



# BioDynaMo: Current Status and Future Outlook

CERN openlab Technical Workshop  
10.03.2021

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on behalf of the BioDynaMo  
collaboration



# Agent-based Simulation

## A Agents



Cell



Person



Neurite Element

Neuron Soma

Blood or lymphatic vessel segment

## B Behavior



Move



Divide

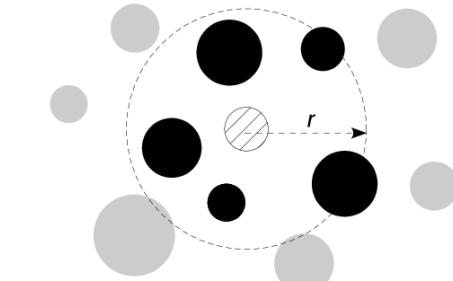


Grow



Substance Secretion

## C Environment



Observed agent

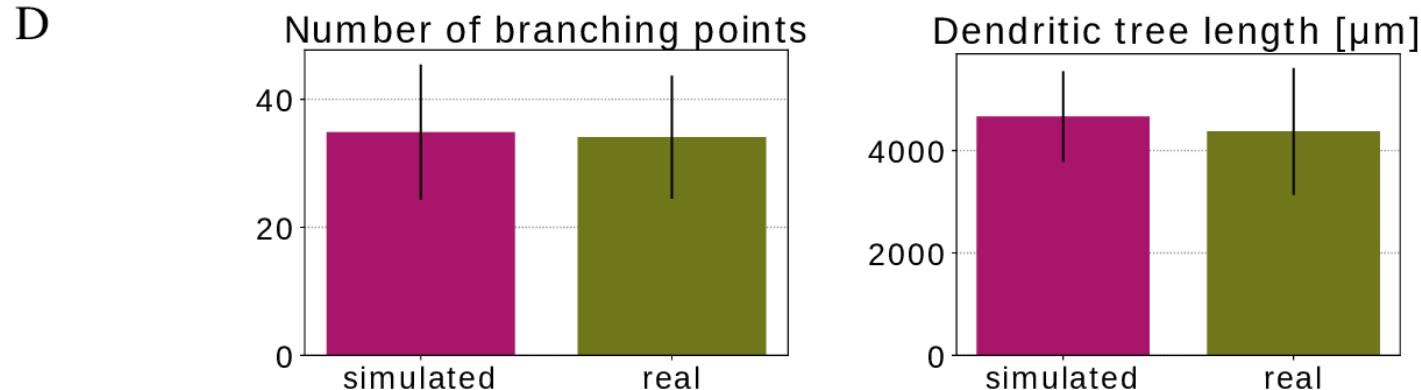
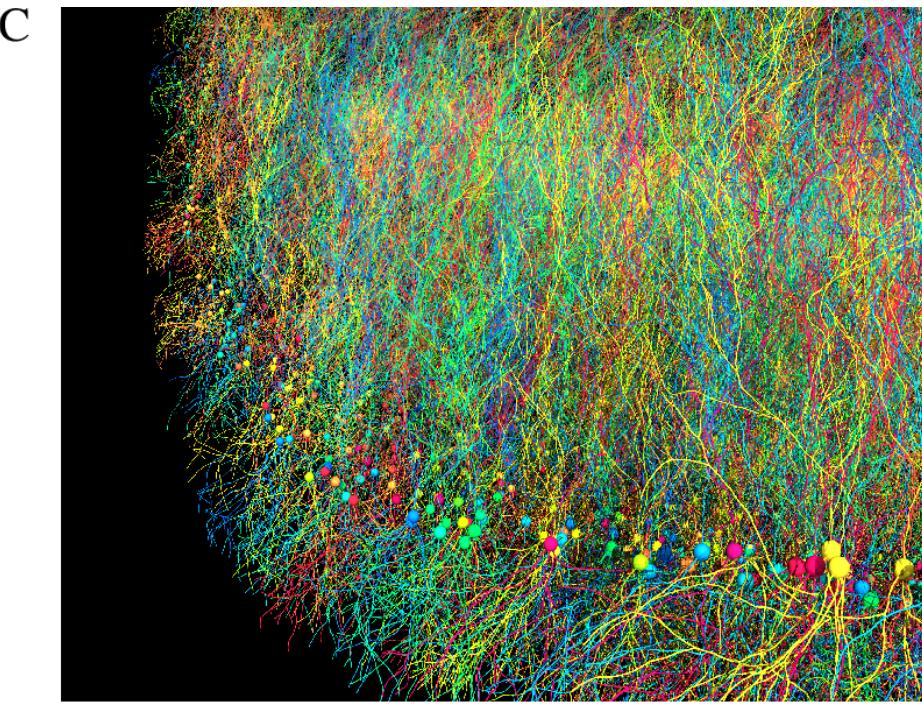
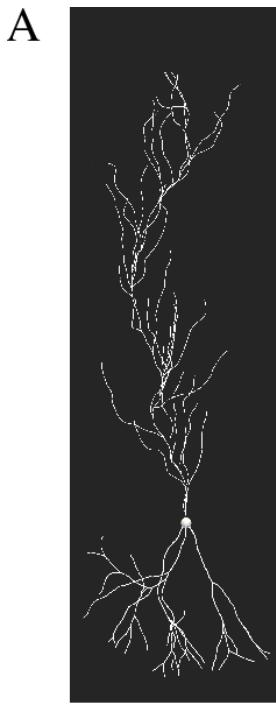
Agents inside environment

