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Multiplexed single cell mRNA sequencing analysis of mouse embryonic cells

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Dear Dr. DSouza:

We submit the enclosed revised manuscript entitled "Multiplexed single cell mRNA sequencing analysis of mouse embryonic cells" by Feng *et al* for consideration for publication in *JoVE*. In the past three weeks we have diligently revised our manuscript according to the suggestions made by the editor and reviewers with figure improves, format adjustments, and textual edits. As a result, our manuscript is significantly improved.

Given that our revised manuscript addressed comments made by all reviewers from the initial submission, we would very much appreciate it if the revised manuscript can be evaluated by the same reviewers as before.

We thank you for your kind consideration of our manuscript submission. Please feel free to contact me if you have any questions.

Sincerely,

A handwritten signature in black ink, appearing to be "Guang Li", written over a light blue horizontal line.

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TITLE:

Multiplexed Single Cell mRNA Sequencing Analysis of Mouse Embryonic Cells

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KEYWORDS:

Single cell mRNA-sequencing, mouse embryonic tissue, heart development, multiplex barcode, de-multiplexing, data analysis

SUMMARY:

Here we presented a multiplexed single cell mRNA sequencing method to profile gene expression in mouse embryonic tissues. The droplet-based single cell mRNA sequencing (scRNA-Seq) method in combination with multiplexing strategies can profile single cells from multiple samples simultaneously, which significantly reduces reagent costs and minimizes experimental batch effects.

ABSTRACT:

Single cell mRNA sequencing has made significant progress in the last several years and has become an important tool in the field of developmental biology. It has been successfully used to identify rare cell populations, discover novel marker genes, and decode spatial and temporal developmental information. The single cell method has also evolved from the microfluidic based Fluidigm C1 technology to the droplet-based solutions in the last two to three years. Here we used the heart as an example to demonstrate how to profile the mouse embryonic tissue cells using the droplet based scRNA-Seq method. In addition, we have integrated two strategies into the workflow to profile multiple samples in a single experiment. Using one of the integrated methods, we have simultaneously profiled more than 9,000 cells from eight heart samples. These methods will be valuable to the developmental biology field by providing a cost-effective way to simultaneously profile single cells from different genetic backgrounds, developmental stages, or anatomical locations.

INTRODUCTION:

The transcriptional profile of each single cell varies among cell populations during embryonic development. Although single molecular in situ hybridization can be used to visualize the

expression of a small number of genes¹, single cell mRNA sequencing (scRNA-Seq) provides an unbiased approach to illustrate genome-wide expression patterns of genes in single cells. After it was first published in 2009², scRNA-Seq has been applied to study multiple tissues at multiple developmental stages in the recent years³⁻⁵. Also, as the human cell atlas has launched its developmental-focused projects recently, more single cell data from human embryonic tissues are expected to be generated in the near future.

The heart as the first organ to develop plays a critical role in embryonic development. The heart consists of multiple cell types and the development of each cell type is tightly regulated temporally and spatially. Over the past few years, the origin and cell lineage of cardiac cells at early developmental stages have been characterized⁶, which provide a tremendous useful navigation tool for understanding congenital heart disease pathogenesis, as well as for developing more technologically advanced methods to stimulate cardiomyocyte regeneration⁷.

The scRNA-Seq has undergone a rapid expansion in recent years⁸⁻¹⁰. With the newly developed methods, design and analysis of single cell experiments has become more achievable¹¹⁻¹⁴. The method presented here is a commercial procedure based on the droplet solutions (see **Table of Materials**)^{15,16}. This method features capturing cells and sets of uniquely barcoded beads in an oil-water emulsion droplet under control of a microfluidic controller system. The rate of cell loading into the droplets is extremely low so that the majority of droplet emulsions contain only one cell¹⁷. The procedure's ingenious design comes from single cell separation into droplet emulsions occurring simultaneously with barcoding, which enables the parallel analysis of individual cells using RNA-Seq on a heterogeneous population.

The incorporation of multiplexing strategies is one of the important additions to the traditional single cell workflow^{13,14}. This addition is very useful in discarding cell doublets, reducing experimental costs, and eliminating batch effects^{18,19}. A lipid based barcoding strategy and an antibody based barcoding strategy (see **Table of Materials**) are the two mostly used multiplexing methods. Specific barcodes are used to label each sample in both methods, and the labeled samples are then mixed for single cell capturing, library preparation, and sequencing. Afterwards, the pooled sequencing data can be separated by analyzing the barcode sequences (**Figure 1**)¹⁹. However, significant differences exist between the two methods. The lipid based barcoding strategy is based on lipid-modified oligonucleotides, which has not been found to have any cell type preferences. While the antibody based barcoding strategy can only detect the cells expressing the antigen proteins^{19,20}. In addition, it takes about 10 min to stain the lipids but 40 min to stain the antibodies (**Figure 1**). Furthermore, the lipid-modified oligonucleotides are cheaper than antibody-conjugated oligonucleotides but not commercially available at the time of writing this article. Finally, the lipid-based strategy can multiplex 96 samples in one experiment, but the antibody-based strategy currently can only multiplex 12 samples.

The recommended cell number to multiplex in a single experiment should be lower than 2.5×10^4 , otherwise, it will lead to a high percentage of cell doublets and potential ambient mRNA contamination. Through the multiplexing strategies, the cost of single cell capturing, cDNA generation, and library preparation for multiple samples will be reduced to the cost of one

sample but the sequencing cost will remain the same.

PROTOCOL:

The animal procedure is in accordance with the University of Pittsburgh Institutional Animal Care and Use Committee (IACUC).

1. Mouse embryonic heart dissection and single cell suspension preparation

NOTE: This step could take a few hours depending on the numbers of embryos to dissect.

1.1. To acquire E18.5 embryonic hearts, euthanize a pregnant CD1 mouse by CO₂ administration. Use a razor to remove the unwanted hair in the abdominal area and disinfect the skin with 70% ethanol.

1.2. Cut the skin of the abdomen using sterilized scissors and carefully dissect the embryos out and quickly put them into cold phosphate-buffered saline (PBS) on ice.

1.3. Isolate hearts from each individual embryo carefully in a 10 cm dish filled with cold PBS under a stereoscopic microscope using forceps and scissors.

NOTE: Keep the four chambers intact by dissecting the lung with heart together and DO NOT directly catch/pull the heart with surgical instruments.

1.4. Transfer ~10 hearts into a new 10 cm dish filled with cold PBS and micro-dissect the hearts into left atrium, right atrium, left ventricle, and right ventricle.

NOTE: This is assumed to yield more than 1×10^6 cells from each sample. We recommend to start with at least 1×10^5 cells per sample.

1.5. Transfer each of the 4 chamber tissues to a 1.5 mL tube and chop them into pieces using scissors. Centrifuge at $300 \times g$ for 3 min to collect the tissues.

1.6. After aspirating the supernatant, add 1 mL of 0.25% Trypsin/EDTA to each tube and incubate in a 37 °C water bath for 10 min. Pipet up and down gently 7–8 times using a P1000 pipette.

1.7. If the embryonic stage is older than E11.5, add 1 mL of 10 mg/mL collagenase A/B mixture and incubate at 37 °C for 10–20 min. Gently pipet up and down until most cells are dissociated.

1.8. Transfer the cells to a 15 mL tube and add 8 mL Hank's balanced salt solution (HBSS) to dilute the enzymes. Spin down the cells at $300 \times g$ for 5 min. Suspend the cells in 1 mL of PBS and transfer them to a 1.5 mL tube. Filter the cells through a 40 µm cell strainer.

1.9. Take 15 µL of volume from each sample and mix with the same amount of 0.04% trypan blue. Load this on a cell counting chamber and count the cells in a cell counter.

NOTE: To generate high quality results, cell viability is recommended to be higher than 95%.

2. Single cell multiplexing barcoding

NOTE: This step takes at least 40 min which varies based on the number of samples processed. A clean bench area treated with RNase decontamination solution is required for pre-amplification steps (step 2.11 to 3.11), and a separate clean bench area is required for the post-amplification steps (the steps after 3.11).

2.1. Lipid based barcoding procedure (optional procedure 1)

2.1.1. Based on cell concentration, keep less than 5×10^5 cells per sample. Make sure the cell suspension is free of debris and cell aggregates.

2.1.2. Prepare 2 μ M anchor/barcode stock solution and 2 μ M co-anchor stock solution for each sample (**Table 1**).

NOTE: The anchor and co-anchor were kindly gifted by Dr. Zev J. Gartner lab. To synthesize these lipid-modified oligonucleotides, DNA sequences were conjugated with fatty acid on a solid support and purified by reversed-phase high-performance liquid chromatography (HPLC)^{18,19}.

2.1.3. Wash the cells twice with PBS and collect the cells at 300 x *g* for 5 min. Suspend cells in 180 μ L of PBS.

2.1.4. Add 20 μ L of anchor/barcode stock solution and pipette up and down gently to mix. Incubate on ice for 5 min.

2.1.5. Add 20 μ L of co-anchor stock solution and pipette up and down gently to mix, then incubate on ice for another 5 min.

2.1.6. Add 1 mL of cold PBS with 1% BSA and centrifuge at 300 x *g* for 5 min at 4 °C. Wash at least 2 more times with ice cold 1% BSA in PBS.

2.1.7. Combine all samples together and filter through 40 μ m cell strainers. Count the cells and keep the cell suspension on ice to use in section 3.

2.2. Antibody-based barcoding procedure (optional procedure 2)

2.2.1. Centrifuge 1×10^6 – 2×10^6 cells for each sample (from step 1.8) at 300 x *g* for 5 min and suspend them in 100 μ L of staining buffer (**Table 1**) in 1.5 mL low bind tubes.

