

# Allen Cell Toolkit

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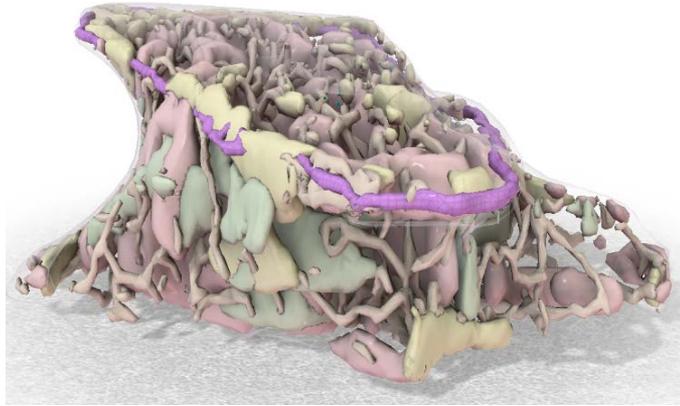
Open-source resources and tools for visualizing,  
interrogating and modeling 3D cell behavior

**University of Toronto**  
**June 7, 2021**

Kimberly (Kim) Cordes Metzler, PhD  
Sr. Program & Alliances Manager  
Allen Institute for Cell Science

# Look at a cell and know what it is doing

*...what it did*



*what it will do...*

cell organization

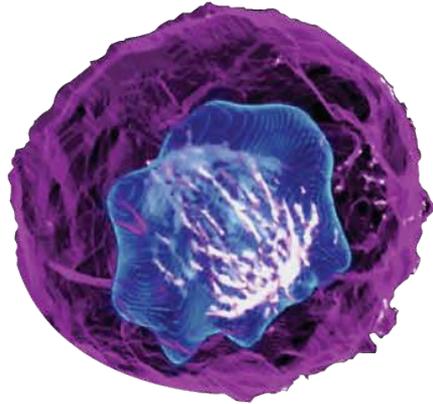


function

Create and understand a “state space” of human stem cell signatures

**Holistic approach via 3D live cell imaging**

# Building the Allen Cell Explorer Tool Kit



Cell designer - Allen Cell Collection



Cell image generator

- Automated microscopy platform  
- Image Collection



Cell image analyzer

- 3D Allen Cell and Structure Segmenter



Cell image visualizer

- AGAVE  
- Integrated Cell Models



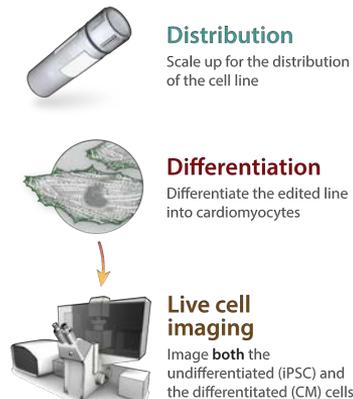
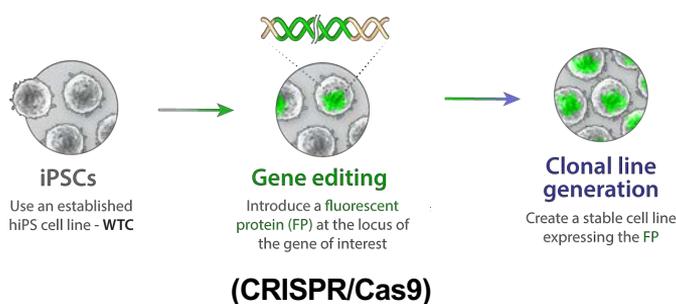
Cell image simulator - Simularium<sup>beta</sup>

An emerging suite of tools and workflows for visualizing, interrogating, and modeling cell behaviors in 3D with use cases for research and education



# Allen Cell Collection - a suite of FP-tagged hiPSC lines representing major structures of the cells

Community engagement to select key proteins to tag



- Generate a collection of high quality clonal FP-tagged iPSC lines
  - Enable live imaging of major structures in stem cells and CMs
- Develop editing strategy, workflows and QC methods
- Release cell lines to the research community

	Structure	Gene/Protein
1	Adhesions	Paxilin
2	Microtubules	Alpha tubulin
3	Nucleus	LaminB1
4	Mitochondria	Tom20
5	Cell-cell junctions	Desmoplakin
6	Actin	Beta actin
7	ER	Sec61B
8	Nucleolus	Fibrillarlin
9	Golgi	ST6Gal1
10	Centrosome	Centrin2



# The Allen Cell Collection- isogenic FP-tagged hiPSCs for live imaging

	Structure	Protein	FP	Status
1	Matrix adhesions	Paxillin	EGFP	Available
2	Microtubules	Alpha-tubulin	mEGFP	Available
3	Nuclear envelope	Lamin B1	mEGFP	Available
4	Mitochondria	Tom20	mEGFP	Available
5	Desmosomes	Desmoplakin	mEGFP	Available
6	Actin filaments	Beta-actin	mEGFP	Available
7	Endoplasmic reticulum (ER)	Sec61 beta	mEGFP	Available
8	Nucleolus (Dense Fibrillar Component)	Fibrillarin	mEGFP	Available
9	Actomyosin bundles	Non-muscle myosin heavy chain IIB	mEGFP	Available
10	Tight junctions	Tight junction protein ZO-1	mEGFP	Available
11	Cytoplasm	Safe harbor	mEGFP	Available
12	Centrosome	Centrin-2	mTagRFP-T	Available
13	Microtubules	Alpha-tubulin	mTagRFP-T	Available
14	Golgi	<b>Sialyltransferase 1</b>	mEGFP	Available
15	Lysosome	LAMP-1	mEGFP	Available
16	Autophagosomes	Autophagy-related protein LC3 B	mEGFP	Available
17	Endosome	<b>Ras-related protein Rab-5A</b>	mEGFP	Available
18	Peroxisomes	Peroxisomal membrane protein PMP34	mEGFP	Available
19	Plasma membrane	Safe harbor, CAAX domain	mTagRFP-T	Available
20	Gap junctions	Connexin-43	mEGFP	Available
21	Nucleolus (Granular Component)	Nucleophosmin	mEGFP	Available
22	Nuclear pores	Nucleoporin Nup153	mEGFP	Available
23	Histones	Histone H2B type 1-J	mEGFP	Available
24	Adherens junctions	Beta-catenin	mEGFP	Available
25	Paraspeckles/stress Granules	RNA-binding protein FUS	mEGFP	Available
26	Cohesin	SMC protein 1A	mEGFP	Available
27	ER/Nuclear envelope	<b>Sec61 beta/lamin B1</b>	mEGFP	Available
28	Transcription factor	Transcription factor SOX-2	mEGFP	Available
29	Nucleolus dual	<b>Fibrillarin/nucleophosmin</b>	mEGFP	Available
30	CM - Sarcomeric thin filament	Troponin I, slow skeletal type	mEGFP	Available
31	CM - Sarcomeric thick filament	MLC-2a (early)	mEGFP	Available
32	CM - Sarcomere M-line	Titin	mEGFP	Available
33	Sarcoplasmic reticulum/Endoplasmic Reticulum	SERCA2	mEGFP	Available
34	CM - Sarcomeric thick filament	MLC-2v (late)	mEGFP	Available
35	CM - Sarcomeric z-disc	Alpha-actinin-2	mEGFP	Available

- ~51 FP-tagged isogenic iPSC lines (WTC-11)
  - Major structures, signaling, cardio-specific, multi-edits
  - Mostly mono-allelic (1 structure tagged/line)
  - Extensive QC

## ➤ Sharing cell lines, plasmids, and methods

- Cell lines – Coriell Institute
- Plasmids – Addgene
- Distribution to stem cell cores at major institutes
- Methods and tutorials - MBoC, Stem Cell Reports, JoVE
- [Allencell.org](http://Allencell.org)



**Bolded**- both mono and bi-allelic lines  
**Red** – Cardiomyocyte-specific edits  
**Blue** - dual tagged lines

# Allen Cell Collection ([allencell.org/cell-catalog](http://allencell.org/cell-catalog))

## Cell Catalog

The catalog below provides a listing of our completed cell lines, as well as those in progress. Click a row in the catalog table to see images and quality control data related to each completed line.

### Cell Catalog **update April 21, 2021**

We have one new fluorescently tagged hiPSC line available in the Allen Cell Collection. The line is a single edited, nuclear line in which telomeres are visualized via mEGFP-tagged TRF2.

#### **Nuclear line:**

- TERF2-mEGFP-mono

The Allen Cell Collection (below) now has 48 high quality-certified fluorescently tagged hiPSC lines that target 38 key cellular structures and substructures available to help your research program.



Allen Institute for Cell Science  
**Lab Plasmids**

# Video Tutorials and Methods



## Instructional Videos & Tutorials for Cell Methods

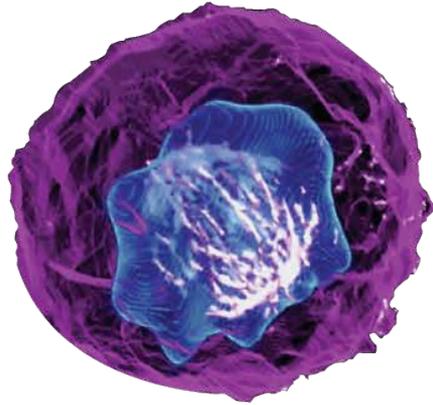
### Allen Cell Methods

Instructional Videos for Success in the Lab

To ensure researchers have success working with our human induced pluripotent stem cell lines in their lab, researchers from our teams highlight nuanced techniques and helpful tips while demonstrating various laboratory protocols.

Read our paper on [Systematic gene tagging using CRISPR/Cas9 in human stem cells to illuminate cell organization](#) in *Molecular Biology of the Cell (MBoC)*

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Cell image analyzer - 3D Allen Cell and Structure Segmenter



Cell image visualizer - AGAVE  
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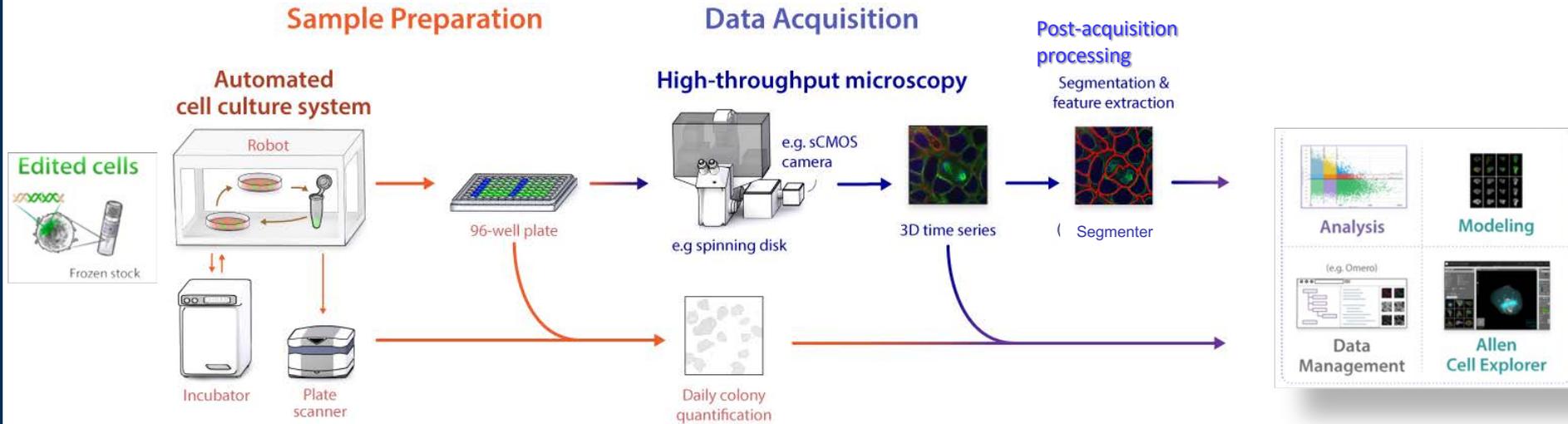


