Segmentation and Tracking of Organoids in Brightfield Microscopy Image Data

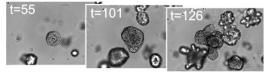


Lucia Hradecká Dupkaničová | Advisor: Martin Maška Faculty of Informatics, Masaryk University, Brno, Czech Republic

MOTIVATION

• Organoids are in vitro cultures that mimic living tissues and their dynamics, allowing studies of physiological processes in a controlled environment under various conditions. They are observed using optical microscopy that produces high-resolution time-lapse sequences. Their automated processing requires reliable and robust algorithms that are currently lacking in the field, thus having biologists to rely on manual processing of the acquired image data.

• **Common challenges** for automated processing of highresolution organoid images include the presence of spurious objects, collisions, occlusions, and abrupt changes of the organoid location and texture due to manual interventions taken during long-term imaging.

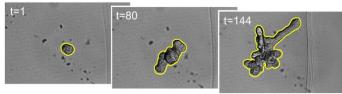


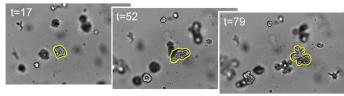
AIMS OF THE THESIS

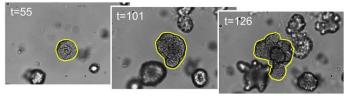
 To develop a reliable method for automated segmentation and tracking of organoids in highresolution brightfield microscopy sequences

• To **validate the performance** of the method over a heterogeneous dataset of mammary epithelial organoids of five different phenotypes

• To deploy the method in an easy-to-use form

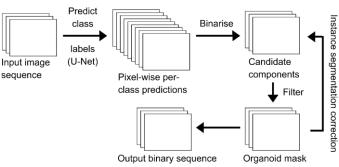






METHODOLOGY

- A family of deep-learning-based algorithms
 - Convolutional neural network (U-Net architecture)
 - Tuneable prediction binarisation
 - Adaptive morphological and component filtering
 - A novel segmentation correction procedure



DET 1	SEG T	HD ⁹⁵ ↓	тім↓
Baseline	Baseline	Baseline	Baseline
Real + PP-1	Real + PP-1	Real + PP-1	Real + PP-1
Synth-1 + PP-1	Synth-1 + PP-1	Synth-1 + PP-1	Synth-1 + PP-1
Synth-2 + PP-1	Synth-2 + PP-1	Synth-2 + PP-1	Synth-2 + PP-1
Synth-3 + PP-1	Synth-3 + PP-1	Synth-3 + PE-1	Synth-3 + PP-1
Synth-4 + PP-1	Synth-4 + PP-1	Synth-4 + PP-1	Synth-4 + PP-1
Synth-5 + PP-1	Synth-5 + PP-1	Synth-5 + PP-1	Synth-5 + PP-1
Synth-4 + PP-2	Synth-4 + PP-2	Synth-4 + PP-2	Synth-4 + PP-2
Synth-2 + PP-3 A	Synth-2 + PP-3 A	Synth-2 + PP-3 A	Synth-2 + PP-3 A
Synth-4 + PP-3 A	Synth-4 + PP-3 A	Synth-4 + PP-3 A	Synth-4 + PP-3 A
Synth-5 + PP-3 A	Synth-5 + PP-3 A	Synth-5 + PP-3 A	Synth-5 + PP-3 A
Synth-2 + PP-3 F	Synth-2 + PP-3 F	Synth-2 + PP-3 F	Synth-2 + PP-3 F
Synth-4 + PP-3 F	Synth-4 + PP-3 F	Synth-4 + PP-3 F	Synth-4 + PP-3 F
Synth-5 + PP-3 F	Synth-5 + PP-3 F	Synth-5 + PP-3 F	Synth-5 + PP-3 F
Synth-5 + PP-4	Synth-5 + PP-4	Synth-5 + PP-4	Synth-5 + PP-4
Synth-5 + PP-5	Synth-5 + PP-5	Synth-5 + PP-5	Synth-5 + PP-5
Synth-5 + PP-0	Synth-5 + PP-0	Synth-5 + PP-0	Synth-5 + PP-0

RESULTS

• Algorithm development: real and computer-generated sequences of three distinct organoid phenotypes

- Six semantic segmentation models (Real, Synth-X)
- Five postprocessing routines (PP-X)

• Algorithm validation: real sequences of two additional organoid phenotypes with considerably different shape, size, and texture characteristics

• **Performance criteria**: single-organoid tracking accuracy (DET), segmentation accuracy (SEG), boundary localisation error (HD⁹⁵), and execution time (TIM)

- Recommended four reliable and robust algorithms
- An easy-to-use application with a practical guide
- One of the algorithms presented also in **a manuscript** that is under review for publication **in a top-tier journal**

CONTRIBUTION HIGHLIGHTS

• A group of **well-performing and robust algorithms** for segmentation and tracking of organoids was developed

• Their performance and robustness were **validated** using diverse image data with respect to different criteria

• Implementation of the developed methods is available for use in practise (https://is.muni.cz/th/hpuxk/)

• First co-authorship of a journal article presenting one of the recommended algorithms (<u>https://cbia.fi.muni</u> .cz/research/spatiotemporal/organoids.html)