2.2.2. Add 10 μ L Fc blocking reagent and incubate for 10 min at 4 °C.

2.2.3. Prepare antibodies (see **Table of Materials**) by centrifuging at 14,000 x *g* for 10 min at 2–8 °C.

2.2.4. Add 1 µg of each oligo-conjugated antibody to 50 µL of cell staining buffer to make antibody staining solution²⁰. Add one antibody staining solution to each sample tube. Incubate for 30 min at 4 °C.

2.2.5. Wash cells 3 times with 1 mL of PBS, spin for 5 min at 350 x *g* at 4 °C.

2.2.6. Pool all samples at desired proportions in 1 mL of staining buffer, spin for 5 min at 350 x *g* at 4 °C.

2.2.7. Resuspend cells in PBS at appropriate concentration (up to 1,500 cells/µL) and filter cells through a 40 µm cell strainer. Immediately proceed to the next step.

3. Droplet generation and mRNA reverse transcription

NOTE: This step takes about 90 min for one multiplexed reaction.

3.1. Equilibrate the gel beads (see **Table of Materials**) to room temperature for 30 min. Take out reagents from gel beads-in-emulsion (GEM) kit (see **Table of Materials**) and keep them at their indicated temperature.

3.2. Assemble the chip B into a chip holder (see **Table of Materials**).

3.3. Dispense 75 µL of 50% glycerol solution into the unused wells in row 1; 40 µL in row 2; 280 µL in row 3. Do not add glycerol in any recovery wells on the top row of the chip.

3.4. Prepare the master mix on ice according to **Table 1**. Add appropriate volume of cell suspension and nuclease-free water to master mix according to a cell suspension volume calculator table¹⁷ and gently pipette the mix. Dispense 75 µL of cell mixture into the bottom center of the sample well in row 1 without introducing bubbles.

3.5. Vortex the gel beads for 30 s using a vortex adapter and slowly dispense 40 µL of gel beads into the bottom center of the gel bead well in row 2 without introducing bubbles.

NOTE: It is critical to wait for 30 s between adding cells and gel beads to avoid wetting failure.

3.6. For the partitioning oil well in row 3, dispense 280 µL of partitioning oil through the sidewall of the well.

NOTE: Loading less than 270 µL of partitioning oil will lead to abnormal GEM generation.

3.7. Attach the gasket onto the chip, do not press down on the gasket and keep it horizontal to

avoid wetting the gasket.

3.8. Load the assembled chip with the gasket in the chromium controller and run the chromium single cell B program (see **Table of Materials**), immediately proceed to the next step when the program completes.

3.9. Take the chip out and discard the gasket. Fold the lid back to expose wells at 45°, check the liquid level to make sure no clogs are present.

3.10. Slowly aspirate 100 µL of GEM from the lowest points of the recovery well and check the uniformity of the GEM. Dispense GEM into a new polymerase chain reaction (PCR) tube on ice with the pipette tips against the sidewall of the tube.

NOTE: If excess aqueous layer is observed, it is suggested to re-prepare the samples. Importantly, take a picture of the mixture when the GEM are still in the pipette tips. This picture can tell if there is a wetting failure, partially emulsified GEM, and reagent clogs. The photograph can also be used as evidence to get reimbursement from the reagent company with replacement reagents and chips.

3.11. Put the tube in a thermal cycler and perform the reverse transcription procedure (**Table 2**).

NOTE: Stop here or proceed to the next step. The PCR product can be stored at –20 °C for up to a week.

4. cDNA amplification

NOTE: This step takes about 150 min.

4.1. Post single cell reverse transcription cleanup

4.1.1. Take out the cDNA amplification reagents from GEM kit (see **Table of Materials**) and keep them at their indicated temperature.

4.1.2. Add 125 µL of recovery agent to the sample at room temperature to acquire a biphasic mixture. No opaque liquid should be observed and avoid pipetting or vortexing the mixture.

4.1.3. After waiting for 60 s, slowly remove 125 µL of recovery agent from the bottom of the tube.

4.1.4. Vortex the magnetic beads (see **Table of Materials**) thoroughly for 30 s and immediately use it to prepare beads cleanup mixture (**Table 1**). Reagents should be added sequentially as listed.

4.1.5. Vortex the beads cleanup mixture and add 200 µL to the sample. Pipette the mixture 10 times then incubate it for 10 min at room temperature.

4.1.6. Add the reagents sequentially as listed in **Table 1** to prepare the elution solution and elute the cDNA as follows.

4.1.6.1. Place the samples on the magnet (high position) (see **Table of Materials**) until the solution clears, then remove the supernatant.

4.1.6.2. Add 200 μ L of 80% ethanol to the pellet. Wait for 30 s, then remove the ethanol.

4.1.6.3. Repeat step 4.1.6.2 for another 2 times. Centrifuge briefly and place on the magnet (low position). Carefully remove the remaining ethanol and air dry for less than 2 min.

NOTE: DO NOT exceed air drying past 2 min, otherwise the elution efficiency will decrease.

4.1.6.4. Remove the sample from the magnet. Add 35.5 μ L of elution solution and pipette to mix 15 times. Incubate 2 min at room temperature.

4.1.6.5. Place the sample on the magnet (high position) until the solution clears. Transfer 35 μ L of the sample to a new tube strip.

NOTE: This purification procedure is also used in steps 4.2.1.6, 4.2.2.3, 5.8, 6.1.10, and 6.2.6. Pay attention to the concentration of magnetic beads and the volume of EB buffer/ ultrapure water used to elute the samples at each step.

4.1.7. Quantify the size, concentration and integrity of eluted cDNA using an automated electrophoresis instrument²¹ (see **Table of Materials**) (**Figure 2**).

4.2. Amplification of cDNA

4.2.1. cDNA amplification using the lipid-based barcoding strategy (optional procedure 1)

4.2.1.1. Prepare amplification reaction mixture (**Table 1**) on ice.

4.2.1.2. Add the amplification reaction mixture to 35 μ L of cDNA samples (from step 4.1.6.7). Pipette the mix, and centrifuge briefly. Incubate the mixture in a thermal cycler following the cDNA amplification procedure (**Table 2**).

4.2.1.3. After vortexing thoroughly, add 120 μ L of select reagent and 100 μ L of ultrapure water to 100 μ L of sample to acquire a 0.6x concentration of select reagent (see **Table of Materials**). Pipette the mixture for 15 times.

4.2.1.4. Incubate for 5 min at room temperature and then place the sample on magnet until the solutions become clear.

NOTE: Endogenous cDNA in the beads fraction and multiplexing barcoded cDNA is in the supernatant.

4.2.1.5. Transfer the supernatant into a 1.5 mL low bind tube for multiplexing barcoded cDNA library construction at step 6.1.

4.2.1.6. Clean the endogenous cDNA by following the steps in 4.1.6 and elute them with 40 μ L of EB buffer.

4.2.1.7. Run 1 μ L of purified cDNA sample on an automated electrophoresis instrument (see **Table of Materials**) to analyze/quantify the cDNA.

4.2.1.8. Aliquot 10 μ L of cDNA into a new PCR tube for endogenous library construction.

NOTE: Stop here or proceed to the next step. The remaining sample can be stored in -20 $^{\circ}$ C for up to 4 weeks to generate additional libraries if needed.

4.2.2. cDNA amplification in the antibody based barcoding strategy (Optional procedure 2)

4.2.2.1. Add 2 pmol of HTO and ADT additive primer and 15 μ L of cDNA primers to 50 μ L of amplification reaction mixture (**Table 1**) and perform cDNA amplification with the cDNA amplification procedure (**Table 2**).

4.2.2.2. Use 0.6x select reagent to separate endogenous cDNA (beads fraction) and multiplexing barcode cDNA (in supernatant). Remember to save the supernatant to perform barcoding library construction in step 6.2.

4.2.2.3. Purify and elute the endogenous transcript cDNA by following the steps in 4.1.6, perform quality control (QC) of the libraries and aliquot 10 μ L into a new PCR tube for endogenous library construction.

5. Endogenous transcript library preparation

NOTE: This step takes about 120 min.

5.1. Keep gene expression library construction reagents from the library kit (see **Table of Materials**) at their indicated temperature, respectively.

5.2. Prepare the fragmentation mixture (**Table 1**) on ice, pipette to mix and centrifuge briefly.

5.3. Add 25 μ L EB buffer to the 10 μ L purified cDNA sample (from step 4.2.1.8 or 4.2.2.3) and then add the newly prepared 15 μ L fragmentation mixture to the sample, pipette the mixture 15 times on ice and centrifuge briefly.

5.4. Transfer the sample into a pre-cooled thermal cycler and initiate the PCR program for fragmentation, end repair and A-tailing (**Table 2**).

5.5. Vortex the select reagent to suspend magnetic beads and successively use 0.6x and 0.8x select reagents to make a double-sided size selection according to the user guide^{17,22}. Use 50 µL of EB buffer to elute the DNA.

5.6. Prepare adaptor ligation mixture (**Table 1**), then pipette the mixture thoroughly and centrifuge briefly.

5.7. Add 50 µL of adaptor ligation mixture to 50 µL of sample, pipette mix again for 15 times and centrifuge briefly. Perform the adaptor ligation as per the protocol in a thermal cycler (**Table 2**).

5.8. Use 0.8x select reagent to purify the ligation product and elute the purified sample with 30 µL of EB buffer (see step 4.1.6).

5.9. Prepare the sample index PCR mixture (**Table 1**) and add 60 µL to the purified sample. Add 10 µL of sample index to the sample, pipette mix up and down for 5 times and centrifuge briefly, incubate in a thermal cycler following the sample index protocol (**Table 2**).

NOTE: Stop here or proceed to the next step. If more than one well is used, choose one specific sample index (see **Table of Materials**) for each well. Remember to record the index ID used for each well and ensure no overlap in a multiplexed sequencing run.

5.10. Successively use 0.6x and 0.8x select reagents to make a double-sided size selection to acquire 35 µL of purified endogenous cellular library DNA¹⁷.

