in the Fig. 1B legend. (C) Bar plots show the number of cells sampled (top), unique alleles observed (middle), and the average number of sites edited (bottom) for 45 v7 embryos collected at four developmental time points and two levels of Cas9 RNP (1/3x and 1x). Colors correspond to stages shown in (A). Although more alleles are observed with sampling of larger numbers of cells at later time points, the proportion of target sites edited remains relatively constant. (D) Bar plots show the proportion of edited barcodes containing the most common editing event in a given embryo. Six of 45 embryos had the most common edit in approximately 50% of cells (dashed line), consistent with this edit having occurred at the two-cell stage (see fig. S8A for example). Colors correspond to stages shown in (A). These same edits are rarer or absent in other embryos (gray bars below). (E) For each of the 45 v7 embryos, all barcodes observed were sampled without replacement. The cumulative number of unique alleles observed as a function of the number of cells sampled is shown (average of the 500 iterations shown per embryo; two levels of Cas9 RNP: 1/3x on left, 1x on right). The number of unique alleles observed, even in later developmental stages where we are sampling much larger numbers of cells, appears to saturate, and there is no consistent pattern supporting substantially greater diversity in later time points, consistent with the bottom row of (C) in supporting the conclusion that the majority of editing occurs before dome stage.

are nucleated (30)]. Only five alleles defined over 98% of cells in the ADR1 blood sample (Fig. 5B), suggesting highly clonal origins of the adult zebrafish blood system from a few embryonic progenitors. Consistent with the presence of blood in all dissected organs, these common blood alleles were also observed in all organs (10 to 40%) (Fig. 5C) but largely absent from cardiomyocytes isolated by flow sorting (0.5%). Furthermore, the relative proportions of these five alleles remained largely constant in all dissected organs, suggesting that they primarily mark the blood and do not substantially contribute to nonblood lineages (Fig. 5D). In performing similar analyses of clonality across all organs (while excluding the five most common blood alleles), we observed that a small subset of alleles dominates each organ (Fig. 5E). Indeed, for all dissected organs, fewer than 7 alleles comprised >50% of cells (median 4, range 2 to 6), and, with the exception of the brain, fewer than 25 alleles comprised >90% of cells (median 19, range 4 to 38). Most of these dominant alleles were organ-specific—i.e., although they were found rarely in other organs, they tended to be dominant in only one organ (Fig. 5F). For example, the most frequent allele observed in the intestinal bulb comprised 13.6% of captured nonblood cells observed in that organ but <0.01% of cells observed in any other organ. There are exceptions, however. For example, one allele is observed in 24.7% of sorted cardiomyocytes, 13.4% of the intestinal bulb, and at lower abundances in all other organs. Similar results were observed in ADR2 (fig. S13). These results indicate that the majority of cells in diverse adult organs are

descended from a few differentially edited embryonic precursors.