Cell image simulator - Simularium<sup>beta</sup>

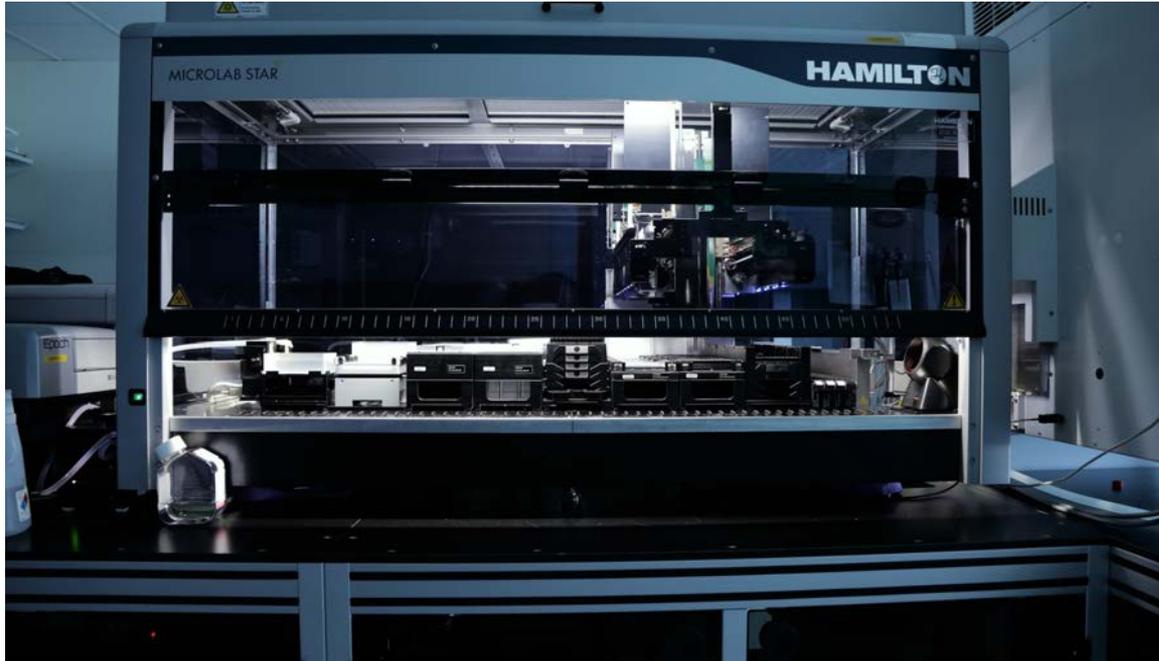
An emerging suite of tools and workflows for visualizing, interrogating, and modeling cell behaviors in 3D with use cases for research and education

[allencell.org](https://allencell.org)

# Image data acquisition pipeline

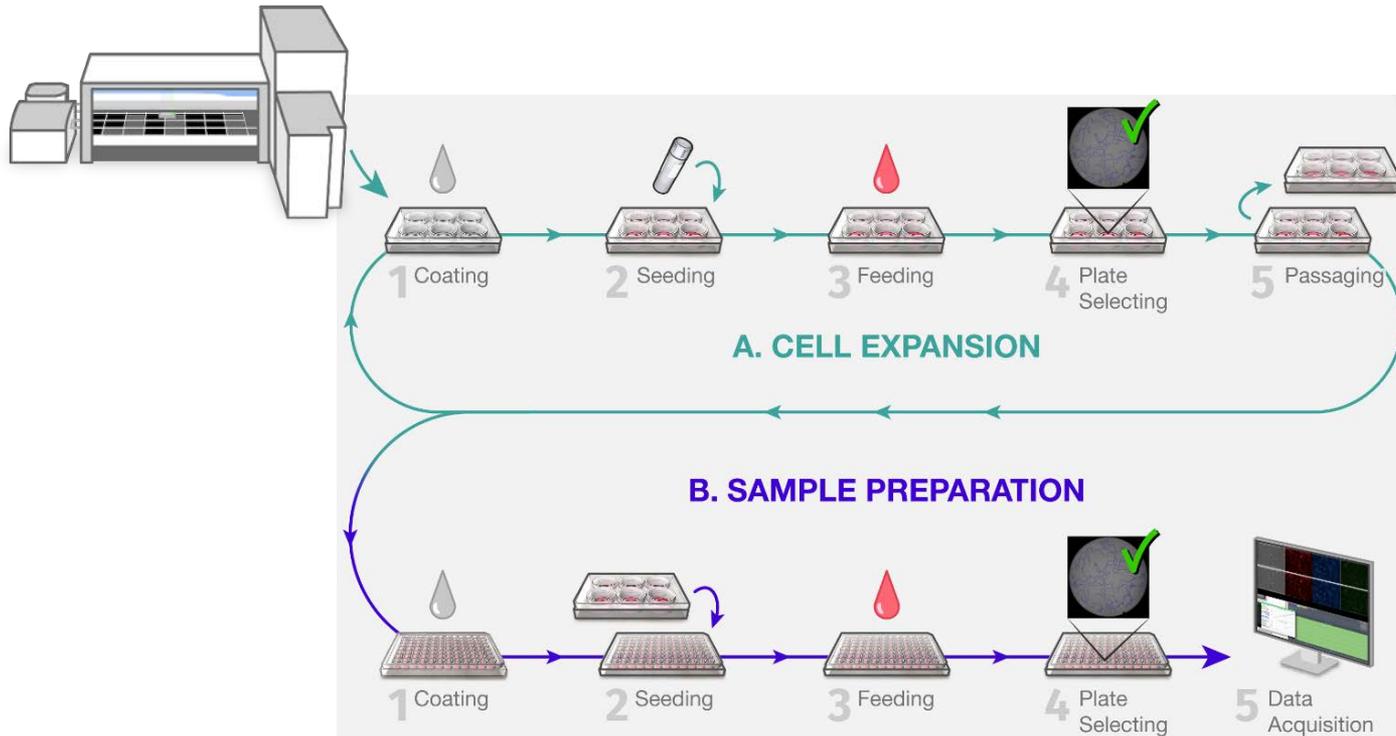


# Automated Cell Culture System



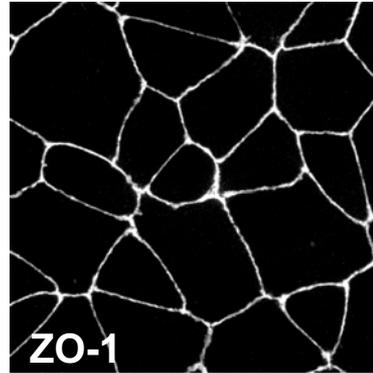
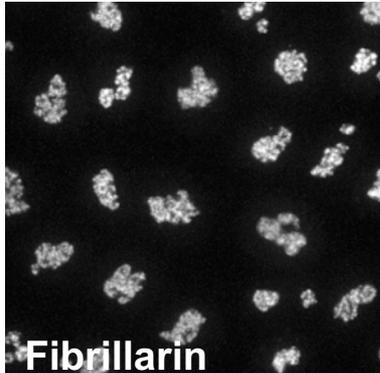
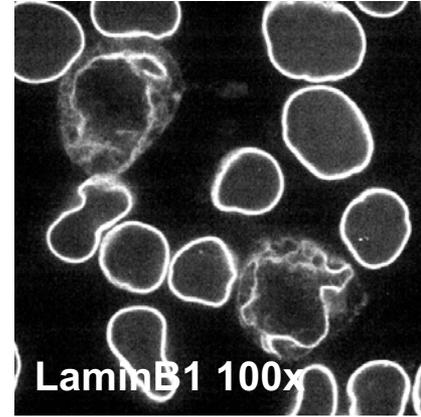
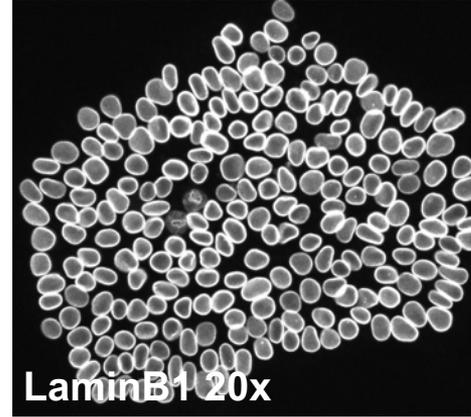
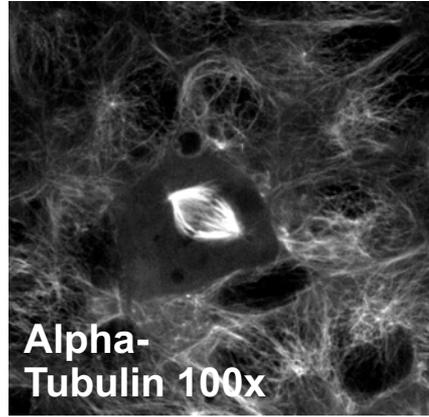
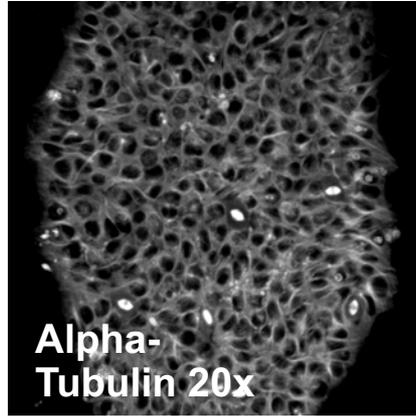
Coston M.E., et. al., *bioRxiv* 11/2020

# Automated Cell Culture System



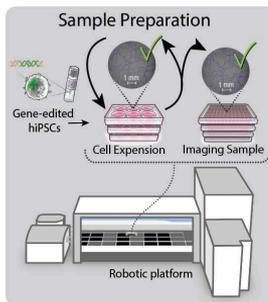
Coston M.E., et. al., *bioRxiv* 11/2020

# Acquiring Our Image Collection

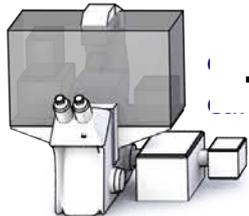


# An automated microscopy platform provides live, 3D single cell data at scale

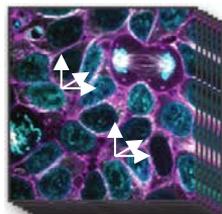
## Reproducible, scalable 3D live cell imaging



+

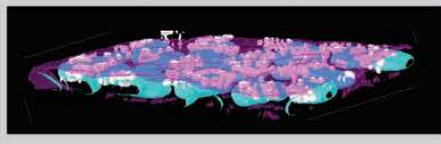


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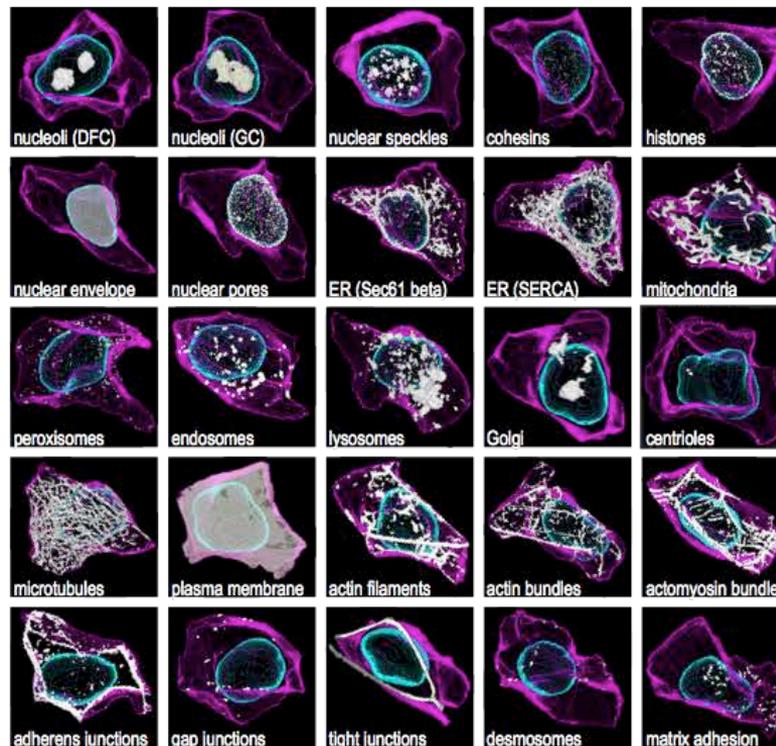


+

## Image Processing



## Individually segmented cells

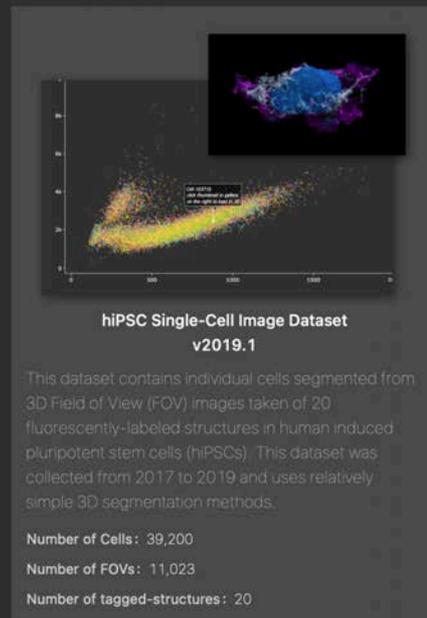
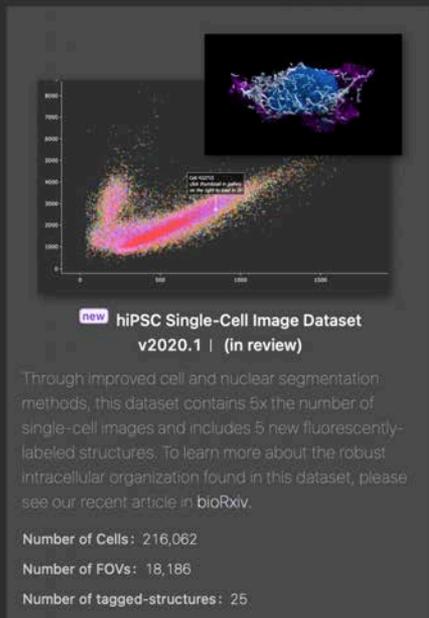


# The Cell Feature Explorer

Cell Feature Explorer

View any of over 200,000 3D cell images and plot cells by features such as organelle volume

## Load a dataset



hiPSC-derived cardiac dataset coming this summer!