Agents outside environment

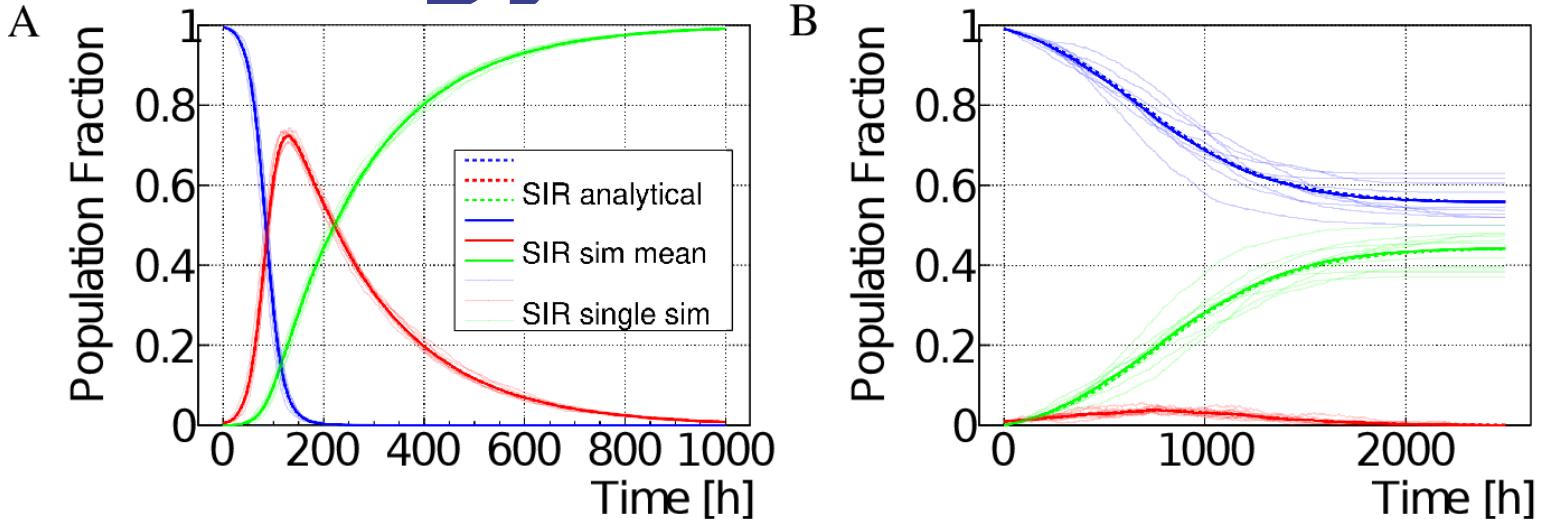
## D Simulation Algorithm

```
// Define initial model  
Place simulation objects in space  
Set their attributes  
Define behavior  
  
// Run simulation  
for each simulation step  
    Update environment  
    for each agent  
        for each agent operation  
            Run agent_operation(agent)  
    for each standalone operation  
        Run standalone_operation()
```