5.11. QC the endogenous cellular library before sequencing (**Figure 2**).

6. Preparation of multiplexing sample barcode cDNA libraries

NOTE: This step takes at least 120 min.

6.1. Sample barcode library generation for the lipid based multiplexing strategy (optional procedure 1)

6.1.1. Add 520 µL of select reagent and 360 µL of isopropanol to sample barcode cDNA from step 4.2.1.5 to get a 3.2x select reagent concentration. Pipette the mixture 10 times and incubate at room temperature for 5 min.

6.1.2. Place the tube on a magnetic rack and wait for the solution to clear. Then discard supernatant.

6.1.3. Use 500 µL of 80% ethanol to wash beads twice on a magnet and wait for 30 s after each wash.

6.1.4. Briefly centrifuge the beads and place on a magnet. Remove the remaining ethanol with a P10 micropipette and leave beads for 2 min.

6.1.5. Remove the tube from the magnet rack and resuspend beads in 50 µL of EB buffer. Pipet up and down to mix thoroughly. Incubate at room temperature for 2 min.

6.1.6. Return the tube to a magnet and wait for the solution to clear. Transfer the supernatant (sample barcode cDNA) to a new PCR tube. Be careful not to transfer any beads.

6.1.7. Quantify the concentration of sample barcode cDNA²³.

6.1.8. Prepare lipid barcode library mixture (**Table 1**), add 3.5 ng of purified barcoded cDNA (from step 6.1.6) and nuclease-free water for a total volume of 50 µL.

6.1.9. Keep it in a thermal cycler following the lipid-based barcode library PCR (**Table 2**).

6.1.10. Use 1.6x select reagent to purify the PCR product and elute the DNA with 25 µL of EB buffer (see step 4.1.6).

6.1.11. Quantify the library concentration using a high sensitivity DNA analysis method²⁴ from the initial dilution of 1:5 (**Figure 2**).

6.2. Sample barcode library generation for the antibody based multiplexing strategy (optional procedure 2)

6.2.1. Add additional 1.4x reaction volume of select reagent to the supernatant containing sample barcodes acquired from step 4.2.2.3 to get a 2x select reagent ratio.

6.2.2. Wash the beads with 80% ethanol by following the steps in 4.1.6 and elute the barcoded cDNA with ultrapure water.

6.2.3. Perform the selection protocol with 2x select reagent for a second time and elute using ultrapure water.

6.2.4. Prepare antibody barcode library mixture (**Table 1**), and add 45 µL of purified barcoded cDNA from the last step.

6.2.5. Incubate in a thermal cycler following the antibody barcode library PCR (**Table 2**)²⁰.

6.2.6. Use 1.6x select reagent to purify the PCR product and elute the purified sample with 30 µL of ultrapure water (see step 4.1.6).

7. Library sequencing

NOTE: Multiple next generation sequencing platforms such as HiSeq 4000 and NovaSeq can be used to sequence the endogenous transcript libraries and multiplexing barcode libraries.

7.1. Use a next generation sequencing platform of choice to sequence the endogenous transcript libraries and multiplexing barcode libraries.

7.2. Dilute the libraries according to the recommendations from an expert at a sequencing company or sequencing facility. Minimum 20,000 reads per cell is recommended for the endogenous transcript library and 3000 reads for the barcode libraries.

8. Data analysis

NOTE: De-multiplex the sequencing data using the cloud-based resource BaseSpace or by running the bcl2fastq package on a UNIX server.

8.1. Endogenous transcriptome data analysis

8.1.1. With the fastq data generated from demultiplexing software, run “mkfastq” on the commercially available data analysis pipeline (see **Table of Materials**) to further demultiplex each GEM barcode.

8.1.2. Run “count” to perform the alignment, filtering, barcode counting, and UMI counting.

8.1.3. Optionally, run “aggr” to aggregate multiple sequencing lanes from a single experiment.

8.1.4. Use “cell browser” (see **Table of Materials**) to visualize data, cluster cells, identify differentially expressed genes, and generate tSNE or gene expression heatmap plots.

8.1.5. Optionally, use a well-maintained R-based platform²⁵ (see **Table of Materials**) to normalize and scale data, identify differentially expressed genes, and generate tSNE/UMAP plots and gene expression heatmaps (**Figure 3**).

8.2. Multiplexing barcode data analysis:

8.2.1. Analysis of the data from lipid based barcoding strategy

8.2.1.1. Use the commercially available data analysis pipeline or deMULTiplex R package (<https://github.com/chris-mcginnis-ucsf/MULTI-seq>) to convert the sample barcode FASTQ files into a sample barcode UMI count matrix.

8.2.1.2. Load the barcode UMI count matrix together with endogenous transcriptome data to an

R-based platform (see **Table of Materials**) for integration analysis (**Figure 3**).

8.2.2. Analysis of the data from antibody-based barcoding strategy

8.2.2.1. Use “count” from the commercially available data analysis pipeline to map the barcodes by providing the library CSV file and hashtag feature reference CSV file.

8.2.2.2. Load the output unified feature-barcode matrix, which contains gene expression counts alongside feature barcode counts for each cell barcode, to an R-based platform for downstream analysis.

REPRESENTATIVE RESULTS:

In this study, we used mouse embryonic heart as an example to exhibit how multiplexed single cell mRNA sequencing was performed to process the different samples from separate parts of an organ simultaneously. E18.5 CD1 mouse hearts were isolated and dissected into left atrium (LA), right atrium (RA), left ventricle (LV) and right ventricle (RV). The atrial and ventricular cells were then barcoded independently using a lipid-based barcoding procedure and mixed together before GEM generation and reverse-transcription. The schematic overview is shown in **Figure 1**. We quantified the cDNA concentration before library construction (**Figure 2A**). One of the distinctions in performing multiplexed scRNA-Seq from the standard scRNA-Seq is that the endogenous cDNA library and the sample barcode DNA library were acquired separately after cDNA amplification and purification (Step 4.2.1 and 4.2.2.2). The two libraries were also qualified in our experiment (**Figure 2B,C**). Next generation sequencing and data analysis were performed followed by library construction and QC.

We used HiSeqX platform to sequence both libraries in the same sequencing lane. With the sequencing data, we first separated the endogenous transcript data and barcode data using the BaseSpace program. Then we analyzed barcode expression in each single cell and found 8 groups of single cells that uniquely express one type of barcode, representing cells from 8 different samples (**Figure 3A**). In addition, we also found that some cells do not express any barcode, which we defined as negative cells, and some cells express two different barcodes, which represent doublets (**Figure 3B**). In summary, we found that around 70% of cells are singlets, 25% of cells are negative and 5% of the cells are doublets.

With the singlet cells, we can perform further downstream analyses to understand the cellular heterogeneity and molecular regulations. The potential analyses can be cell type annotation (**Figure 4A**), novel/rare cell type identification (**Figure 4B**), anatomical zone comparative analysis (**Figure 4C**), and gene ontology pathway analysis such as cell cycle phase separations (**Figure 4D**).

FIGURE AND TABLE LEGENDS:

Figure 1: Multiplexed single cell mRNA sequencing workflow. Embryonic day 18.5 stage hearts were analyzed using a multiplexed droplet-based single cell sequencing procedure. RT = reverse transcription.

Figure 2: Representative QC results at different steps. (A) QC analysis of cDNA from step 4.1.7. The target fragment size is 200 to 9000 bp. (B) Endogenous library and (C) barcode library were analyzed with an automated electrophoresis instrument. The target fragment size for the endogenous library is 300–600 bp, and the barcode library DNA size is around 172 bp.

Figure 3: Demultiplexing the sequencing data from the lipid based barcoding strategy. (A) Unsupervised analysis of the barcode expression. X-axis represents single cells, and y-axis represents barcodes. Each of the 8 single cell populations were identified to uniquely express one of the 8 barcodes. Note some cells express more than one barcode, and some cells do not express any barcodes. (B) t-SNE plot of the singlet cells, doublet cells, and negative cells.

Figure 4: Advanced analysis of single cell transcriptional data. (A–D) Single cell data can be analyzed in different ways to understand the cellular heterogeneity and molecular pathways. We have listed several applications here as examples. Single cells were loaded into an R package to identify cell types (A), rare cell populations (B), cell anatomical zones (C), and cell cycle phases (D).

Table 1: The reagent mixtures used in the protocol.

Table 2: The incubating procedure used in the protocol. (1) Pay attention to the different lid temperature used in every Procedure. (2) Set total cycle numbers according to the cell load: 13 cycles for <500 cell load; 12 cycles for 500–6,000 cell load; 11 cycles for >6,000 cell load. (3) Set total cycle numbers according to the cDNA input: 14–16 cycles for 1–25 ng cDNA; 12–14 cycles for 25–150 ng cDNA; 10–12 cycles for 150–500 ng cDNA; 8–10 cycles for 500–1,000 ng cDNA; 6–8 cycles for 1000–1500 ng cDNA. (4) Set total cycle numbers according to the cDNA input: 8–12 cycles. (5) Set total cycle numbers according to the cDNA input: 6–10 cycles.

Table 3: Oligonucleotide sequences used in this protocol. N: Barcode or index sequence; *: Phosphorothioate bond

DISCUSSION:

In this study, we have demonstrated a protocol to analyze single cell transcriptional profiles. We have also provided two optional methods to multiplex samples in the scRNA-Seq workflow. Both methods have proved to be feasible at various labs and provided solutions to run a cost-effective and batch effect-free single cell experiment^{18,26}.