# The Cell Feature Explorer

## Cell Feature Explorer

< Gallery

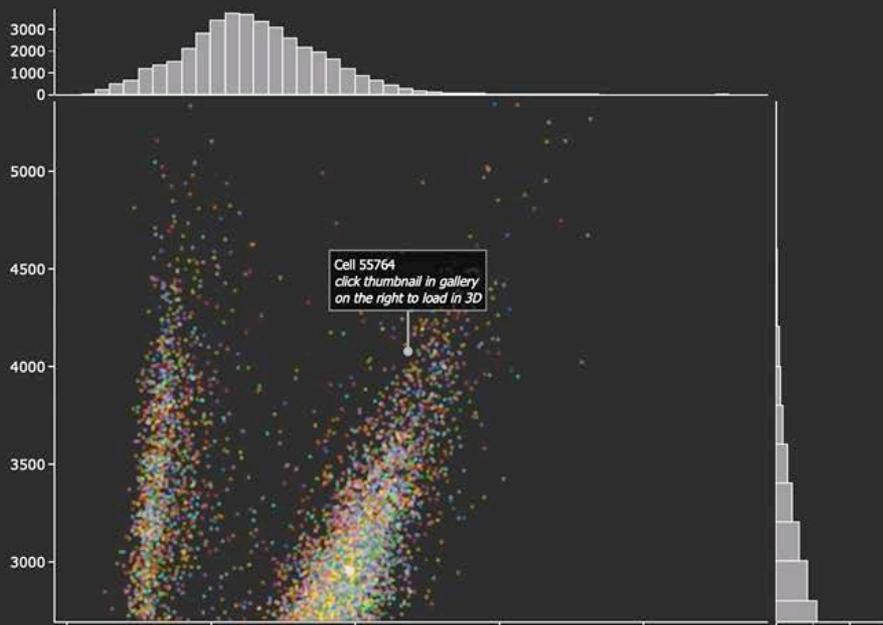
### Plot

▼ Data grouped by tagged structures

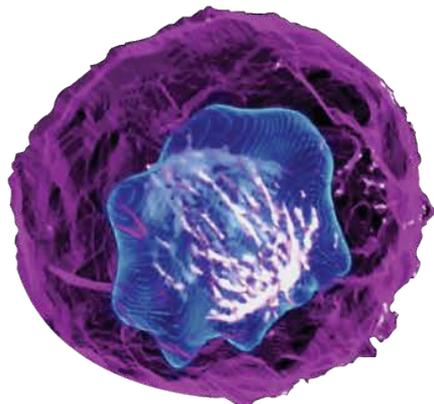
Color by: Protein

✓ Show/Hide all	# of cells	
✓ Alpha-actinin-1	1809	⬇
✓ Alpha-tubulin	2409	⬇
✓ Beta-actin	1039	⬇
✓ Beta-catenin	2343	⬇
✓ CAAX domain of K-Ras	2098	⬇
✓ Centrin-2	1605	⬇
✓ Connexin-43	1491	⬇
✓ Desmoplakin	2320	⬇
✓ Fibrillarin	1536	⬇
✓ LAMP-1	1476	⬇
✓ Lamin B1	3664	⬇
✓ Non-muscle myosin heavy chain IIB	1392	⬇
✓ Nucleophosmin	3717	⬇
✓ Paxillin	1637	⬇

Cellular Volume (fL) ▼



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Cell image simulator - Simularium<sup>beta</sup>

[allencell.org](https://allencell.org)

An emerging suite of tools and workflows for visualizing, interrogating, and modeling cell behaviors in 3D with use cases for research and education

# We Created an Integration Assay for Gene-edited hiPSCs

cell membrane

CellMask Deep Red

mitochondria

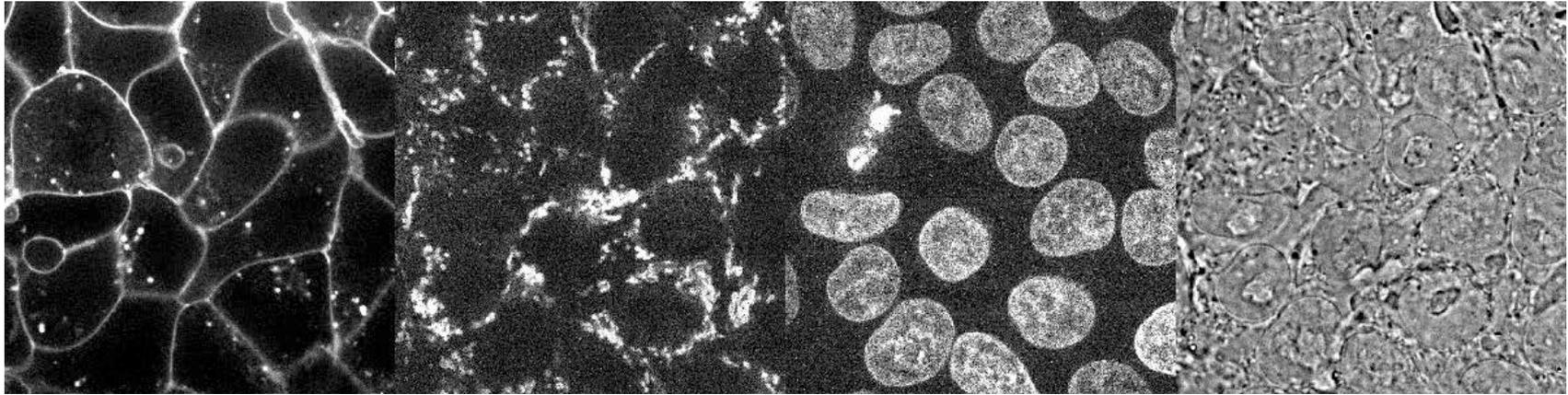
Tom20-mEGFP

DNA (nucleus)

Hoechst

Brightfield

transmitted light image



- **Live 3D imaging of over 18,000 fields of views of hiPSCs for 29 structures and counting**

# How to create a scalable 3D cell integration assay for gene-edited hiPSCs?

cell membrane

CellMask Deep Red

mitochondria

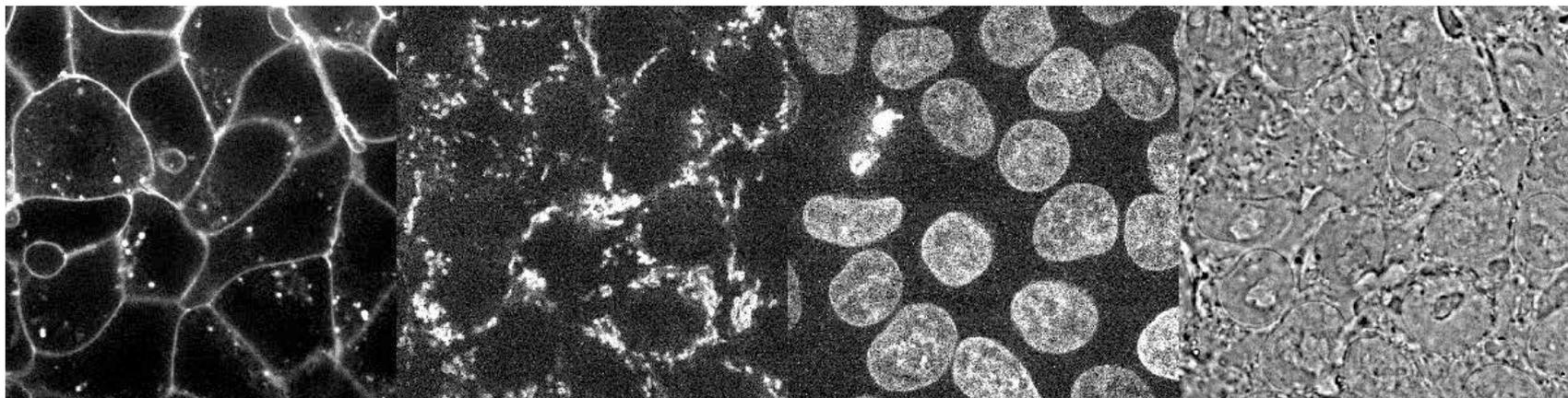
Tom20-mEGFP

DNA (nucleus)

Hoechst

Brightfield

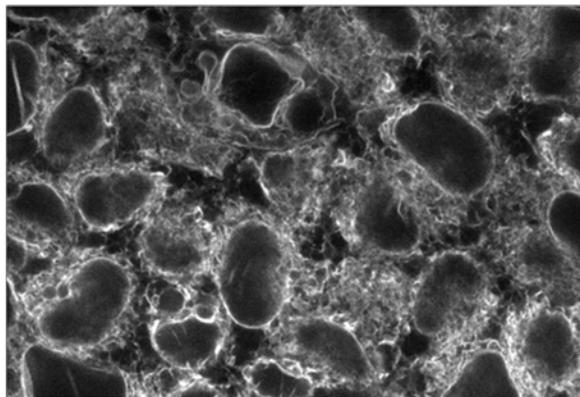
transmitted light image



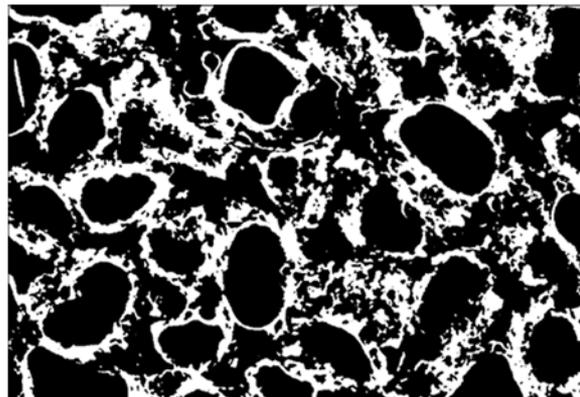
- **Live 3D imaging of over 18,000 fields of views of hiPSCs for 29 structures and counting**
- **Need a tool that enables robust and accurate 3D segmentation of cells, nuclei and structures**

# The Allen Cell & Structure Segmenter

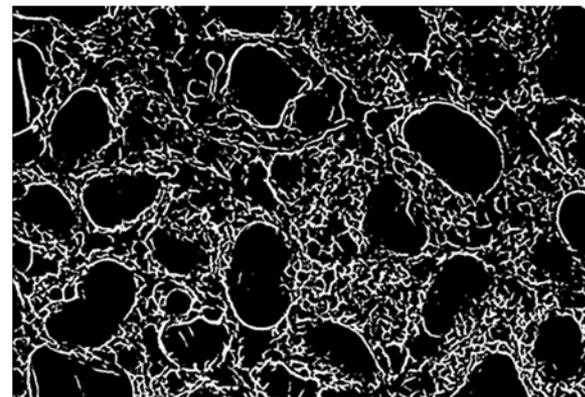
**Goal:** extract the most high-quality & biologically informative segmentations in 3D from optical microscopy possible [allencell.org/segmenter](https://allencell.org/segmenter)



Input 3D image stack  
(ER via Sec61 beta)



Threshold segmentation  
(local adaptive threshold)



Segmenter classic  
workflow: SEC61B

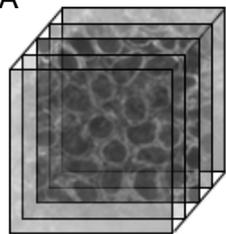
Note: All images are 3D. A middle z-slice is shown.