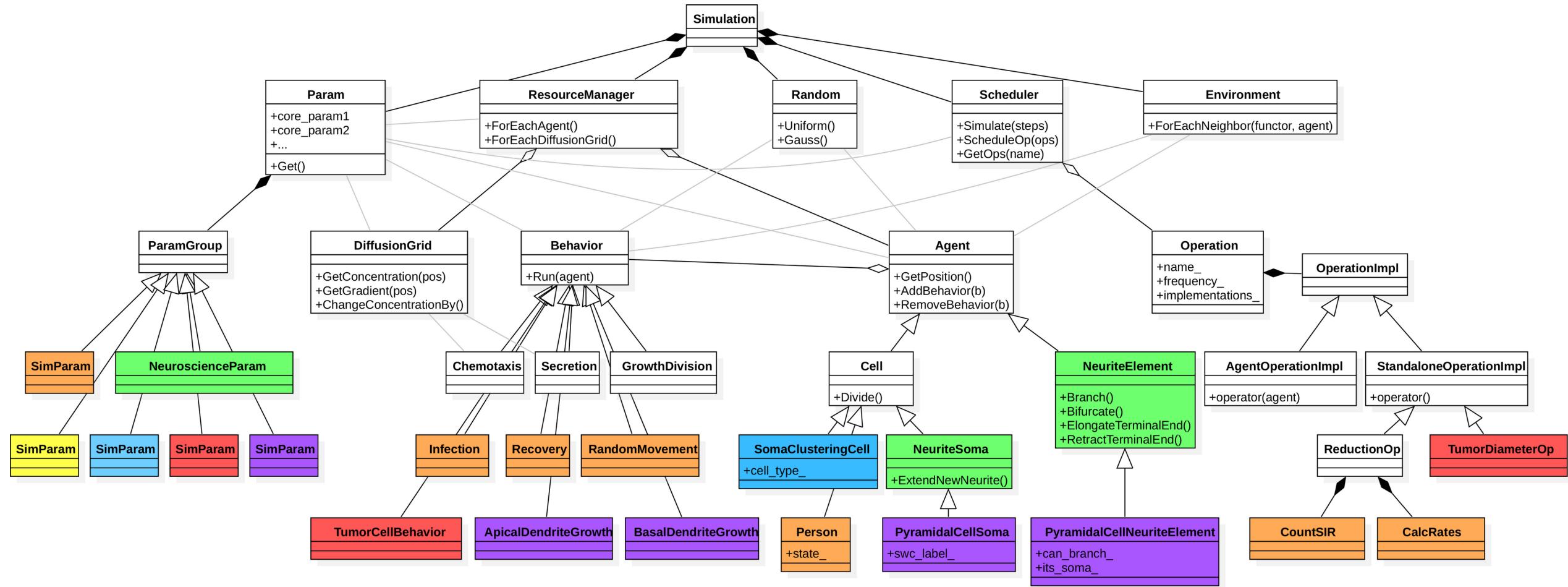
# Neuroscience Use Case



# Epidemiology Use Case

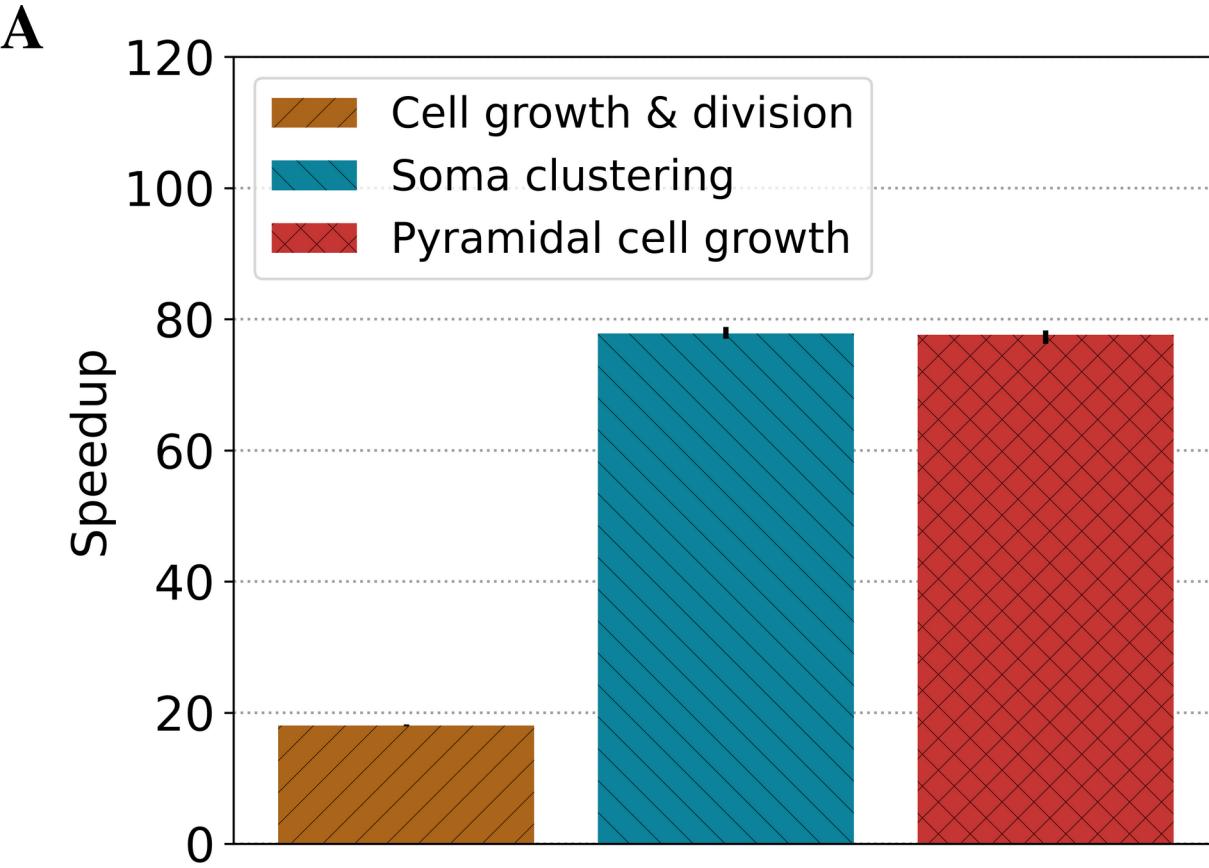


# Modular Software Architecture

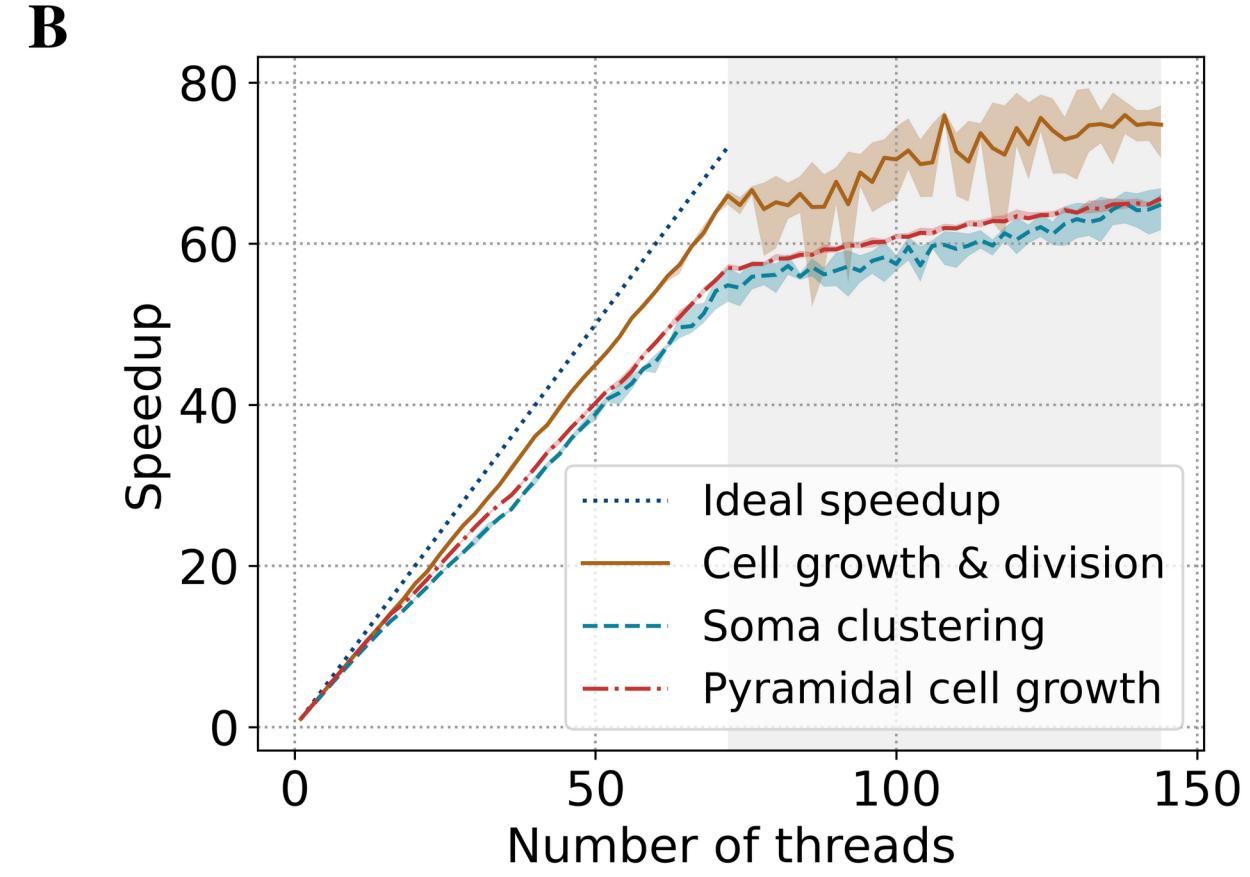


# High-Performance Simulation Engine 1/2

Comparison between BioDynaMo and Cortex3D



Strong scaling analysis of BioDynaMo



# High-Performance Simulation Engine 2/2

Simulation	Agents	Diffusion volumes	Iterations	System (Table 4)	Physical CPUs	Runtime	Memory