### Reconstructing lineage relationships in adult organs

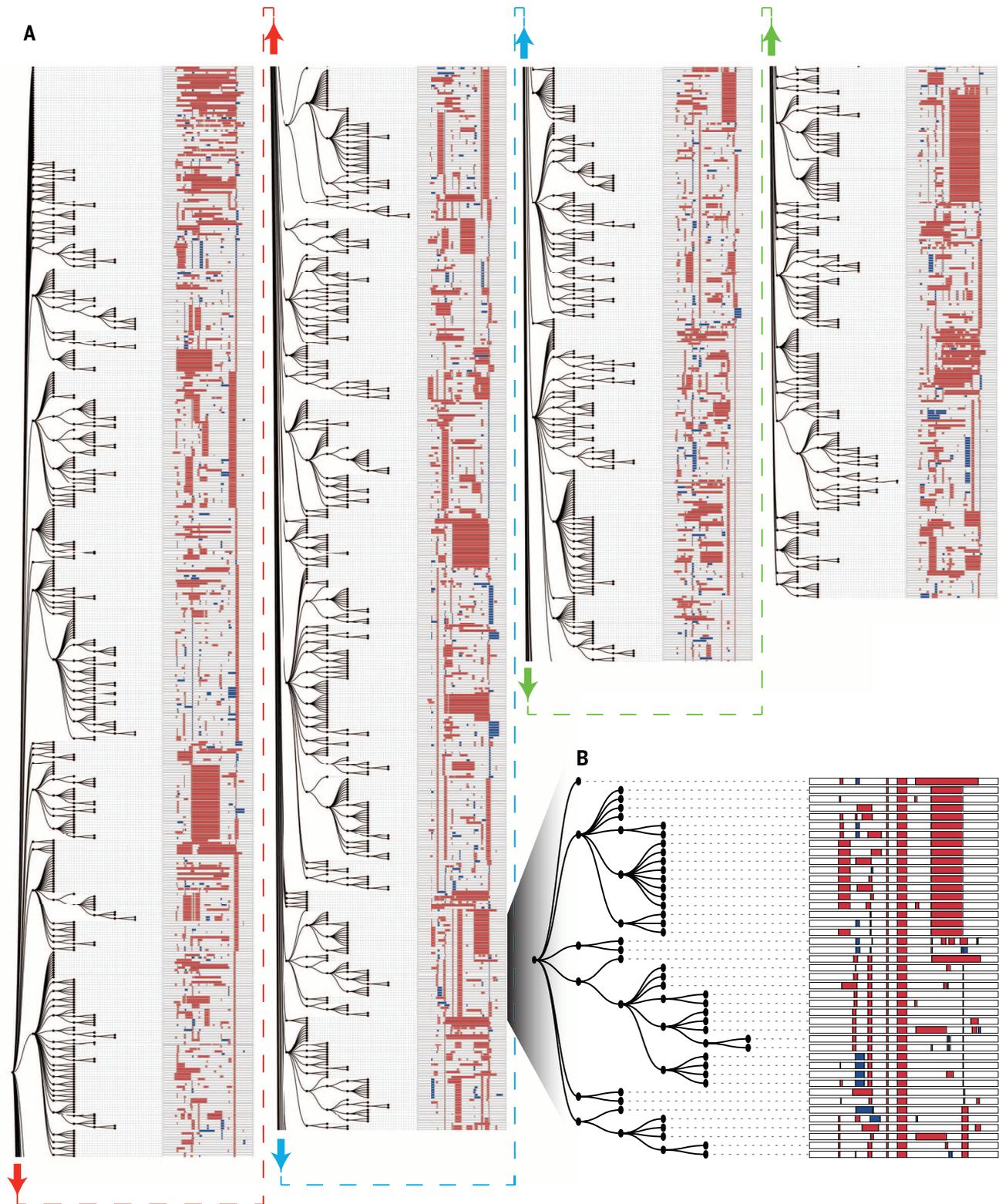
To reconstruct the lineage relationships between cells both within and across organs on the basis of shared edits, we again relied on maximum parsimony methods (fig. S4B). The resulting trees for ADR1 and ADR2 are shown in Fig. 6 and fig. S14, respectively. We observed clades of alleles that shared specific edits. For example, ADR1 had eight major clades, each defined by “ancestral” edits that are shared by all captured cells assigned to that clade (Fig. 7A; also indicated by colors in the tree shown in Fig. 6). Collectively, these clades comprised 49% of alleles and 90% of the 197,461 cells sampled from ADR1 (Fig. 7A). Blood was contributed to by three major clades (nos. 3, 6, and 7) (Fig. 7B). After reallocating the five dominant blood alleles from the composition of individual organs back to blood (Fig. 5B and fig. S15), we observed that all major clades made highly nonuniform contributions across organs. For example, clade 3 contributed almost exclusively to mesodermal and endodermal organs, while clade 5 contributed almost exclusively to ectodermal organs. These results reveal that GESTALT can be used to infer the contributions of inferred ancestral progenitors to adult organs.

