



Maturation exploration of kidney organoids from single-cell RNA-seq data analysis

Solène Brohard-Julien

► To cite this version:

Solène Brohard-Julien. Maturation exploration of kidney organoids from single-cell RNA-seq data analysis. ISHG 2023 - International Symposium on Human Genomics, Sep 2023, Paris, France. hal-04709442

HAL Id: hal-04709442

<https://hal.science/hal-04709442v1>

Submitted on 30 Sep 2024

HAL is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers.

L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.



Maturation exploration of kidney organoids from single-cell RNA-seq data analysis

Solène Brohard

Bio-informatician

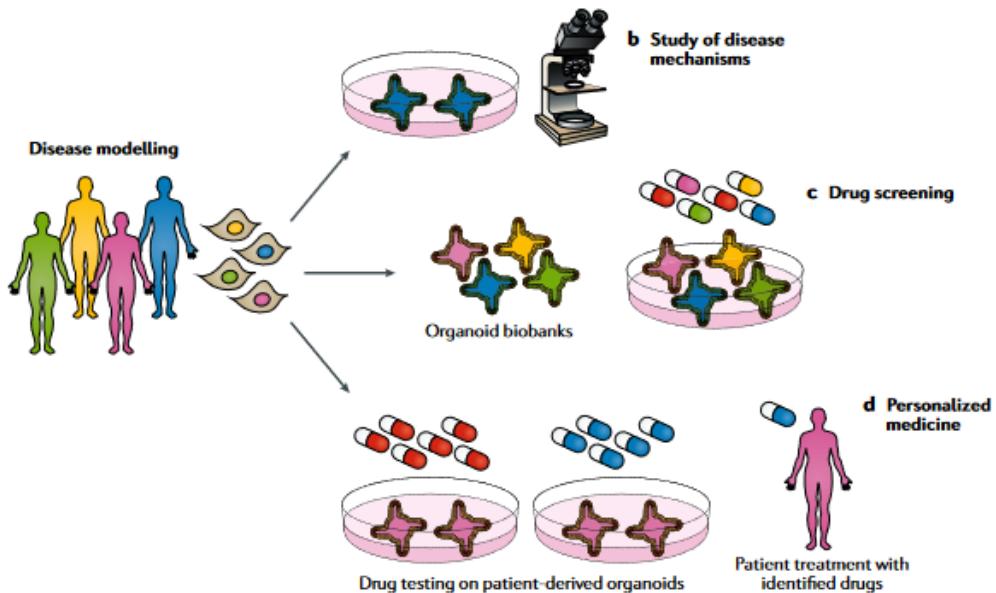


Organoids model organs development

Definition

Organoids are **3D structures** derived from adult (**ASCs**) or pluripotent (**PSCs**) stem-cells. They are cultured *in vitro* and display architectures and functionalities similar to organs *in vivo*. At a much smaller scale, the multicellular repertoire of target organs is expected to validate organoid **maturity**.

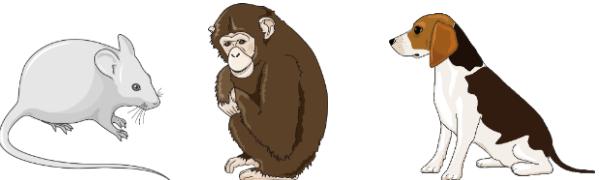
Therapeutic Application



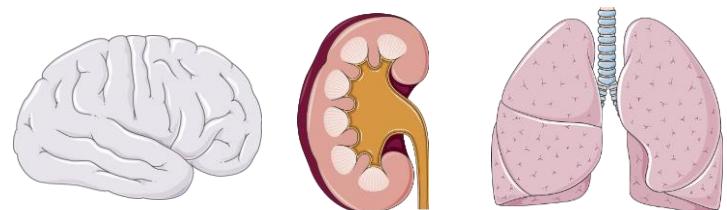
Rossi et al., 2018, Nature Review.

Ethical implication

Animal experimentations



Tissue collection



De Kanter et al., 2023, Tissue Engineering.



Organoid maturation limits/challenges

Limits

Cell differentiation in organoids is closer to **fetal** than adult target organ.

- Restricted lifespan limits ability to reach latter stages.
- In vitro environment lacks specific *in vivo* factors to diffuse nutrients.

Challenges

- Improve organoid **specificity** to the target organ.
- Define **organ specific cells** vs off target cells for quality control.
- Vascularization by bioengineering or transplantation.

→ The single-cell RNA-seq is widely used to control the cell composition of organoids.

Rossi *et al.*, 2018, Nature Review.
Picollet-D'hahan *et al.*, 2017, Trends in Biotechnology.
The Organoid Cell Atlas, 2021, Nature Biotechnology.



Available resources on kidney organoids

- Kidney cell fate, targeted and off target cell types in kidney tissues.
- Single-cell RNA-seq data available and analyzed.

Cell Stem Cell
Resource

High-Throughput Screening Enhances Kidney Organoid Differentiation from Human Pluripotent Stem Cells and Enables Automated Multidimensional Phenotyping

Stefan M. Czermicki,^{1,2,3,9} Nelly M. Cruz,^{1,2,3,9} Jennifer L. Harder,^{4,9} Rajasree Menon,⁵ James Annis,³ Edgar A. Otto,⁴ Ramila E. Gulieva,^{1,2,3} Laura V. Islas,^{1,2,3} Yong Kyun Kim,^{1,2,3} Linh M. Tran,^{1,2,3,6} Timothy J. Martins,³ Jeffrey W. Pippin,¹ Hongxia Fu,^{3,6} Matthias Kretzler,^{4,5} Stuart J. Shankland,¹ Jonathan Himmelfarb,^{1,2} Randall T. Moon,^{3,7} Neal Paragas,¹ and Benjamin S. Freedman^{1,2,3,8,10,*}

Cell Stem Cell 22, 929–940, June 1, 2018

CellPress
OPEN ACCESS

Cell Stem Cell

Resource

Spatial dynamic metabolomics identifies metabolic cell fate trajectories in human kidney differentiation

Gangqi Wang,^{1,2} Bram Heijts,^{2,3} Sarantos Kostidis,³ Rosalie G.J. Rietjens,¹ Marije Koning,¹ Lushun Yuan,¹ Gesa L. Tiemeier,¹ Ahmed Mahfouz,^{4,5} Sébastien J. Dumas,^{1,2,6} Martin Giera,^{2,3} Jesper Kers,⁷ Susana M. Chuva de Sousa Lopes,^{7,8} Catheline W. van den Berg,^{1,2} Bernard M. van den Berg,¹ and Ton J. Rabelink^{1,2,9,*}

Cell Stem Cell 29, 1580–1593, November 3, 2022

npj | Regenerative Medicine

www.nature.com/npjregenmed

REVIEW ARTICLE OPEN

Check for updates

Defining the variety of cell types in developing and adult human kidneys by single-cell RNA sequencing

A. Schumacher¹, M. B. Rookmaaker², J. A. Joles², R. Kramann^{3,4}, T. Q. Nguyen⁵, M. van Griensven¹ and V. L. S. LaPointe^{1,6*}

npj Regenerative Medicine (2021) 4:5



Available resources on kidney organoids

PROTOCOL

- Kidney cell fate, targeted and off target cell types in kidney tissues.
- Single-cell RNA-seq data available and analyzed.

Cell Stem Cell Resource

High-Throughput Screening Enhances Kidney Organoid Differentiation from Human Pluripotent Stem Cells and Enables Automated Multidimensional Phenotyping

Stefan M. Czerniecki,^{1,2,3,9} Nelly M. Cruz,^{1,2,3,9} Jennifer L. Harder,^{4,9} Rajasree Menon,⁵ James Annis,³ Edgar A. Otto,⁴ Ramila E. Gulleva,^{1,2,3} Laura V. Islas,^{1,2,3} Yong Kyun Kim,^{1,2,3,6} Linh M. Tran,^{1,2,3,6} Timothy J. Martins,³ Jeffrey W. Pippin,¹ Hongxia Fu,^{3,6} Matthias Kretzler,^{4,5} Stuart J. Shankland,¹ Jonathan Himmelfarb,^{1,2} Randall T. Moon,^{3,7} Neal Paragas,¹ and Benjamin S. Freedman^{1,2,3,8,10,*}

Cell Stem Cell 22, 929–940, June 1, 2018

CellPress
OPEN ACCESS

Cell Stem Cell

Resource Spatial dynamic metabolomics identifies metabolic cell fate trajectories in human kidney differentiation

Gangqi Wang,^{1,2} Bram Heijts,^{2,3} Sarantos Kostidis,³ Rosalie G.J. Rietjens,¹ Marije Koning,¹ Lushun Yuan,¹ Gesa L. Tiemeier,¹ Ahmed Mahfouz,^{4,5} Sébastien J. Dumas,^{1,2,6} Martin Giera,^{2,3} Jesper Kers,⁷ Susana M. Chuva de Sousa Lopes,^{7,8} Catheline W. van den Berg,^{1,2} Bernard M. van den Berg,¹ and Ton J. Rabelink^{1,2,9,*}

Cell Stem Cell 29, 1580–1593, November 3, 2022

npj | Regenerative Medicine

REVIEW ARTICLE OPEN

Defining the variety of cell types in developing and adult human kidneys by single-cell RNA sequencing

A. Schumacher¹, M. B. Rookmaaker², J. A. Joles², R. Kramann^{3,4}, T. Q. Nguyen⁵, M. van Griensven⁶ and V. L. S. LaPointe^{1,6*}

npj Regenerative Medicine (2021) 45

www.nature.com/npjregenmed

Published online 18 August 2016; doi:10.1038/npj.2016.098
NATURE PROTOCOLS | VOL.11 NO.9 | 2016



ARTICLE

<https://doi.org/10.1038/s41467-019-13382-0> OPEN

Single cell census of human kidney organoids shows reproducibility and diminished off-target cells after transplantation

Ayshwarya Subramanian^{1,6}, Eriene-Heidi Sidhom^{1,2,6}, Maheswarareddy Emani^{1,6}, Katherine Vernon^{1,2}, Nareh Sahakian¹, Yiming Zhou^{1,2}, Maria Kost-Alimova³, Michal Slyper¹, Julia Waldman¹, Danielle Dionne^{1,2}, Lan T. Nguyen¹, Astrid Weins⁴, Jamie L. Marshall¹, Orit Rosenblatt-Rosen¹, Aviv Regev^{1,5} & Anna Greka^{1,2*}

NATURE COMMUNICATIONS | (2019)10:5462 |

Combes et al. *Genome Medicine* (2019) 11:3
<https://doi.org/10.1186/s13073-019-0615-0>

Genome Medicine

RESEARCH

Open Access

Single-cell analysis reveals congruence between kidney organoids and human fetal kidney

Alexander N. Combes^{1,2*†}, Luke Zappia^{2,3†}, Pei Xuan Er², Alicia Oshlack^{2,3} and Melissa H. Little^{1,2,3,4*}





Available resources on kidney organoids

PROTOCOL

- Kidney cell fate, targeted and off target cell types in kidney tissues.
- Single-cell RNA-seq data available and analyzed.

Cell Stem Cell Resource

High-Throughput Screening Enhances Kidney Organoid Differentiation from Human Pluripotent Stem Cells and Enables Automated Multidimensional Phenotyping

Stefan M. Czerniecki,^{1,2,3,9} Nelly M. Cruz,^{1,2,3,9} Jennifer L. Harder,^{4,9} Rajasree Menon,⁵ James Annis,³ Edgar A. Otto,⁴ Ramila E. Guljeva,^{1,2,3} Laura V. Islas,^{1,2,3} Yong Kyun Kim,^{1,2,3,6} Linh M. Tran,^{1,2,3,6} Timothy J. Martins,³ Jeffrey W. Pippin,¹ Hongxia Fu,^{3,6} Matthias Kretzler,^{4,5} Stuart J. Shankland,¹ Jonathan Himmelfarb,^{1,2} Randall T. Moon,^{3,7} Neal Paragas,¹ and Benjamin S. Freedman,^{1,2,3,8,10,*}

Cell Stem Cell 22, 929–940, June 1, 2018

CellPress
OPEN ACCESS

Resource
Spatial dynamics of metabolic cell type trajectories in human kidney differentiation

Gangqi Wang,^{1,2} Bram Heijts,^{2,3} Sarantos Kostidis,³ Rosalie G.J. Rietjens,¹ Marije Koning,¹ Lushun Yuan,¹ Gesa L. Tiemeier,¹ Ahmed Mahfouz,^{4,5} Sébastien J. Dumas,^{1,2,6} Martin Giera,^{2,3} Jesper Kers,⁷ Susana M. Chuva de Sousa Lopes,^{7,8} Catheline W. van den Berg,^{1,2} Bernard M. van den Berg,¹ and Ton J. Rabelink^{1,2,9,*}

Cell Stem Cell 29, 1580–1593, November 3, 2022

npj | Regenerative Medicine

www.nature.com/npjregenmed

REVIEW ARTICLE OPEN

Defining the variety of cell types in developing and adult human kidneys by single-cell RNA sequencing

Check for updates

NATURE PROTOCOLS | VOL.11 NO.9 | 2016



ARTICLE

<https://doi.org/10.1038/s41467-019-13382-0>

OPEN

Single cell census of human kidney organoids shows reproducibility and diminished off-target cells after transplantation

Ayshwarya Subramanian,^{1,6} Eriene-Heidi Sidhom,^{1,2,6} Maheswarareddy Emani,^{1,6} Katherine Vernon,^{1,2} Nareh Sahakian,¹ Yiming Zhou,^{1,2} Maria Kost-Alimova,³ Michal Slyper,¹ Julia Waldman,¹ Danielle Dionne,¹

Can we assess the tissue specificity and the variation of cell composition of kidney organoids from single-cell RNA-seq data?