There are a few steps that should be followed carefully when going through the protocol. An ideal single cell suspension should have >90% of viable cells and the cell density should also be within a specific range²⁷. It is critical to obtain a good quality of cells to minimize the presence of cellular aggregates, debris, and fibers. Cellular aggregates have negative impact on sample multiplexing and have a potential risk to clog the droplet generating machine¹⁷. Generally speaking, a 30–40 µm cell strainer is ideal for removing large clumps and debris while preserving the cell samples because most cells will shrink below 30 µm after dissociation. Single cell nuclei

are recommend to use instead if the cell diameter is larger than 30 μm . At early embryonic stages, the cell size for all types of mouse cells should be smaller than 30 μm . However, at later stages, the cardiomyocytes in the heart, neurons in the brain, muscle cells in limbs, and some fat cells may have a cell size larger than 30 μm . Cell size should be measured for these types of cells before starting the single cell experiments.

The multiplexing strategies provide a way to simultaneously analyze a large number of samples in a cost-effective way. In addition, by profiling multiple samples together, we can significantly avoid the batch effects and identify cell doublets. These advantages will be very attractive to the single cell field. However, there are some factors that may limit their usage. As more cells are multiplexed in a single experiment, the cell doublet ratio will also increase. Although those doublets can be identified and removed by analyzing the multiplexing barcode data, it will lead to a large waste of sequencing reads. In addition, as more cells are pooled together, the cells are easier to break and cause an increase of the ambient mRNA, which will be captured into the droplets with cells and interfere with the detection sensitivity. We are expecting that a further optimization of the experimental workflow or bioinformatics pipeline analysis will resolve these two issues in the near future.

ACKNOWLEDGMENTS:

We thank David M. Patterson and Christopher S. McGinnis from Dr. Zev J. Gartner lab for their kind supply of the lipid based barcoding reagents and suggestions on the experimental steps and data analysis. This work was founded by the National Institutes of Health (HL13347202).

DISCLOSURES:

The authors have no conflicts of interest to disclose.