Although some ancestral clades appear to contribute to all germ layers, we find that subclades, defined by additional shared edits within a clade, exhibit greater specificity. For example, although clade 1 contributes substantially to all organs

except blood, additional edits divide clade 1 into three subclades with greater tissue restriction (Fig. 7, C and D). The 1+A subclade primarily contributes to mesodermal organs (heart and both gastrointestinal organs), whereas the 1+C subclade primarily contributes to neuroectodermal organs (brain, left eye, and gills). Similar patterns are observed for clade 2 (Fig. 7, E and F), where the 2+A subclade contributes primarily to mesodermal organs, the 2+B subclade to the heart, and the 2-C subclade to neuroectodermal organs. Additional edits divide these subclades into further tissue-specific sub-subclades. For example, whereas the 2+A subclade is predominantly mesoderm, additional edits define 2+A+D (heart, primarily cardiomyocytes), 2+A+E (heart and posterior intestine), and 2+A+F (intestinal bulb). All of the major clades exhibit similar patterns of increasing restriction with additional edits (Fig. 7, C to F, and fig. S16). Similar observations were made in fish ADR2 (fig. S17). These results indicate that GESTALT can record lineage relationships across many cell divisions and capture information both before and during tissue restriction.

### Discussion

We describe a method, GESTALT, which uses combinatorial and cumulative genome editing to record cell lineage information in a highly multiplexed fashion. We successfully applied this method to both artificial lineages (cell culture) as well as to a whole organism (zebrafish). Full-tree reconstructions for cell culture, zebrafish embryo, and zebrafish adult experiments are provided at <http://gestalt.gs.washington.edu>.



**Fig. 4. Lineage reconstruction of an edited zebrafish embryo. (A)** A lineage reconstruction of 1323 alleles recovered from the v6 embryo also represented in Fig. 3B, generated by a maximum parsimony approach implemented in the PHYLIP Mix package (see Materials and Methods and fig. S4B). A dendrogram to the left of each column represents the lineage relationships, and the alleles are represented on the right. Each row represents a unique allele. Matched colored arrows and dashed lines connect subsections of the tree

together. There are many large clades of alleles sharing specific edits, as well as subclades defined by “dependent” edits. These dependent edits occur within a clade defined by a more frequent edit but are rare or absent elsewhere in the tree. **(B)** A portion of the tree is shown at higher resolution. Two edits are shared by all alleles in this clade. Six independent edits define descendant subclades within this clade, and further edits define additional sub-subclades within the clade.

### Fig. 5. Organ-specific progenitor cell dominance.

(A) The indicated organs were dissected from a single adult v7 transgenic edited zebrafish (ADR1). A blood sample was collected as described in the Methods. The heart was further split into the four samples shown (fig. S10). (B) Patterns of editing in the most prevalent 25 alleles (out of 135 total) recovered from the blood sample. Layout as described in the Fig. 1B legend. The most prevalent five alleles (indicated by asterisks) comprise >98% of observed cells. (C) Patterns of editing in the most prevalent 25 alleles (out of 399 total) recovered from brain. Layout as described in the Fig. 1B legend. Alleles that have identical editing patterns compared with the most prevalent blood alleles are indicated by asterisks and light shading. (D) The five dominant blood alleles (shades of red) are present in varying

proportions (10 to 40%) in all intact organs except the FACS-sorted cardiomyocyte population (0.5%). All other alleles are summed in gray. (E) The cumulative proportion of cells (y axis) represented by the most frequent alleles (x axis) for each adult organ of ADR1 is shown, as well as the adult organs in aggregate. In all adult organs except blood, the five dominant blood alleles are excluded. All organs exhibit dominance of sampled cells by a small number of progenitors, with fewer than seven alleles comprising the majority of cells. For