*bioRxiv* preprint (Chen J, et. al., Dec. 13., 2020)

# The Allen Cell & Structure Segmenter:

An open-source toolkit for segmenting 3D intracellular structures in fluorescence microscopy images

A

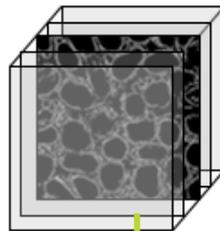


Original single channel 3D image stack

Pre-processing

Core Segmentation Algorithms

Post-processing



3D binary image stack

analysis or models



Classic Image Segmentation Workflow

B

Deep learning model

Training data



Fluorescent images



Ground truth images

sorting/merging



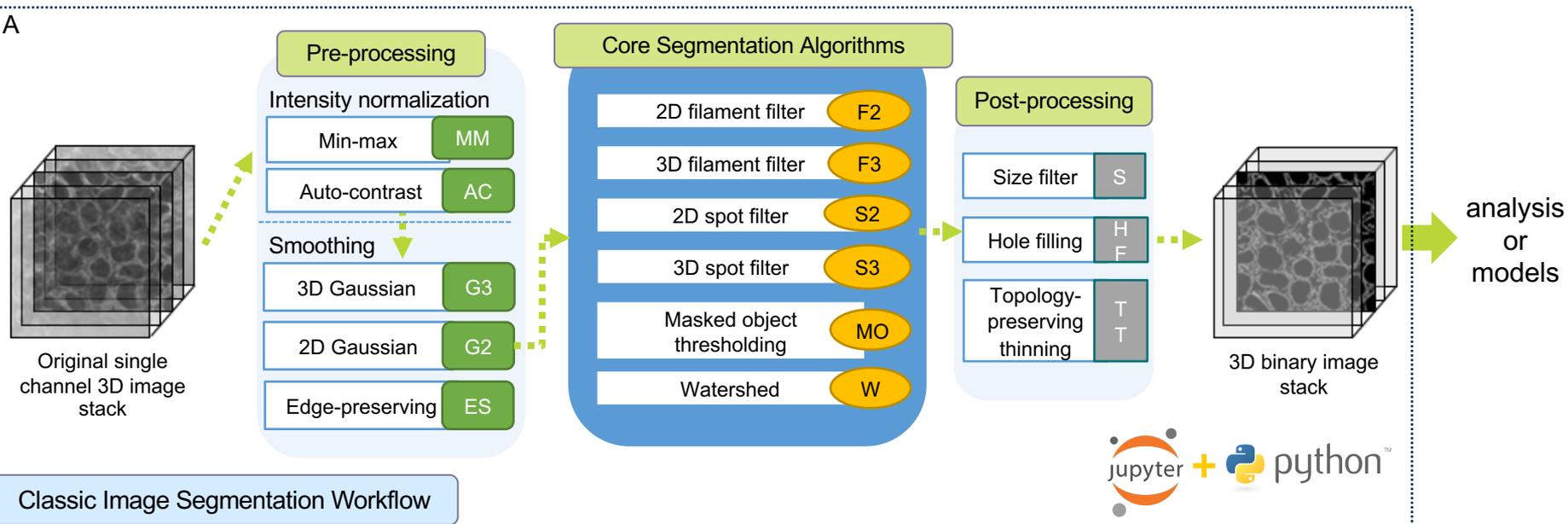
Iterative Deep Learning Workflow



[allencell.org/segmenter](https://allencell.org/segmenter)

# The Allen Cell & Structure Segmenter: The Classic Segmentation Workflow

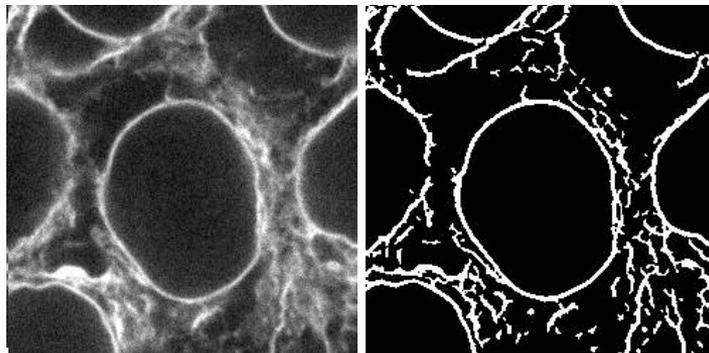
A



# Intracellular structure classic segmentation workflow

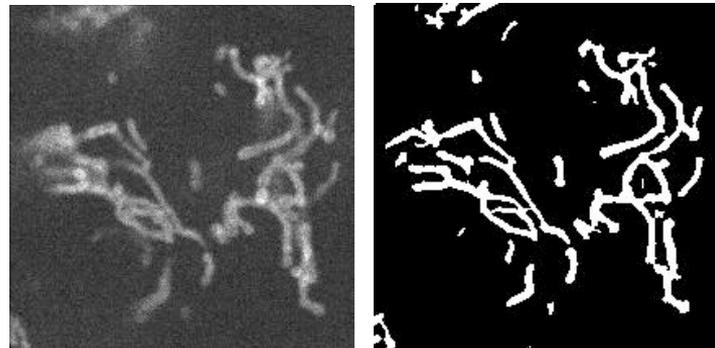
Sec61 beta

10µm



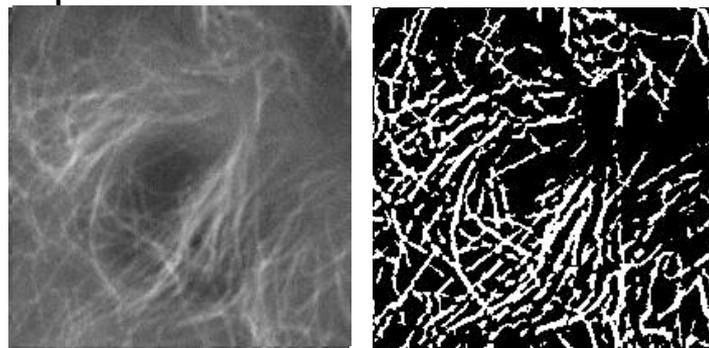
Tom20

10µm

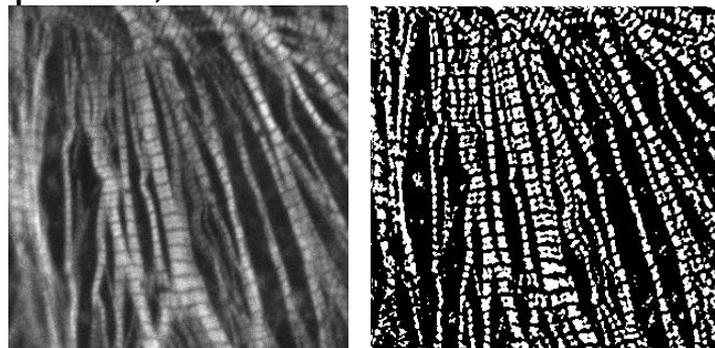


Alpha tubulin

10µm



Troponin I, slow skeletal muscle 10µm



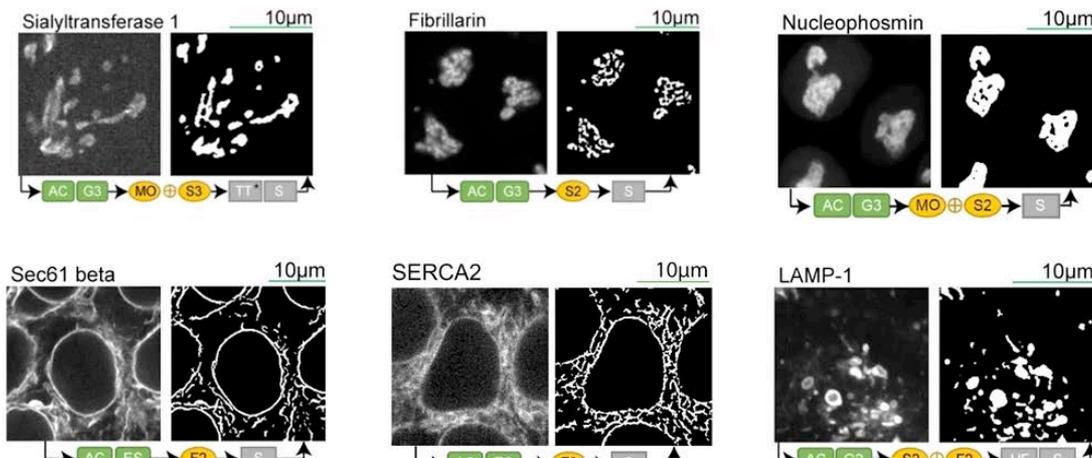
# Created a Lookup Table for Intracellular Structure Classic Segmentation Workflow

## algorithm symbolic legend

- MM Min-max normalization
- AC Auto-contrast normalization
- G2 2D Gaussian smoothing
- G3 3D Gaussian smoothing
- ES Edge-preserving smoothing
- F2 2D filament filter
- F3 3D filament filter
- S2 2D spot filter
- S3 3D spot filter
- MO Masked object thresholding
- W Watershed
- S Size filter
- HF Hole filling
- TT Topology-preserving thinning

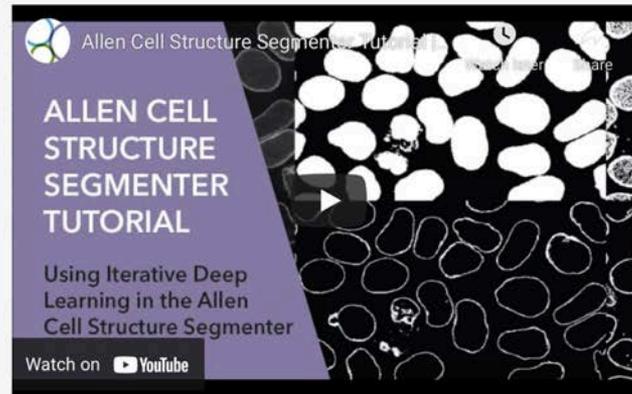
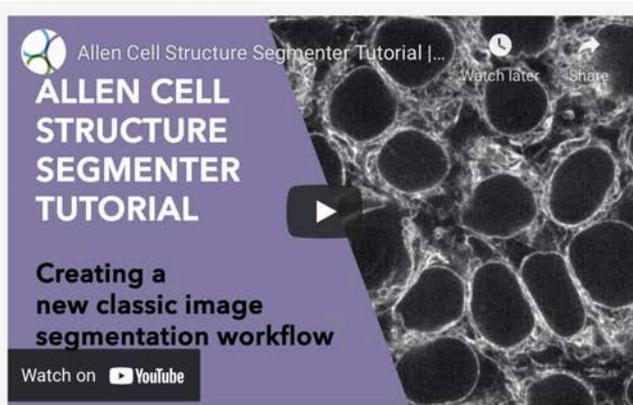
Lookup table of classic image segmentation workflows for 28 intracellular structure localization patterns

[Click on thumbnail to view video](#)



“Find your Morphology Match”

# Making the Segmenter User-friendly



Jupyter Notebooks & Tutorials

Napari plugin App  
*coming June 30th*

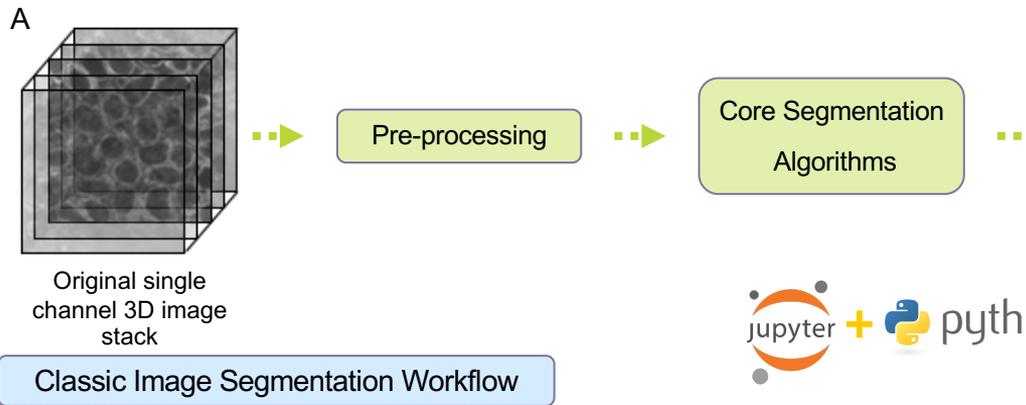
[napari.org](https://napari.org)

Learn more at  
[allencell.org/segmenter](https://allencell.org/segmenter)



Questions:  
[forum.allencell.org](https://forum.allencell.org)

# Napari Allen Cell & Structure Segmenter Plugin



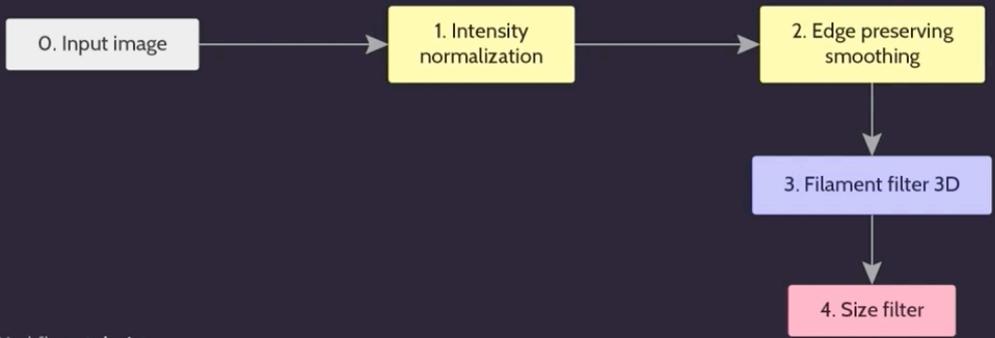
ALLEN CELL & STRUCTURE SEGMENTER  
v1.0 supports static 3D images only

Workflow selection steps:

1. cardio\_tnni
2. Channel 0
3. Click a button below that most closely resembles your image channel to select & start a workflow

Image input	Segmentation output

# Napari Allen Cell & Structure Segmenter



Workflow: tuba1a

## Glossary

DESCRIPTION OF PARAMETERS IN EACH FUNCTION WIDGET

Note: the parameters described here are only for the widgets in the Napari plugin. Not all parameters are exposed to the widget for the sake of simplicity. For programmer users, please refer the full documentation to see the detailed APIs.

