

# Exploring human pluripotent stem cell heterogeneity using a multi-scale imaging and informatics pipeline

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BRIGHAM AND  
WOMEN'S HOSPITAL



HARVARD  
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Hu Li  
Christian Ross

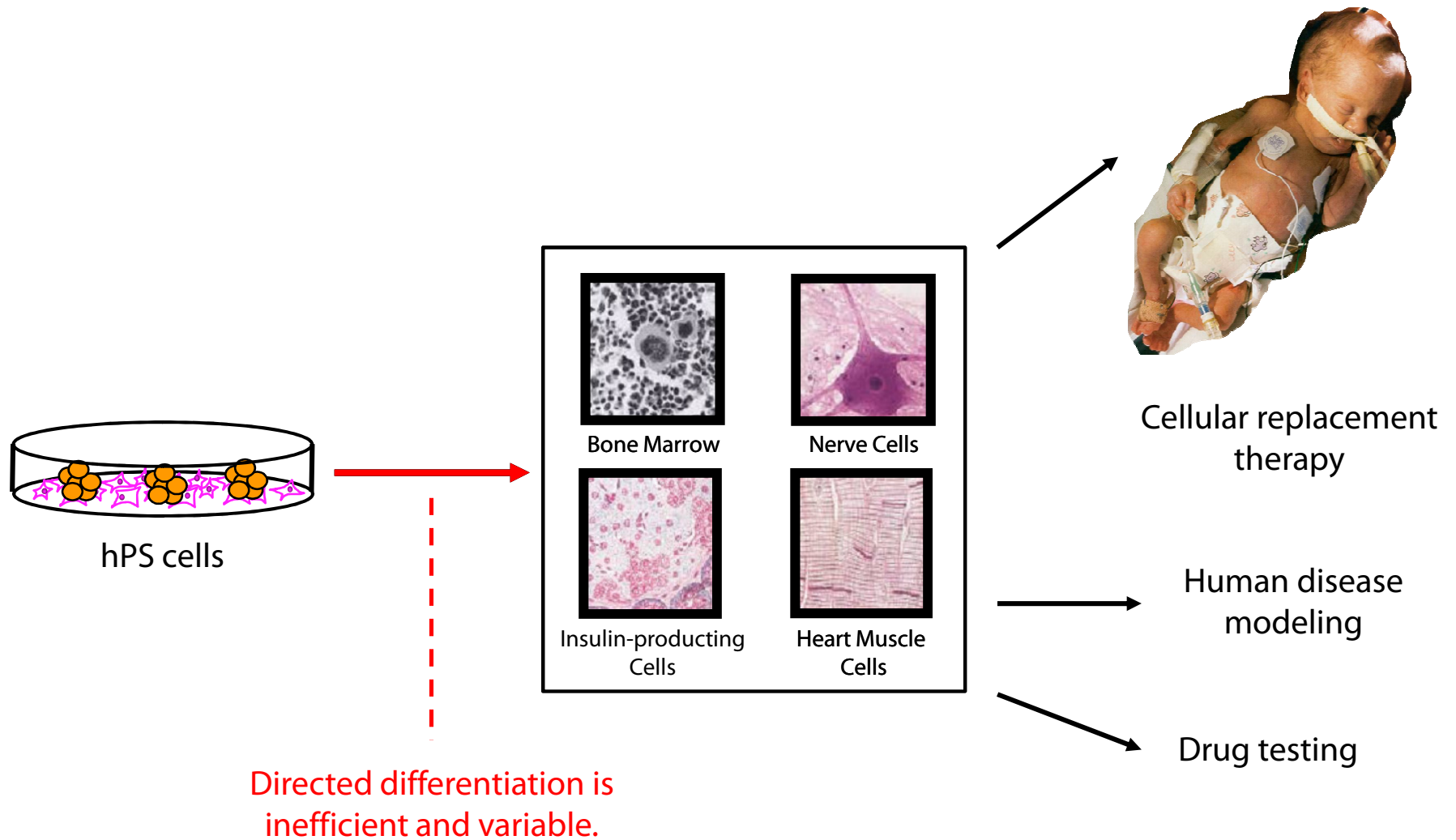
## UNC – Purvis Lab

Raluca Dumitru  
Jeremy Purvis  
Sam Wolff

## Draper Labs

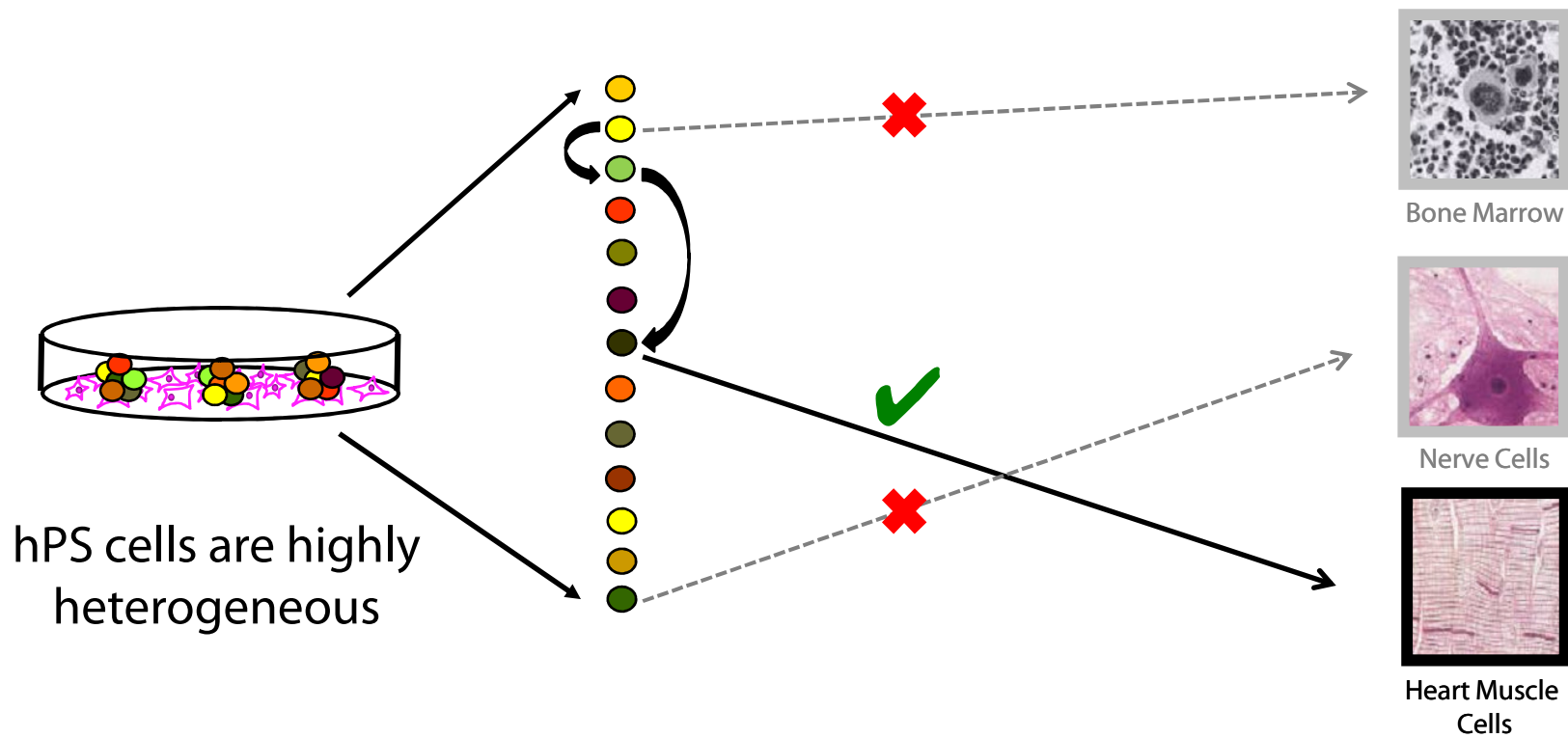
Rami Mangoubi  
Nathan Lowry

# The promise of human pluripotent cells



# Directed differentiation is unreliable due to noisy input

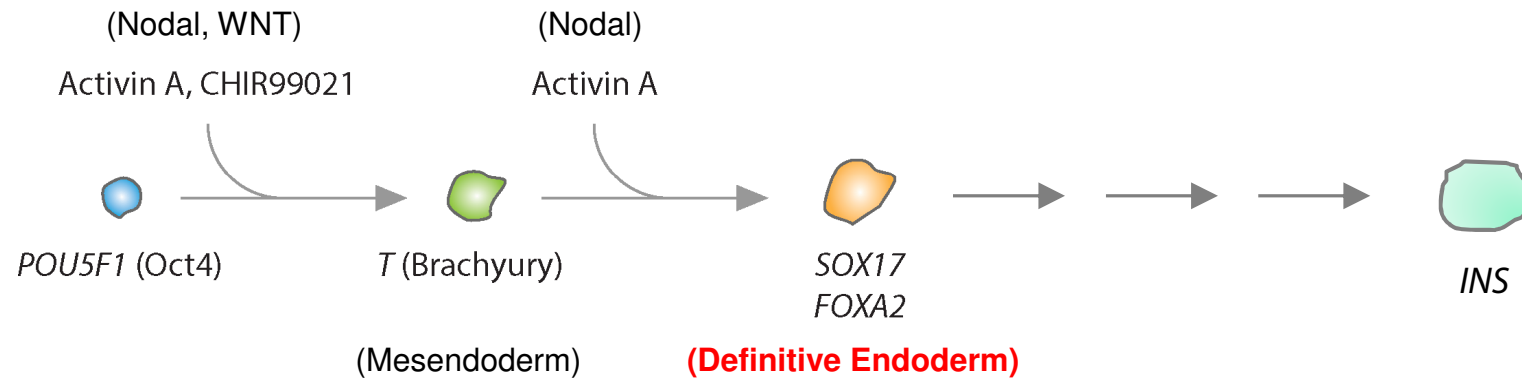
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# Differentiation to Definitive Endoderm (DE) and subsequent derivatives is progressively inefficient