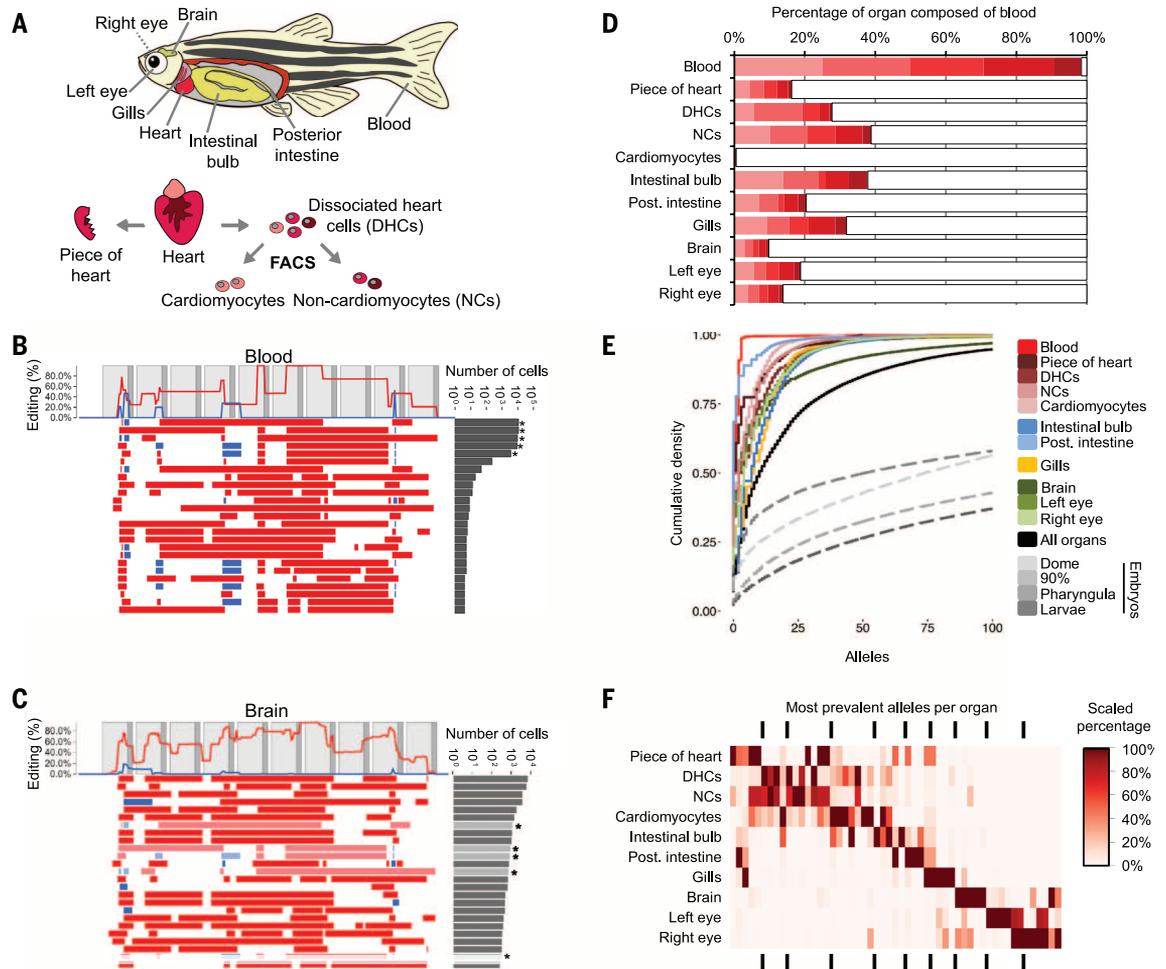
The strengths of GESTALT include (i) the combinatorial diversity of mutations that can be generated within a dense array of CRISPR/Cas9 target sites; (ii) the potential for informative mutations to accumulate across many cell divisions and throughout an organism's developmental history; (iii) the ability to scalably query lineage information from at least hundreds of thousands of cells and with a single sequencing read per single cell; and (iv) the likely applicability of GESTALT to any organism, from bacteria and plants to vertebrates, that allows genome editing, as well as human cells (e.g., tumor xenografts). Even in organisms in which transgenesis is not established, lineage tracing by genome editing may be feasible by expressing editing reagents to densely mutate an endogenous, nonessential genomic sequence.