### INTENSITY NORMALIZATION

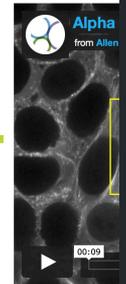
Auto-contrast normalization. First, *mean* and standard deviation (*std*) of the original intensity in image are calculated. Next, the intensity is truncated into range  $[\text{mean} - a * \text{std}, \text{mean} + b * \text{std}]$ , and then recaled to  $[0, 1]$ . *a* and *b* are parameters controlling effect of the adjustment.

- *scaling\_param*: a list of two float values, corresponding to *a* and *b* in the aforementioned equation.

### EDGE PRESERVING SMOOTHING

A smoothing method that reduces the noise, while retaining the sharp edges.

Alpha tubu



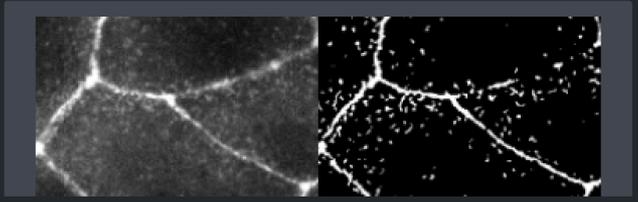
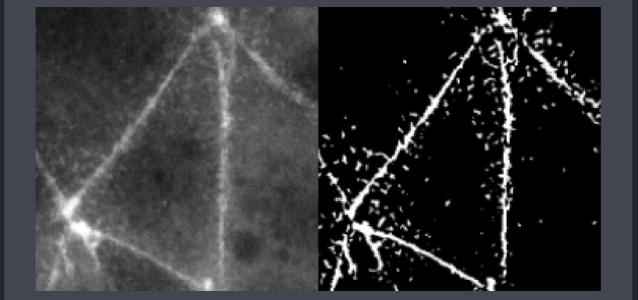
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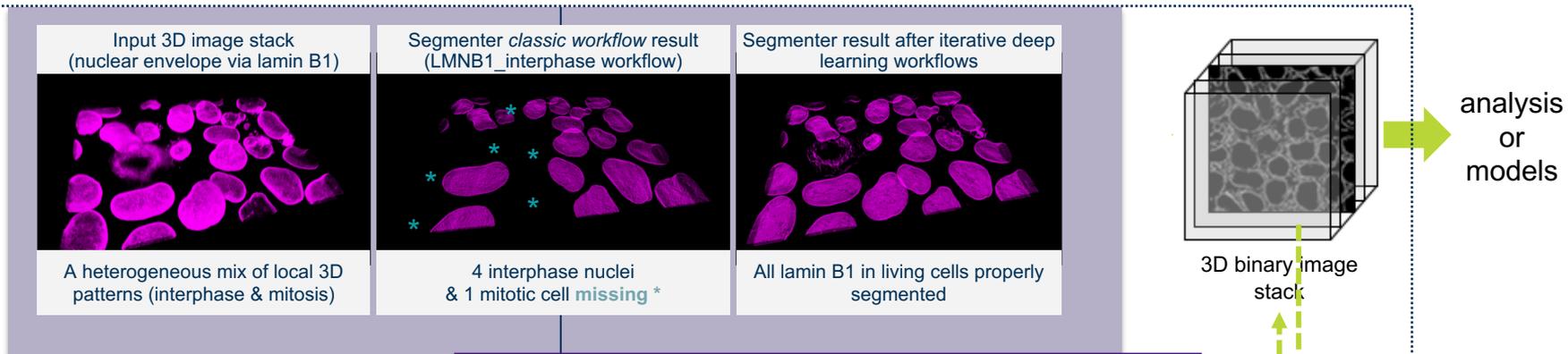
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3. Click a button below that most closely resembles your image channel to select & start a workflow

Image input

Segmentation output

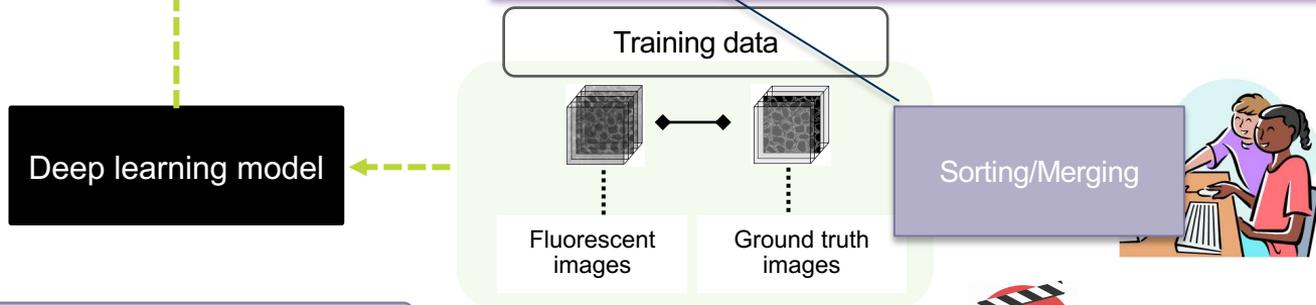


# The Allen Cell & Structure Segmenter: combines classic image segmentation & deep learning



**improve accuracy and robustness**

B



Iterative Deep Learning Workflow



[allencell.org/segmenter](https://allencell.org/segmenter)

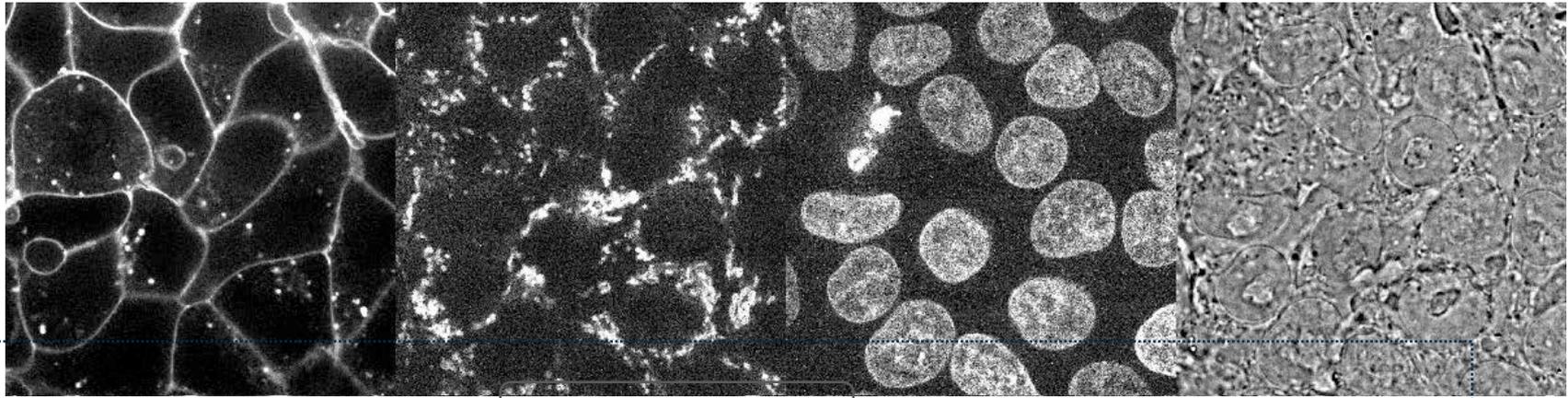
# Scalable cell integration assay for gene-edited hiPSCs

cell membrane  
CellMask Deep Red

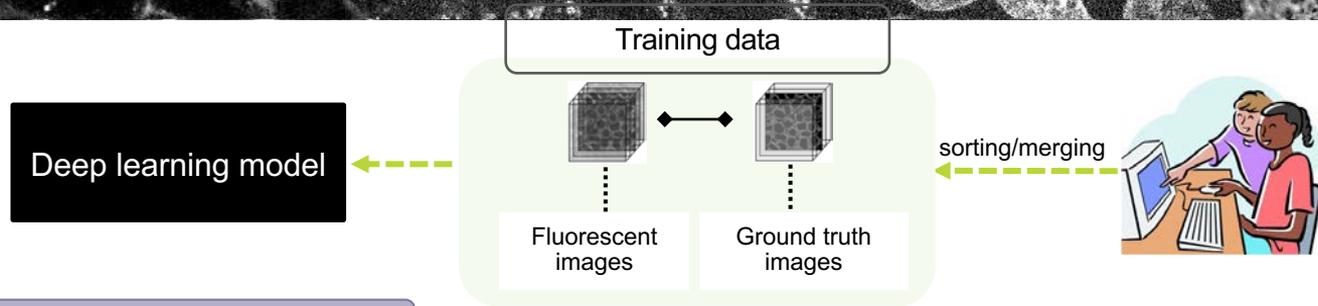
mitochondria  
Tom20-mEGFP

DNA (nucleus)  
Hoechst

Brightfield  
transmitted light image



B



Iterative Deep Learning Workflow

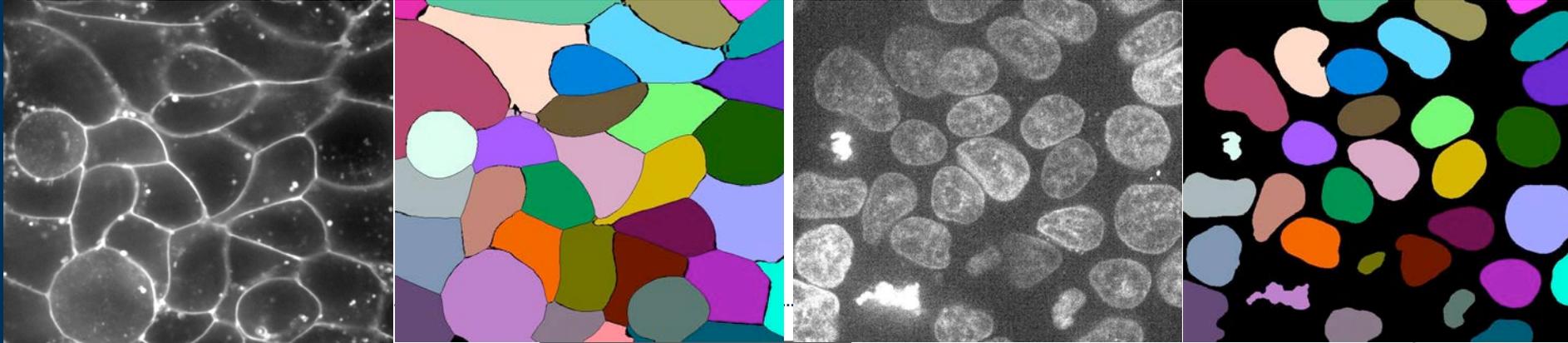
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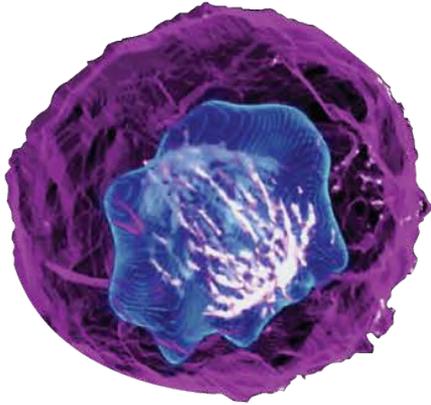
DNA (nucleus)

Hoechst



- Iterative deep learning combined with 'training assays' can improve segmentation accuracy, see *bioRxiv* preprint (Chen J, et. al., Dec. 13., 2020)
- Created a scalable 3D cell integration assay
- Achieved the robust segmentation of >18,000 fields of view to get >215,000 single cell images for analysis
- **Napari Allen Cell & Structure Segmenter plugin available June 30<sup>th</sup>, 2021**