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*in vitro*

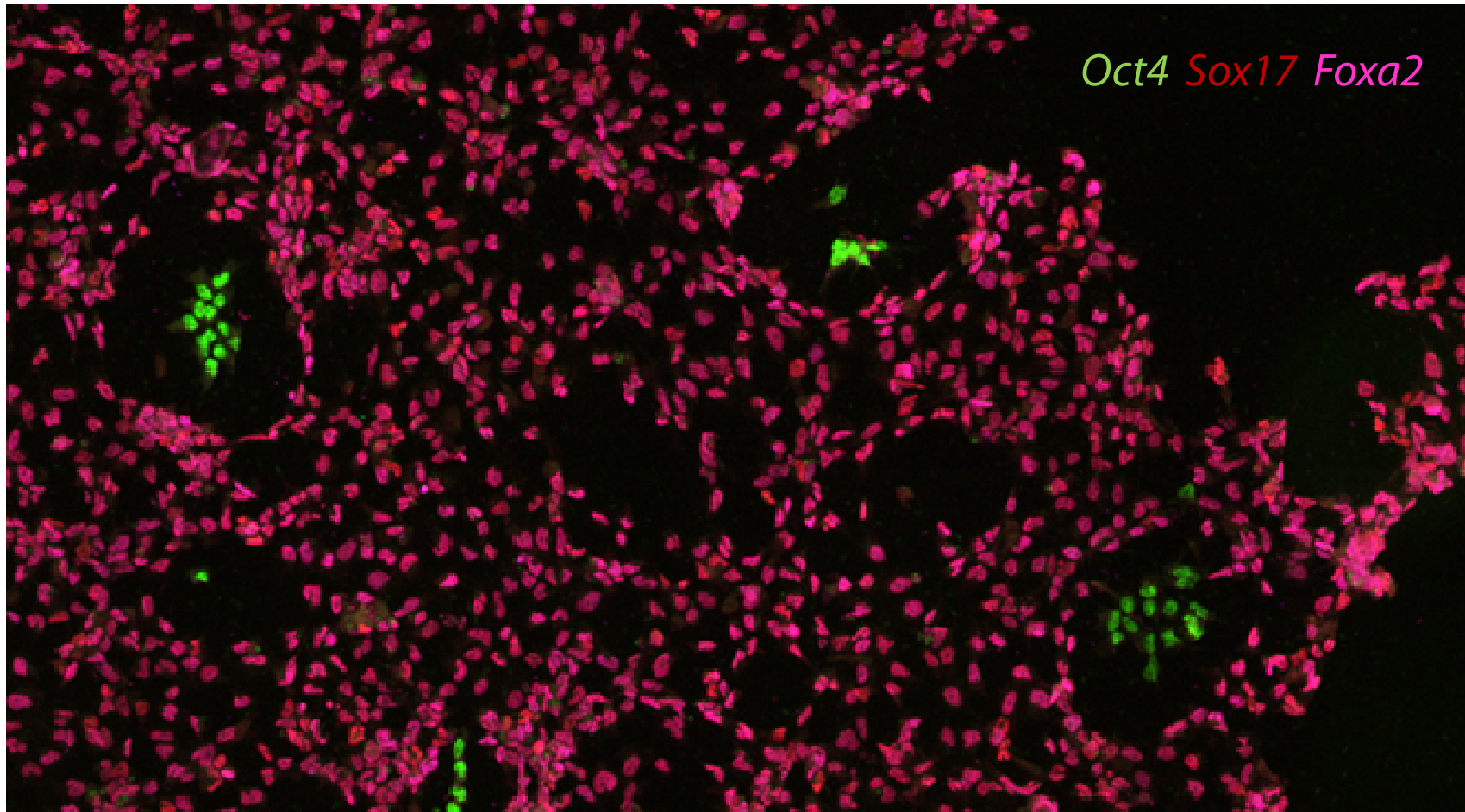


Efficiency: 90% 80% 50% 25% 10%



# Populations of human ESCs show heterogeneity in their differentiation status

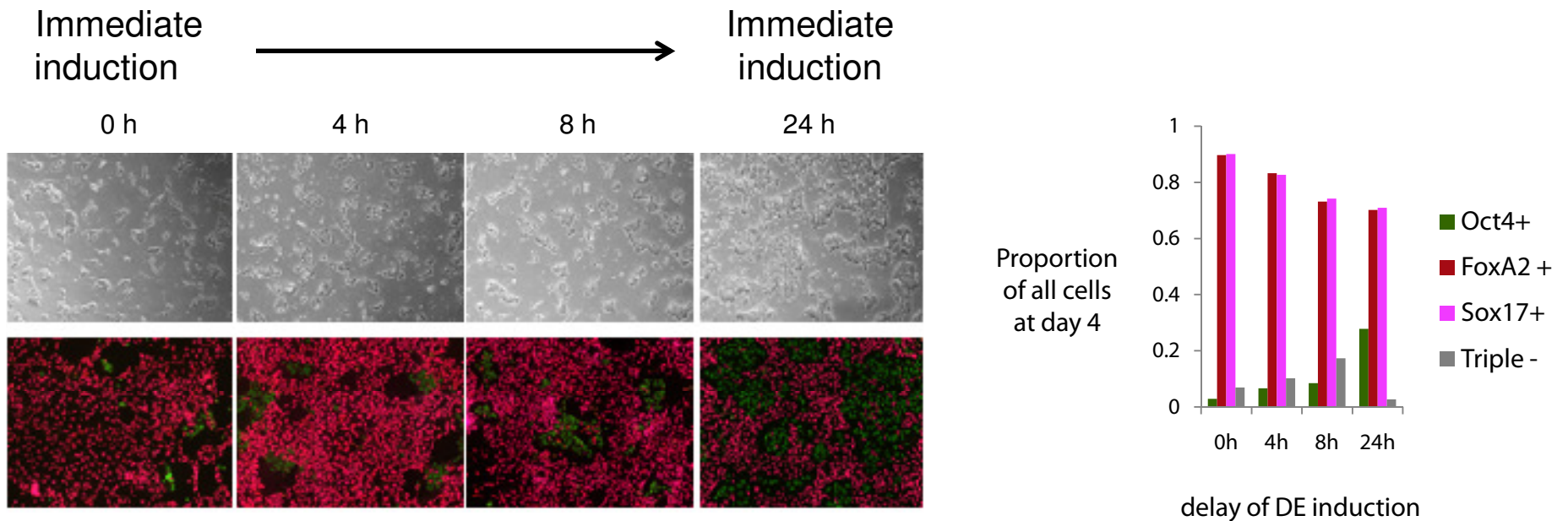
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Human H9 ESCs, Day 4