Our experiments also highlight several remaining technical challenges. Chief among these are (i) the chance recurrence of identical edits or similar

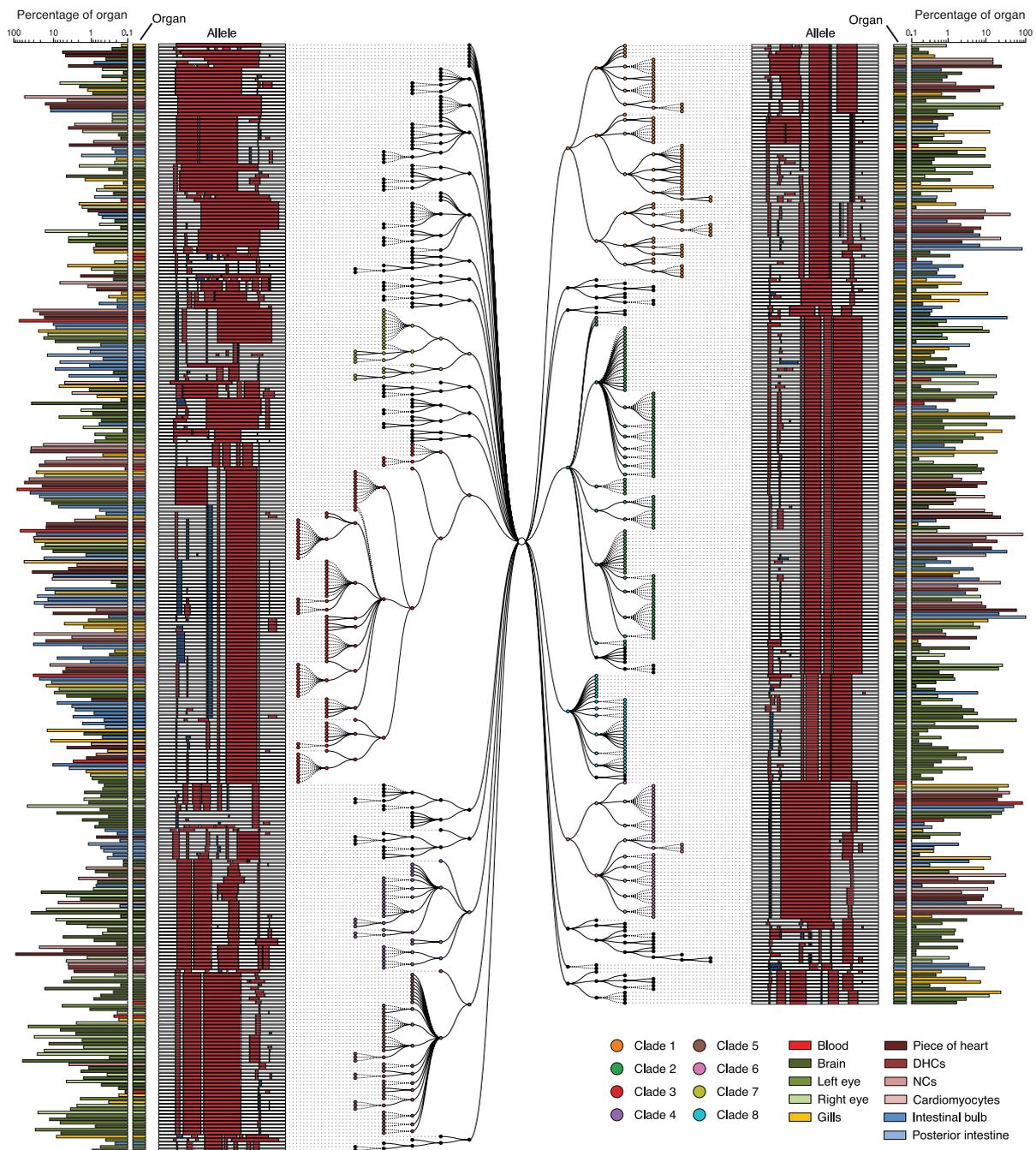
patterns of edits in distantly related cells can confound lineage inference; (ii) nonuniform editing efficiencies and intertarget deletions within the barcode contribute to suboptimal sequence diversity and loss of information, respectively; (iii) the transient means by which Cas9 and sgRNAs are introduced likely restrict editing to early embryogenesis; (iv) the computational challenge of precisely defining the multiple editing events that give rise to different alleles complicates the unequivocal reconstruction of lineage trees; and (v) the difficulty of isolating tissues without contamination by blood and other cells can hinder the assignment of alleles to specific organs. A broader set of challenges includes the lack of information about the precise anatomical location and exact cell type of each queried cell, the fact that genome editing events are not directly coupled to the cell cycle, and the failure to recover all cells. These challenges currently hinder the reconstruction of a lineage tree as complete and precise as the one

that Sulston and colleagues described for *C. elegans* (2). Despite these limitations, our proof-of-principle study shows that GESTALT can inform developmental biology by richly defining lineage relationships among vast numbers of cells recovered from an organism.