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- Automated microscopy platform
- Image Collection



Cell image analyzer

- 3D Allen Cell and Structure Segmenter



Cell image visualizer

- AGAVE
- Integrated Cell Models



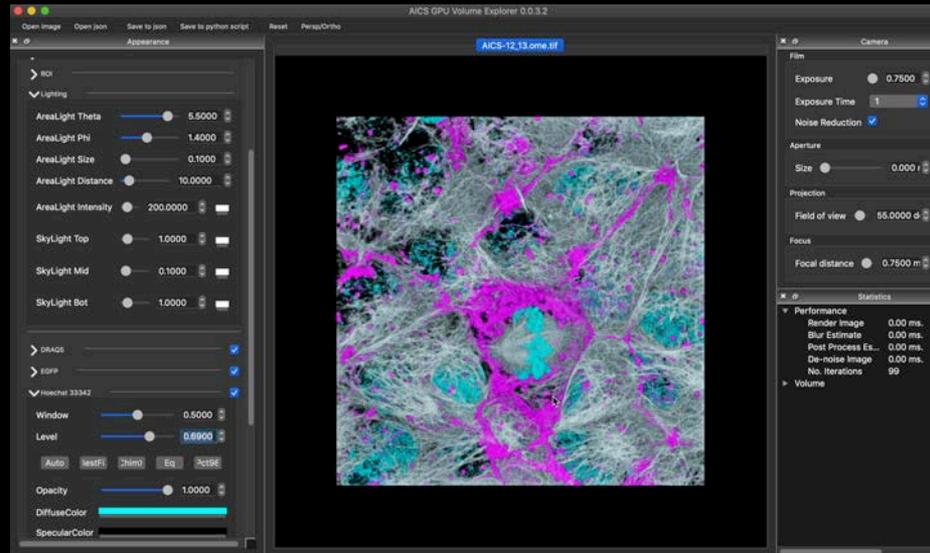
Cell image simulator - Simularium<sup>beta</sup>

[allencell.org](https://allencell.org)

An emerging suite of tools and workflows for visualizing, interrogating, and modeling cell behaviors in 3D with use cases for research and education

# Path-trace rendering of 3D microscope images with AGAVE

Get AGAVE: [allencell.org/software-and-code.html](http://allencell.org/software-and-code.html)



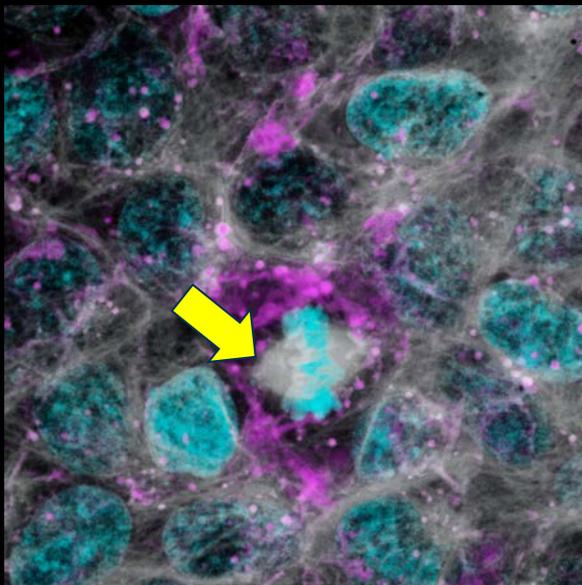
Advanced GPU Accelerated Volume Explorer (AGAVE)

Desktop application for Linux, Windows, and MacOS

# Cell data integration: enhancing 3D interpretability

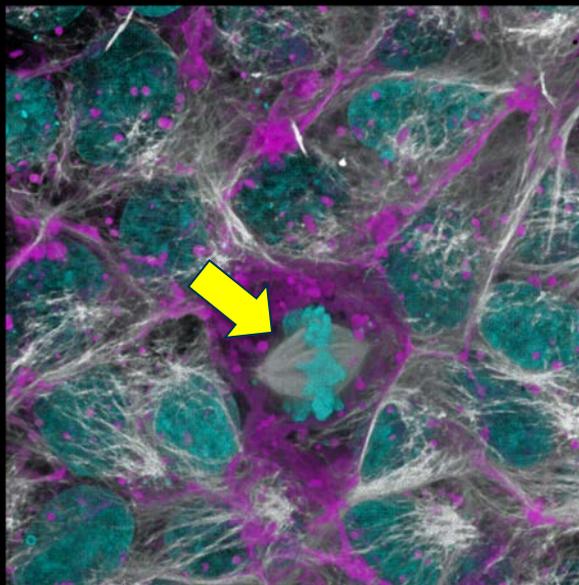
Advanced GPU Accelerated Volume Explore (AGAVE)

Classic

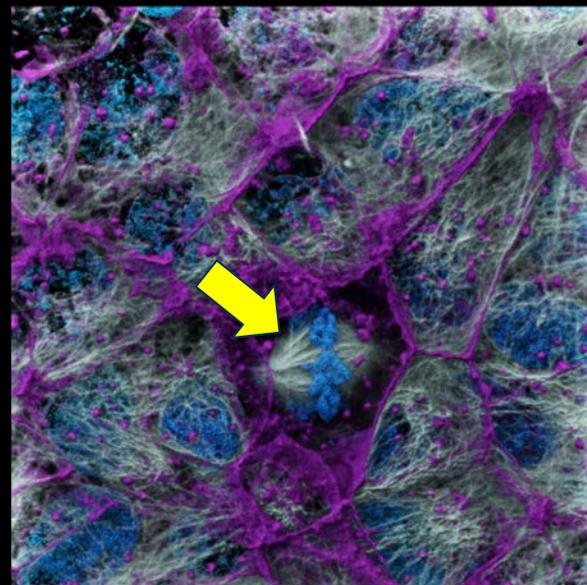


Standard volume rendering

AGAVE



AGAVE transparent path-tracing

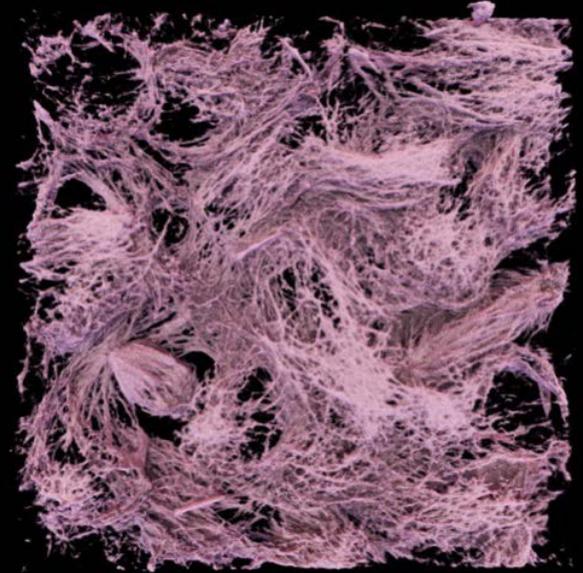
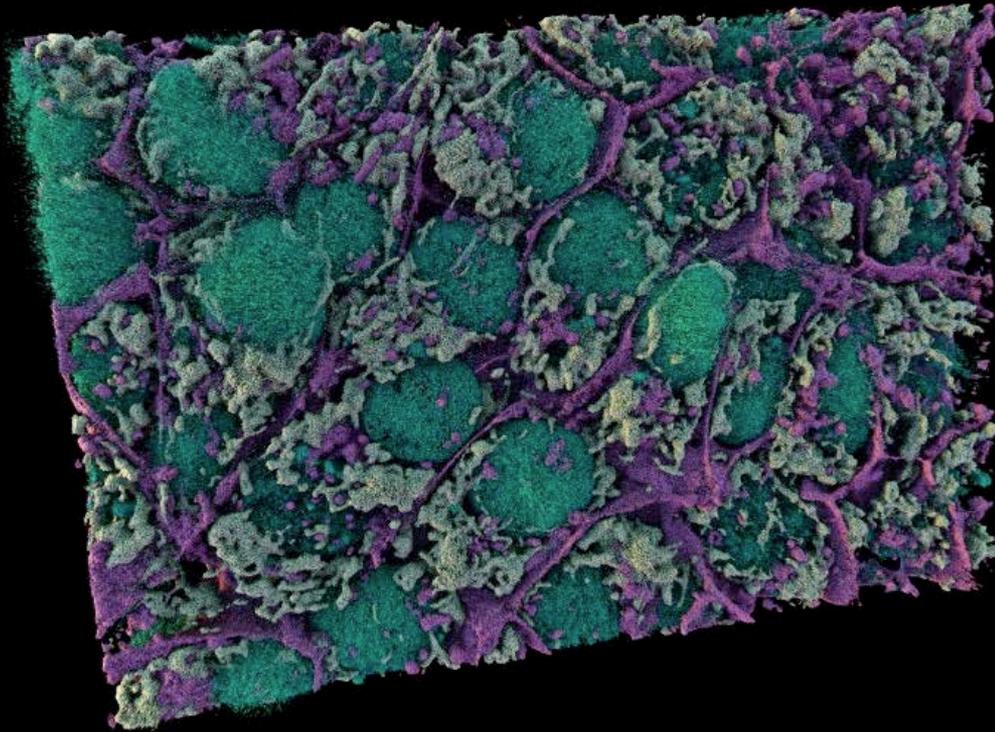


AGAVE cinematographic path-tracing

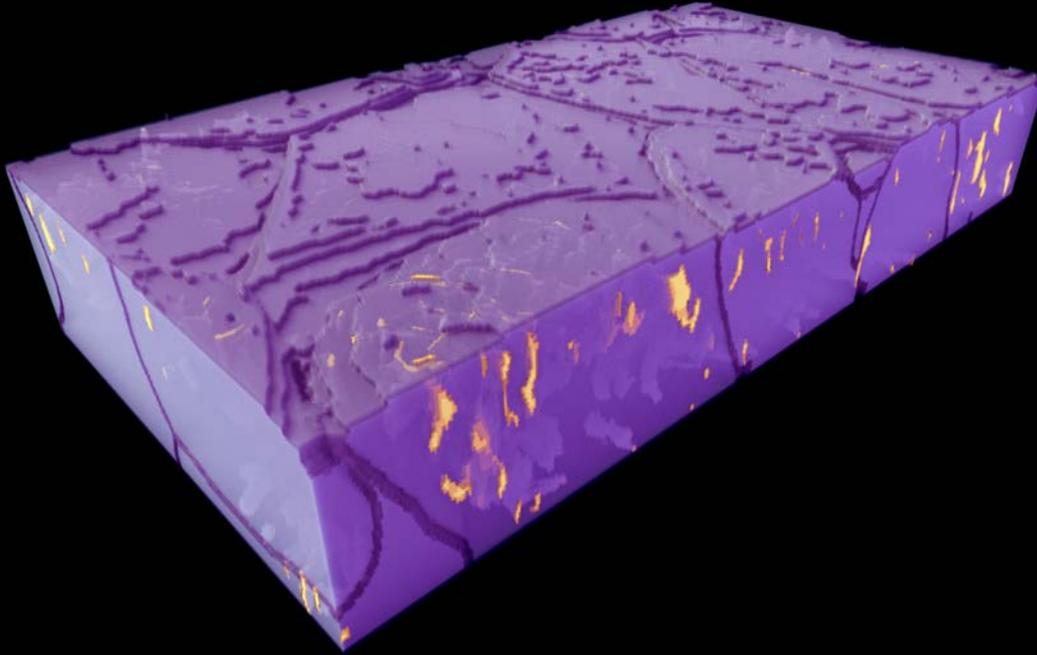
Cell membrane dye | DNA dye | mEGFP-tagged structure

# Why go to the computational expense of pathtracing?

Contributions beyond ambient occlusion: shadow casting can clarify topology



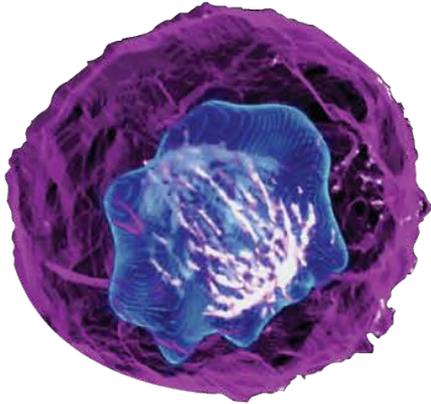
# AGAVE can help understand segmentation results



before training assay  
after training assay

- help finding errors in 3D
- help comparing 3D effect of parameters
- help understand topology/morphology in 3D