# Immediate vs. delayed induction of differentiation influences the degree of heterogeneity

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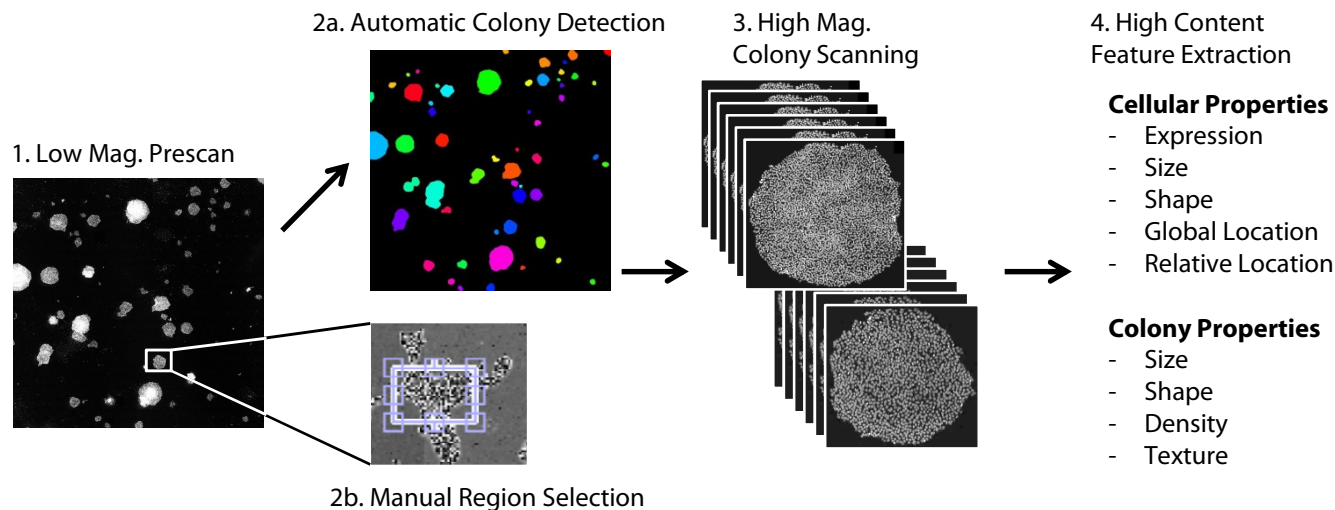
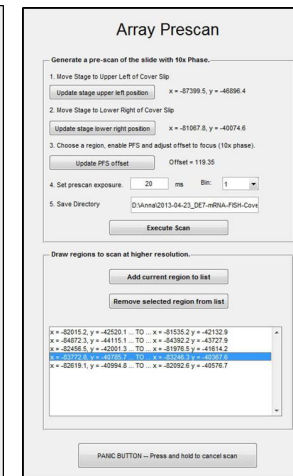
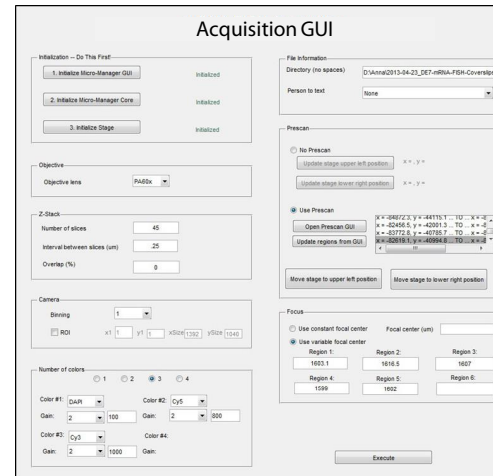
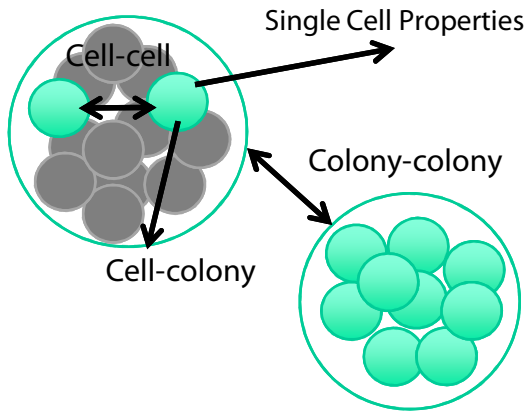