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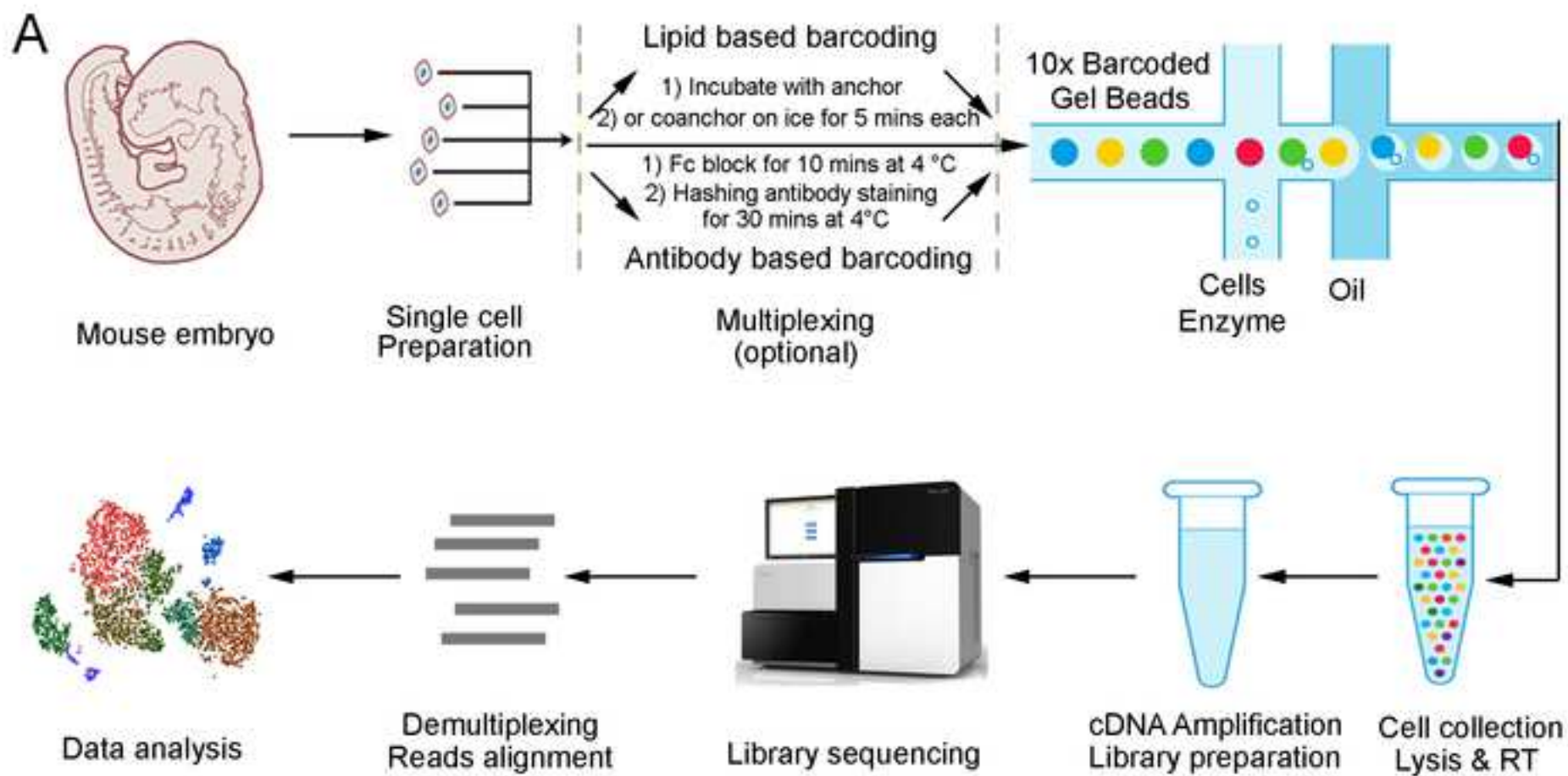
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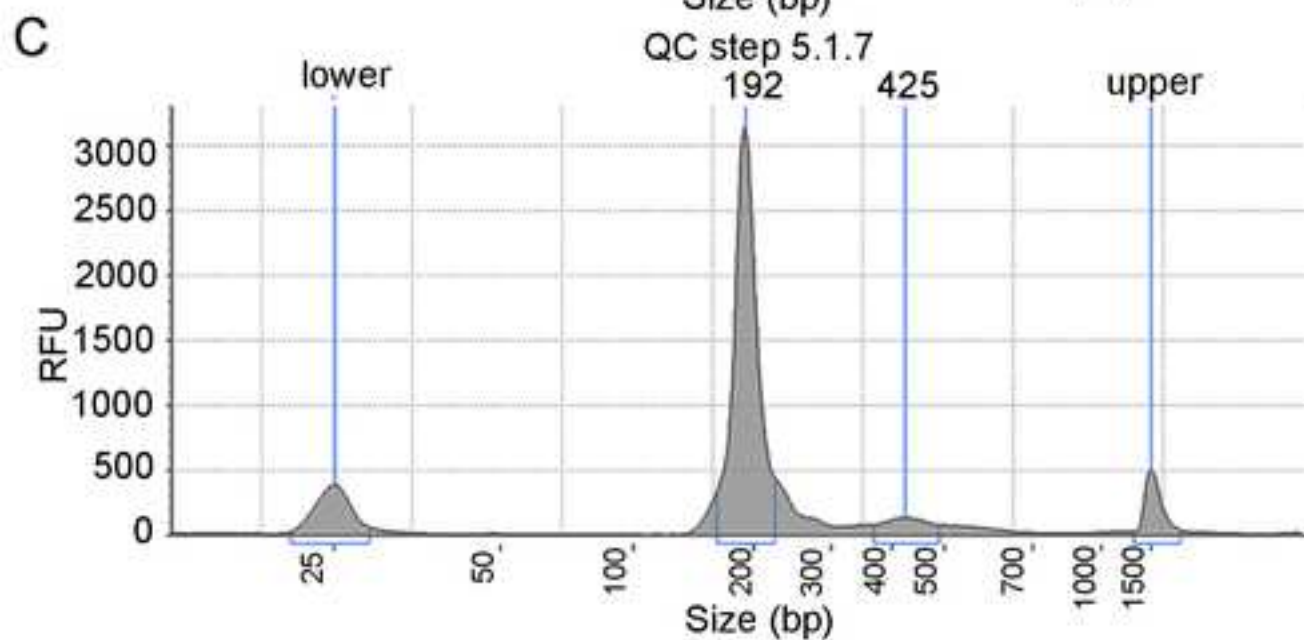
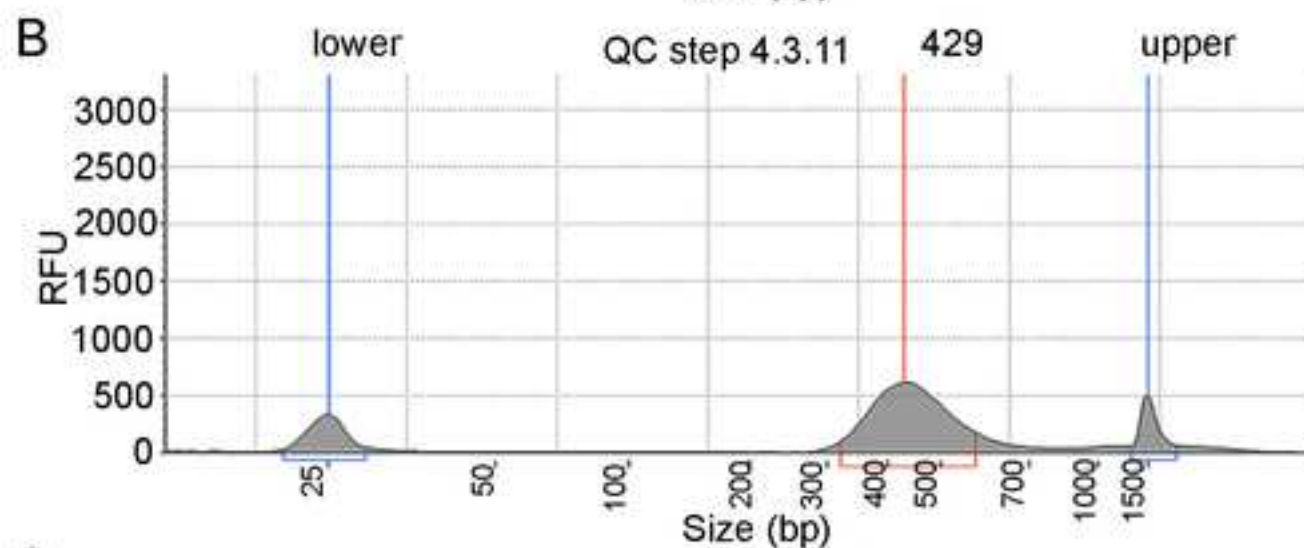
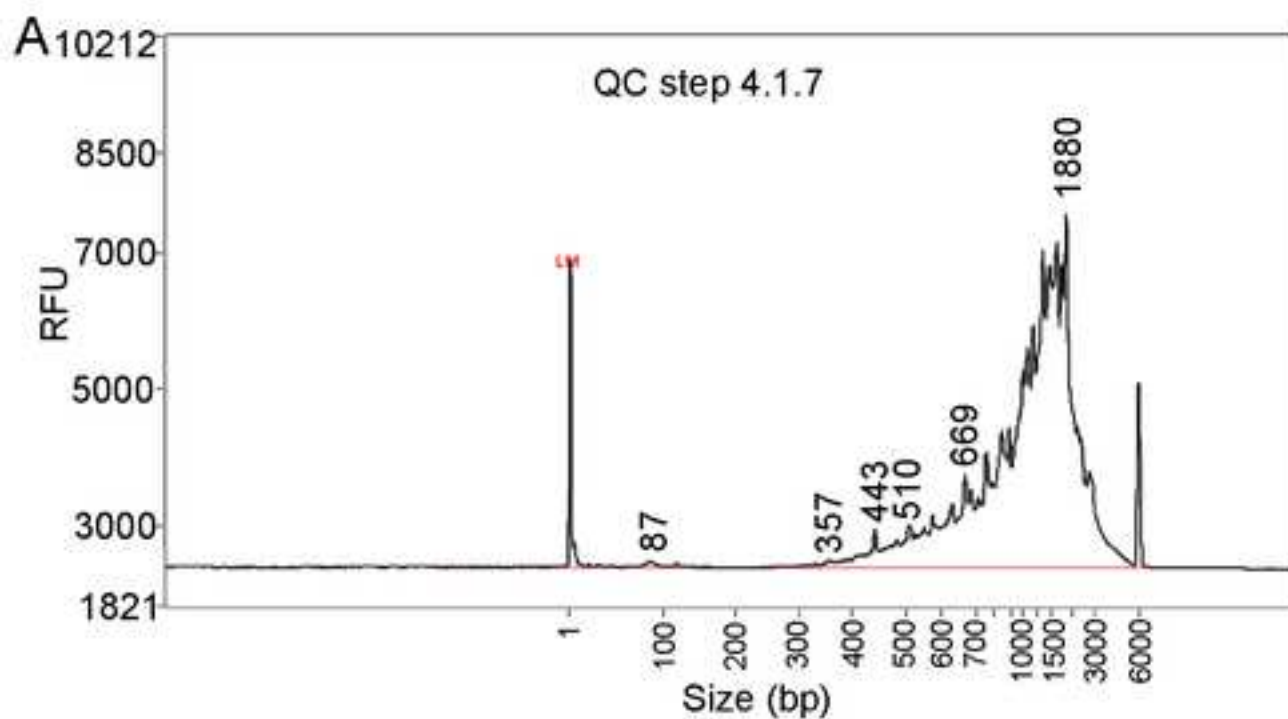
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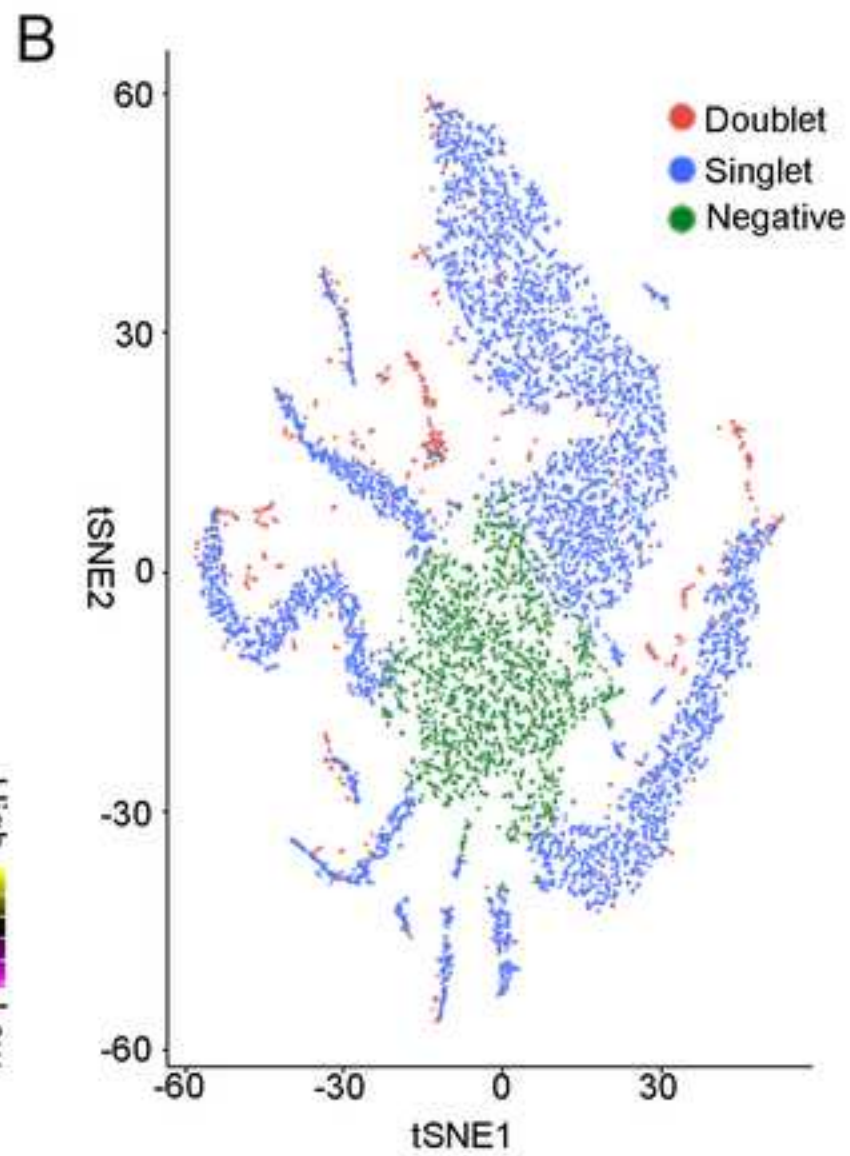
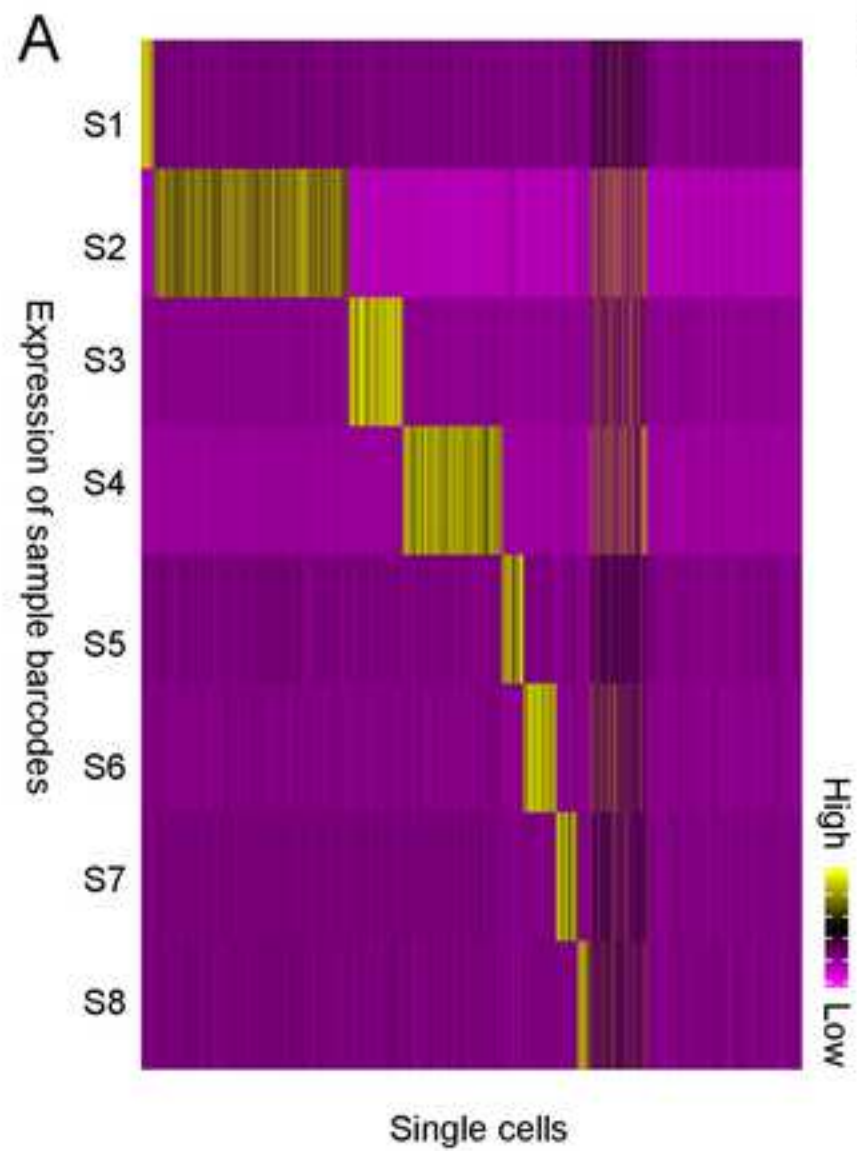
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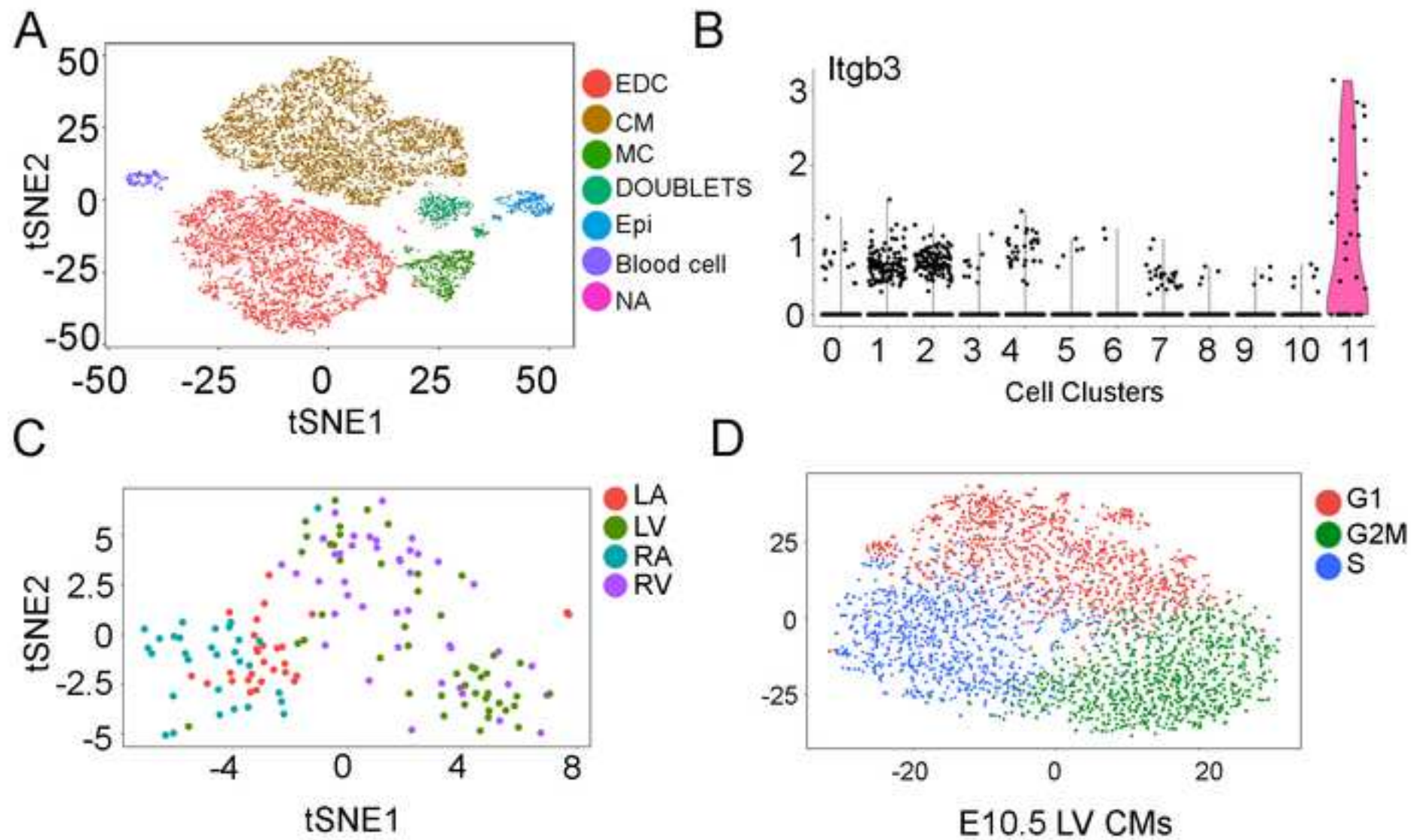
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Mixture Name
Collagenase mixture
2 µM Anchor/Barcode stock solution
2 µM Co-Anchor stock solution
Staining buffer
Master Mixture
Beads Cleanup Mixture
Amplification Reaction Mixture
Elution Solution
Fragmentation Mixture
Adaptor Ligation mixture
Sample Index PCR Mixture
Lipid barcode library mixture
Antibody barcode library mixture