# Building the Allen Cell Explorer Tool Kit



Cell designer - Allen Cell Collection



Cell image generator

- Automated microscopy platform
- Image Collection



Cell image analyzer

- 3D Allen Cell and Structure Segmenter



Cell image visualizer

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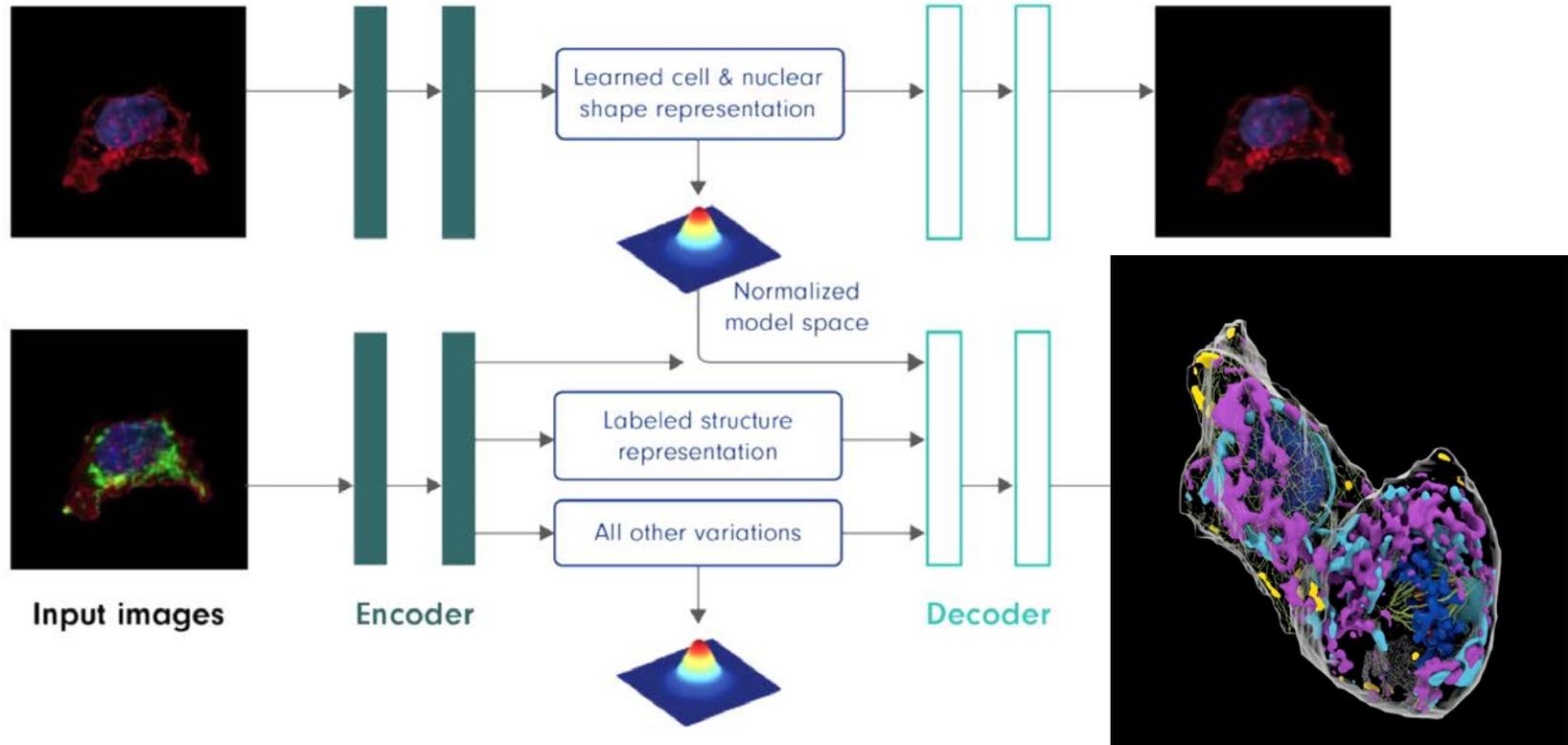


Cell image simulator - Simularium<sup>beta</sup>

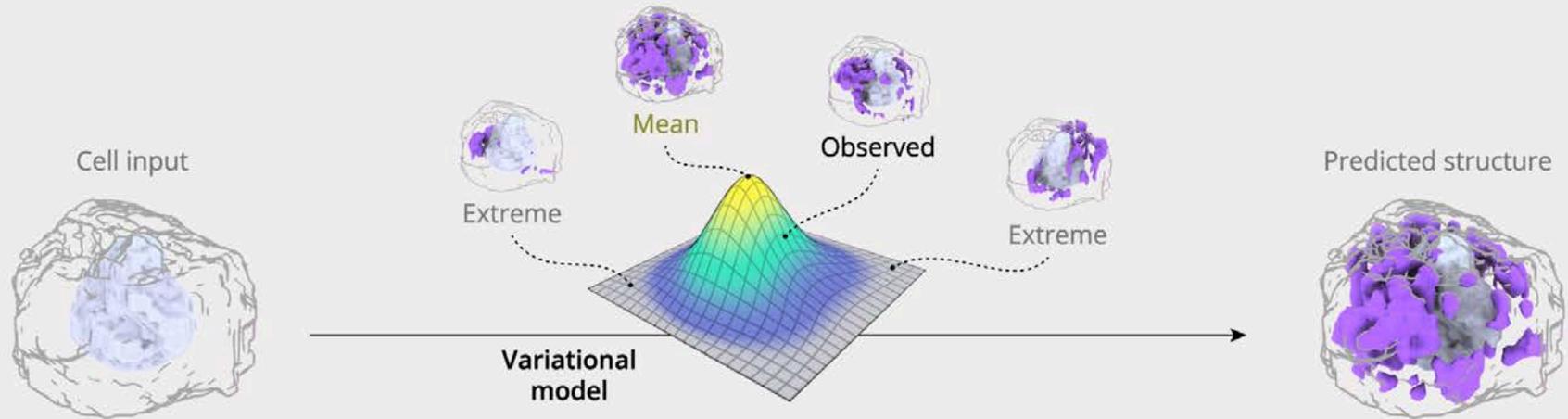
[allencell.org](https://allencell.org)



# Statistical Learning via Autoencoders



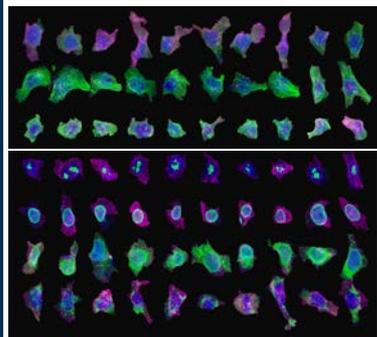
# Statistical Learning via Autoencoders



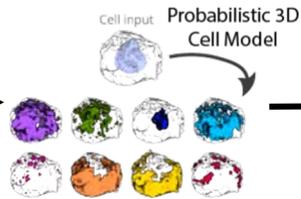
coming soon on *bioRxiv*

# Building an 'integrated cell'

How can we build a complete 'Integrated Cell' from images of a cells tagged with 1 or 2 structures at a time?

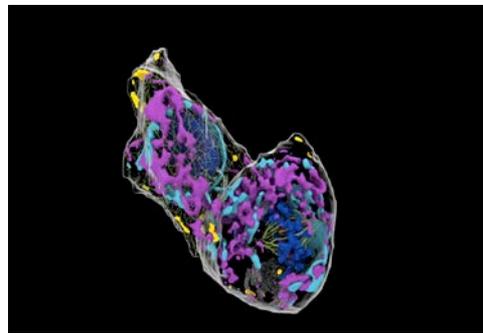
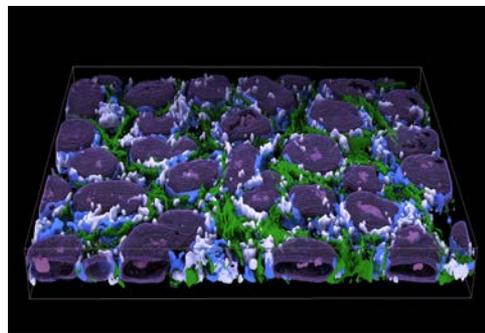
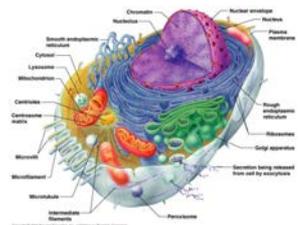
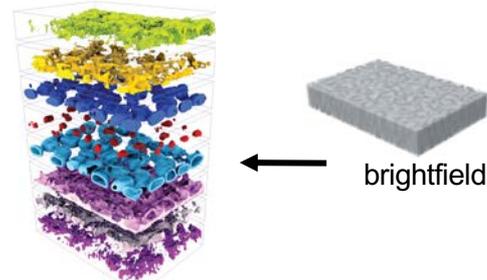


## Statistical learning



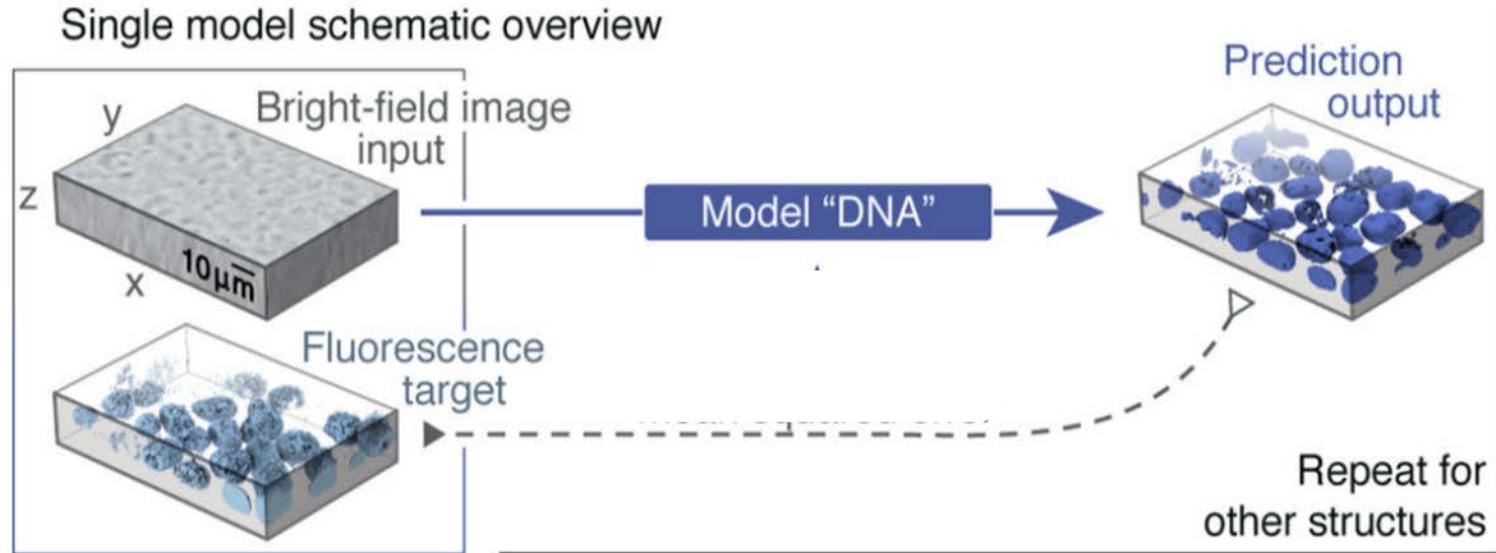
## Spatial integration Predictive modeling

## Label-free approach

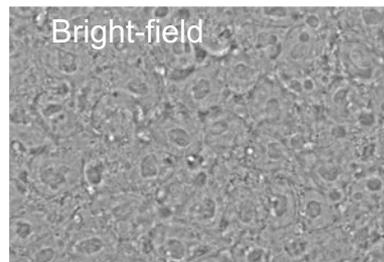


- **Establish correlations**
- **Generate hypothesis**
- **Follow cell states**

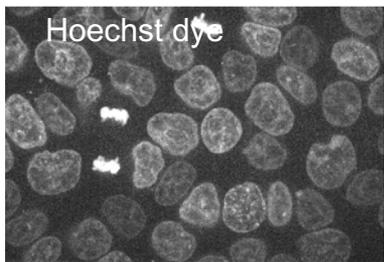
# Label-Free Method



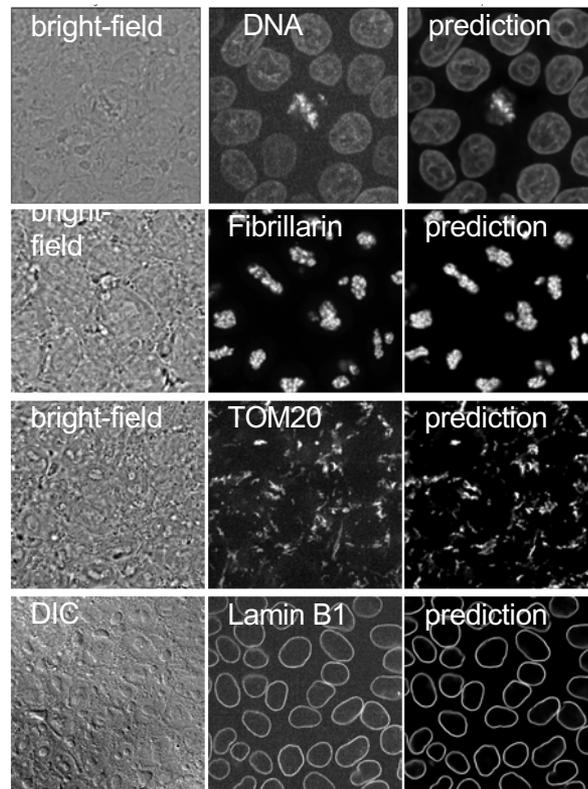
# Label-free prediction of cellular structures