What is the origin of heterogeneity during DE differentiation?

How are spatial organization and differentiation status related?

# Multi-scale imaging and informatics pipeline for in situ pluripotent stem cell analysis

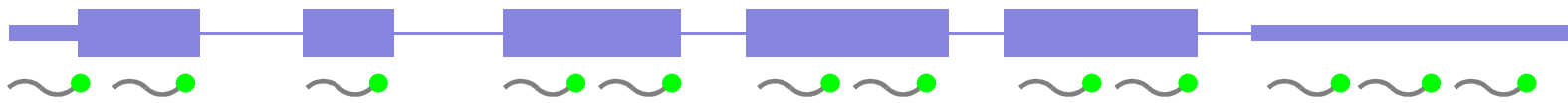
System for rapidly analyzing intercellular dynamics



# Single-molecule mRNA FISH quantifies expression of differentiation markers

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*POU5F4* (Oct4)

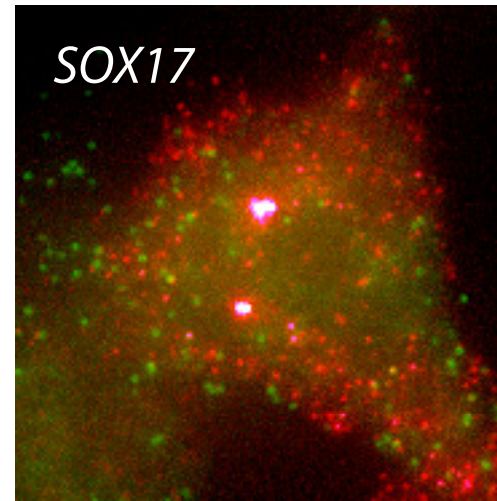
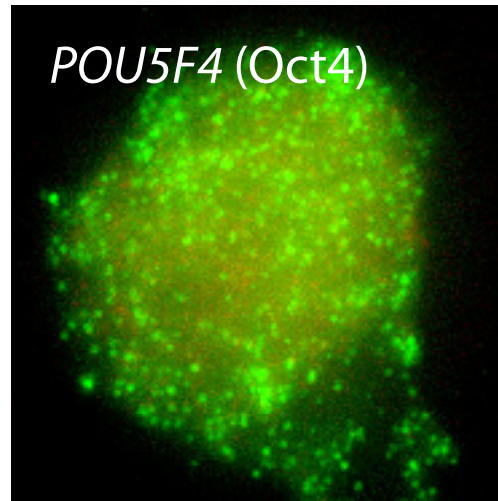