Composition
10 mg/mL collagenase A and 10 mg/mL collagenase B, dissolved in HBSS++ with 40% FBS.
Mix 50 μ M anchor and 10 μ M barcode strand in 1:1 molar ratio in PBS (without FBS or BSA) for a total volume of 25 μ L.
Dilute 1 μ L 50 μ M Co-Anchor with 24 μ L PBS (without FBS or BSA).
PBS containing 2% BSA, 0.01% Tween 20
20 μ L RT Reagent, 3.1 μ L Oligo, 2 μ L Reducing Agent B, 8.3 μ L RT Enzyme C.
182 μ L Cleanup Buffer, 8 μ L Selection Reagent, 5 μ L Reducing Agent B, 5 μ L Nuclease-free Water.
1 μ L of 10 μ M Lipid-tagged additive primer, 15 μ L cDNA primer, 50 μ L Amp Mix
98 μ L Buffer EB, 1 μ L 10% Tween 20, 1 μ L Reducing Agent B.
5 μ L Fragmentation Buffer, 10 μ L Fragmentation Enzyme.
20 μ L Ligation Buffer, 10 μ L DNA Ligase, 20 μ L Adaptor Oligos.
50 μ L Amp Mix, 10 μ L SI Primer
26.25 μ L of 2 \times Hot Start master mix, 2.5 μ L of 10 μ M RPIX primer, 2.5 μ L of 10 μ M TruSeq Universal Adapter primer (see table of materials)
50 μ L of 2 \times Hot Start master mix, 2.5 μ L of 10 μ M RPIX primer, 2.5 μ L of 10 μ M P5-smart-pcr hybrid oligo

Incubating Procedure	Temperature ⁽¹⁾	Time
GEM-RT Incubation	Lid Temperature 53 °C	
Step 1	53 °C	45 min
Step 2	85 °C	5 min
Step 3	4 °C	Hold
10x Genomics cDNA Amplification	Lid Temperature 105 °C	
Step 1	98 °C	3 min
Step 2	98 °C	15 s
Step 3	63 °C	20 s
Step 4	72 °C	1 min
Step 5	Repeat steps 2 to 4 for 12 cycles in total ⁽²⁾	
Step 6	72 °C	1 min
Step 7	4 °C	Hold
Library construction	Lid Temperature 65 °C	
Pre-cool block	4 °C	Hold
Fragmentation	32 °C	5 min
End Repair and A-tailing	65 °C	30 min
Hold	4 °C	Hold
Adaptor ligation	Lid Temperature 30 °C	
Step 1	20 °C	15 min
Step 2	4 °C	Hold
Sample index PCR	Lid Temperature 105 °C	
Step 1	98 °C	45 s
Step 2	98 °C	20 s
Step 3	54 °C	30 s
Step 4	72 °C	20 s
Step 5	Repeat steps 2 to 4 for 12 cycles in total ⁽³⁾	
Step 6	72 °C	1 min
Step 7	4 °C	Hold
Lipid barcode library PCR		
Step 1	95 °C	5 min
Step 2	98 °C	15 s
Step 3	60 °C	30 s
Step 4	72 °C	30 s
Step 5	Repeat steps 2 to 4 for 10 cycles in total ⁽⁴⁾	
Step 6	72 °C	1 min
Step 7	4 °C	Hold
Antibody barcode library PCR		
Step 1	95 °C	3 min
Step 2	95 °C	20 s
Step 3	60 °C	30 s
Step 4	72 °C	20 s

Step 5	Repeat steps 2 to 4 for 8 cycles in total ⁽⁵⁾	
Step 6	72 °C	5 min
Step 7	4 °C	Hold

(1) Pay attention to the different lid temperature used in every Procedure.

(2) Set total cycle numbers according to the cell load: 13 cycles for <500 cell load; 12 cycles for 500-6,000 cell load; 11 cycles for >6,000 cell load.

(3) Set total cycle numbers according to the cDNA input: 14-16 cycles for 1-25 ng cDNA; 12-14 cycles for 25-150 ng cDNA; 10-12 cycles for 150-500 ng cDNA; 8-10 cycles for 500-1000 ng cDNA; 6-8 cycles for 1000-1500 ng cDNA.

(4) Set total cycle numbers according to the cDNA input: 8-12 cycles.

(5) Set total cycle numbers according to the cDNA input: 6-10 cycles.

