

Project 32-L: Development of Cabinet-Based X-Ray Computed Tomography Methods for Studies of Microstructures and Defects in Metals

***Fall 2019 Semi-Annual Meeting
Colorado School of Mines, Golden, CO
October 9 - 11, 2019***

Student: C. Gus Becker (Mines)

Faculty: Amy Clarke (Mines)

Industrial Mentors: Michelle Espy (LANL, E-6: Non-Destructive Testing)



**Center Proprietary – Terms of CANFSA
Membership Agreement Apply**

Project 32-L: Development of Cabinet-Based X-Ray Computed Tomography Methods for Studies of Microstructures and Defects in Metals



- Student: C. Gus Becker (Mines)
- Advisor(s): Amy Clarke (Mines)

Project Duration
PhD: August 2017 to May 2021

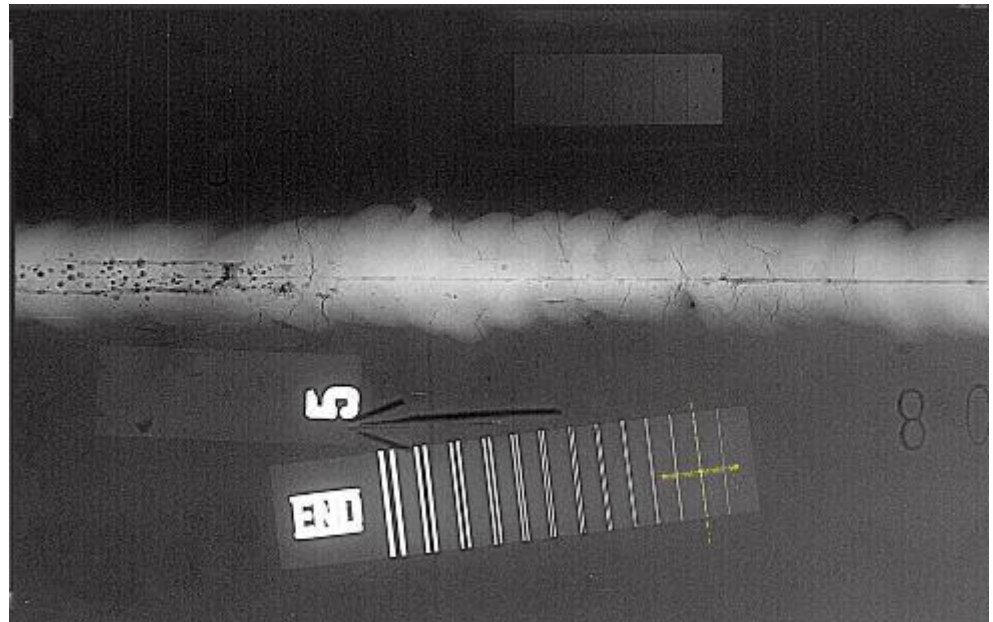
- **Problem:** Industrial processes of metals such as casting and additive manufacturing can benefit from static/dynamic radiography, but user facilities have technique and access limitations.
- **Objective:** Analyze existing radiography data and establish cabinet-based x-ray radiography capabilities at Mines for further experimentation.
- **Benefit:** Identify technique limitations for defect detection in AM metals and studies of solidification.

- Recent Progress**
- Sharpened Python skills for more advanced and efficient image processing
 - Processing of Dynamic Transmission Electron Microscopy (DTEM) data
 - Continue to support other projects by building ImageJ macros (AM simulator)

| Metrics | | |
|---|------------|--------|
| Description | % Complete | Status |
| 1. Development of modular image processing method using ImageJ macros | 100% | ● |
| 2. Investigation of Python as alternative image processing platform | 100% | ● |
| 3. Image processing and analysis of datasets from E-6, APS, and pRad | 80% | ● |
| 4. Begin processing electron radiography (eRad) data and compare to micro-focus data | 0% | ● |
| 5. Material investigation with micro-focus XCT (AM lattice experiments, solidification, etc.) | 0% | ● |

Industrial Relevance

- Identify defects in additively manufactured (AM) builds by non-destructive imaging
 - Qualification and certification
 - Technique limitations
- Weld inspection
 - Safe and stable welds
 - Failure points, inclusions, porosity



<http://solutionsinimaging.com/industrial-applications/weld-inspection/>

Industrial Relevance



- In-situ x-ray imaging of dynamic materials processes (e.g. casting) to inform model development
- Establishment of x-ray radiography and computed tomography (CT) cabinet at Mines
 - Characterization of materials for thesis
 - Support current projects
 - Consideration of future projects from industry
 - Accommodates custom/flexible experimental platforms (solidification: casting, welding, AM, etc.; deformation: tension, compression, etc.)