*SOX17*



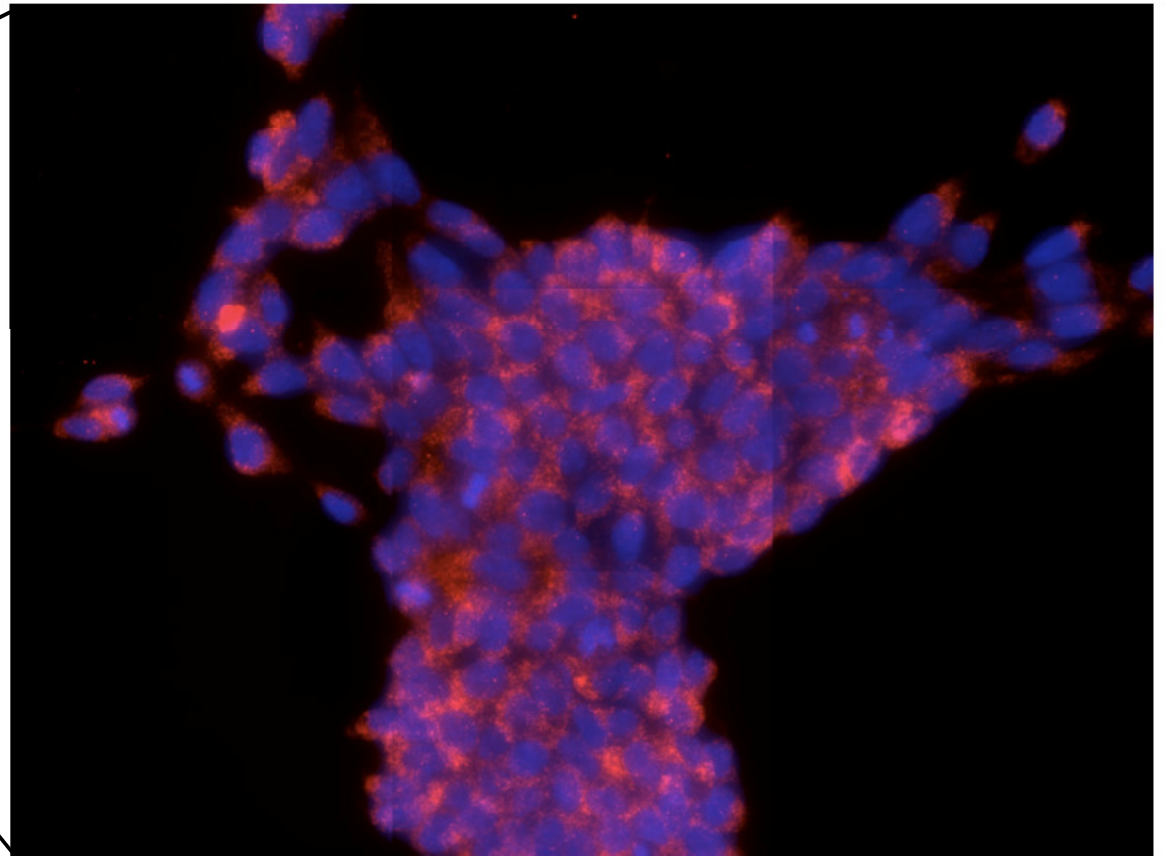
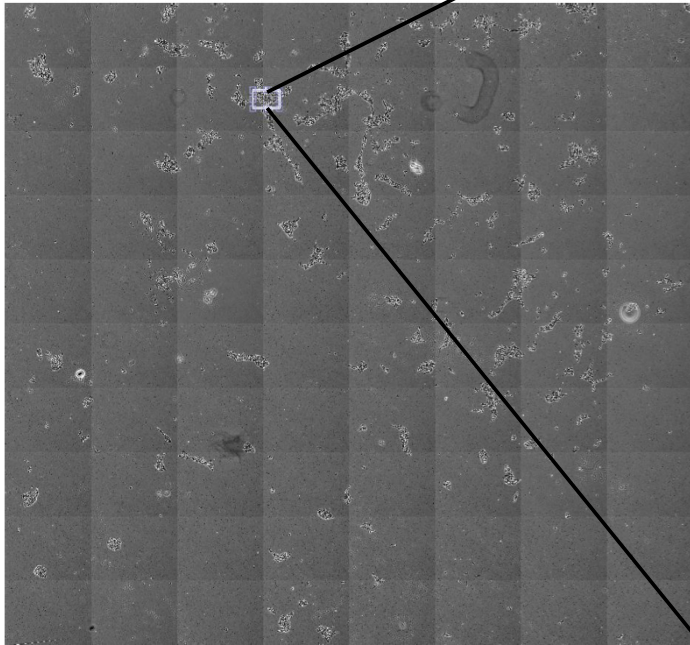
# Single-molecule FISH allows robust quantification of expression of differentiation markers

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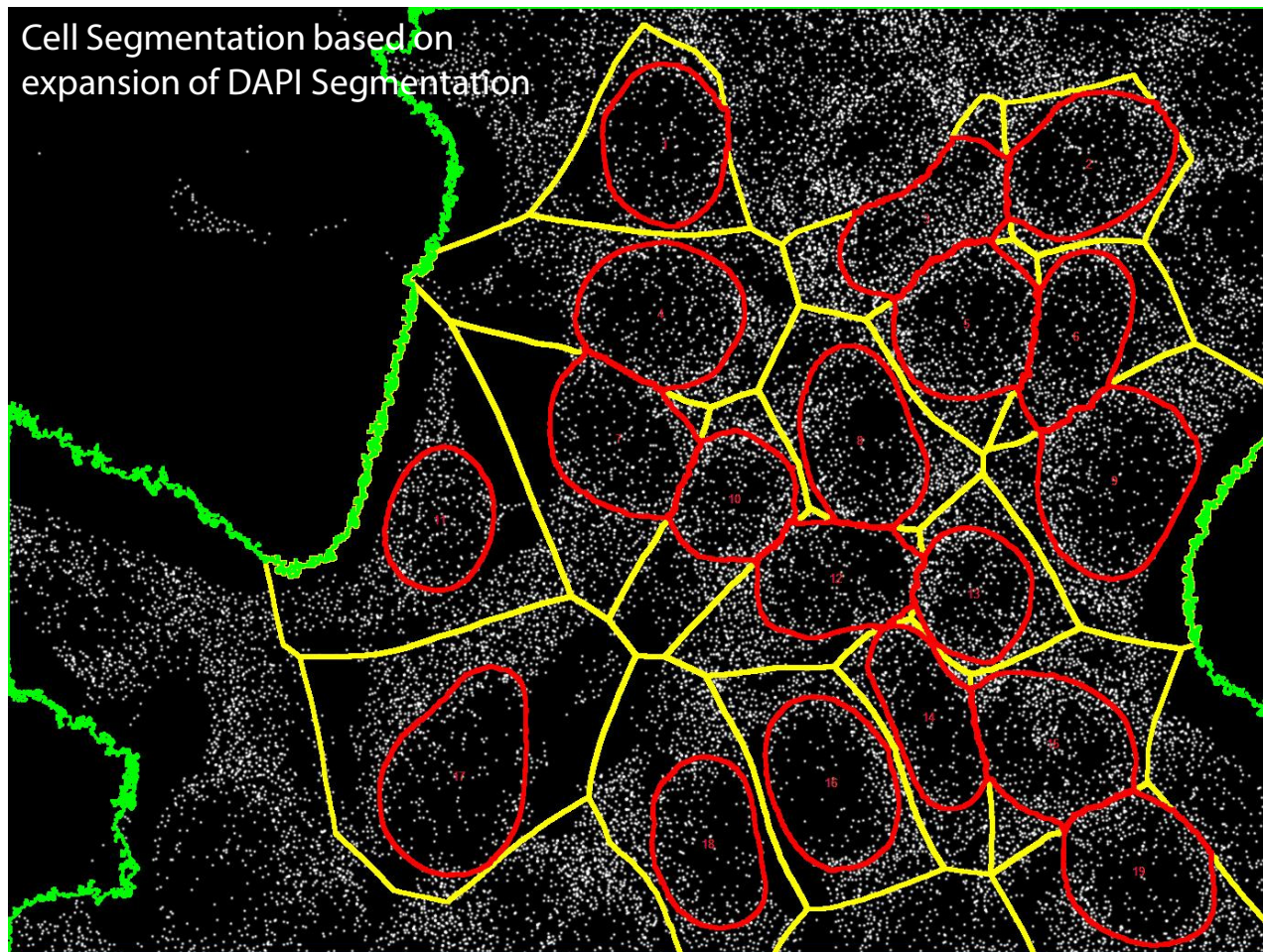
# Single-molecule FISH allows robust quantification of expression of differentiation markers