RESEARCH

Open Access

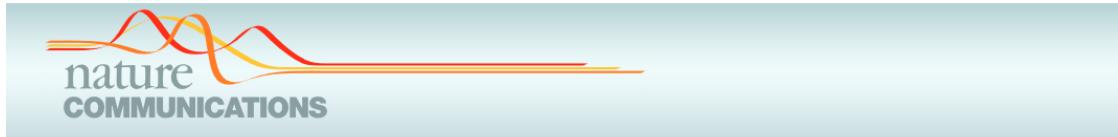
Single-cell analysis reveals congruence between kidney organoids and human fetal kidney

Alexander N. Combes^{1,2*}, Luke Zappia^{2,3†}, Pei Xuan Er², Alicia Oshlack^{2,3} and Melissa H. Little^{1,2,3,4*}





Public datasets used of kidney organoids



ARTICLE

<https://doi.org/10.1038/s41467-019-13382-0>

OPEN

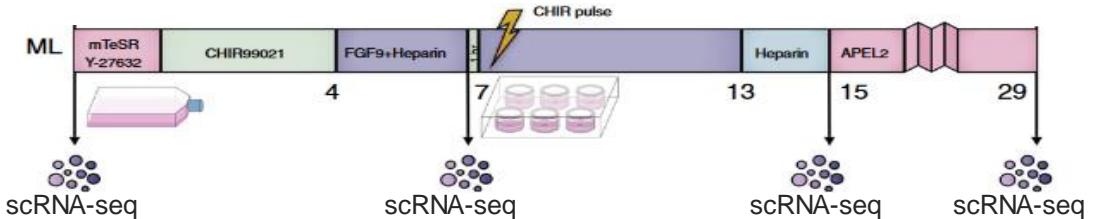
Single cell census of human kidney organoids shows reproducibility and diminished off-target cells after transplantation

Ayshwarya Subramanian^{1,6}, Eriene-Heidi Sidhom^{1,2,6}, Maheswarareddy Emani^{1,6}, Katherine Vernon^{1,2}, Nareh Sahakian¹, Yiming Zhou^{1,2}, Maria Kost-Alimova³, Michal Slyper¹, Julia Waldman¹, Danielle Dionne^{1,6}, Lan T. Nguyen¹, Astrid Weins⁴, Jamie L. Marshall¹, Orit Rosenblatt-Rosen¹, Aviv Regev^{1,5} & Anna Greka^{1,2*}

NATURE COMMUNICATIONS | (2019)10:5462

- Freely available datasets.
- Alstem(AS) human induced pluripotent stem cell line.
- 4 time points of maturation (D0, D7, D15 and D29).

Protocol



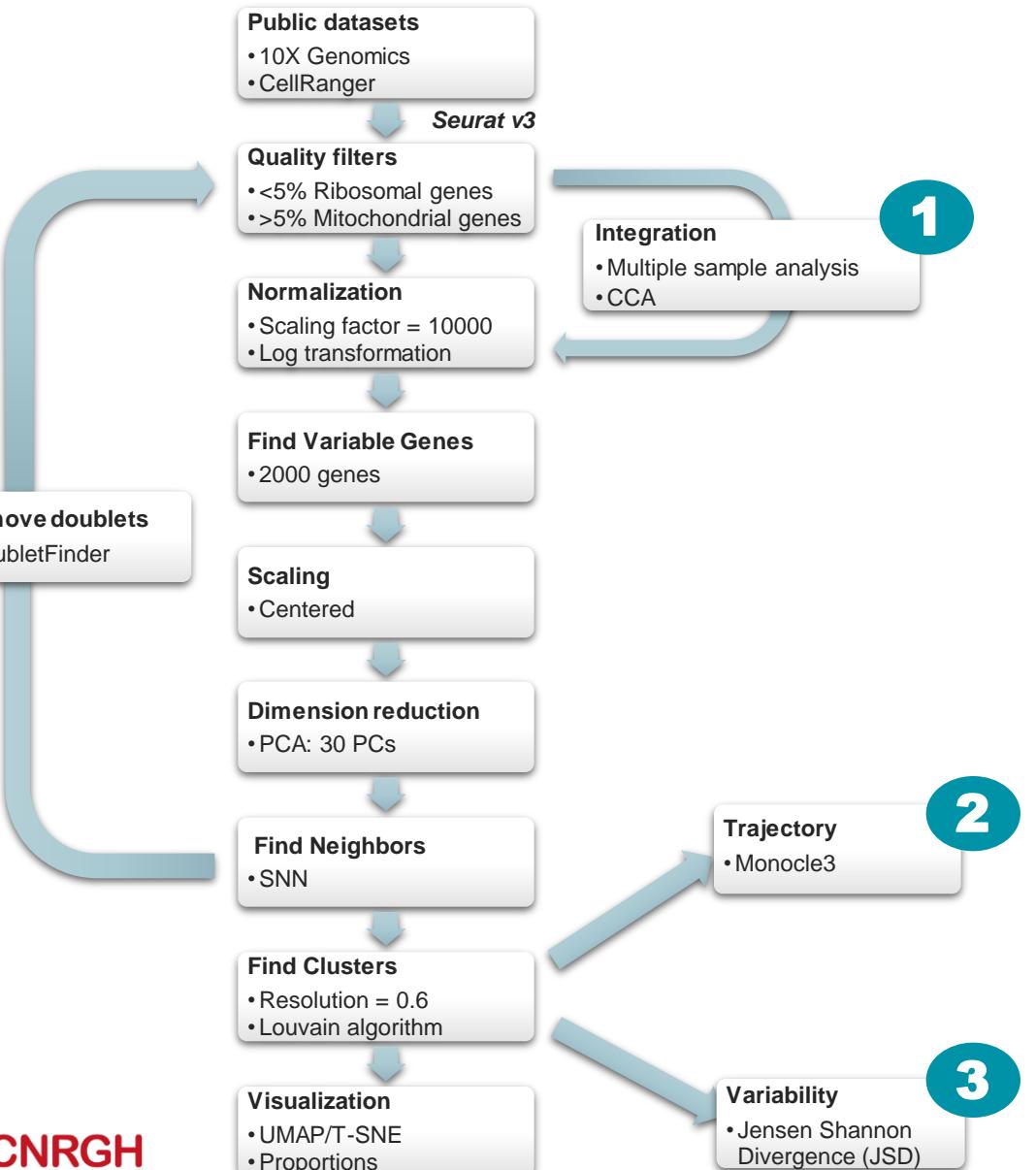
Takasato et al, 2016, Nature Protocols

Single-cell RNA-seq datasets

Day of maturation Number of cells

D0	16786
D7	16072
D15	50976
D29	47799

Single-cell RNA-seq workflow adapted for organoids



Maturation study of organoids from single-cell RNA-seq data analysis

Solène Brohard¹, Camille Lemercier, Alexandre Hubert, Jean-François Deleuze and Eric Bonnet
Université Paris-Saclay, CEA, Institut Jaude, Centre National de Recherche en Génomique Humaine (CNRGH), 91000 Évry-Courcouronnes, France



Introduction

Organoids are 3D structures derived from adult (ASCs) or pluripotent (PSCs) stem-cells. They are cultured *in vitro* and display architectures and functionalities similar to *in vivo* organs. At a much smaller scale, the multicellular repertoire of targeted organs is expected to vary during maturation. We used to study the maturation of organoids by comparing methods with single-cell RNA-seq data of organoids at different maturation stages. We integrated the datasets to highlight cell specificities for each stage of maturation. We also studied cell trajectories to observe if there is a correlation between the cell differentiation and the date of maturation. We finally used statistical methods to explore the variability of cell proportions between stages of maturation.

Organoids

1 Integration

Datasets of kidney organoids cultured from AS hiPSC line at the different days of maturation were integrated to compare the cell populations present in the samples.

The method used to integrate datasets was the Canonical Correlation Analysis (CCA) (Fig.3).

2 Kidney organoid dataset

Public datasets from Subramanian et al¹ allowing organoid maturation study are freely available. The protocol (ML) used in this paper has been defined to target kidney organoids. Single-cell RNA-seq (scRNA-seq) are done on organoids at different stages of maturation (day 0, day 7, day 15 and day 25). Two commercial human iPSC (hiPSC) lines (Aistem-AS and Thermo Fisher THF) are tested (Fig.1).

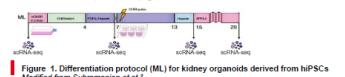


Figure 1. Differentiation protocol (ML) for kidney organoids derived from hiPSCs. Modified from Subramanian et al.¹

scRNA-seq analysis

The workflow (Fig.2) applied on Subramanian et al.¹ count matrices is based on R Seurat package (v3).

Filters to remove low quality cells:

- % of reads covering ribosomal genes > 5%
- % of reads covering mitochondrial genes > 5%
- Doublets: identification of doublets containing multiple cells (estimation by 10X Genomics technology of ~5% of doublets for 10 000 cells targeted)

The number of principal components (PCs) used for principal component analysis (PCA) is kept to the fewer number of PCs that cover the maximum of variability (30 PCs).

The number of clusters to choose is the number of principal components (PCs) used for principal component analysis (PCA) to keep the fewer number of PCs that cover the maximum of variability (30 PCs).

The workflow and the parameters chosen follow the guidelines of Seurat tutorials.

Figure 2. Single-cell RNA-seq workflow

3 Trajectory

From integrated datasets of AS cell line, we use Monocle3 to visualize cell trajectories (Fig.5).



Figure 5. Trajectory visualization

> The tendency observed in Fig. 4 is visualized in cell trajectory.

> The D25 specific clusters are well separated.

> We also visualize the maturation and the cell differentiation from D0 to D25.

4 Variability

The Jensen Shannon Divergence (JSD) statistical approach allows to compare datasets between 0 and 1. It corresponds to a high level of divergence between the 2 classifications.

The JSD score applied on all integrated datasets (AS, THF and all the days of maturation 0, D0, D7, D15 and D25). It compared the proportion of cells in each cluster between 2 samples.

> The JSD score between the AS and THF cell lines at the same maturation time (Fig.6 A) indicated that the maturation was not affected by the cell type line.

> For AS (Fig.6 B) or THF (Fig.6 C) only and between THF and AS (Fig.6 D) or different maturation levels, we observed a maturation effect on the variability.

> As observed in Fig. 4, D0vD7 and D15vD25 showed more similar classification than was coherent with an early and late stages maturation.

In perspective of this preliminary study is to explore and compare organoids of same targeted tissue from different maturation ages, cell lines and protocols. We also planned to use machine learning approaches to develop a method that could try to estimate the maturation level of organoids.

1. Rossi, Martin, J. Loeffl. Progress and potential in organoid research. *Nat Rev Gener* 19, 67–887 (2018).

2. Subramanian, Sidhom, Emrani et al. Single-cell census of human kidney organoids shows reproducibility and diminished off-target cells after transplantation. *Nat Commun* 10, 5462 (2019).

3. Solène Brohard, CNRGH, Université Paris-Saclay, CEA, Institut Jaude, Centre National de Recherche en Génomique Humaine (CNRGH), 91000 Évry-Courcouronnes, France

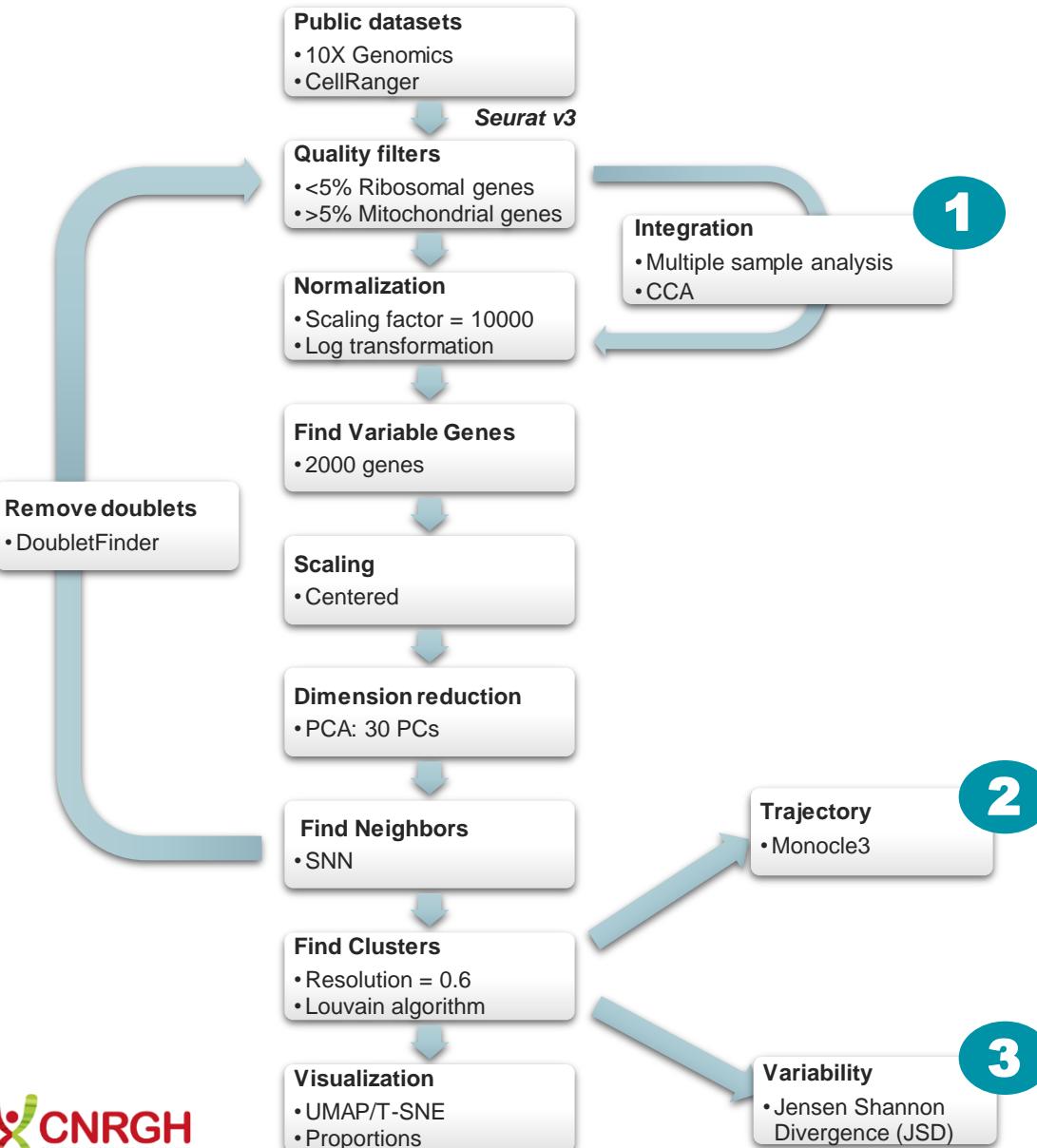
4. Solène Brohard, CNRGH, Université Paris-Saclay, CEA, Institut Jaude, Centre National de Recherche en Génomique Humaine (CNRGH), 91000 Évry-Courcouronnes, France

solene.brohard@crgh.fr

20/09/2023



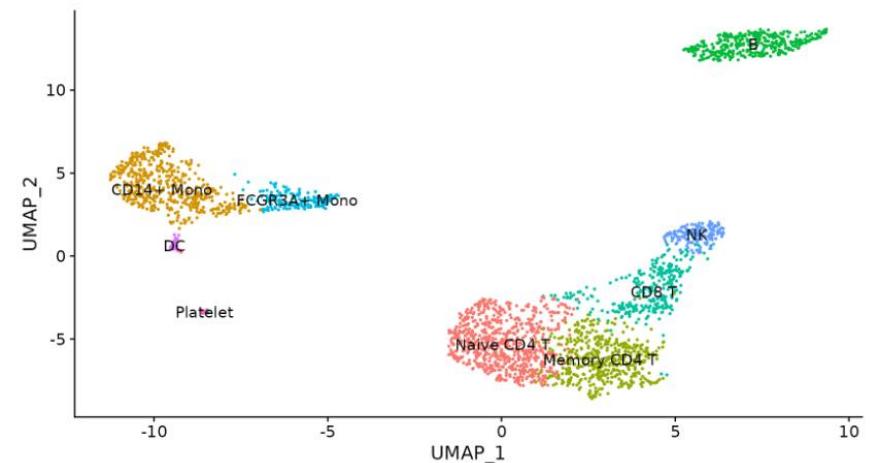
Single-cell RNA-seq workflow adapted for organoids