Cabinet Timeline



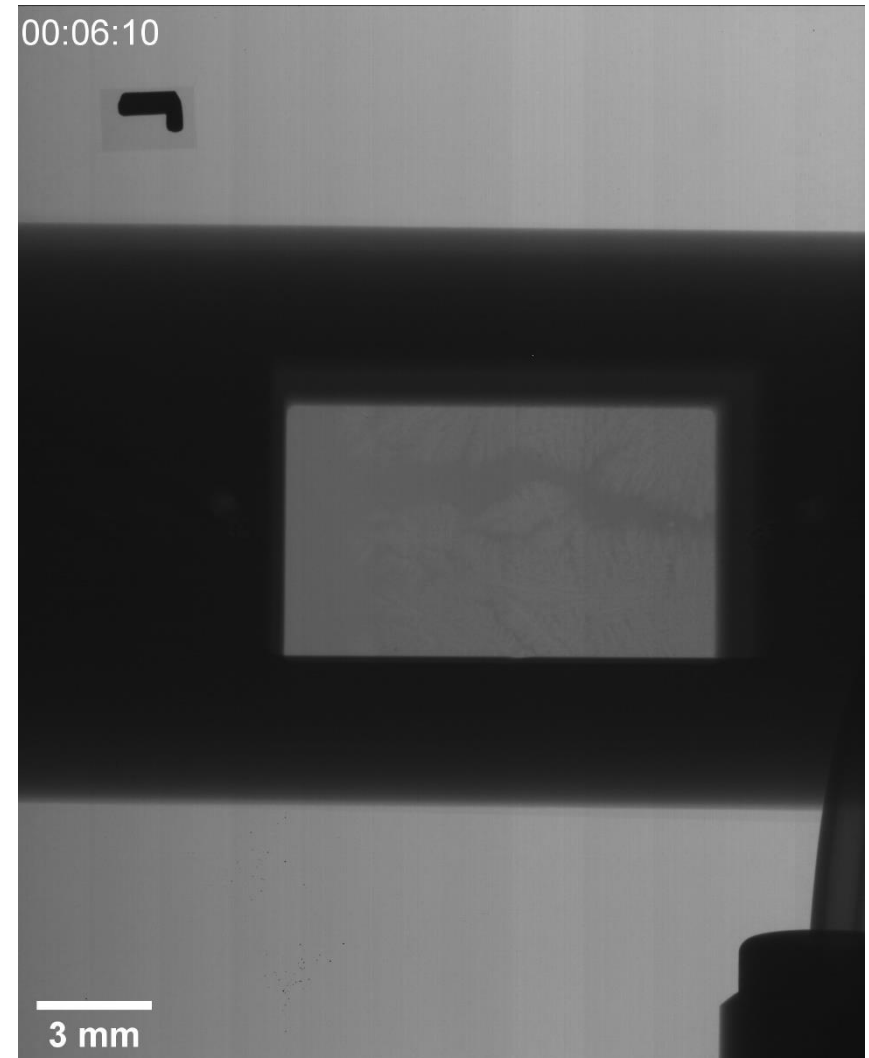
| Process Donation Internally (LANL) | Ship to White Rock, NM | Ship to Santa Clara, CA for Refurbishing | Prepare Lab Space for System | Install New Micro-Focus System | Ship to Mines and Install |
|------------------------------------|------------------------|--|------------------------------|--------------------------------|---------------------------|
| Complete | Complete | Complete | In Progress | In Progress | TBD |

Cabinet Timeline



Dynamic X-Ray Radiography

- High-energy micro-focus radiography
- APS setup
 - 15 mm steel bar
 - 7 x 12 mm window
- Al-30wt.%Ag
- Controlled directional solidification
- Through image processing:
 - Solidification velocity
 - Solute segregation