The current challenges highlight the need for further optimization of the design of targets and arrays, as well as the delivery of editing reagents. For example, an array containing twice as many targets as used here could fit within a single read on contemporary sequencing platforms, thus yielding more lineage information per cell without sacrificing throughput. Also, as we have shown, adjustments to the target sequences and dosages of editing reagents can be used to fine-tune mutation rates and to minimize undesirable intertarget deletions. Finally, sgRNA sequences and lengths (31), Cas9 cleavage activity and target preferences (32, 33), and the means by which Cas9 and sgRNA(s) are expressed [e.g., transient, constitutive (34), or



comparison, a similar plot for the median embryo (dashed line) from each time point of the developmental time course experiment is also shown. (F) The distribution of the most prevalent alleles for each organ, after removal of the five dominant blood alleles, across all organs. The most prevalent alleles were defined as being at >5% abundance in a given organ (median 5 alleles, range 4 to 7). Organ proportions were normalized by column and colored as shown in the legend. Underlying data are presented in table S2.



**Fig. 6. Lineage reconstruction for adult zebrafish ADRL.** Unique alleles sequenced from adult zebrafish organs can be related to one another using a maximum parsimony approach implemented in the PHYLIP Mix package (see Materials and Methods and fig. S4B). For reasons of space, we show a tree reconstructed from the 601 ADRL alleles observed at least five times in individual organs. Eight major clades are displayed with colored nodes, each defined by

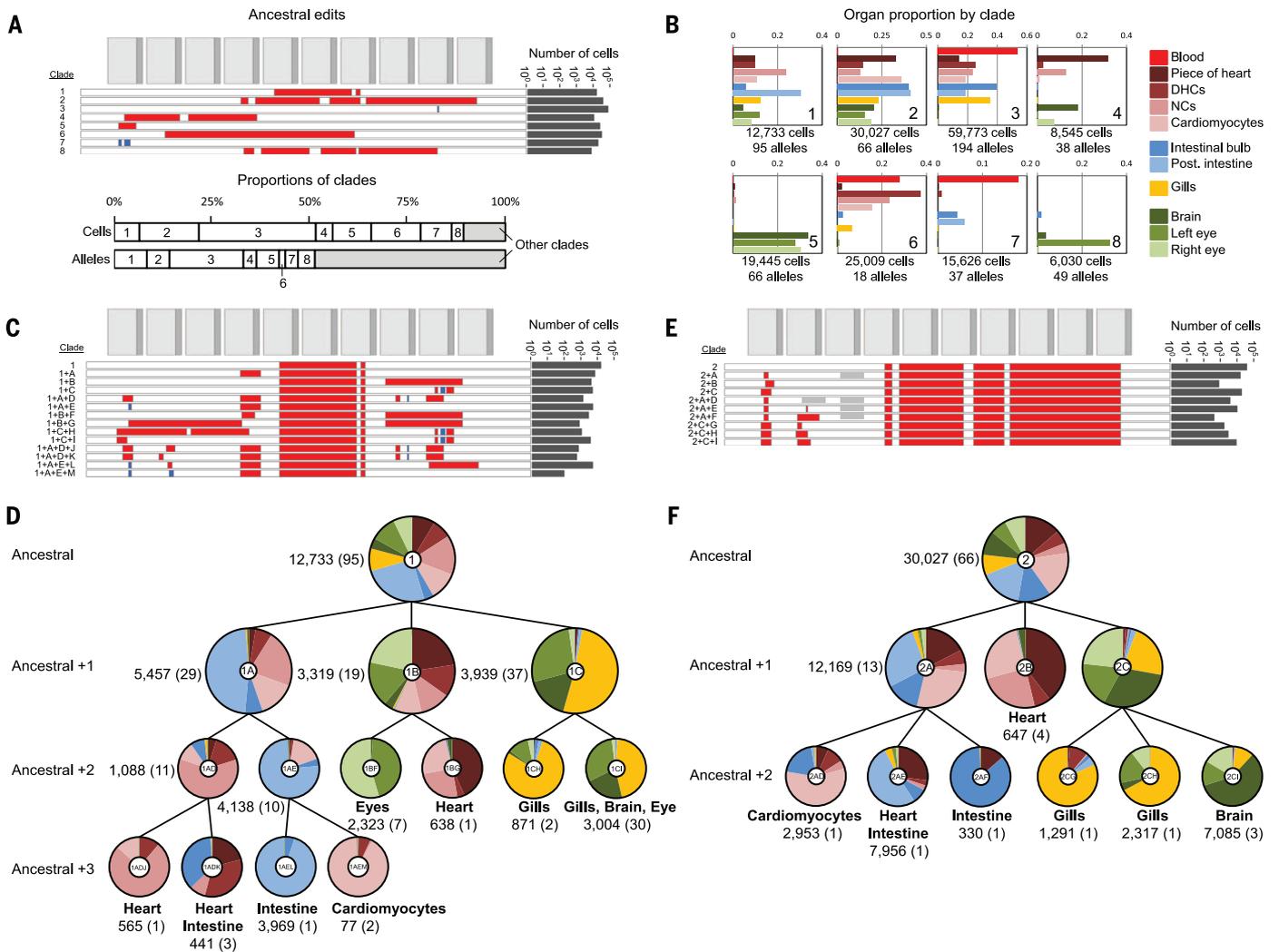
“ancestral” edits that are shared by all alleles assigned to that clade (shown in Fig. 7A). Editing patterns in individual alleles are represented as shown previously. Alleles observed in multiple organs are plotted on separate lines per organ and are connected with stippled branches. Two sets of bars outside the alleles identify the organ in which the allele was observed and the proportion of cells in that organ represented by that allele (log<sub>10</sub> scale).