Neuroscience use case							
Single (Figure 3A in the main manuscript)	1 494	250	500	A	1	0.16 s	375 MB
				D	1	0.13 s	471 MB
Large-scale (Figure 3C in the main manuscript)	9 041 632	65 536	500	A	72	45 s	6 GB
				D	2	10 min 53 s	5.3 GB
<b>Very-large-scale</b>	<b>1 018 280 997</b>	<b>5 606 442</b>	<b>500</b>	<b>B</b>	<b>72</b>	<b>1 h 37 min</b>	<b>507 GB</b>
Oncology use case (Figure 4 in the main manuscript)							
2000 initial cells	4 169	0	312	A	1	1.24 s	378 MB
				D	1	0.98 s	475 MB
4000 initial cells	5 241	0	312	A	1	2.09 s	380 MB
				D	1	1.62 s	477 MB
8000 initial cells	8 225	0	288	A	1	4.16 s	381 MB
				D	1	3.39 s	477 MB
Large-scale	10 123 903	0	288	A	72	2 min 20 s	9.02 GB
				D	2	53 min 31 s	5.94 MB
<b>Very-large-scale</b>	<b>1 012 302 977</b>	<b>0</b>	<b>288</b>	<b>B</b>	<b>72</b>	<b>6 h 49 min</b>	<b>639 GB</b>
Epidemiology use case (Figure 5C in the main manuscript)							
Measles	2 010	0	1000	A	1	0.59 s	372 MB
Seasonal Influenza	2 020	0	2500	A	1	1.59 s	373 MB