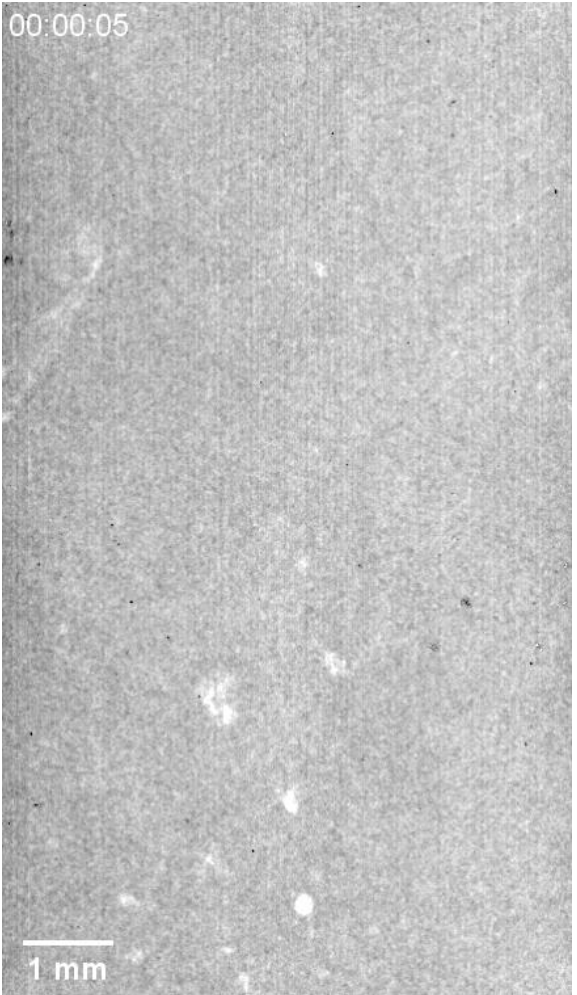
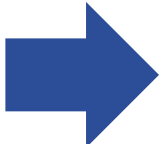
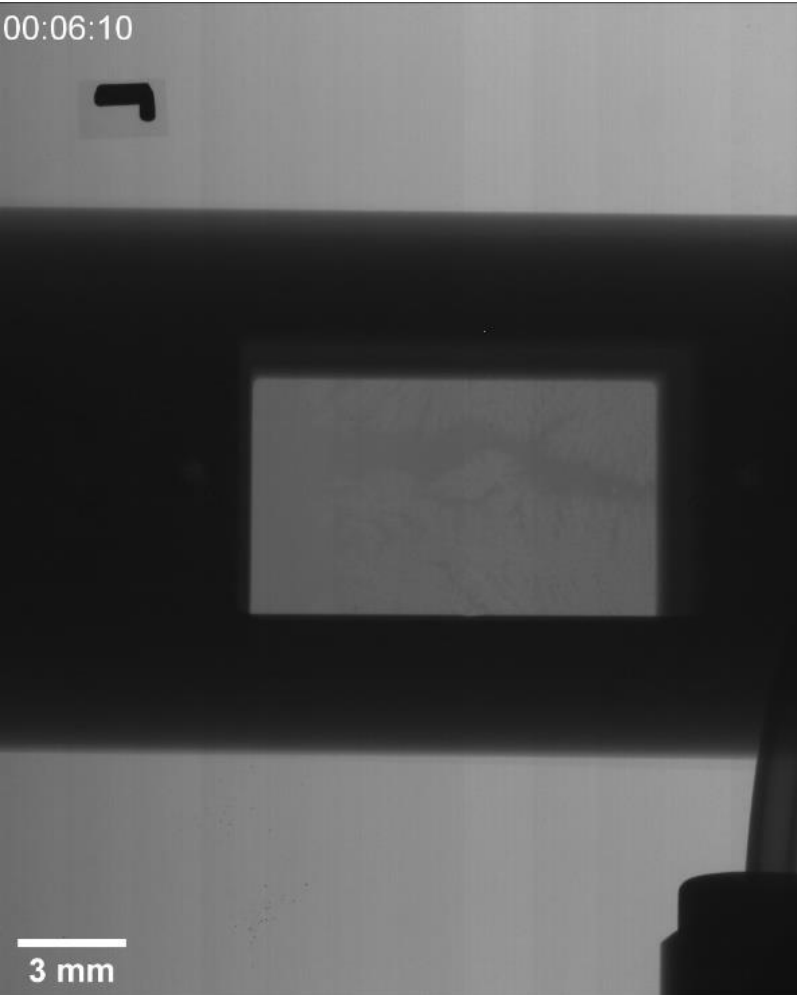


Modular Image Processing Method



- Split image processing routine into separate “modules”
- Each module takes an image directory, performs an image processing step, and outputs the edited images