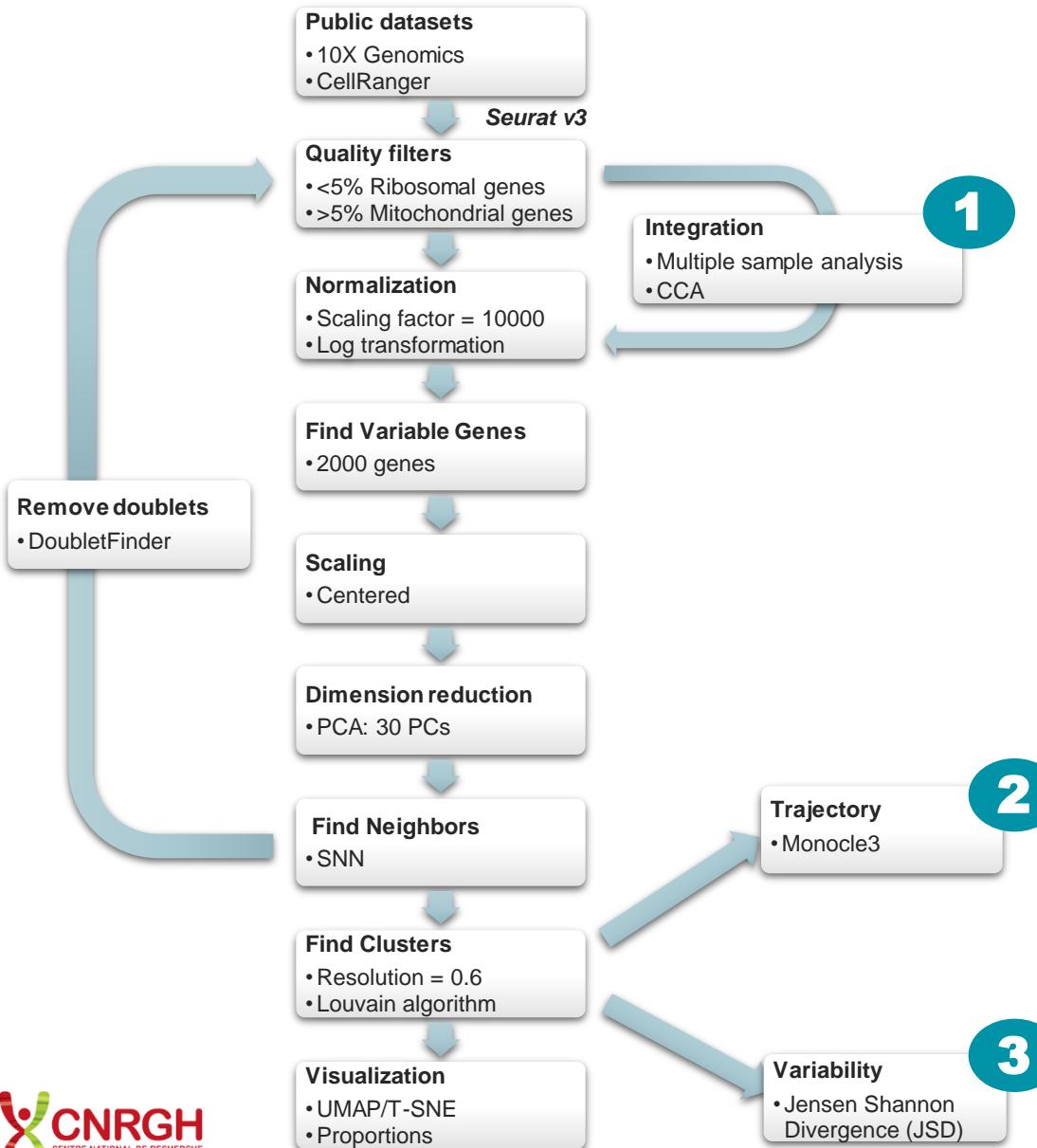
Seurat

Stuart and Butler et al. Comprehensive Integration of Single-Cell Data. Cell (2019) [Seurat V3]

- Transcriptome of each cell.
- 1 point = 1 cell

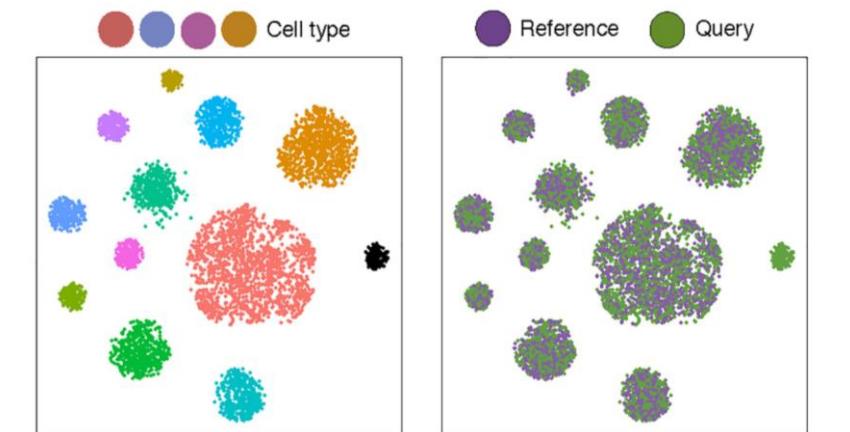
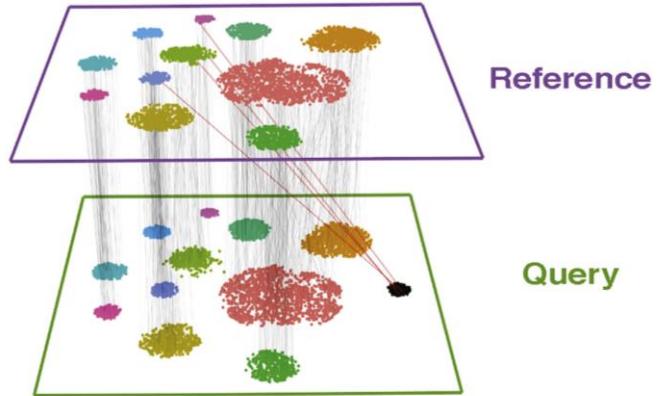


Single-cell RNA-seq workflow adapted for organoids



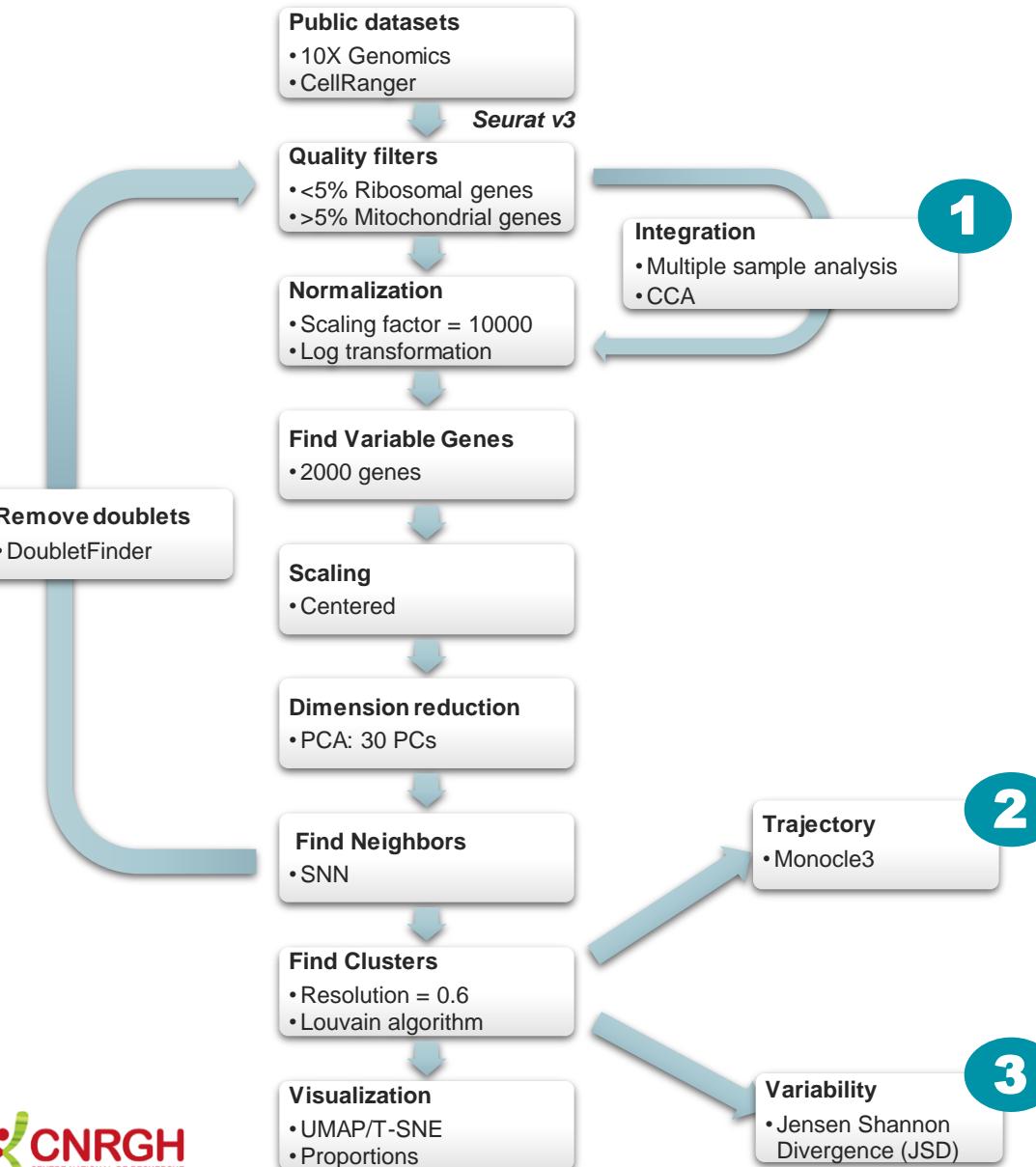
1 Integration

- Canonical Correlation Analysis (CCA)



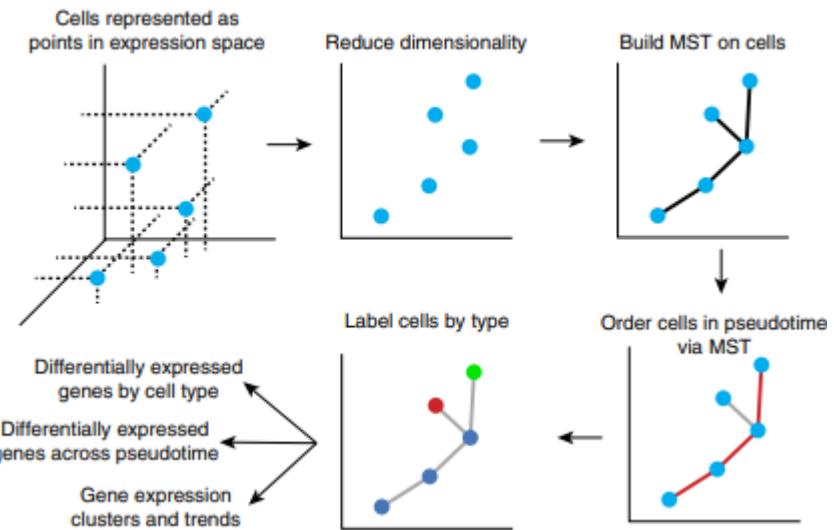
Stuart and Butler *et al*, 2019. Cell

Single-cell RNA-seq workflow adapted for organoids



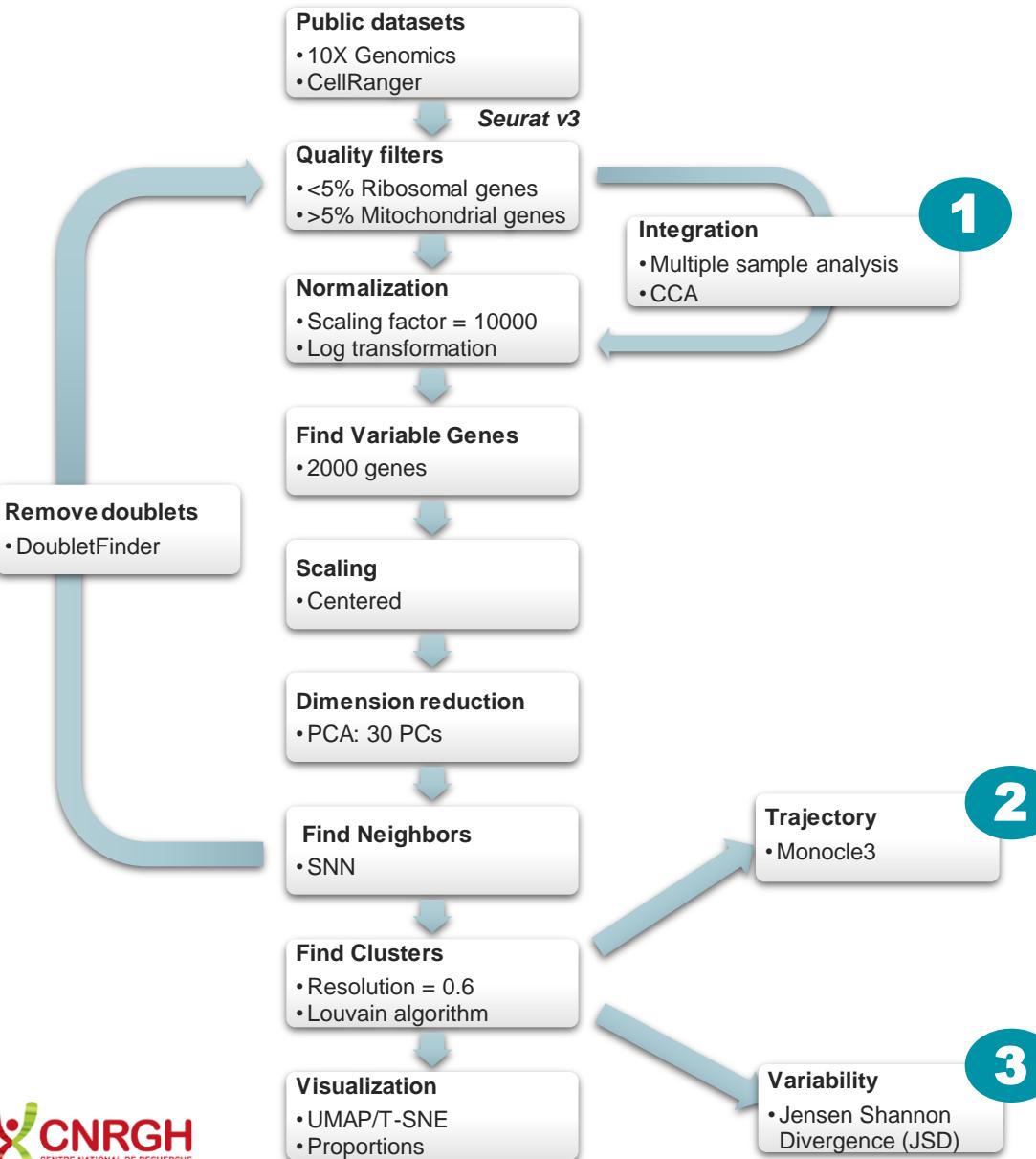
2 Trajectory

- Monocle3
- Order cell by pseudo-time from graph approach depending on cell distances.
- Visualization of cell differentiation



Trapnell et al., 2014. Nature Biotechnology.