Large-scale (measles)	10 050 000	0	1000	A	72	1 min 25 s	6.02 GB
				D	2	54 min 22 s	3.61 GB
<b>Very-large-scale (measles)</b>	<b>1 005 000 000</b>	<b>0</b>	<b>1000</b>	<b>B</b>	<b>72</b>	<b>3 h 54 min</b>	<b>326 GB</b>

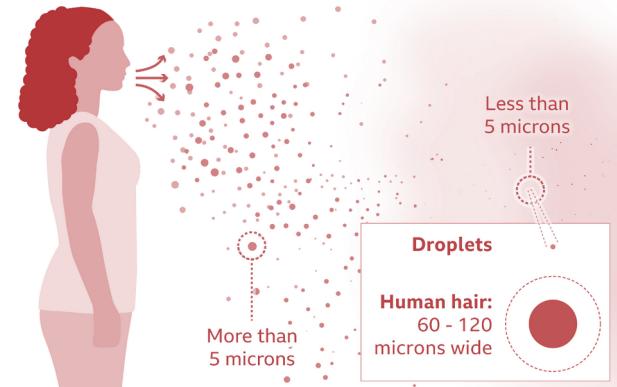
# Ongoing Projects

# Modelling COVID-19 Spreading in Closed Environments

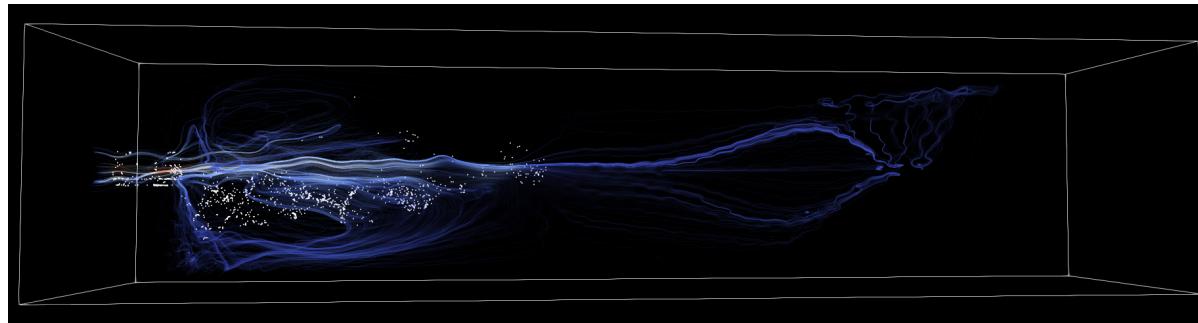
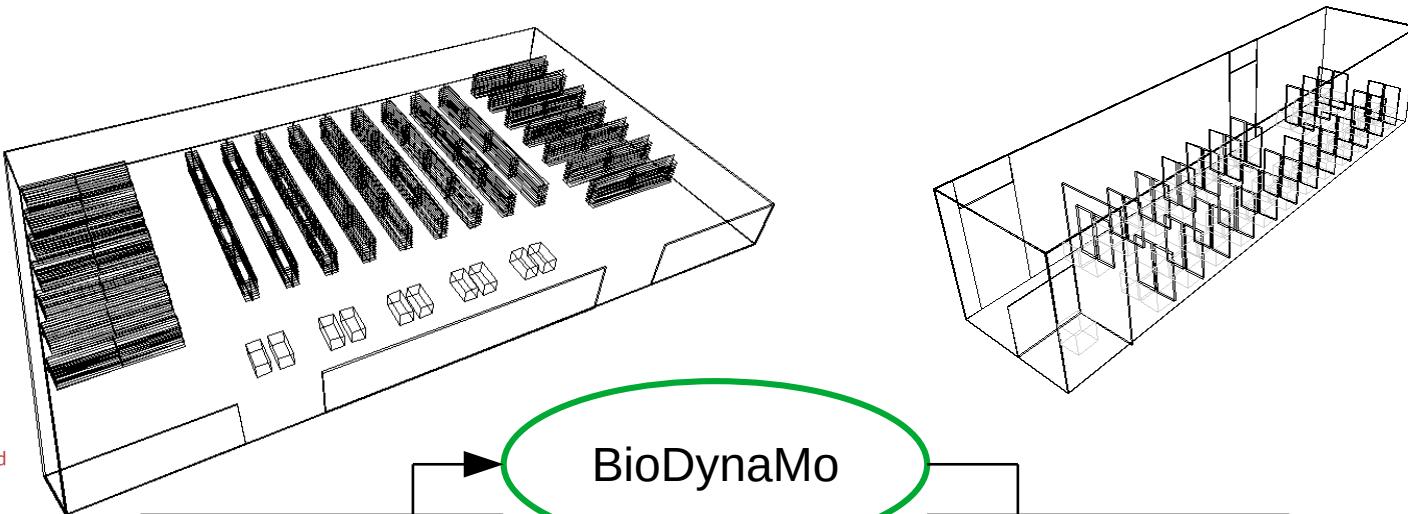
## The difference between droplet and airborne transmission