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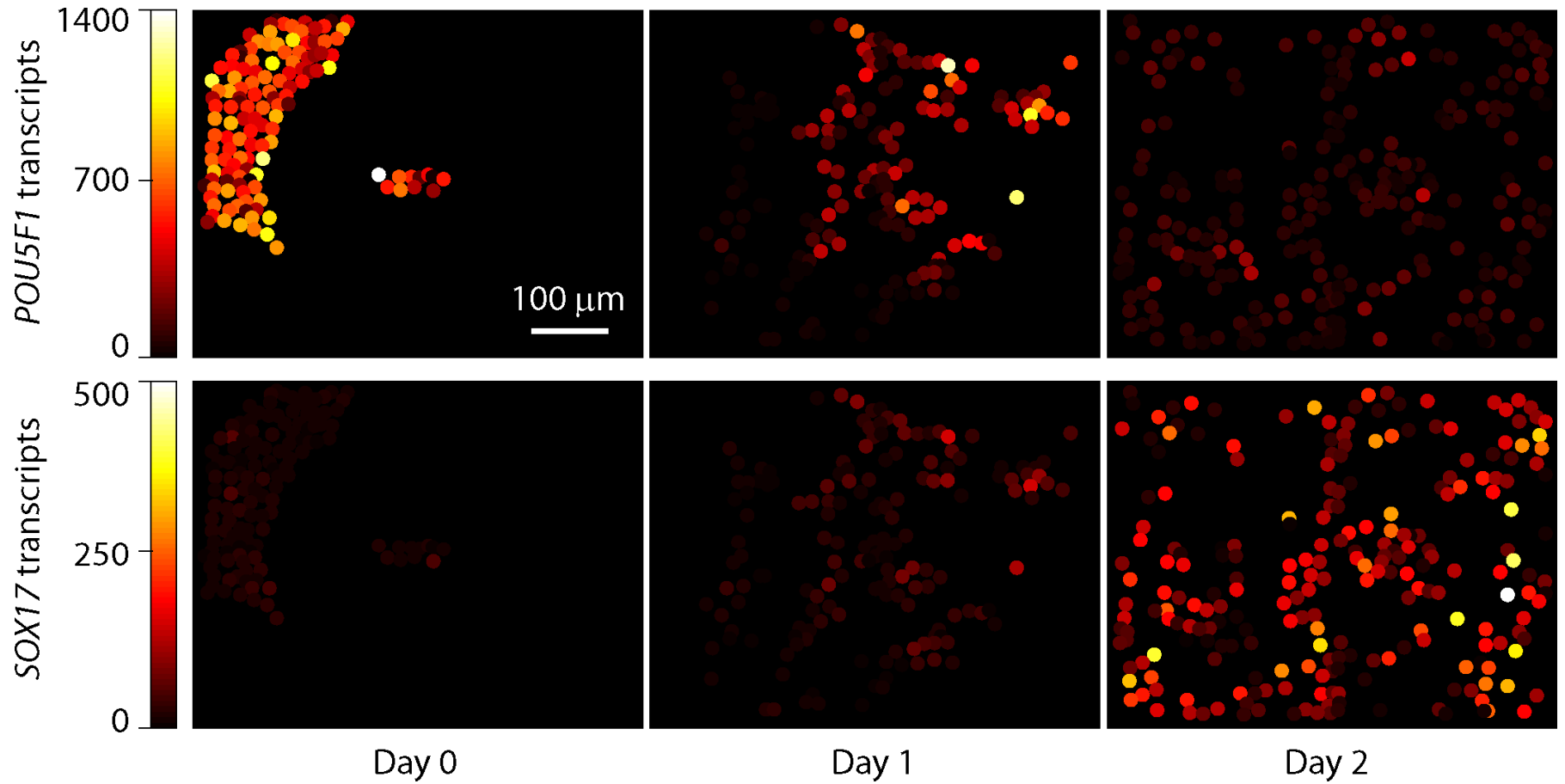
# Single-molecule FISH allows robust quantification of expression of differentiation markers

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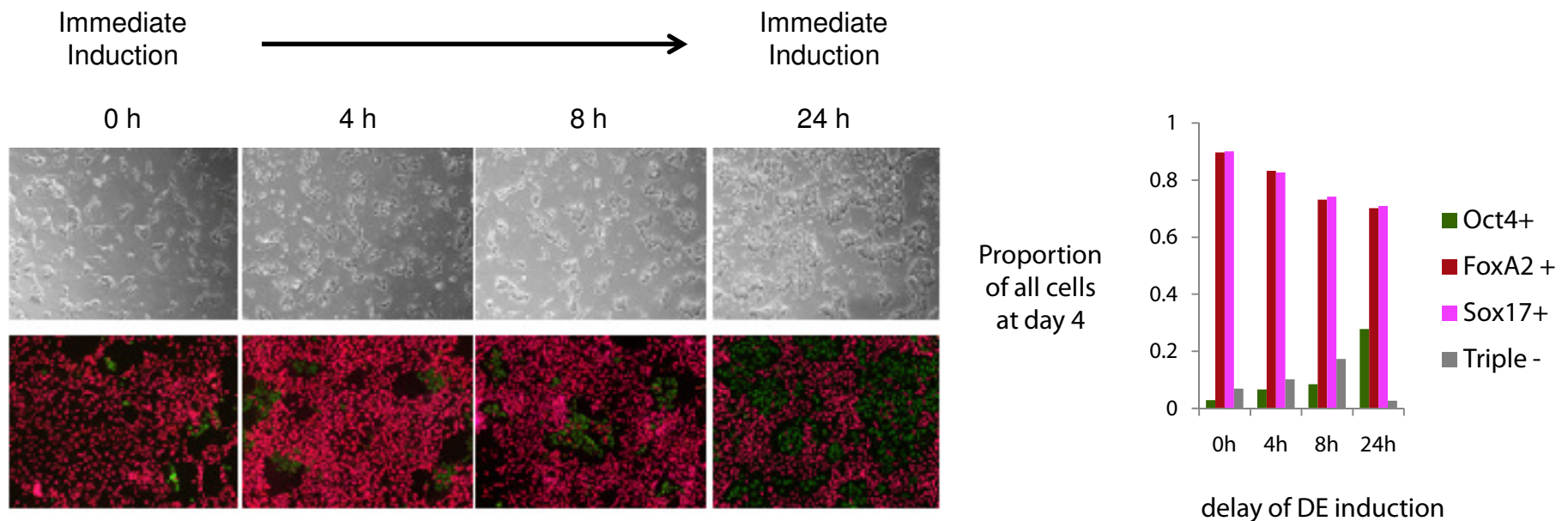
# Processed Data Visualized