Training on DNA



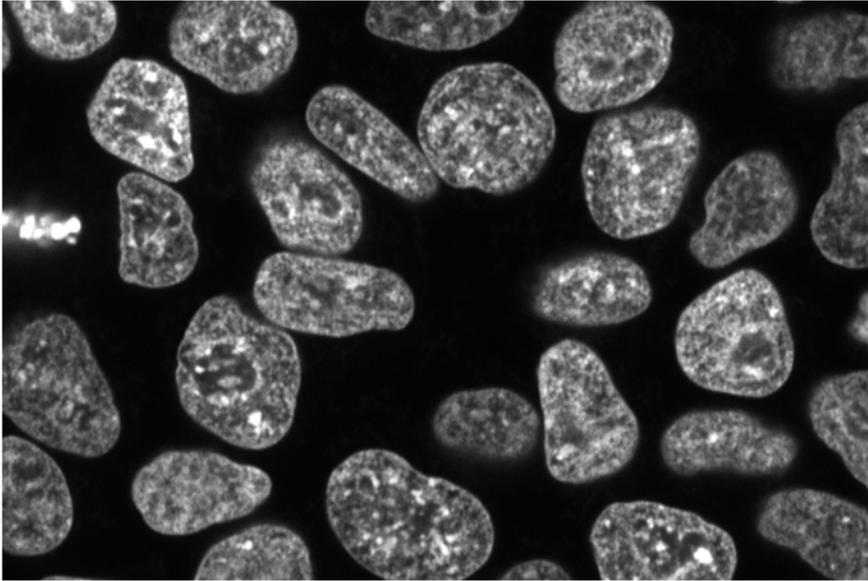
Computer learns the features in the bright field image that correspond to the fluorescence



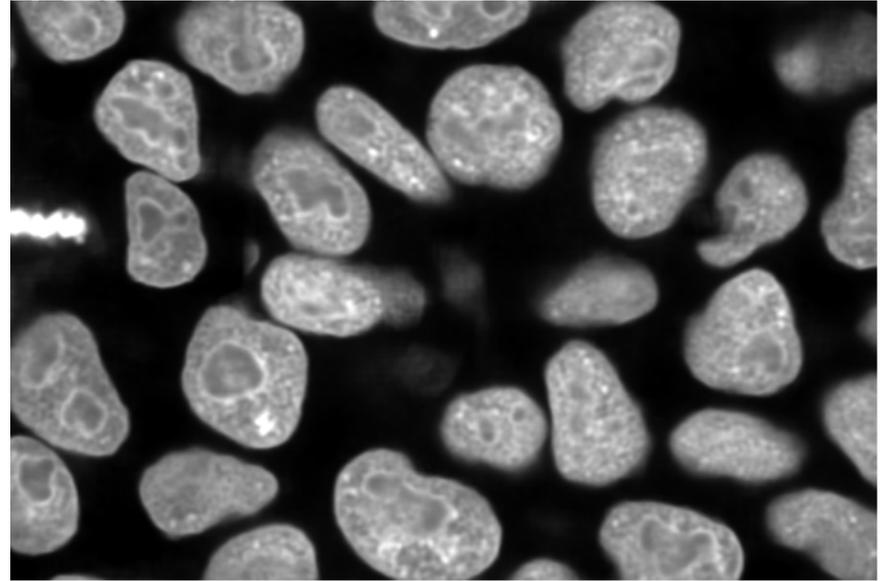
- Code available on GitHub
- Integrating label-free approaches with real data

*Ounkomol, et al. Nature Methods 2019*

# Nuclear Structure Prediction



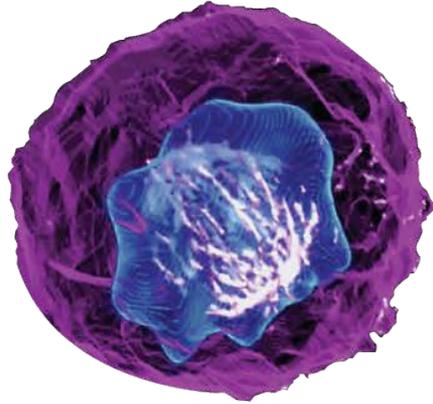
Real H2B



Label-free prediction

Current focus is the shape, not texture.

# Allen Cell Explorer Tool Kit (allencell.org)



An emerging suite of tools and workflows for visualizing, interrogating, and modeling cell behaviors in 3D with use cases for research and education



Cell designer • Allen Cell Collection



Cell image generator

- Automated microscopy platform  
- Image Collection



Cell image analyzer

- Allen Cell & Structure Segmenter



Cell image visualizer

- AGAVE  
- Integrated Cell Models



Cell image simulator

- Simularium<sup>beta</sup>

# Simularium<sup>Beta</sup>

Visualize, analyze, interrogate & share biological simulations



SIMULARIUM HOME

Load model ▾

Help ▾

## Simularium Beta

Visualize, analyze, interrogate & share biological simulations

Simularium makes it easy to share and analyze spatial simulations directly in a web browser. Its primary goal is to facilitate collaborations between experimental biologists and computational biologists by removing major challenges to accessing, running, sharing, and analyzing simulation results.

Try Simularium now

View example simulations or load your own data

[simularium.allencell.org](https://simularium.allencell.org)

# Try Simularium<sup>beta</sup>

View example simulations or load your own data

**Agents**

- ★ SHOW TYPE
- All
- ☆  Actin
- ☆  Budding vesicle
- ☆  HIP1R complex
- ☆  Mother nucleator
- ☆  Arp2/3 complex
- ☆  Cell membrane

**Plots**

### Pit Internalization

Pit internalization (nm)

Time (s)

Time (s)	Pit internalization (nm)
0	0
2	-40
4	-50
6	-55
8	-65
10	-70
12	-75
14	-80
15	-80

### Mean Actin Bending Energy

Mean bending energy (pN\*nm)

Time (s)

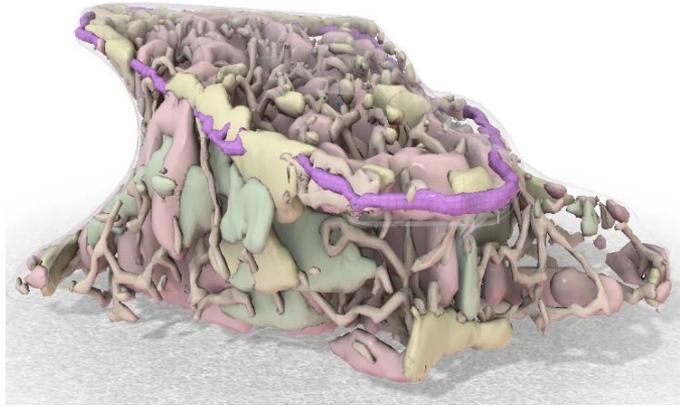
Time (s)	Mean bending energy (pN*nm)
0	0
2	25
4	40
6	10
8	25
10	15
12	30
14	25
15	25

100 nm

0.1 / 15 s

# Tools to Visualize, Analyze and Model Cell Behavior

*...what it did*



*what it will do...*

cell organization



function

Create and understand a “state space” of human stem cell signatures

**Holistic approach via 3D live cell imaging**

# Allen Cell Discussion Forum

Welcome to the Allen Cell Discussion Forum, the official community site for Allen Institute for Cell Science! This forum is a place for learning, helping, and sharing experiences of using our publicly-available cell lines, plasmids, genomic data, software, and analytic tools.  
Get started: read our new user guide and know our community guidelines.

Gene-editing

Human iPSC gene-editing techniques, tips, & issues

hiPSC Culture

Human iPSC culture, differentiation techniques, tips, & issues

Imaging Software & Code

Label-free, cell segmentation, integrated cell modeling, and machine learning techniques, tips, & issues

Education

Cell biology educational resources, use-cases, & tips

More Info

Community Ground Rules & Privacy Statement

allencell.org

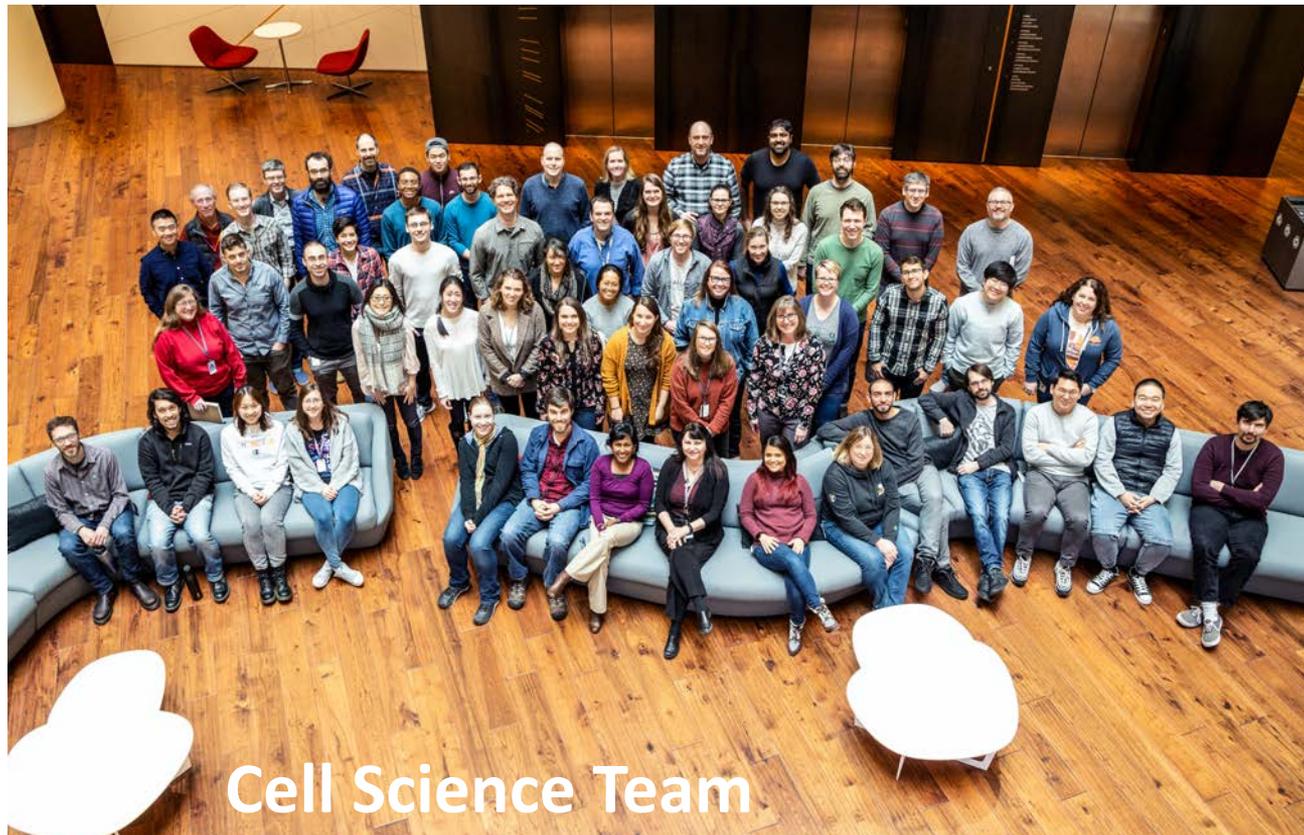
Full website of the Allen Institute for Cell Science including pages for [Gene-editing Methods](#) and [Videos & Tutorials](#)

# Thank you

We wish to thank the Allen Institute for Cell Science founder, Paul G. Allen, for his vision, encouragement, and support.



And a special thanks to our supporting partners at Coriell Institute and Addgene.



Cell Science Team

# THANK YOU

We wish to thank the Allen Institute founder, Paul G. Allen, for his vision, encouragement, and support.



PAUL G. ALLEN  
1953 - 2018