### Droplet transmission

Coughs and sneezes can spread droplets of saliva and mucus



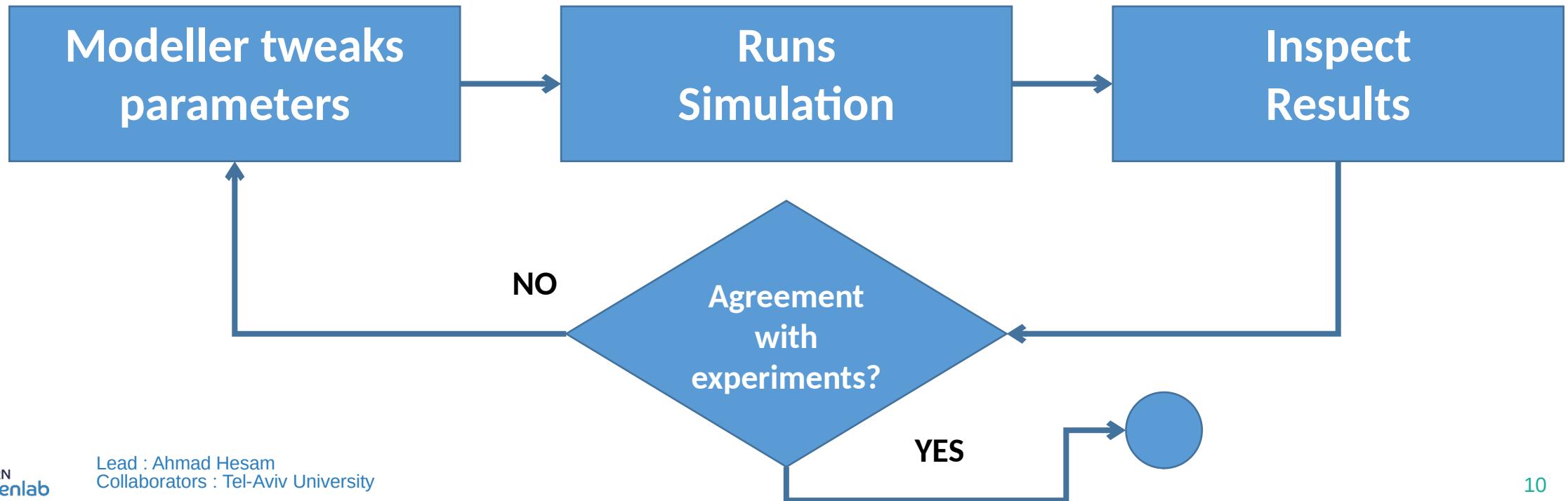
Source : WHO



# Data-Driven Model Optimization

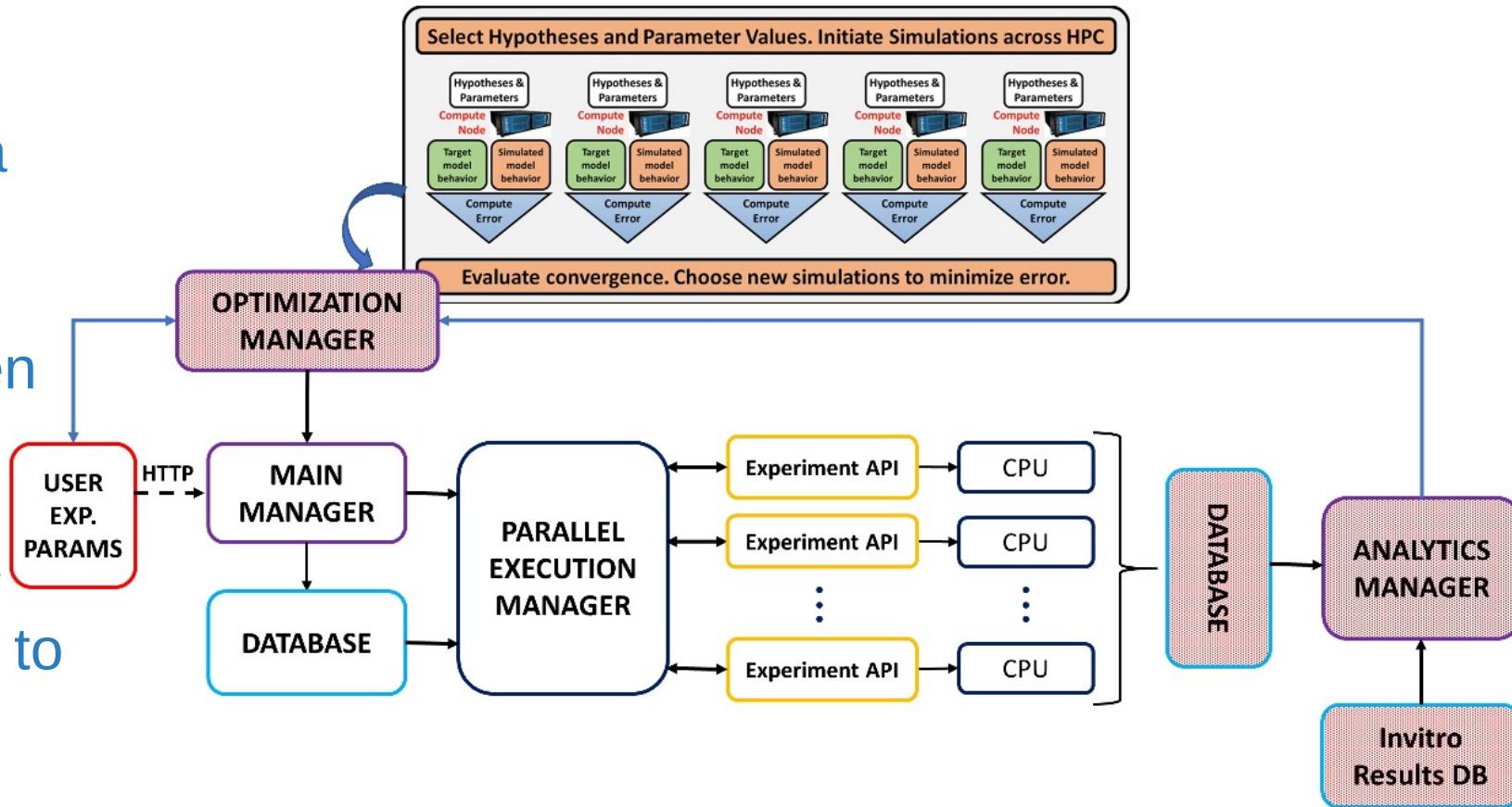
**Common issue:** how to tune model-parameters to match experimental / analytical data?

**Current approach:**



# Data-Driven Model Optimization

- Use experimental data for optimizing model parameters
- Compute error between experimental and simulated data
- Iteratively choose new simulation parameters to minimize error
- Explore parameter space rapidly on HPC cluster



# Further Ongoing Projects Using BioDynaMo

- Distributed runtime to support simulations on multiple servers
- Retinal mosaic development
- Cryopreservation
- Multiscale (organ-to-cell) cancer modelling
- Radiation-induced tissue damage
- Simulations in the socio-economic field

# Summary

BioDynaMo enables scientists to :

- develop models in various computational biology fields in a modular fashion
- obtain results rapidly with the high-performance execution engine
- scale up the model to billions of agents on a single server, and
- produce results that are in agreement with validated experimental data