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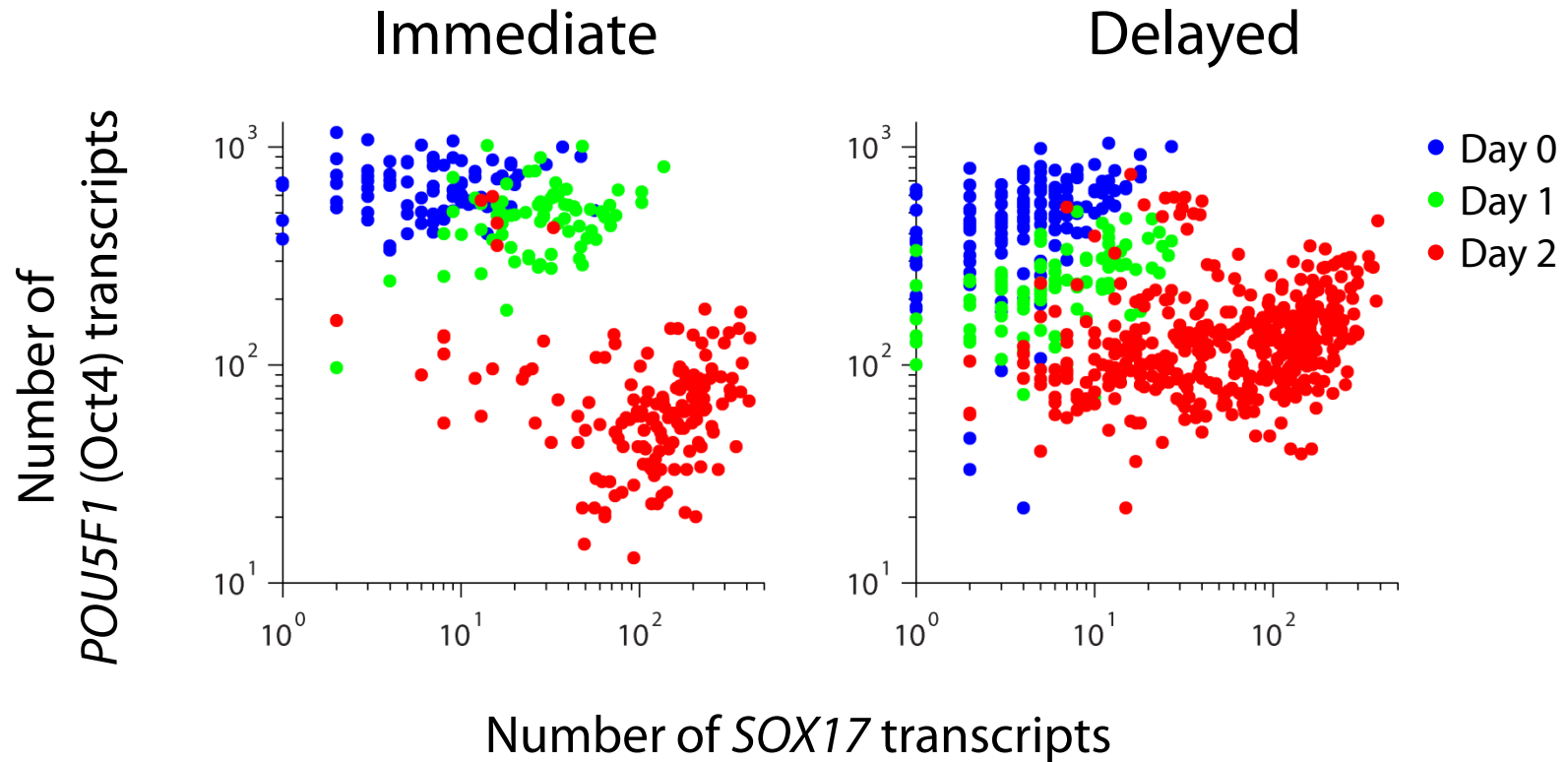
# Immediate vs. delayed induction of differentiation influences the degree of heterogeneity



What is the origin of heterogeneity during DE differentiation?

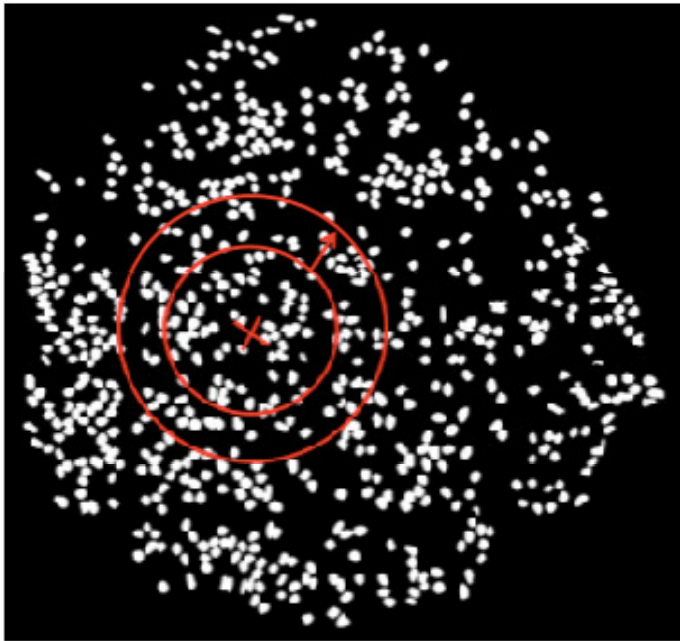
How are spatial organization and differentiation status related?