induced (35, 36), can be altered to control the pace, temporal window, and tissue(s) at which the barcodes are mutated. For example, coupling editing to cell cycle progression might enable higher resolution reconstruction of lineage relationships throughout development.

Our application of GESTALT to a vertebrate model organism, zebrafish, demonstrates its po-

tential to yield insights into developmental biology. First, our results suggest that relatively few embryonic progenitor cells give rise to the majority of cells of many adult zebrafish organs, reminiscent of clonal dominance (37, 38). For example, only 5 of the 1138 alleles observed in ADRL gave rise to >98% of blood cells, and for all dissected organs, fewer than 7 alleles comprised >50% of

cells. There are several mechanisms by which such dominance can emerge—e.g., by uneven starting populations in the embryo, drift, competition, interference, unequal cell proliferation or death, or a combination of these mechanisms (39–42). Controlling the temporal and spatial induction of edits and isolating defined cell types from diverse organs should help resolve the



**Fig. 7. Clades and subclades corresponding to inferred progenitors exhibit increasing levels of organ restriction.**

(A) (Top) The parsimony-inferred ancestral edits that define eight major clades of ADR1 are shown, with the total number of cells in which these are observed indicated on the right. (Bottom) Contributions of the eight major clades to all cells or all alleles. Nineteen alleles (out of 1138 total) that contained ancestral edits from more than one clade were excluded from assignment to any clade and from any further lineage analysis. (B) Contributions of each of the eight major clades to each organ, displayed as a proportion of each organ. To accurately display the contributions of the eight major clades to each organ, we first reassigned the five dominant blood alleles from other organs back to the blood. The total number of cells and alleles within a given major clade are listed below. The clade contributions of all clades and subclades are presented in table S3. For heart subsamples: piece of heart, a piece of heart tissue; DHCs, dissociated unsorted cells; cardiomyocytes, FACS-sorted GFP<sup>+</sup> cardiomyocytes; and NCs,

mechanisms by which different embryonic progenitors come to dominate different adult organs.