# Questions?

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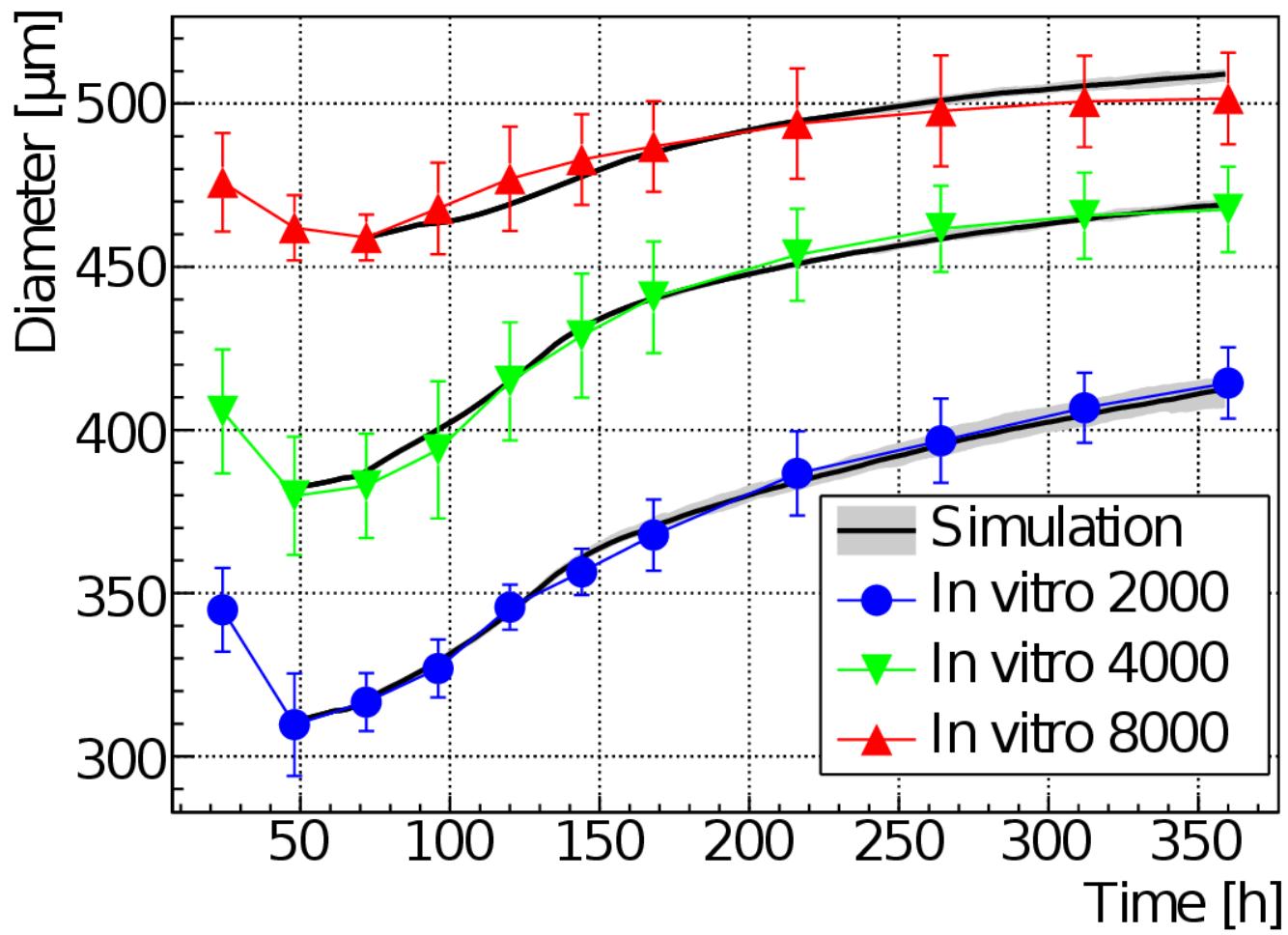
# References

- Lukas Breitwieser, Ahmad Hesam, Jean de Montigny, Vasileios Vavourakis, Alexandros Iosif, Jack Jennings, Marcus Kaiser, Marco Manca, Alberto Di Meglio, Zaid Al-Ars, Fons Rademakers, Onur Mutlu, Roman Bauer  
**BioDynaMo: A General Platform for Scalable Agent-based Simulation**  
<https://arxiv.org/abs/2006.06775>, 5 February 2021.
- Project Website  
<https://biodynamo.org/>
- Source Code  
<https://github.com/BioDynaMo/biodynamo>
- Single-pyramidal cell simulation:  
<https://www.youtube.com/watch?v=taWMFs5D5Pg>
- Large-scale pyramidal cell simulation :  
<https://www.youtube.com/watch?v=MA74wZbhO7w>
- Tumor spheroid simulation :  
<https://www.youtube.com/watch?v=Q9UkpLuLnkU>

# Appendix

# Oncology Use Case

A



B