- Chain modules together by using output images from one as the input images for another
- Creates ordered file hierarchy with each module

Modular Image Processing Method



Switch to Python Image Processing with scikit-image

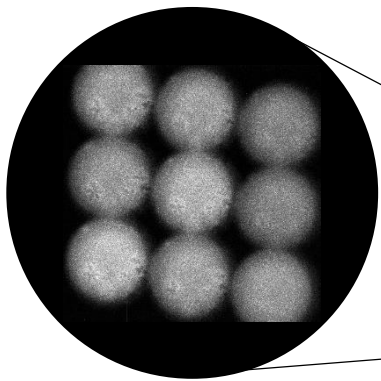
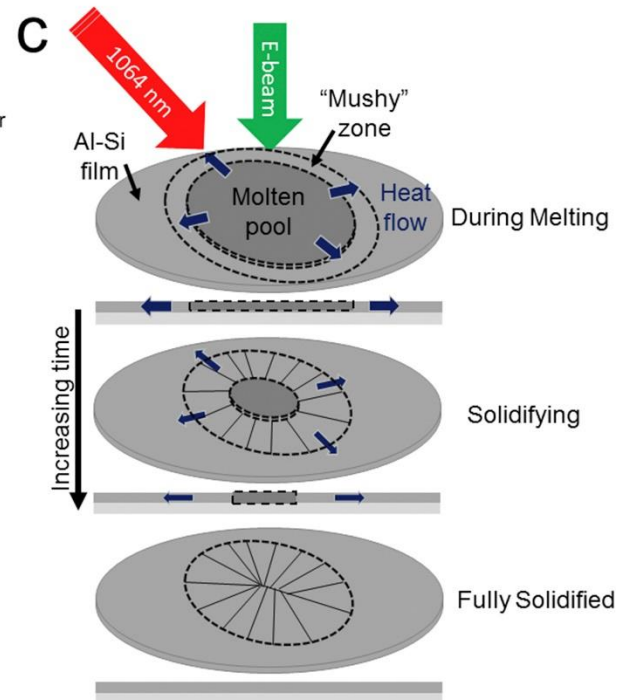
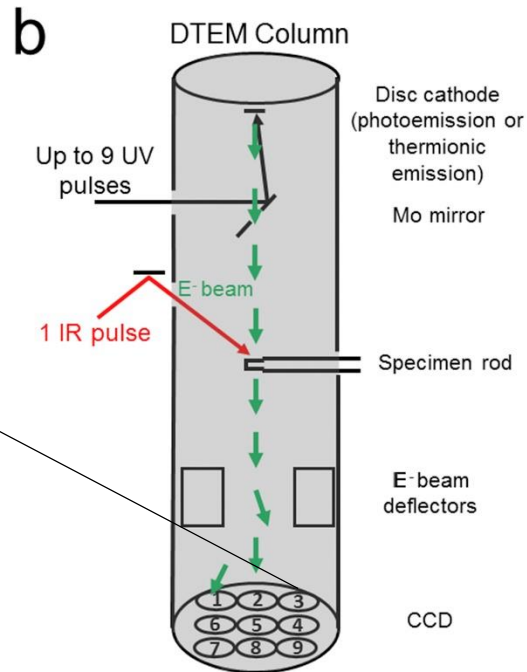
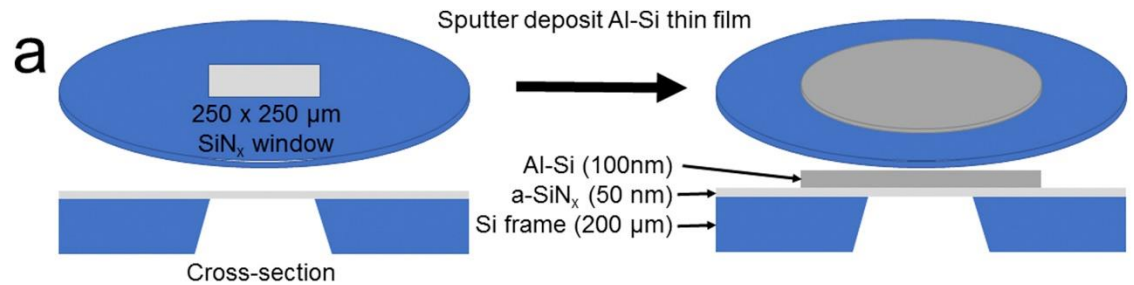