Single-cell RNA-seq workflow adapted for organoids



3 Jensen Shannon Divergence

The **Jensen Shannon Divergence (JSD)** statistical approach that compare object frequencies in groups.

Score comprised between 0 and 1:

- 0: identical classifications.
- 1: high level of divergence between the 2 classifications.

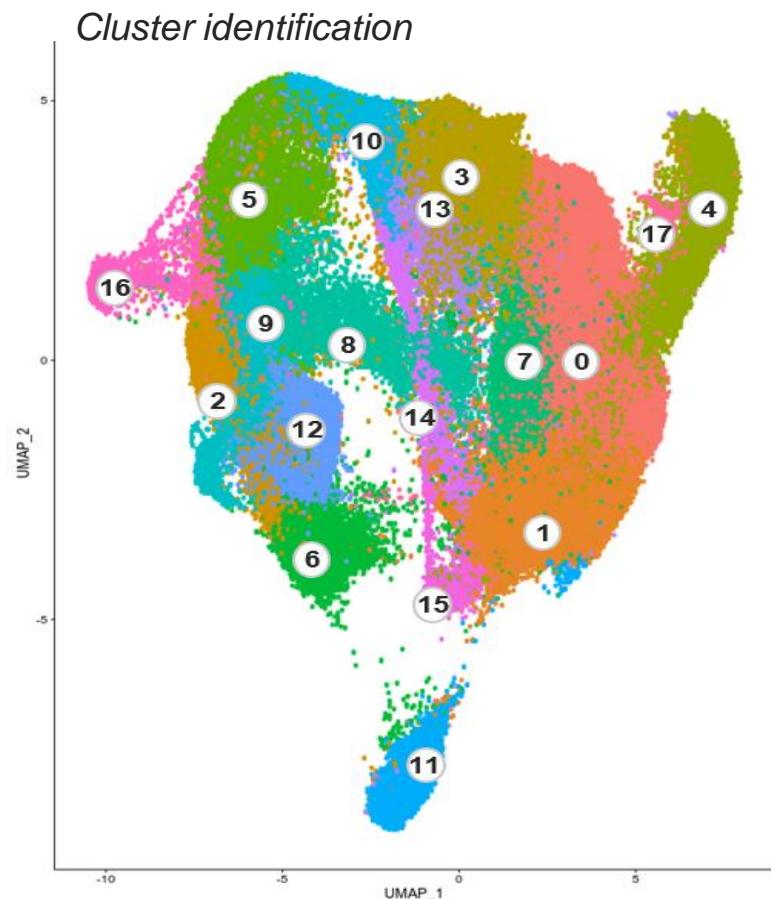
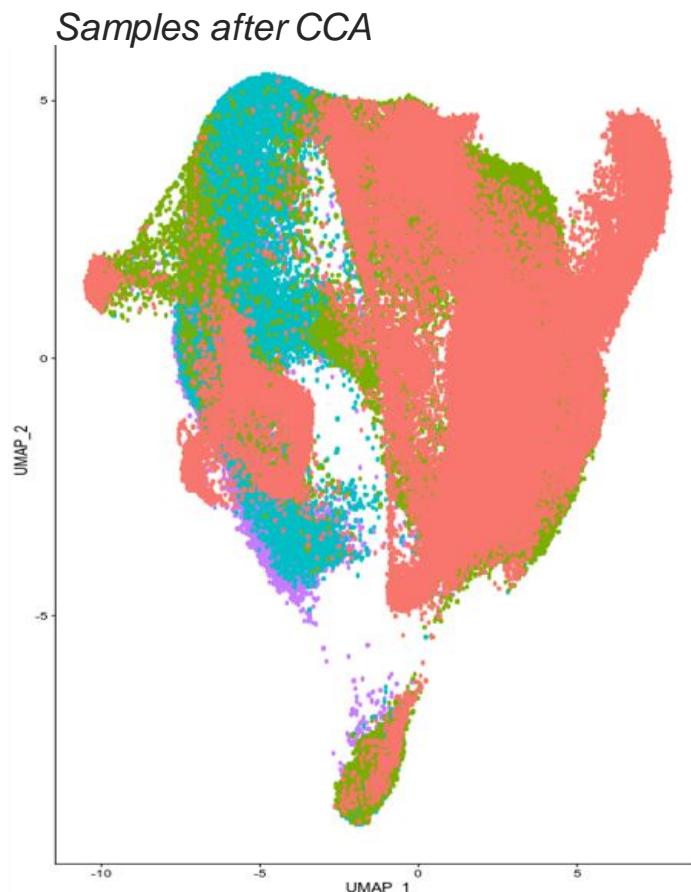
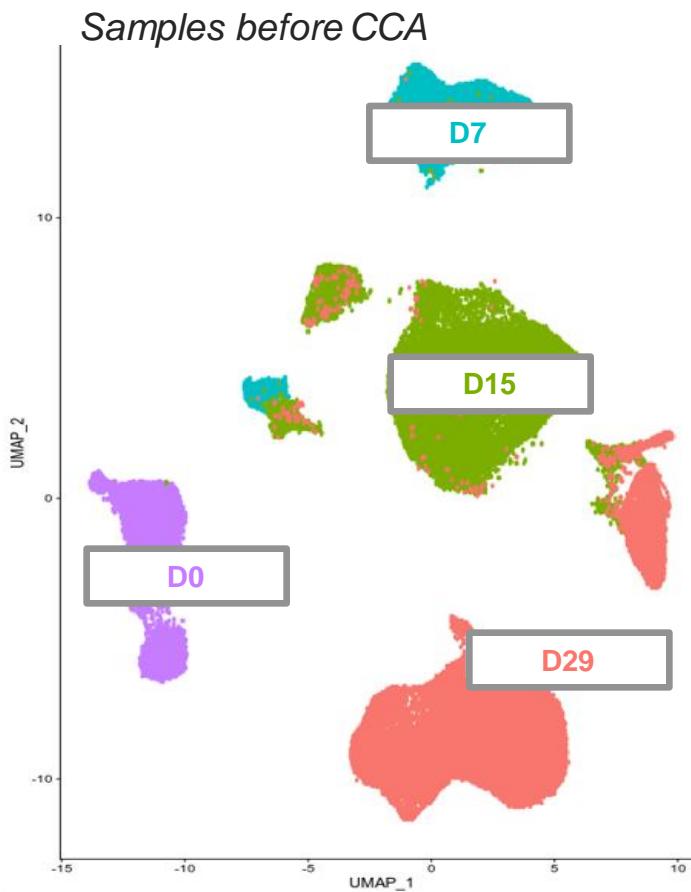
Lin., 1991, IEEE Transaction on Information Theory.

20/09/2023

6

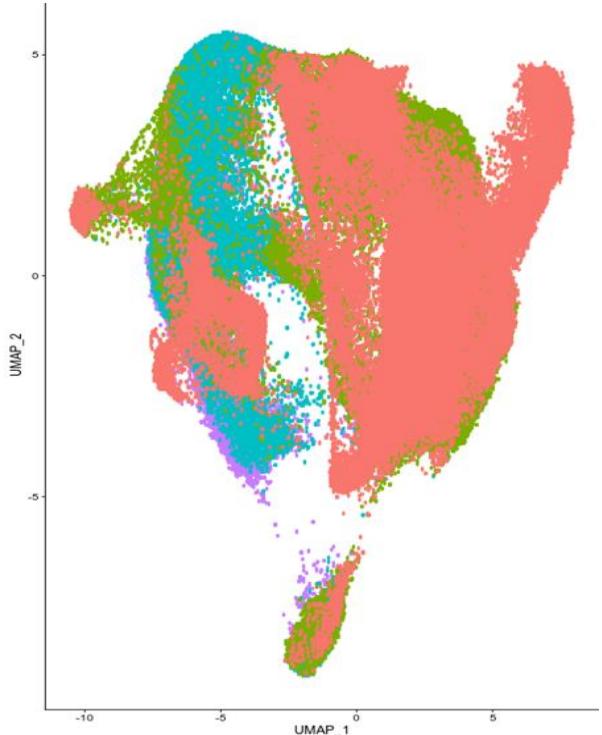
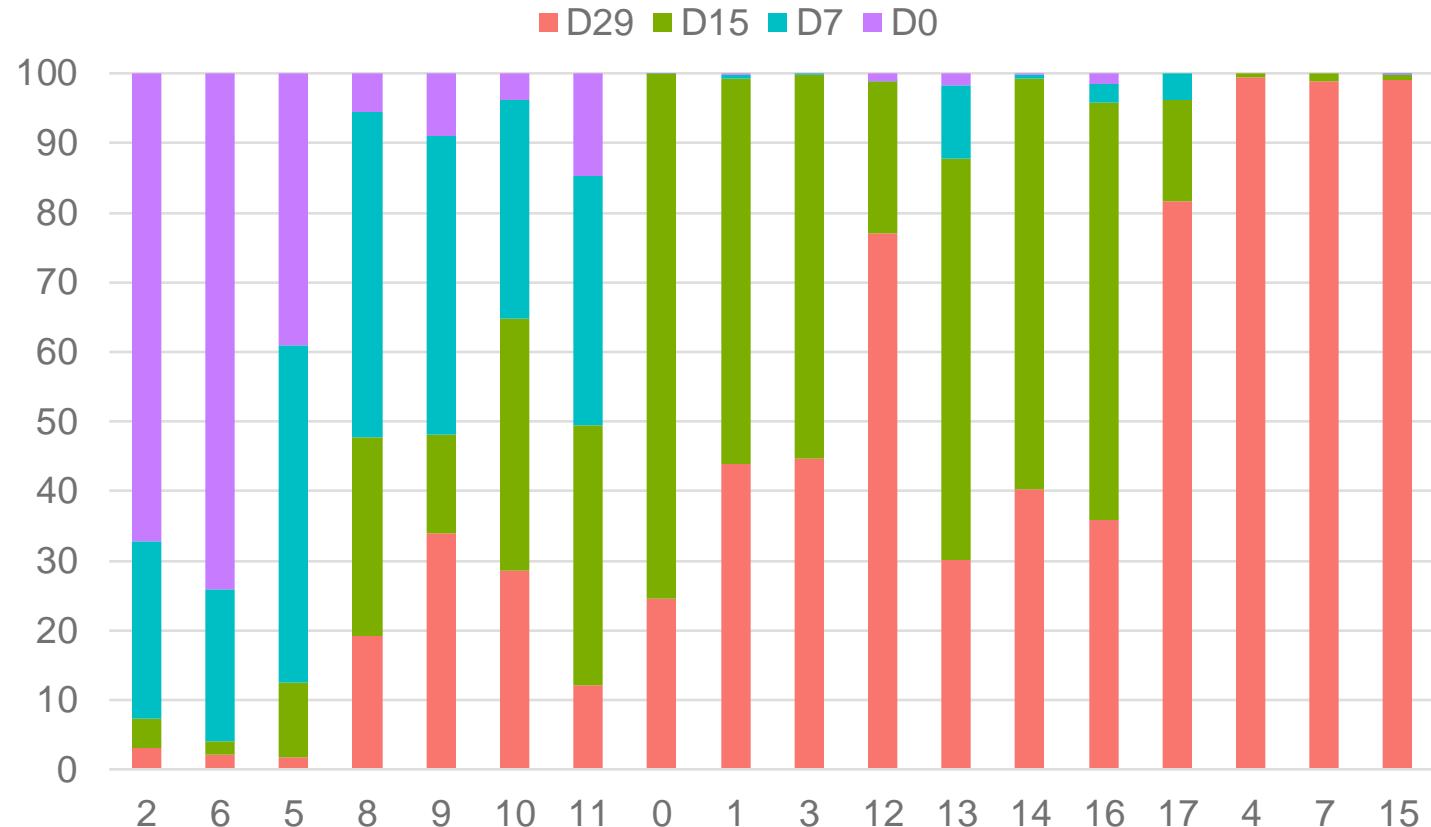