Lipid based barcoding Oligonucleotides
Anchor LMO
Co-Anchor LMO
Barcode Oligo
Lipid barcoding Additive Primer
RPIX Primer
Universal Adapter Primer
Antibody based barcoding Oligonucleotides
Antibody barcoding oligo
HTO additive Primer
ADT additive Primer
P5-smart-pcr hybrid oligo

N: Barcode or index sequence; *: Phosphorothioate bond

5'-TGGAATTCTCGGGTGCCAAGGGTAACGATCCAGCTGTCACT-Lipid-3'

5'-Lipid-AGTGACAGCTGGATCGTTAC-3'

5'-CCTTGGCACCCGAGAATTCCANNNNNNNNA30-3'

5'-CTTGGCACCCGAGAATTCC-3'

5'-CAAGCAGAAGACGGCATACGAGATNNNNNNNGTGACTGGAGTTCC

TTGGCACCCGAGAATTCCA-3'

5'-AATGATACGGCGACCACCGAGATCTACACTCTTCCCTACACGAC

GCTCTTCCGATCT-3'

5'-GTGACTGGAGTTCAGACGTGTGCTCTTCCGATCTNNNNNNNNNN

NNBAAAAAAAAAAAAAAAAAAAAAAAAAAAAAA*A*A-3'

5'-GTGACTGGAGTTCAGACGTGTGCTC-3'

5'-CCTTGGCACCCGAGAATTCC-3'

5'-AATGATACGGCGACCACCGAGATCTACACGCCTGTCCGCGGAAGC

AGTGGTATCAACGCAGAGT*A*C-3'

Name of Material/Equipment

10% Tween-20
 10x Chip Holder
 10x Chromium Controller
 10x Magnetic Separator
 10x Vortex Adapter
 10x Vortex Clip
 4200 TapeStation System
 Agilent High Sensitivity DNA Kit
 Barcode Oligo
 Buffer EB
 CD1 mice
 Centrifuge 5424R
 Chromium Chip B Single Cell Kit, 48 rxns
 Chromium i7 Multiplex Kit, 96 rxns
 Chromium Single Cell 3' GEM Kit v3,4 rxns
 Chromium Single Cell 3' Library Kit v3
 Chromium Single cell 3' v3 Gel Beads
 Collagenase A
 Collagenase B
 D1000 ScreenTape
 DNA LoBind Tube Microcentrifuge Tube, 1.5 mL
 DNA LoBind Tube Microcentrifuge Tube, 2.0 mL
 Dynabeads MyOne SILANE
 DynaMag-2 Magnet
 Ethanol, Pure (200 Proof, anhydrous)
 Falcon 15mL High Clarity PP Centrifuge Tube
 Falcon 50mL High Clarity PP Centrifuge Tube
 Fetal Bovine Serum, qualified, United States
 Finnpiptette F1 Multichannel Pipettes, 10-100µl
 Finnpiptette F1 Multichannel Pipettes, 1-10µl
 Flowmi Cell Strainer
 Glycerin (Glycerol), 50% (v/v)
 HBSS, no calcium, no magnesium
 Human TruStain FcX (Fc Receptor Blocking Solution)
 Isopropanol (IPA)
 Kapa HiFi HotStart ReadyMix (2X)
 Lipid Barcode Primer (Multi-seq Primer)
 Low TE Buffer (10 mM Tris-HCl pH 8.0, 0.1 mM EDTA)
 MasterCycler Pro

Company

Bio-Rad
 10x Genomics
 10x Genomics
 10x Genomics
 10x Genomics
 10x Genomics
 Agilent
 Agilent
 Integrated DNA Technologies
 Qiagen
 Chales River
 Appendorf
 10x Genomics
 10x Genomics
 10x Genomics
 10x Genomics
 10x Genomics
 Sigma/Millipore
 Sigma/Millipore
 Agilent
 Eppendorf
 Eppendorf
 10x Genomics
 Thermo Scientific
 Sigma
 Corning Cellgro
 Corning Cellgro
 Fisher Scientific
 Thermo Scientific
 Thermo Scientific
 Sigma
 Ricca Chemical Company
 Thermo Fisher Scientific
 BioLegend
 Fisher Scientific
 Fisher Scientific
 Integrated DNA Technologies
 Thermo Fisher Scientific
 Eppendorf

Nuclease-Free Water (Ambion)	Thermo Fisher Scientific
PCR Tubes 0.2 ml 8-tube strips	Eppendorf
Phosphate-Buffered Saline (PBS) 1X without calcium & magnesium	Corning Cellgro
Phosphate-Buffered Saline (PBS) with 10% Bovine Albumin (alternative to Thermo Fisher product)	Sigma-Aldrich
Pipet 4-pack (0.1–2.5µL, 0.5-10µL, 10–100µL, 100–1,000µL variable-volume pipettes)	Fisher Scientific
Selection reagent (SPRIselect Reagent Kit)	Beckman Coulter
Template Switch Oligo	10x Genomics
The antibody based barcoding strategy is also known as Cell Hashing	
The cell browser is Loup Cell Browser	10x Genomics
The commercial available analysis pipeline in step 8.1 is Cell Ranger	10x Genomics
The lipid based barcoding strategy is also known as MULTI-seq	
The well maintained R platform is Seurat V3	satijalab
TipOne RPT 0.1-10/20 ul XL ultra low retention filter pipet tip	USA Scientific
TipOne RPT 1000 ul XL ultra low retention filter pipet tip	USA Scientific
TipOne RPT 200 ul ultra low retention filter pipet tip	USA Scientific
TotalSeq-A0301 anti-mouse Hashtag 1 Antibody	BioLegend
TotalSeq-A0302 anti-mouse Hashtag 2 Antibody	BioLegend
TotalSeq-A0302 anti-mouse Hashtag 3 Antibody	BioLegend
TrueSeq RPI primer	Integrated DNA Technologies
Trypan Blue Solution, 0.4%	Fisher Scientific
Trypsin-EDTA (0.25%), phenol red	Fisher Scientific
Universal I5	Integrated DNA Technologies

Catalog Number	Comments/Description
1610781	
120252 330019	
120223	
120250 230003	
330002, 120251	
120253 230002	
G2991AA	
5067-4626	University of Pittsburgh Health Sciences Sequencing Core
Single-stranded DNA	25 nmol
19086	
Strain Code 022	ordered pregnant mice
2231000214	
1000073	Store at ambient temperature
120262	Store at -20°C
1000094	Store at -20°C
1000095	Store at -20°C
2000059	Store at -80°C
10103578001	Store powder at 4°C, store at -20°C after it dissolves
11088807001	Store powder at 4°C, store at -20°C after it dissolves
5067-5582	University of Pittsburgh Health Sciences Sequencing Core
022431021	
022431048	
2000048	Store at 4°C, used in Beads Cleanup Mix (Table 1)
12321D	
E7023-500mL	
14-959-70C	
14-959-49A	
26140079	Store at -20°C
4661020N	
4661000N	
BAH136800040	Porosity 40 µm, for 1000 uL Pipette Tips, pack of 50 each
3290-32	
14170112	
422301	Add 5 µl of Human TruStain FcX per million cells in 100 µl staining volume
A464-4	
NC0295239	Store at -20°C, used in Lipid-tagged barcode library mix (Table 1)
Single-stranded DNA	100 nmol
12090-015	
950W	

AM9937
951010022
21-040-CV
SRE0036
05-403-151
B23318 (60ml)
3000228

Store at -20°C, used in Master Mix (Table 1)

[https://support.10xgenomics.com/single-cell-gene-expression/software/visualization/latest/what-is-loupe-cell-br](https://support.10xgenomics.com/single-cell-gene-expression/software/visualization/latest/what-is-loupe-cell-browser/)
<https://support.10xgenomics.com/single-cell-gene-expression/software/pipelines/latest/what-is-cell-ranger>

<https://satijalab.org/seurat/>

1180-3710
1182-1730
1180-8710
155801
155803
155805
Single-stranded DNA
15250061
25200-056
Single-stranded DNA

0.1 - 1.0 µg of antibody in 100 µl of staining buffer for every 1 million cells
0.1 - 1.0 µg of antibody in 100 µl of staining buffer for every 1 million cells
0.1 - 1.0 µg of antibody in 100 µl of staining buffer for every 1 million cells
100 nmol, used in Lipid-tagged barcode library mix (Table 1)

100 nmol

owser

Point-by-Point Responses to Reviewer Comments

We sincerely thank the editor and reviewers for their helpful comments and suggestions to our previously submitted manuscript. Here, we respond to the editorial and reviewer comments with revisions. As displayed below, editorial and reviewer comments are presented in black followed by detailed replies to each comment in blue. We also tracked the major changes in the manuscript. For the paragraphs that we have changed significantly, we have labeled them with a pair of red round brackets. For the sentences that we have improved, we have underlined and italicized them.

We believe our revisions to the manuscript have significantly improved the paper. We hope these improvements will be favorably considered for publication in JoVE.

Editorial Comments

Please take this opportunity to thoroughly proofread the manuscript to ensure that there are no spelling or grammatical errors.

Response: We thank the editor for the suggestion. We have went through the manuscript and ensured that there are no spelling or grammatical errors.

Protocol Detail: Please note that your protocol will be used to generate the script for the video, and must contain everything that you would like shown in the video. Please add more specific details (e.g. button clicks for software actions, numerical values for settings, etc) to your protocol steps. There should be enough detail in each step to supplement the actions seen in the video so that viewers can easily replicate the protocol. Examples:

- 1) 1.1., 1.2: Please mention all details of the surgical steps including how sterility is maintained, tools used, incision etc.
- 2) 1.3: How is the dissection performed?

Response: We apologies for not including enough details in some protocol steps. We have went through the whole protocol and included as many details as we can in each step. For example, we have included more details on the mouse dissection at step 1 (line 100-101, 108-109, 113-114) and sequencing data analysis at step 5.11 and 6.1.7 (line 365, 391).

Protocol Numbering: Please adjust the numbering of your protocol section to follow JoVE's instructions for authors, 1. should be followed by 1.1. and then 1.1.1. if necessary and all steps should be lined up at the left margin with no indentations.

Response: We thank the editor for the suggestion. We have adjusted the numbering and format accordingly.

Protocol Highlight: After you have made all of the recommended changes to your protocol (listed above), please re-evaluate the length of your protocol section. There is a 10-page limit for the protocol text, and a 3- page limit for filmable content. If your protocol is longer than 3 pages, please highlight ~2.5 pages or less of text (which includes headings and spaces) in yellow, to identify which steps should be visualized to tell the most cohesive story of your

protocol steps.

1) The highlighting must include all relevant details that are required to perform the step. For example, if step 2.5 is highlighted for filming and the details of how to perform the step are given in steps 2.5.1 and 2.5.2, then the sub-steps where the details are provided must be included in the highlighting.