- Why Python?
 - Control
 - Flexibility
 - Ease of use
 - Community



scikit-image
image processing in python

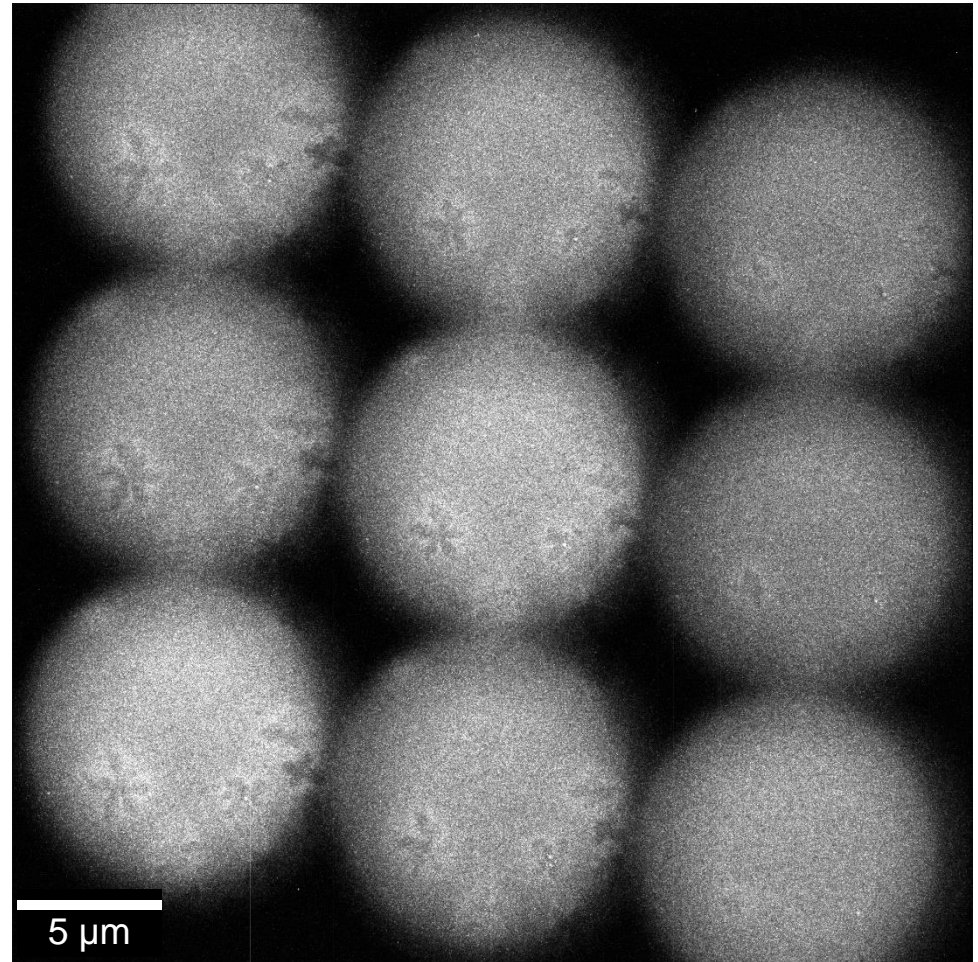
Dynamic Transmission Electron Microscope (DTEM)