Integration and cluster identification



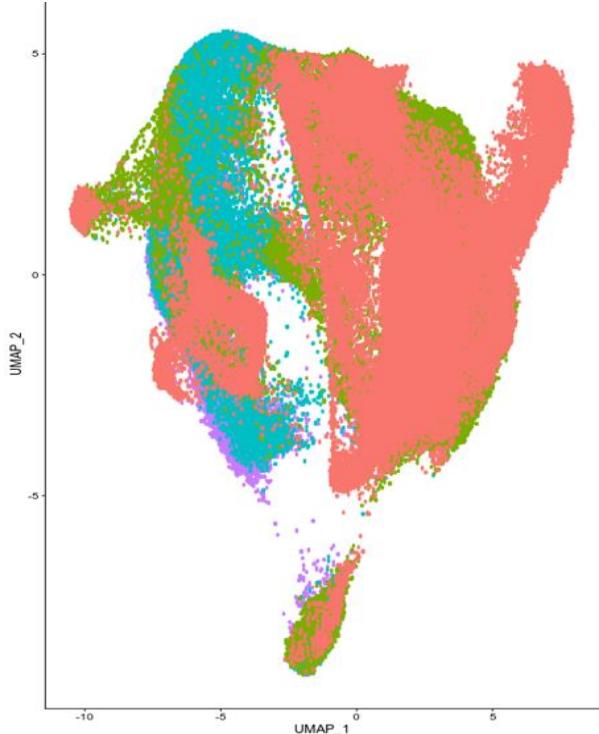
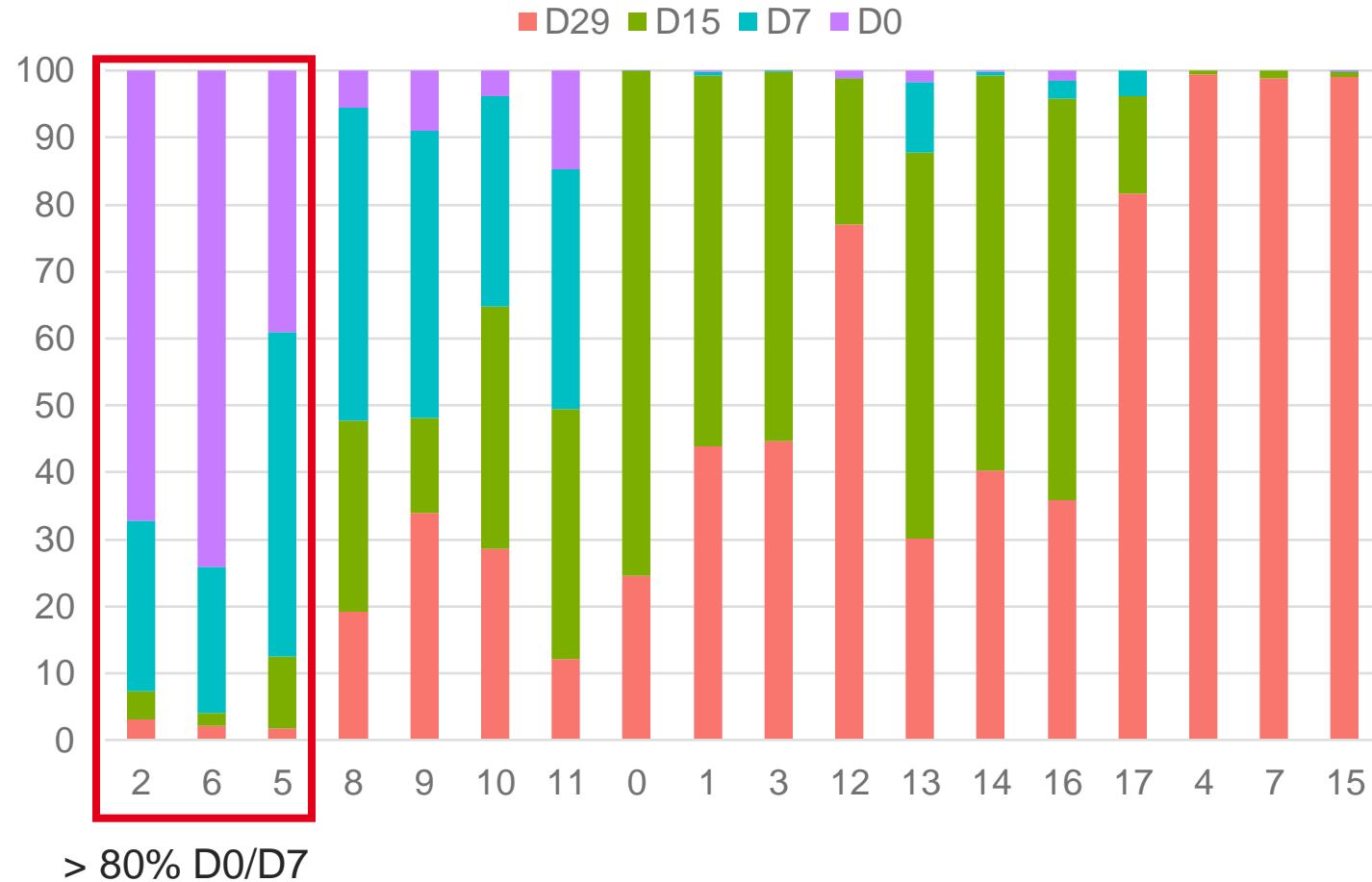
Heterogeneity of cell proportions in clusters

- Distinguish clusters that are common to all the maturation days from those specific to one level with the percentage of cells belonging to each maturation day for every cluster.



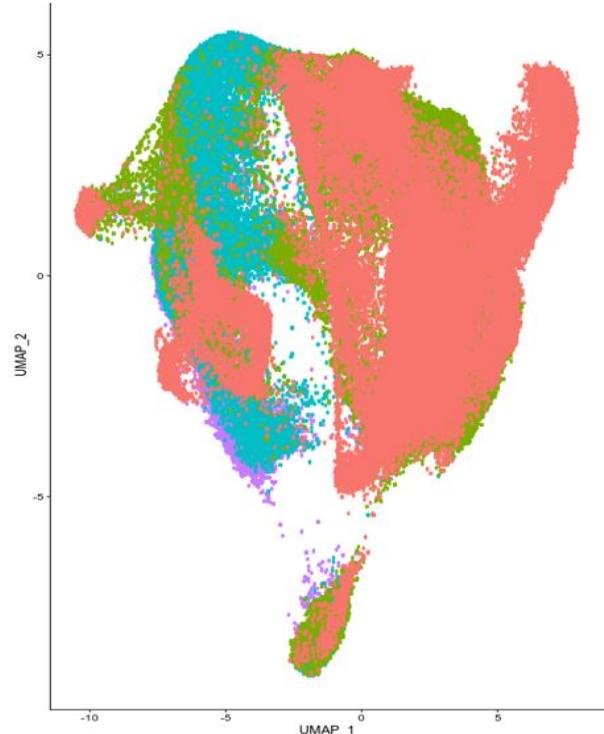
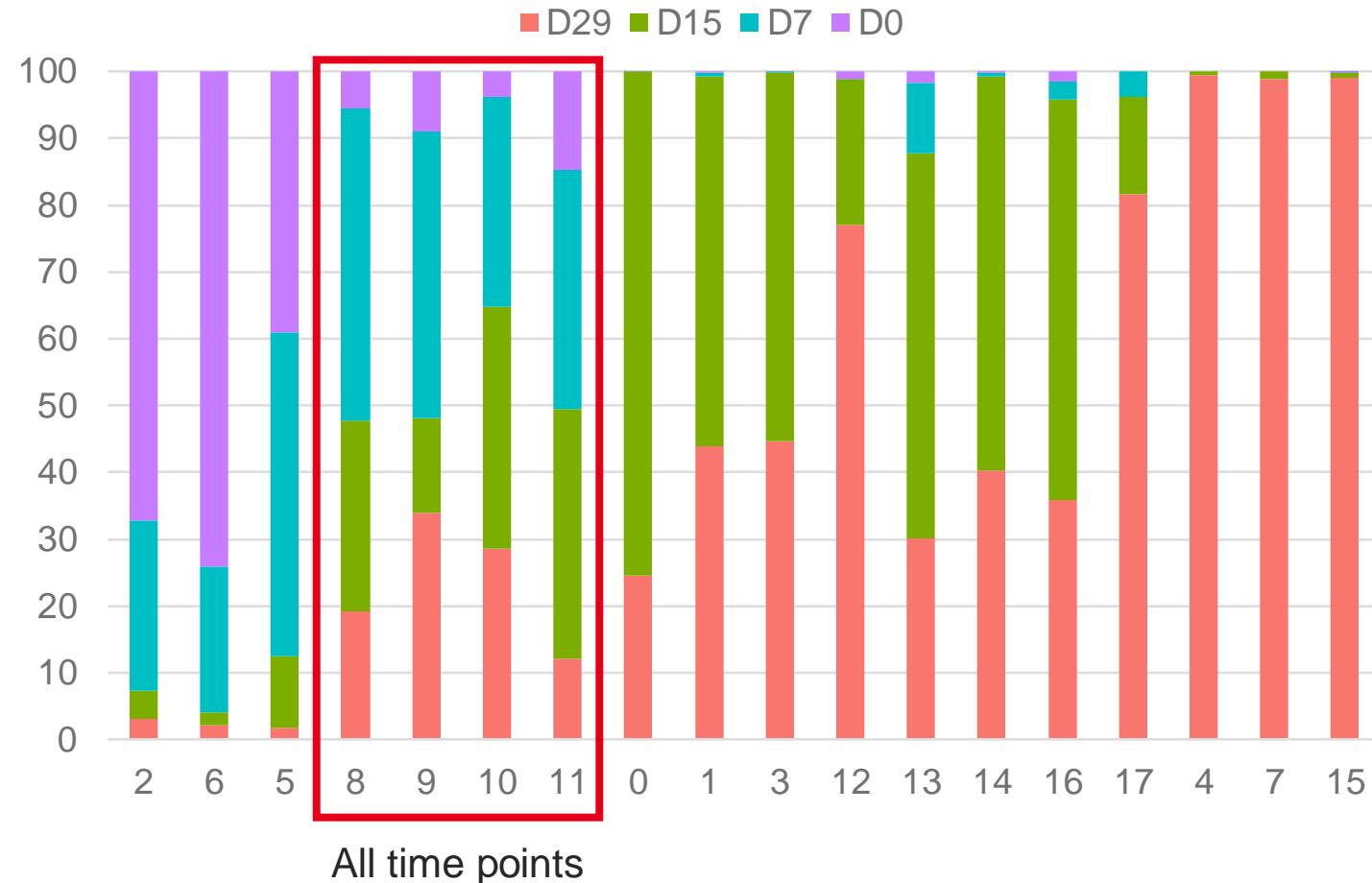
Heterogeneity of cell proportion in clusters

- Distinguish clusters that are common to all the maturation days from those specific to one level with the percentage of cells belonging to each maturation day for every cluster.



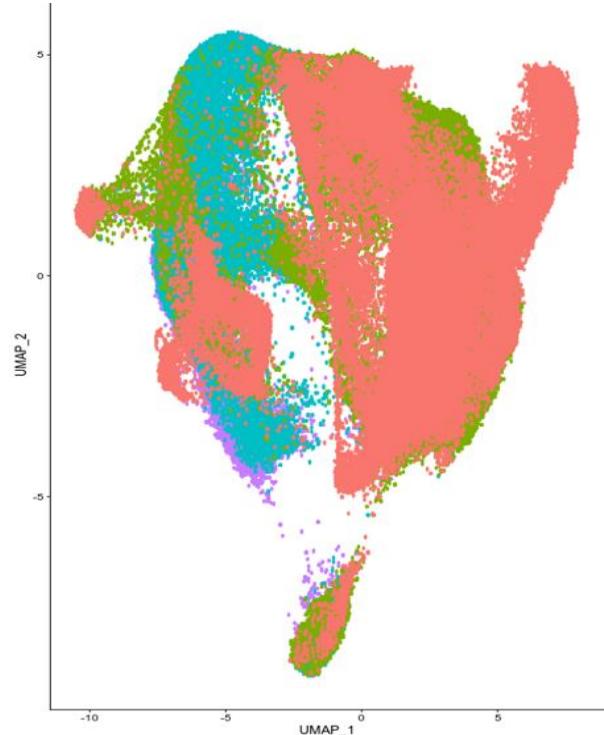
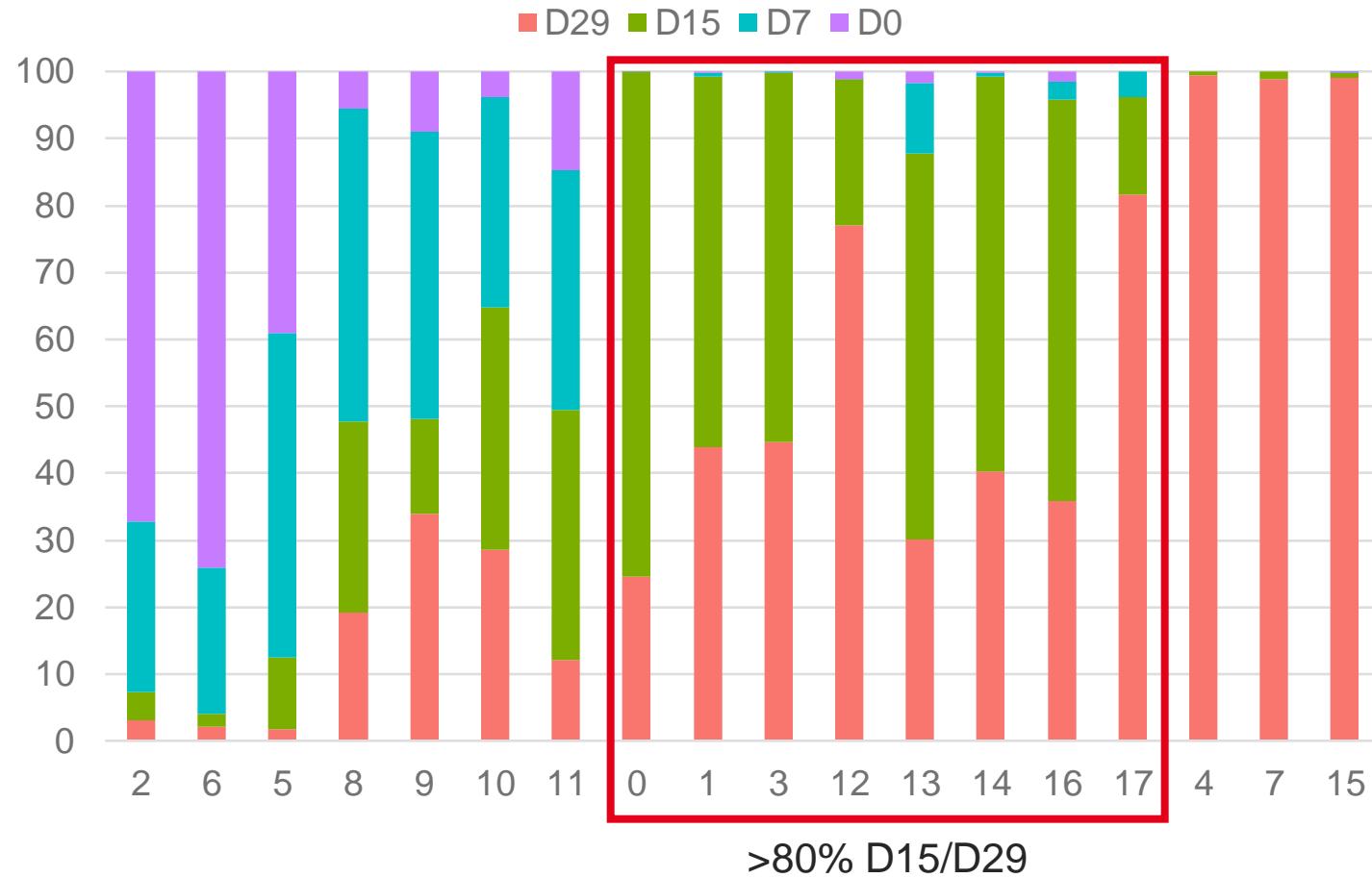
Heterogeneity of cell proportion in clusters

- Distinguish clusters that are common to all the maturation days from those specific to one level with the percentage of cells belonging to each maturation day for every cluster.