2) The highlighted steps should form a cohesive narrative, that is, there must be a logical flow from one highlighted step to the next.

3) Please highlight complete sentences (not parts of sentences). Include sub-headings and spaces when calculating the final highlighted length.

Response: We thank the editor for the suggestions. We have highlighted about 2.5 pages for filmable content and made sure the highlighting include all relevant details and form a cohesive narrative.

Discussion: JoVE articles are focused on the methods and the protocol, thus the discussion should be similarly focused. Please ensure that the discussion covers the following in detail and in paragraph form (3-6 paragraphs): 1) modifications and troubleshooting, 2) limitations of the technique, 3) significance with respect to existing methods, 4) future applications and 5) critical steps within the protocol.

Response: We thank the editor for the critical comment. We have revised our discussion part to focus on the listed points (Line 547-570).

Figures

1) Fig 2: Axis ticks are too small to read.

Response: Thanks. We have updated it.

Commercial Language: JoVE is unable to publish manuscripts containing commercial sounding language, including trademark or registered trademark symbols (TM/R) and the mention of company brand names before an instrument or reagent. Examples of commercial sounding language in your manuscript are 10x Genomics Inc., Drop-seq, InDrop, MULTI-seq and Cell Hashing, falcon, Flowmi Cell Strainers, SD100 Cell Counting Chamber, Template Switch Oligo, NexcelomCellometer Auto 2000, TruStain FcX™ PLUS (FcX, BioLegend), Chromium Single cell 3' v3, Chromium Chip B, Dynabeads MyOne SILANE, Dynabeads, Agilent, Agilent TapeStation, SPRIselect, TruSeq RPIX , KAPA HiFi HotStart, CellRanger, Seurat V2 or V3, Co-Anchoretc.

1) Please use MS Word's find function (Ctrl+F), to locate and replace all commercial sounding language in your manuscript with generic names that are not company-specific. All commercial products should be sufficiently referenced in the table of materials/reagents. You may use the generic term followed by "(see table of materials)" to draw the readers' attention to specific commercial names.

2) Please remove the registered trademark symbols TM/R from the table of reagents/materials.

3) Please check Table 1 as well.

Response: We thank the editor for the comments and suggestions. We have replaced all the commercial sounding names with generic names and removed the registered trademark symbols. However, for the term multi-seq, cell hashing, seurat v3, and co-anchor, we don't think they are commercial names. Although we have updated these names as generic names, we think it will be better to keep these names as they were to avoid confusing the readers. Please let us know if the editor agrees about that. If so, we can change those names back to their original name. If not, we can use these names as they currently are.

Table of Materials: Please revise the table of the essential supplies, reagents, and equipment. The table should include the name, company, and catalog number of all relevant materials/software in separate columns in an xls/xlsx file. Please include items such as antibodies with concentrations and RRIDs,

Response: We thank the editor for the comment. We have updated the table with detailed name/company/catalog number information and included a concentration/RRID information for the antibodies. In addition, the table has been saved as "table of materials".

If your figures and tables are original and not published previously or you have already obtained figure permissions, please ignore this comment. If you are re-using figures from a previous publication, you must obtain explicit permission to re-use the figure from the previous publisher (this can be in the form of a letter from an editor or a link to the editorial policies that allows you to re-publish the figure). Please upload the text of the re-print permission (may be copied and pasted from an email/website) as a Word document to the Editorial Manager site in the "Supplemental files (as requested by JoVE)" section. Please also cite the figure appropriately in the figure legend, i.e. "This figure has been modified from [citation]."

Response: We thank the editor for the important comments. Considering part of the figure 1A and figure 4 (Figure 4A, 4B, 4C, 4D) in our previous submission were derived from one of our published paper, we have updated all of them with unpublished figures. We have also updated the texts by removing the citations.

Comments from Peer-Reviewers

Reviewers' comments:

Reviewer #1:

Manuscript Summary:

Here, Feng et al present a protocol for performing 10x scRNA-seq on embryonic heart. The protocol is well described, the heart dissociation protocol can be useful for scientist working with this model. Rest of the protocol is relevant to any scientists using 10x genomics. Although as it is, the protocol does not bring anything new compared to what is already available from 10X and a few references (correctly cited), but it is not a JOVE requirement. It would be helpful for the scientific communities if the Multi-seq anchor / barcode synthesis / experimental design and limitation (cell type dependence) could be discussed more.

Response: We thank the reviewer for noting our protocol is well described. We also greatly appreciate the reviewer for pointing out the weaknesses of the manuscript.

Major Concerns:

- Line 114 (and other places): please report precisely the Flowmi strainers used (size + ref)

Response: We thank the reviewer for the comment. The cell strainer we used is 40µm. We have updated it in the manuscript and table of materials (line 127).

- MULTI-seq procedure: line 126

Here the authors only refers to the already published paper. If I am correct, the synthesis of the anchor, co-anchor is not trivial and not accessible to everyone. Maybe the authors could comment more on how they performed the synthesis?

Response: We thank the reviewer for the comment. We have added a paragraph to comment on the synthesis of anchor and co-anchor (Line 146-148).

- Line 133 (and 154). The authors do not comment on the number of cells that can be used at this step.

Response: We thank the reviewer for the important comment. We have updated the cell number information for both Multi-seq and Cell hashing procedures (line 141,167).

- Line 142. 1% BSA has been reported to inhibit 10X reaction. So cells have to be diluted. Can the authors comment on the maximum final %BSA the cells are just before loading on the 10x chip. This might be relevant to scientists working on the same cell / tissue model as presented here.

Response: We thank the reviewer for the comment. Since the cells will need to dilute with nuclease-free water to a specific cell concentration before loading into the Chromium, the BSA concentration after dilution will range from 0.1%-0.3%, which will depend on the targeted recovery cell number.

In addition, according to the information from 10X Genomics website (<https://kb.10xgenomics.com/hc/en-us/articles/218170703-What-is-the-highest-BSA-concentration-that-can-be-used-in-the-cell-buffer->), the BSA concentrations ranging from 0.1-2% have no adverse effects on the workflow or sequencing data.

- line 277-278: mentioned step 6.1. But is this not 5.1?

Response: We thank the reviewer for the comment and apologies for the error. We have corrected it in our updated protocol (line 329).

Minor Concerns:

- writing ScRNA-seq is unusual (e.g. line 61). scRNA-seq seems more appropriate

Response: Thanks. We have updated all ScRNA-seq as scRNA-Seq.

Reviewer #2:

In this manuscript Li and collaborators describe how to perform single cell RNA-seq library preparation from individual heart cells from E18.5 embryos using the 10X genomics platform. They also describe 2 options for multiplexing multiple samples in the same reaction, thus reducing the batch effect and the cost of each experiment.

Response: We thank the reviewer for summarizing our study.

Major Concerns:

The manuscript needs a moderate revision before being ready for publication. While the protocol is well described, the authors should better explain the general workflow of the protocol at the very beginning (maybe with a clearer figure) and explain the technical differences between the 2 options they are describing. They should state at the beginning advantages and disadvantages of each of them and help the reader in the decision.

Response: We thank the reviewer for the great suggestions. We have updated figure 1 by including more details to show the workflow differences between Cell hashing and Multi-seq. In addition, we have included a few sentences in the introduction to explain the advantages/disadvantages of the two methods (Line 77-83).

They should also indicate clearly how many samples and how many cells they can multiplex in the same experiment. As the ultimate goal of multiplexing is the cost reduction (on top of the batch effect removal), a sentence about the magnitude of the cost reduction is also needed.

Response: We thank the reviewer for the important suggestions. We have included a few sentences in the introduction to talk about the number of samples/cells that can multiplex in the same experiment and a sentence for the magnitude of the cost reduction (line 82-89).

The whole sentence about FACS in the discussion is misleading/wrong. FACS and micromanipulation are not used to isolate single cell, but to isolate "specific" single cells with a specific surface molecule pattern or in a specific position. FACS especially is it still is the only option available for specific purpose. In the protocol presented there is no possibility to isolate specific subpopulations of cells, but only the way to obtain a single cell suspension from multiple samples.

Response: We thank the reviewer for the comment and apologies for the misleading. We have removed all the sentences about FACS in the discussion.

As different people will use different tissues or different embryonic stages, a general sentence about the total number of cells required as a starting point is needed.

Response: We thank the reviewer for the suggestion. We have added a sentence to talk about the total number of cells required as a starting point (line 113-114).

Minor Concerns:

The manuscript would benefit from a revision from a native English speaker. Some sentences are truncated (line 63) and some words are wrong (unbiased/unbiasedly)

Response: We thank the reviewer for the suggestion and apologies for the truncating sentences and grammar errors. The revised manuscript has been carefully read through by a native English speaker.

The word “recently” in the abstract must be explained, as everything is very recent in this field.

Response: Thanks. We have replaced the “recently” with “in the last two to three years”.

The sentence “significant cell variation” must be explained (line 44), what does significant mean?

Response: We thank the reviewer for the comment and apologies for the confusion. We have updated the sentence as “The transcriptional profile of each single cell varies among cell populations during embryonic development” (line 43).

The words DNA or cDNA must be used appropriately.

Response: Thanks. We have went through the manuscript to make sure the two words were used appropriately.

Some abbreviations need to be spelled out (EP tubes?).

Response: We thank the reviewer for the suggestion. We have updated the protocol by replacing some abbreviations including EP tubes with their full names.

A sentence describing the need of both a pre- and a post-amplification areas in the lab is needed.

Response: Thanks. We have added two sentences to emphasize this point in the protocol (line 135-137).

I think that if the authors would add a sentence about how long each main step takes and if there is any safe stopping point, the reader will have a better grip on the protocol.

Response: We thank the reviewer for the important suggestion. We have added an estimated time for each main step and marked that step if it is safe to stop.

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Author(s):	Wei Feng, Andrew Przysinda, Guang Li

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