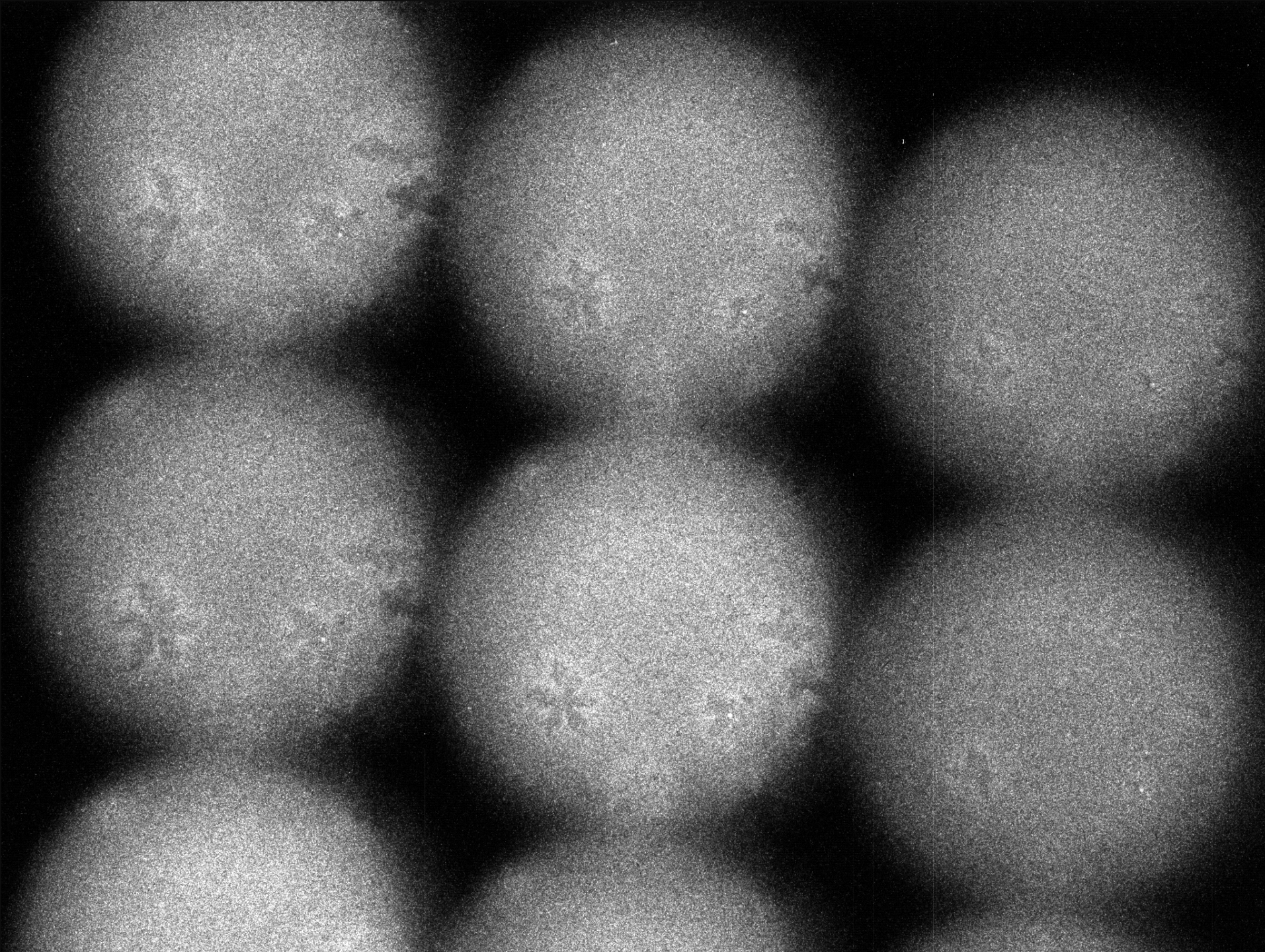


Roehling J, Coughlin D, Gibbs J, Baldwin J, Mertens J, et. al. Acta Mater. 2017.

Dynamic Transmission Electron Microscope (DTEM)

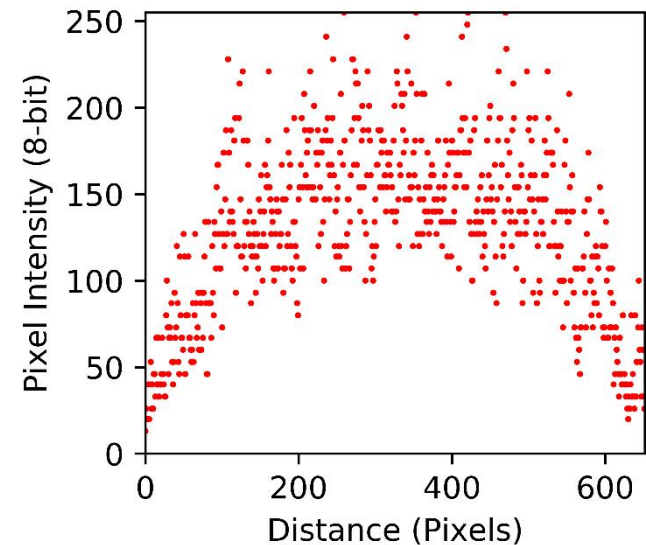
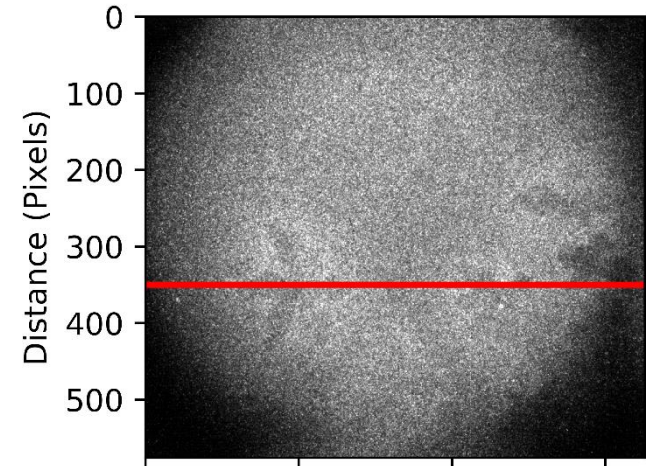
- LLNL
- Al-45wt.%Ge
- 10 μ s intervals
- Through image processing:
 - Image denoising
 - Region separation
 - Animation