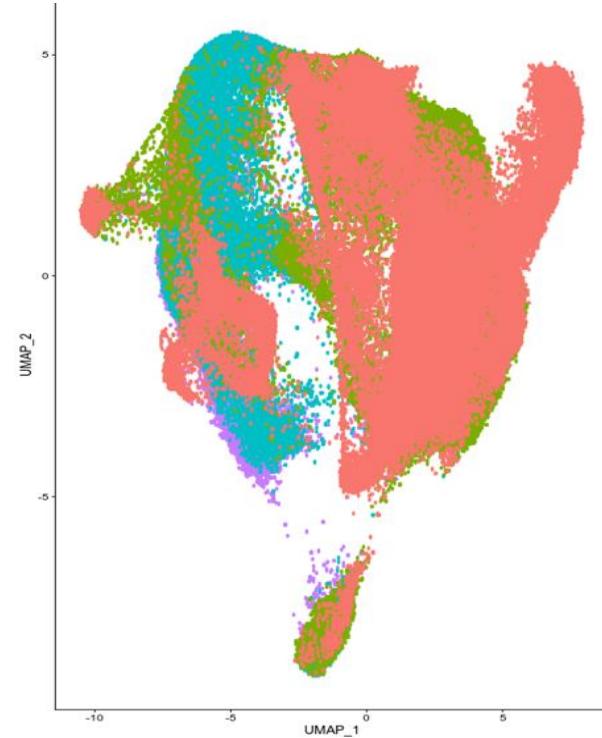
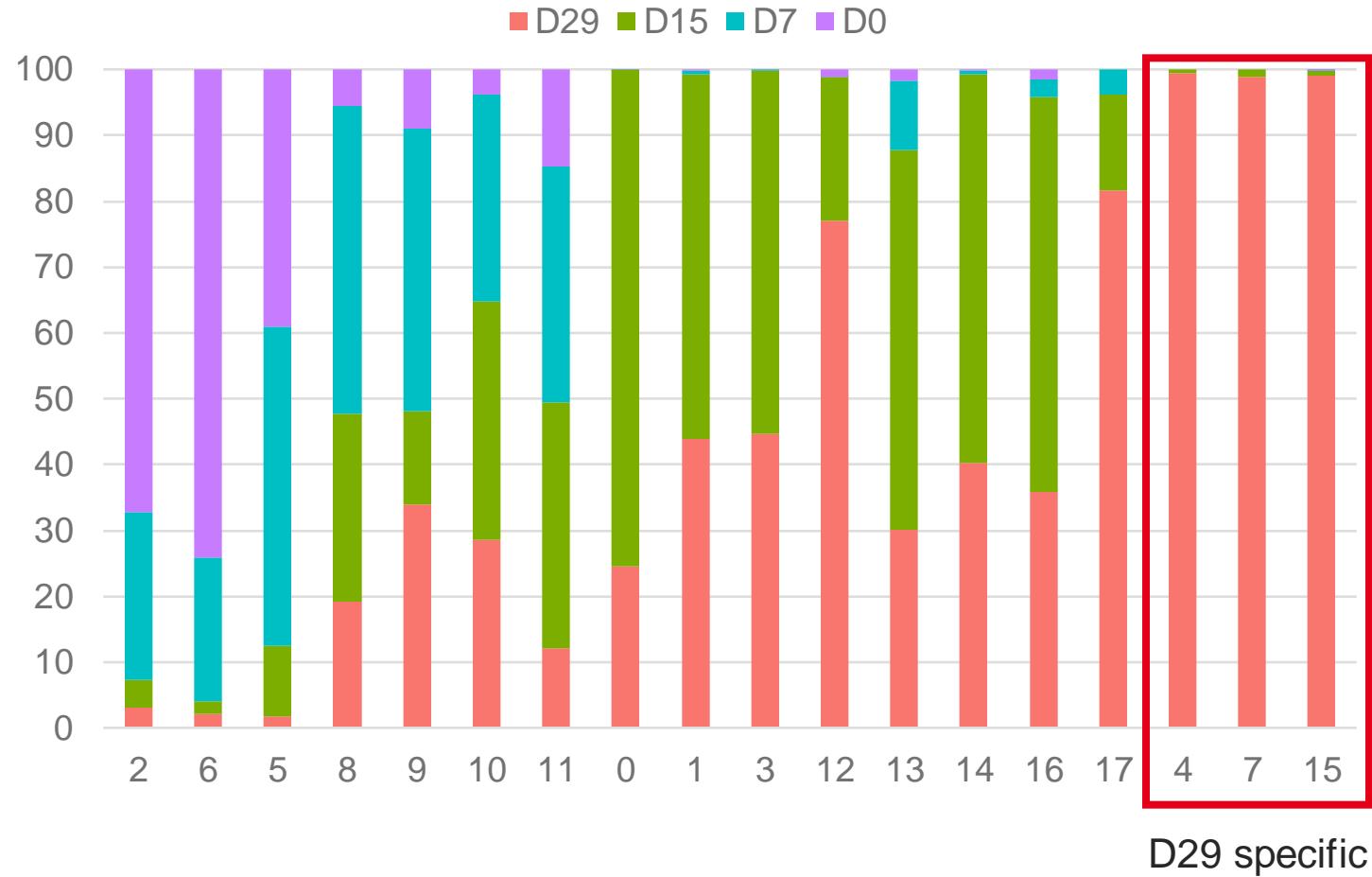
Heterogeneity of cell proportion in clusters

- Distinguish clusters that are common to all the maturation days from those specific to one level with the percentage of cells belonging to each maturation day for every cluster.



Heterogeneity of cell proportion in clusters

- Distinguish clusters that are common to all the maturation days from those specific to one level with the percentage of cells belonging to each maturation day for every cluster.



- Observation of early and more advanced maturation stages.

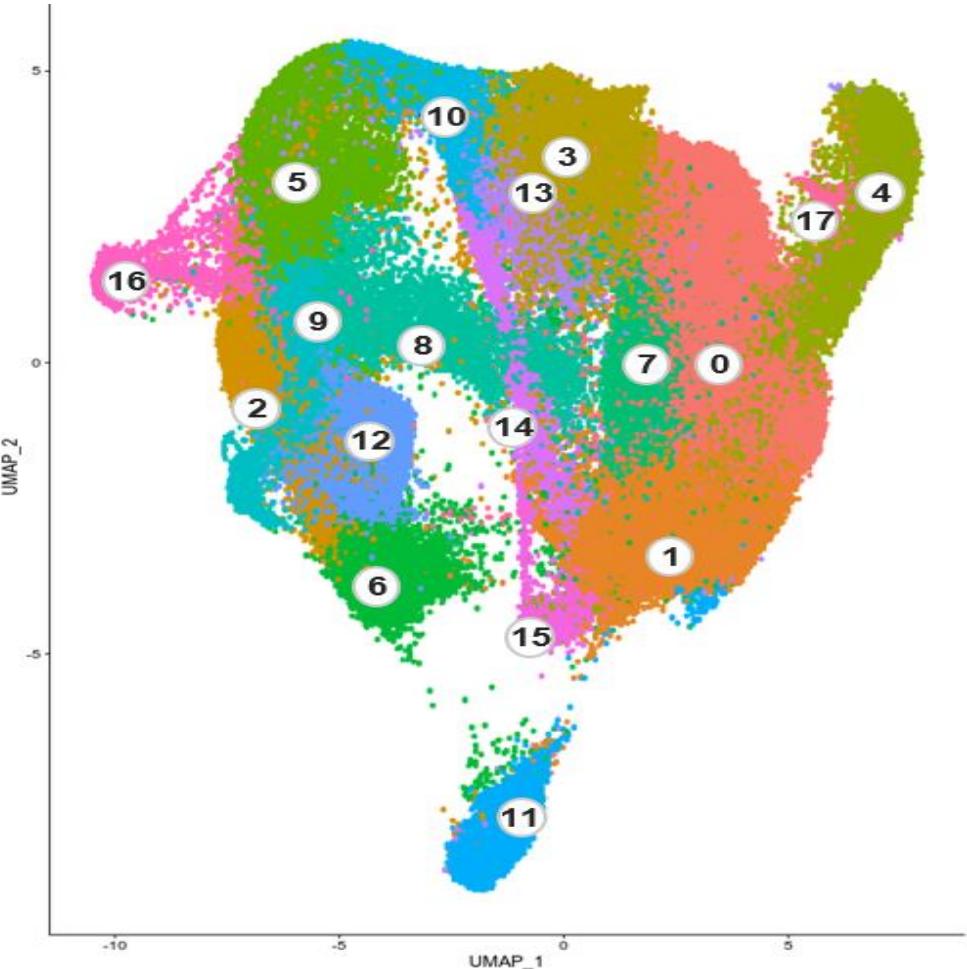
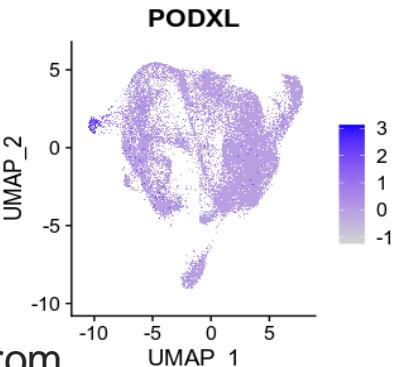
Cell labeling of clusters

Definition

- Assigning cell types to clusters identified by Seurat.
- Based on knowledge of the transcriptome specificity of cell populations.

Different methods used and aggregated

- Marker genes differentially expressed in clusters:
 - Known marker genes of cell populations (Schumacher *et al.*, 2021).
 - Human Protein Atlas.
 - marker gene expression in cell/clusters.
- Automated labeling with Seurat:
 - Comparison of a labelled reference with the query dataset.
 - References: D29 and adult kidney datasets from Subramanian *et al.* paper.



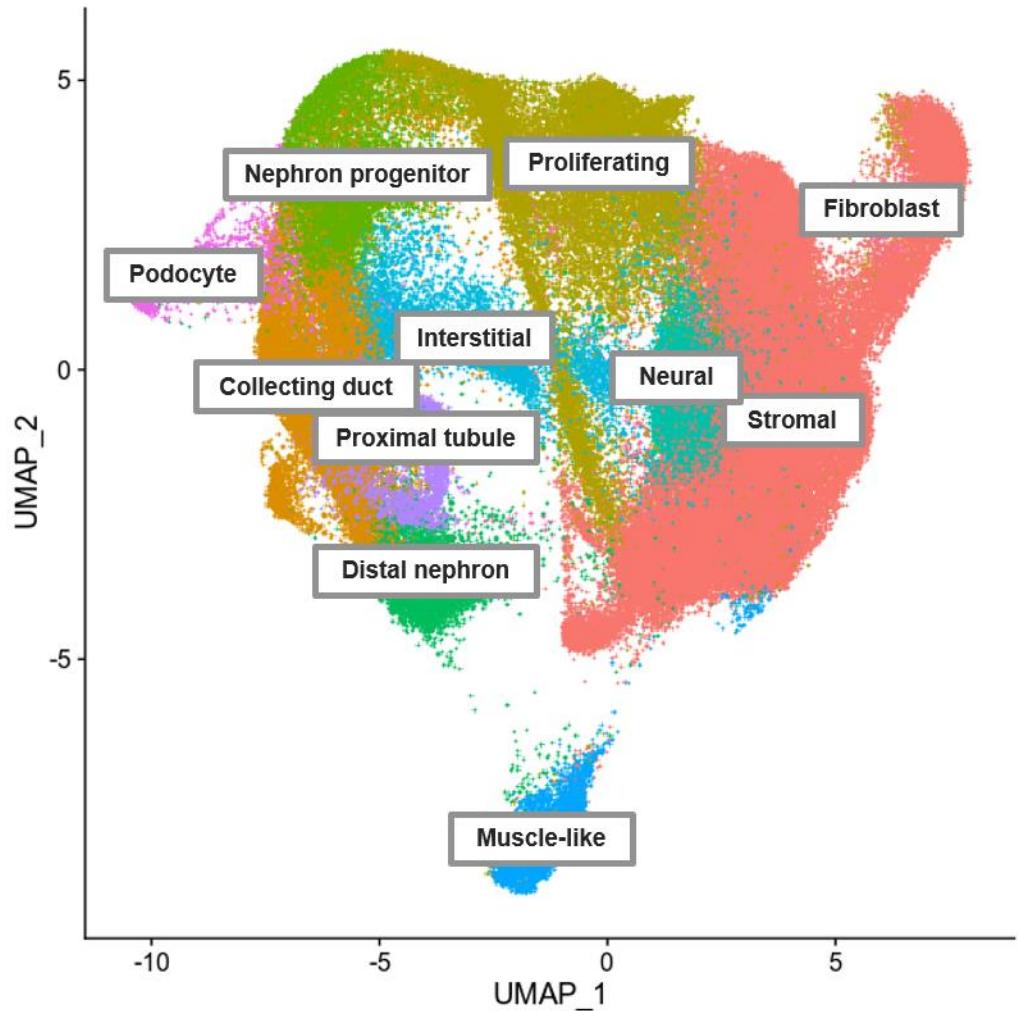
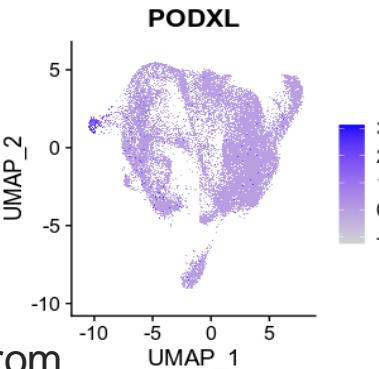
Cell labeling of clusters

Definition

- Assigning cell types to clusters identified by Seurat.
- Based on knowledge of the transcriptome specificity of cell populations