Second, we show that GESTALT can inform the lineage relationships among thousands of differentiated cells. For example, following the accumulation of edits from ancestral to more complex reveals the progressive restriction of progenitors to germ layers and then organs. Cells within an organ can both share and differ in their alleles, revealing additional information about

organ development. Future studies will need to determine whether such lineages reflect distinct cell fates (e.g., blood sublineages or neuronal subpopulations), because the anatomical resolution at which we queried alleles was restricted to grossly dissected organs and tissues. Because edited barcodes are expressed as RNA, we envision that combining our system with other platforms will permit much greater levels of anatomical resolution without sacrificing throughput. For ex-

noncardiomyocyte heart cells. (C and E) Edits that define subclades of clade 1 (C) and clade 2 (E), with the total number of cells in which these are observed indicated on the right. A gray box indicates an unedited site or sites, distinguishing it from related alleles that contain an edit at this location. (D and F) Lineage trees corresponding to subclades of clade 1 (D) and clade 2 (F) that show how dependent edits are associated with increasing lineage restriction. The pie chart at each node indicates the organ distribution within a clade or subclade. Ratios of cell proportions are plotted, a normalization that accounts for differential depth of sampling between organs. Labels in the center of each pie chart correspond to the subclade labels in (C) and (E). Alleles present in a clade but not assigned to a descendant subclade (either they have no additional lineage restriction or are at low abundance) are not plotted for clarity. The number of cells (and the number of unique alleles) are also listed, and terminal nodes also list major organ restriction(s), i.e., those comprising >25% of a subclade by proportion.

ample, in situ RNA sequencing (RNA-seq) of barcodes would provide explicit spatial and histological context to lineage reconstructions (19, 20). Also, capturing richly informative lineage markers in single-cell RNA-seq or assay for transposase-accessible chromatin (ATAC)-seq data sets may inform the interpretation of those molecular phenotypes, while also adding cell type resolution to studies of lineage (43, 44). Such integration may be particularly relevant to efforts to

build comprehensive atlases of cell types. Because these single-cell methods generate many reads per single cell, this would also facilitate using multiple, unlinked target arrays. In principle, the combined diversity of the barcodes queried from single cells could be engineered to uniquely identify every cell in a complex organism. In addition, orthogonal imaging-based lineage tracing approaches in fixed and live samples [e.g., Brainbow and related methods (16, 29)] and longitudinal whole-animal imaging approaches (45, 46) might be used in parallel to validate and complement lineages resolved by GESTALT.

Although further work is required to optimize GESTALT toward enabling spatiotemporally complete maps of cell lineage, our proof-of-principle experiments show that using multiplex in vivo genome editing to record lineage information to a compact barcode at an organism-wide scale will be a powerful tool for developmental biology. This approach is not limited to normal development but can also be applied to animal models of developmental disorders, as well as to investigate the origins and progression of cancer. Our study also supports the notion that, although its most widespread application has been to modify endogenous biological circuits, genome editing can also be used to stably record biological information (47), analogous to recombinase-based memories but with considerably greater flexibility and scalability. For example, coupling editing activity to external stimuli or physiological changes could record the history of exposure to intrinsic or extrinsic signals. In the long term, we envision that rich, systematically generated maps of organismal development, wherein lineage, epigenetic, transcriptional, and positional information are concurrently captured at single-cell resolution, will advance our understanding of normal development, inherited diseases, and cancer.

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A.F.S. have filed a provisional patent application (62/332,896) that relates to genome editing of synthetic target arrays for lineage tracing. Author contributions: G.M.F., A.M., and J.S. developed the initial concept. G.M.F. led the cell culture experiments and developed the UMI protocol, with assistance from A.M. J.A.G. led the fish experiments, with assistance from A.M. and G.M.F. A.M. led development of the analysis pipeline. A.M., G.M.F., and J.A.G. processed and analyzed the data. A.M., G.M.F., J.A.G., A.F.S., and J.S. designed experiments and interpreted the data. M.S.H. provided critical early insight. A.M., G.M.F., J.A.G., A.F.S., and J.S. wrote the manuscript.

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