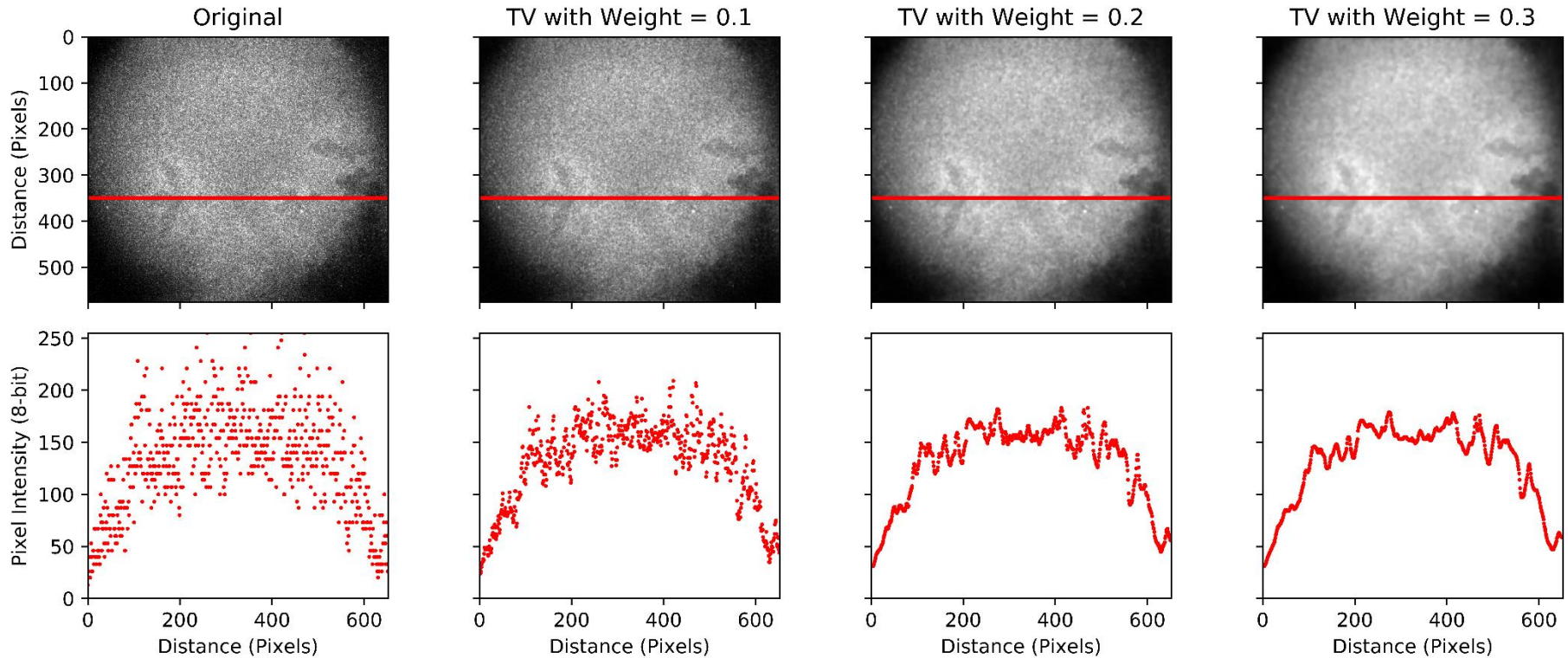


Noise Reduction in DTEM Images

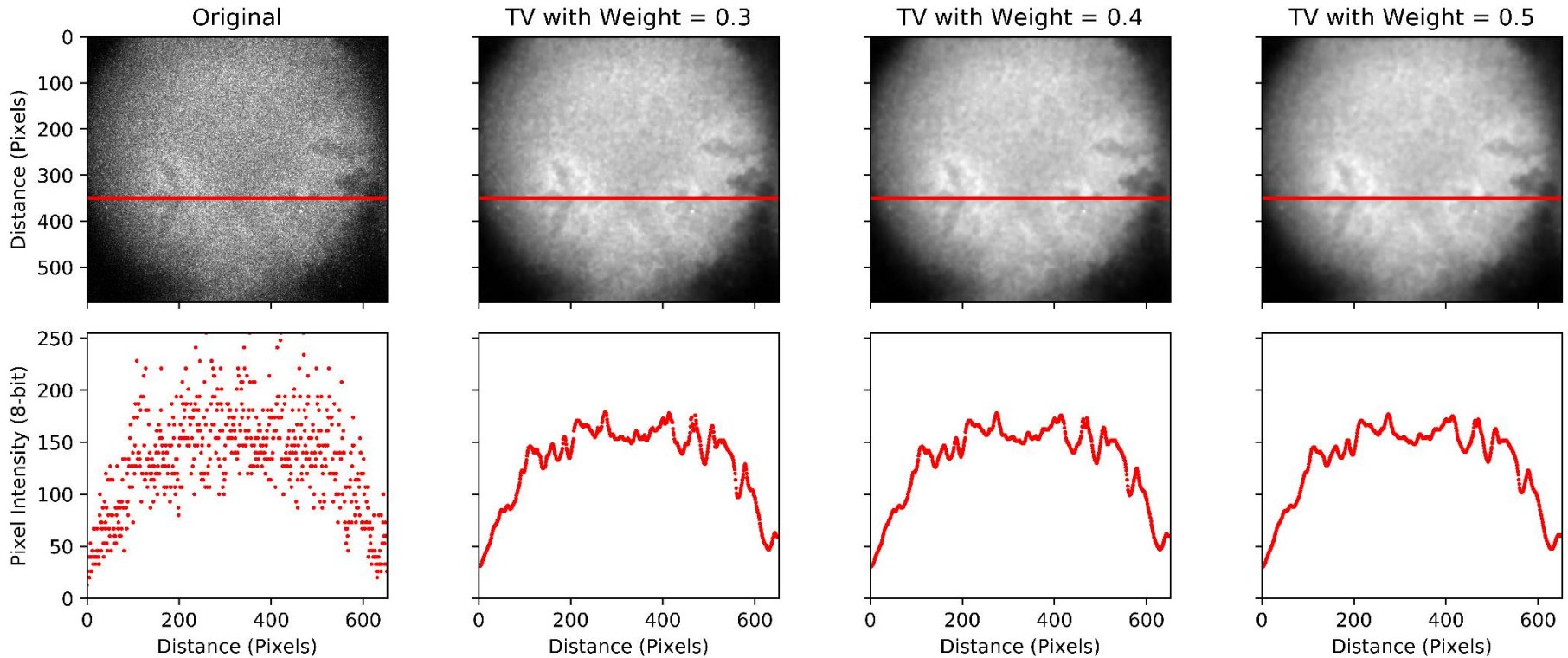
- Total variation (TV) denoising
- Edge preserving
- TV Chambolle algorithm from scikit-image