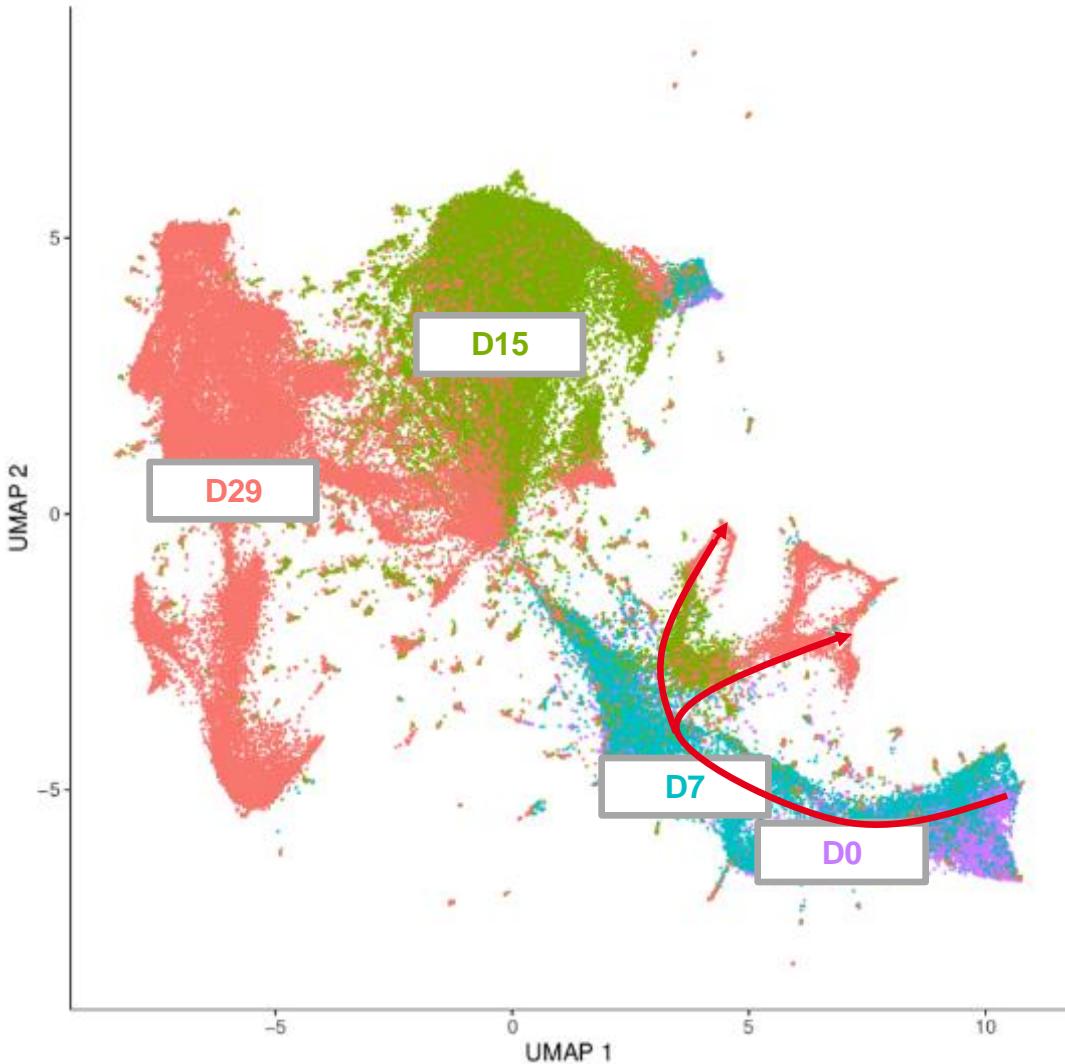
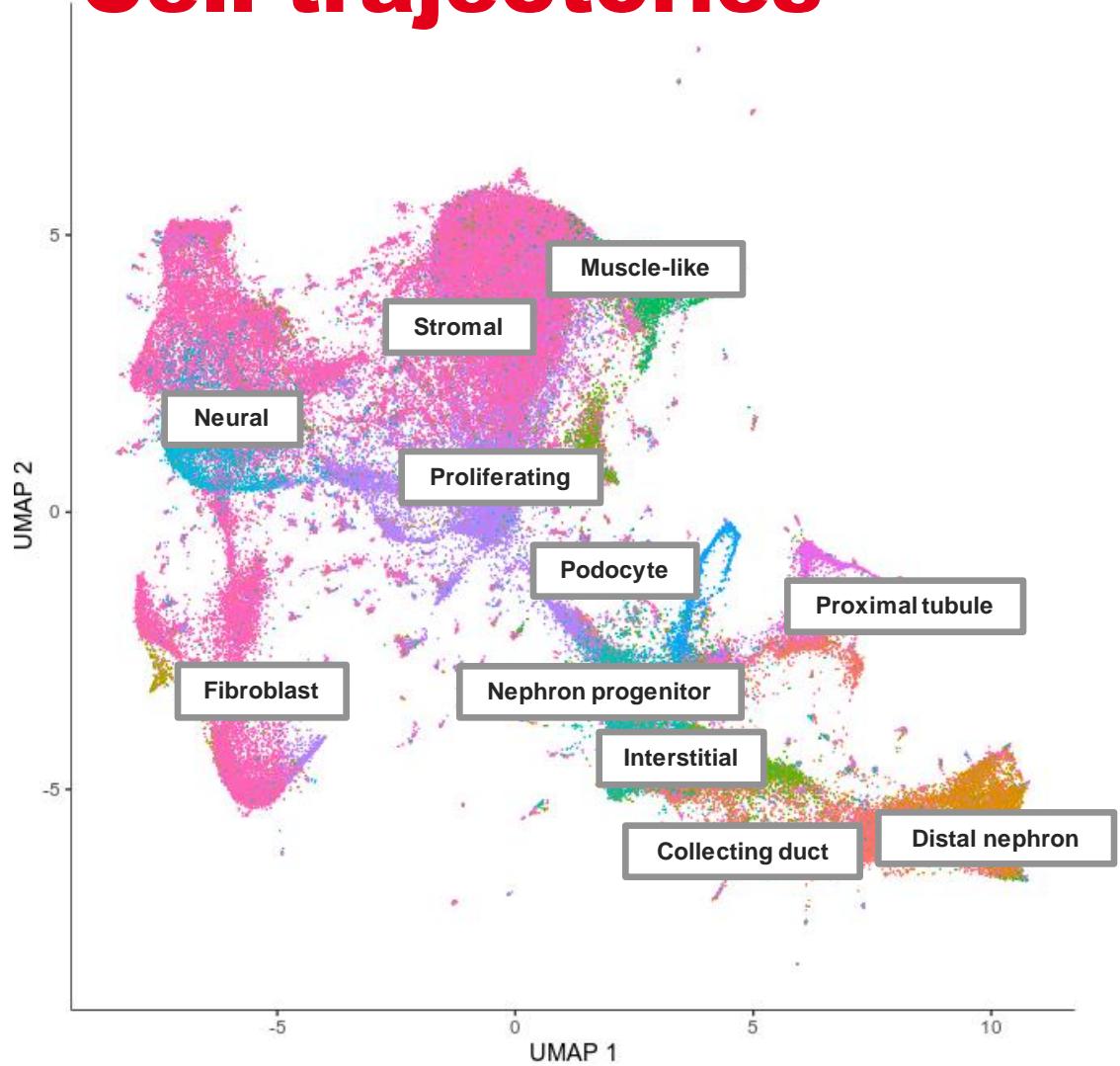
Different methods used and aggregated

- Marker genes differentially expressed in clusters:
 - Known marker genes of cell populations (Schumacher *et al.*, 2021).
 - Human Protein Atlas.
 - marker gene expression in cell/clusters.
- Automated labeling with Seurat:
 - Comparison of a labelled reference with the query dataset.
 - References: D29 and adult kidney datasets from Subramanian *et al.* paper.





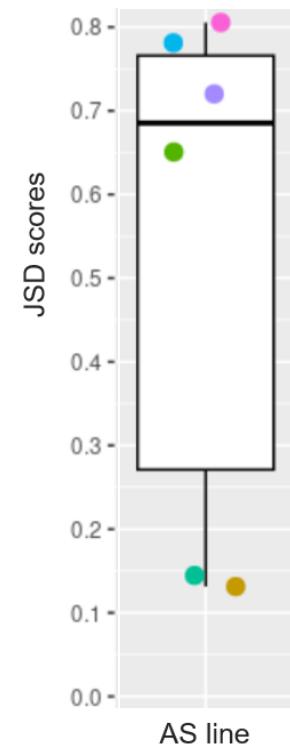
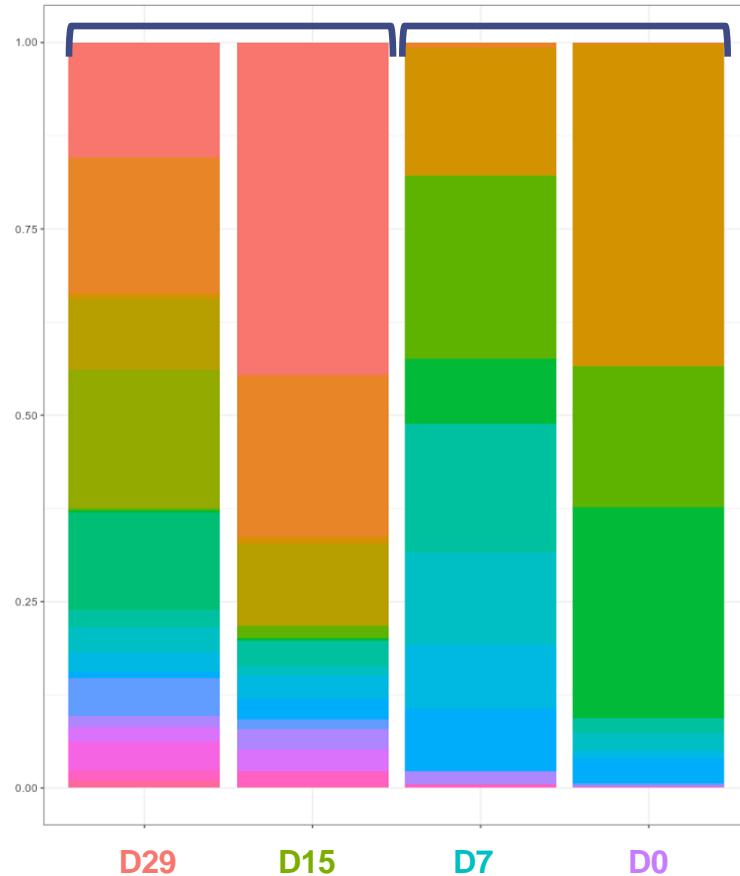
Cell trajectories



- The **D29** specific clusters are well separated.
- We also visualize the maturation and the cell differentiation from **D0** to **D29**.

Variability score between maturation ages

- The JSD (Jensen Shannon Divergence) was applied on AS integrated datasets of all the days of maturation (D0, D7, D15 and D29).
- It compared the proportion of cells in each cluster between 2 samples.



Maturation date (nb days)

- D0 vs D7
- D7 vs D15
- D15 vs D29
- D0 vs D15
- D7 vs D29
- D0 vs D29

- As observed previously D0vsD7 and D15vsD29 showed more similar classifications.



Validation of the method with a new dataset

A new organoid dataset

Combes et al. *Genome Medicine* (2019) 11:3
<https://doi.org/10.1186/s13073-019-0615-0>

Genome Medicine

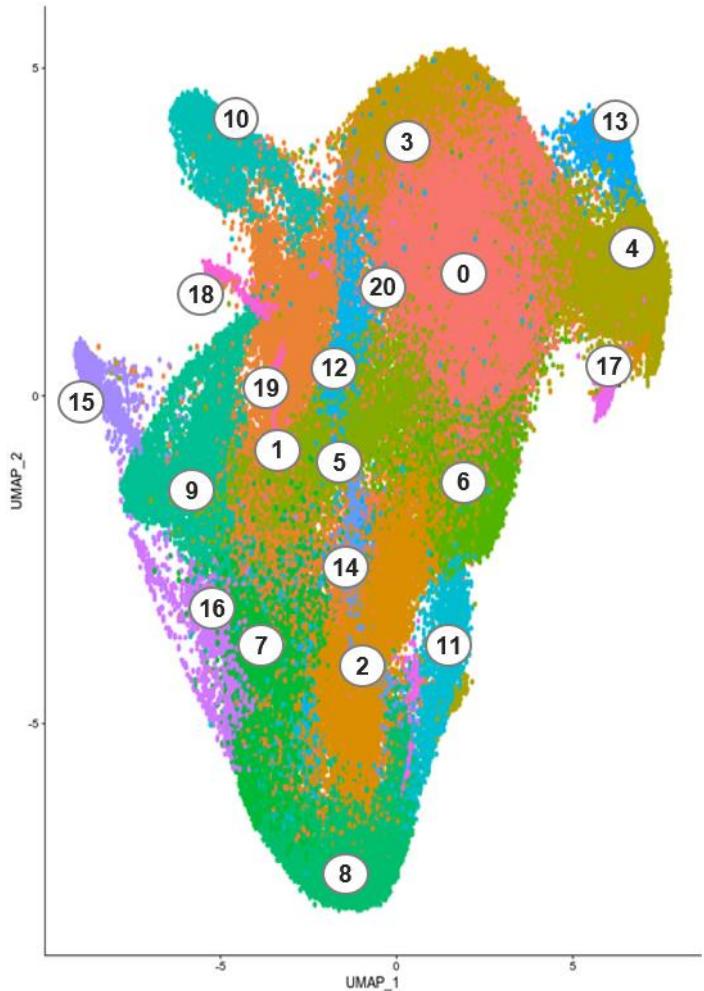
RESEARCH

Open Access

Single-cell analysis reveals congruence between kidney organoids and human fetal kidney