# Delayed induction of DE differentiation increases heterogeneity



# Spatial statistics of cell features

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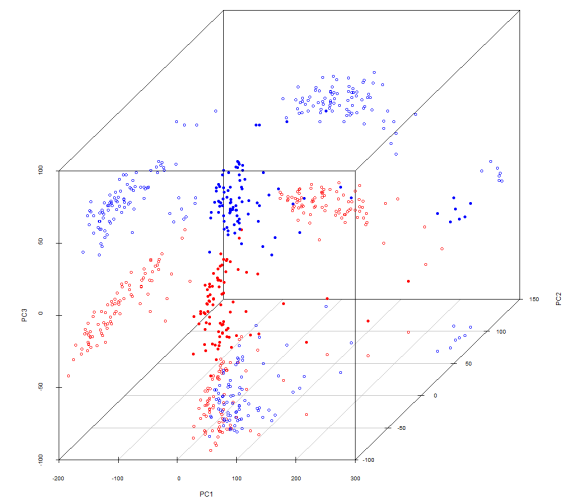
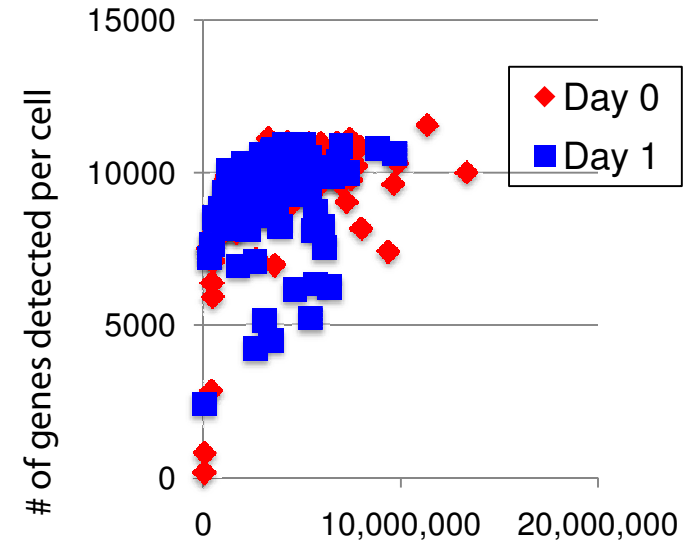
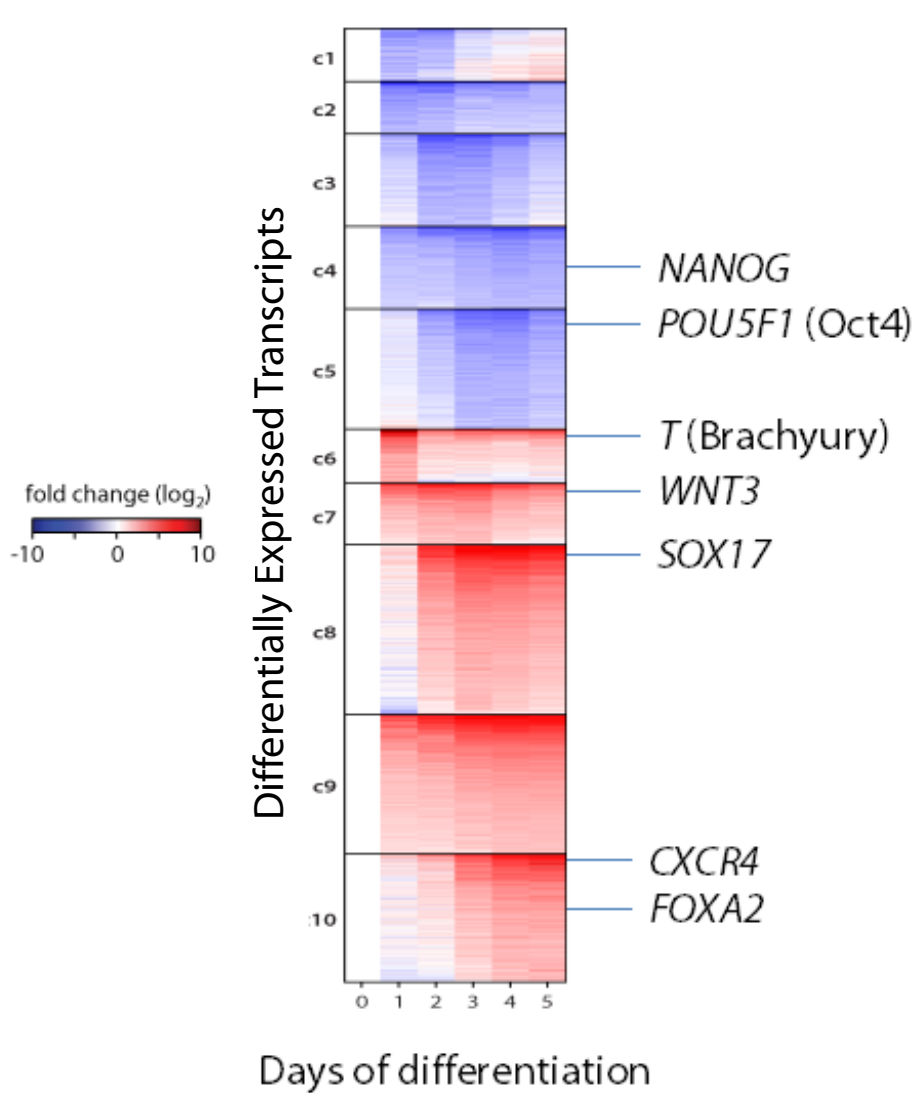


- If a cellular feature distribution is uniform and continuous, then it may be modeled as a spatial poisson process.
- Thus, if a random point is chosen in a colony and a circle of radius  $r$  is extended outward, the probability of  $k$  cells belonging to a given cell state contained in the circle,  $X(S)$ :

$$P \{X(S) = k\} = \frac{[\lambda\pi r^2]^k e^{-\lambda\pi r^2}}{k!}.$$

- The (observed) distribution of the arrival times of cells with a specific feature into the expanding circle is statistically compared (K-S test) against an exponential distribution (random).

# mRNA sequencing defines intermediate stages and expression diversity during DE differentiation



# Conclusion

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- hPS differentiation is inefficient in part due to intrinsic heterogeneity
- We hypothesize that improved understanding of the origin and dynamics of heterogeneity will lead to improved differentiation protocols
- In situ single cell analysis is essential for understanding the role of the cellular micro-environment during differentiation
- We have developed a customized high content imaging system adapted to hPSCs that allows us to perform multi-scale analysis (e.g. features of the colonies in which a cell resides to number of transcripts within each cell)
- We are using bulk and single-cell mRNA seq to define the expression heterogeneity during DE differentiation and hope to identify novel genes that make give insight into the cellular dynamics we have begin to observe.

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