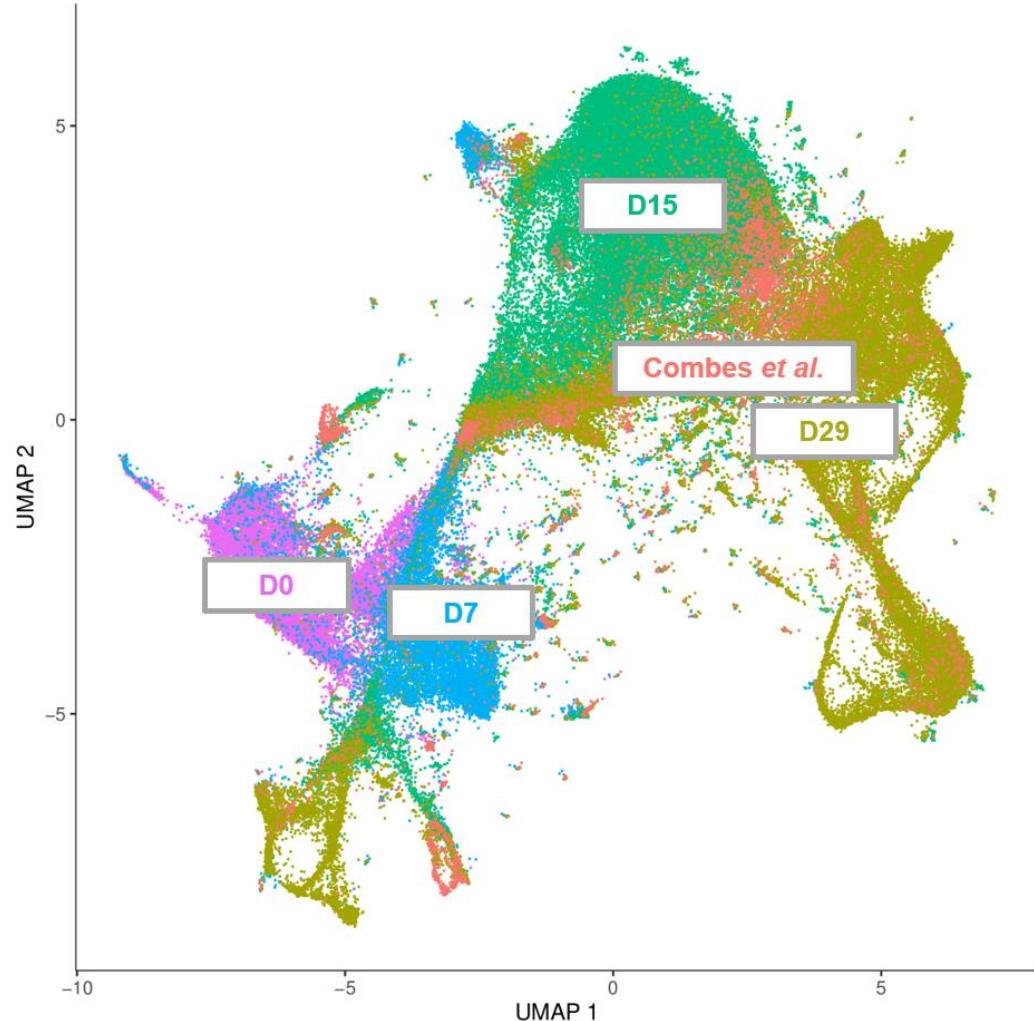
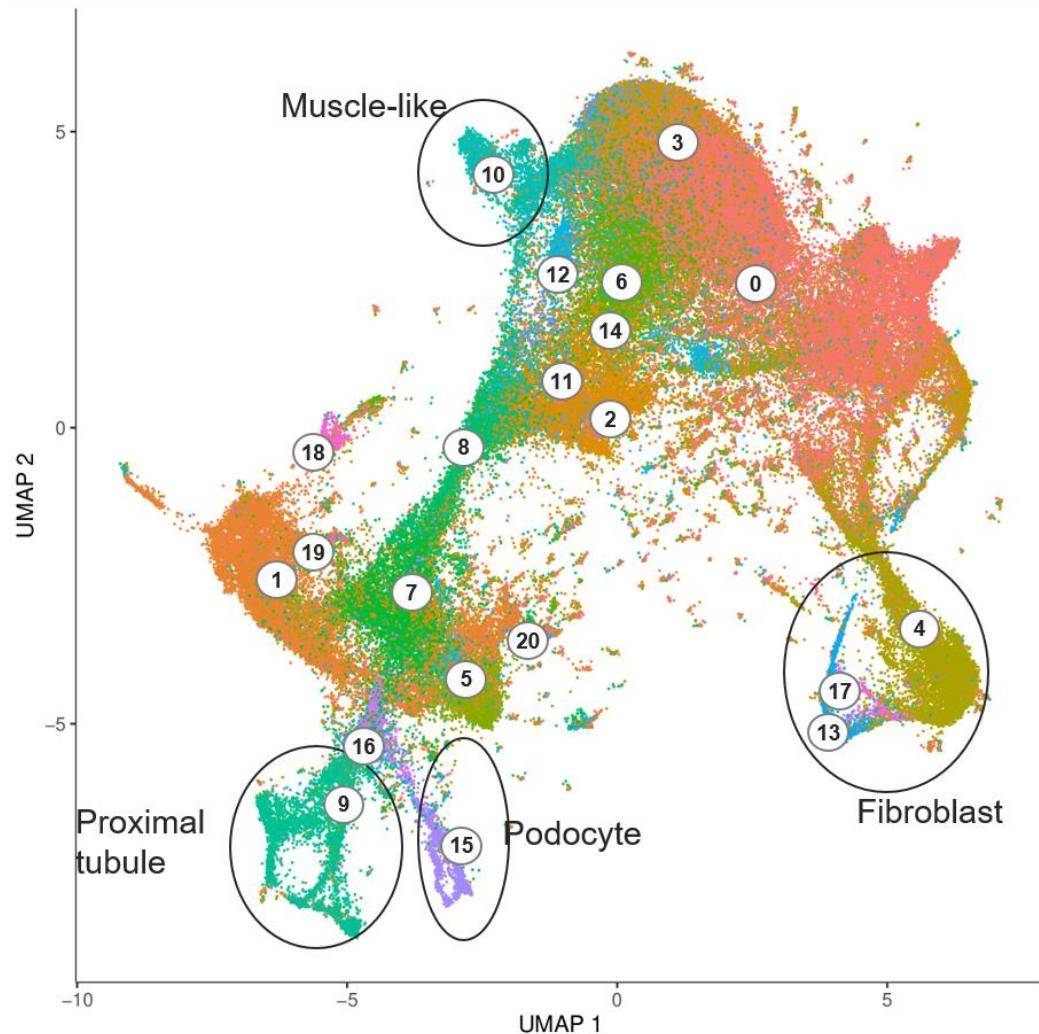
Alexander N. Combes^{1,2*†}, Luke Zappia^{2,3†}, Pei Xuan Er², Alicia Oshlack^{2,3} and Melissa H. Little^{1,2,3,4*} 

- 3 single-cell RNA-seq datasets from the same organoid.
- 24 days of maturation.
- Same protocol (M. Little)



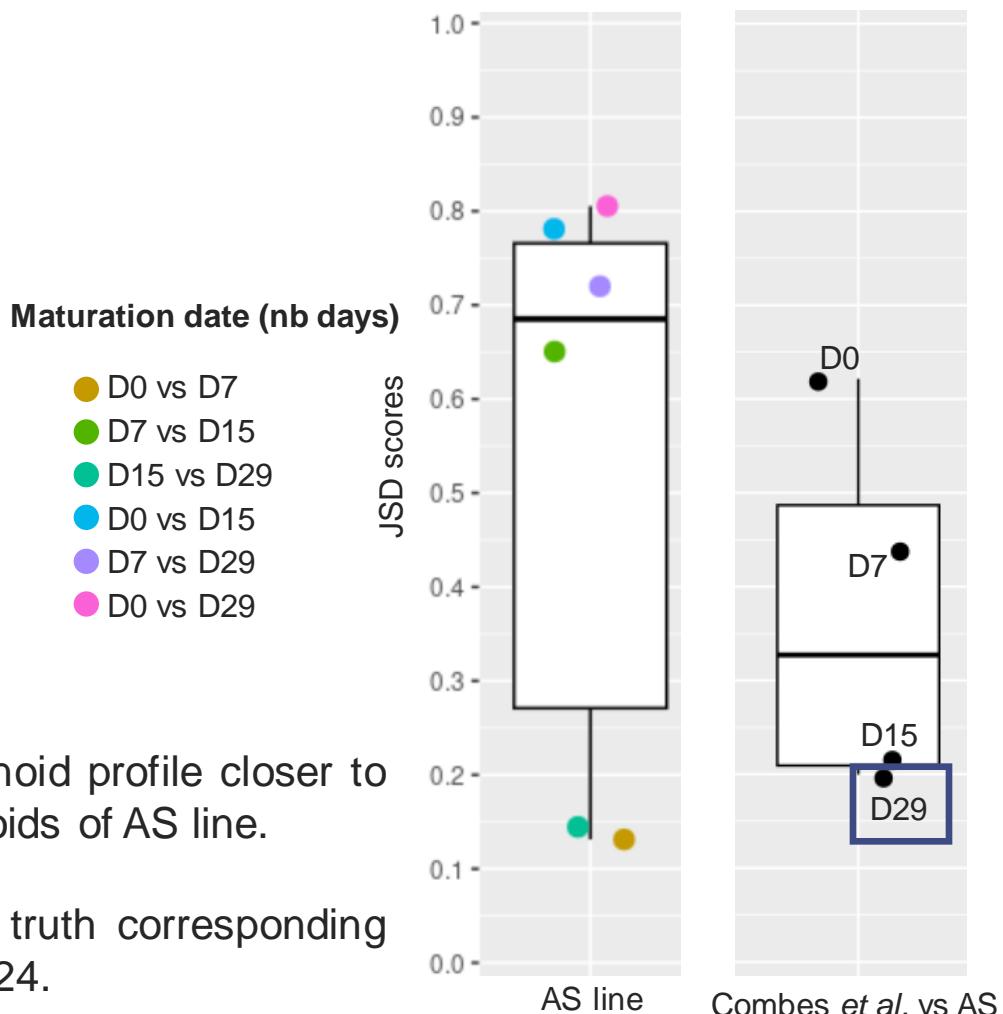
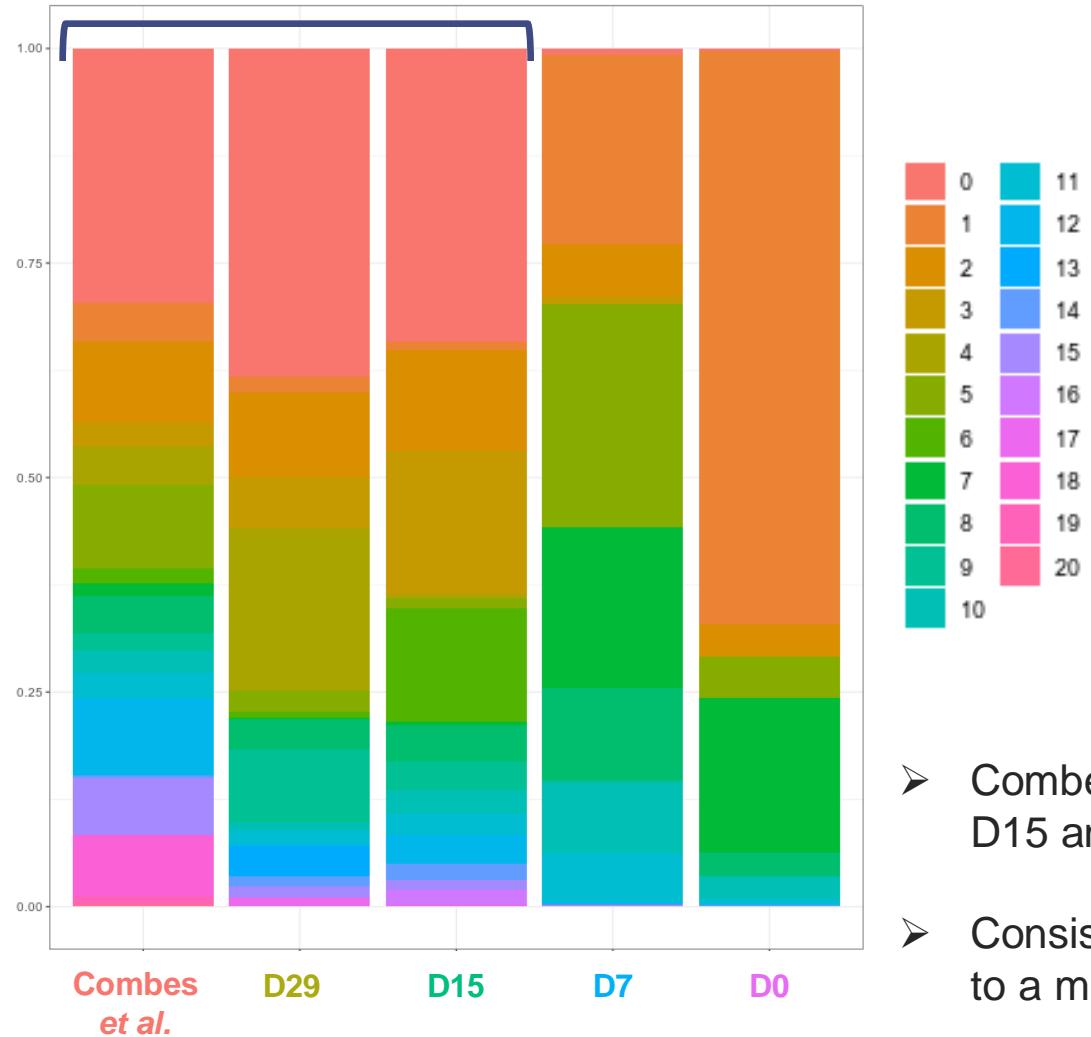
Validation of the method with a new dataset

- Comparison of clusters of Combes *et al.* with previous AS line organoids.



Validation of the method with a new dataset

- Comparison of clusters of Combes *et al.* with previous AS line organoids.



- Combes *et al.* organoid profile closer to D15 and D29 organoids of AS line.
- Consistent with the truth corresponding to a maturation at D24.



Main messages

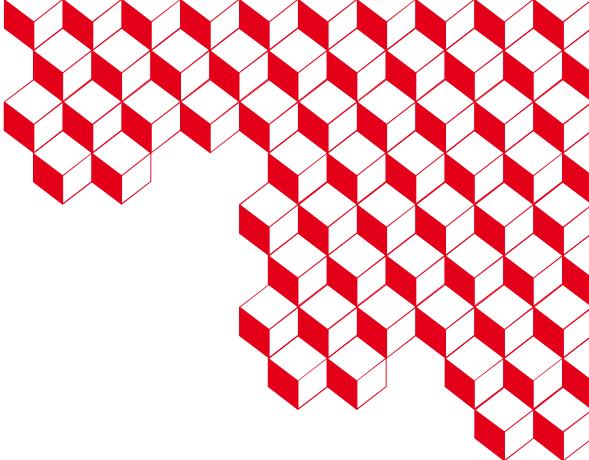
- Kidney organoids could be characterized at different maturation stages.
- The observation of 2 early and later maturation levels (D0-D7 and D15-D29) is consistent with Subramanian *et al.*. future protocol improvements focused on this interval.
- The integration of another dataset validated the method with a correct estimation of the number of maturation days.

Perspectives...

- Apply the same method on organoids of different protocols and source cells to study the reproducibility.
- Test the method on organoids of another targeted organ (example: skin – Lee *et al.*, 2020, Nature)
- Use machine learning based approach to estimate the age of the organoid.



jacob



Acknowledgements

LBA:

Eric Bonnet

Jean-François Deleuze

All the team!

Alumni

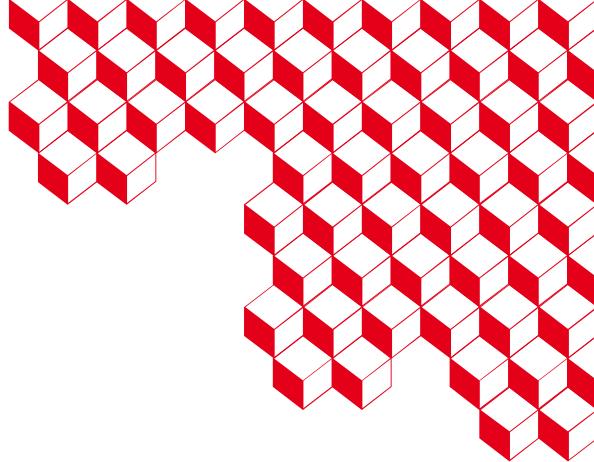
Alexandre Hubert

Camille Lemercier





jacob



Thank you for your attention

Questions?