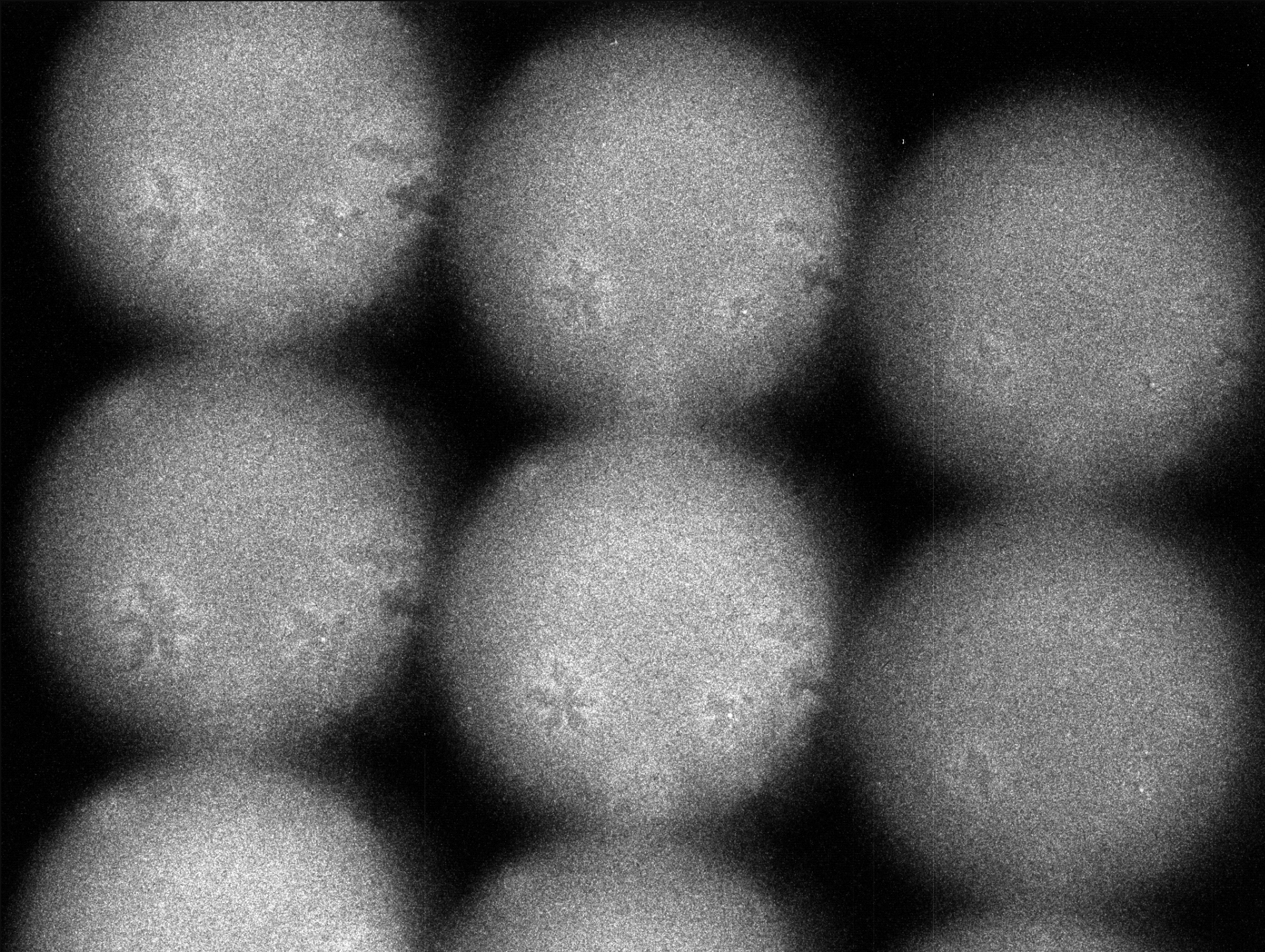


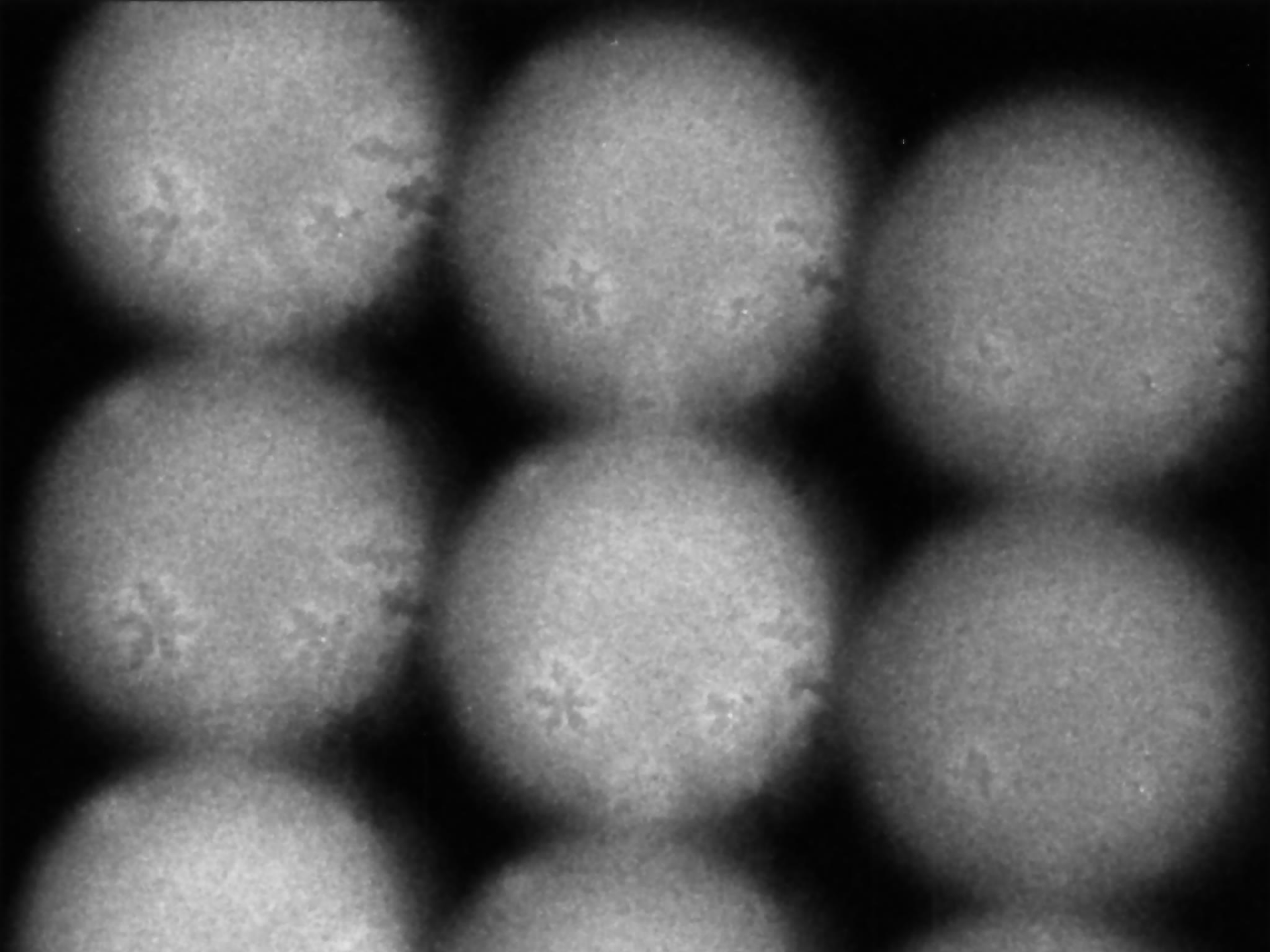
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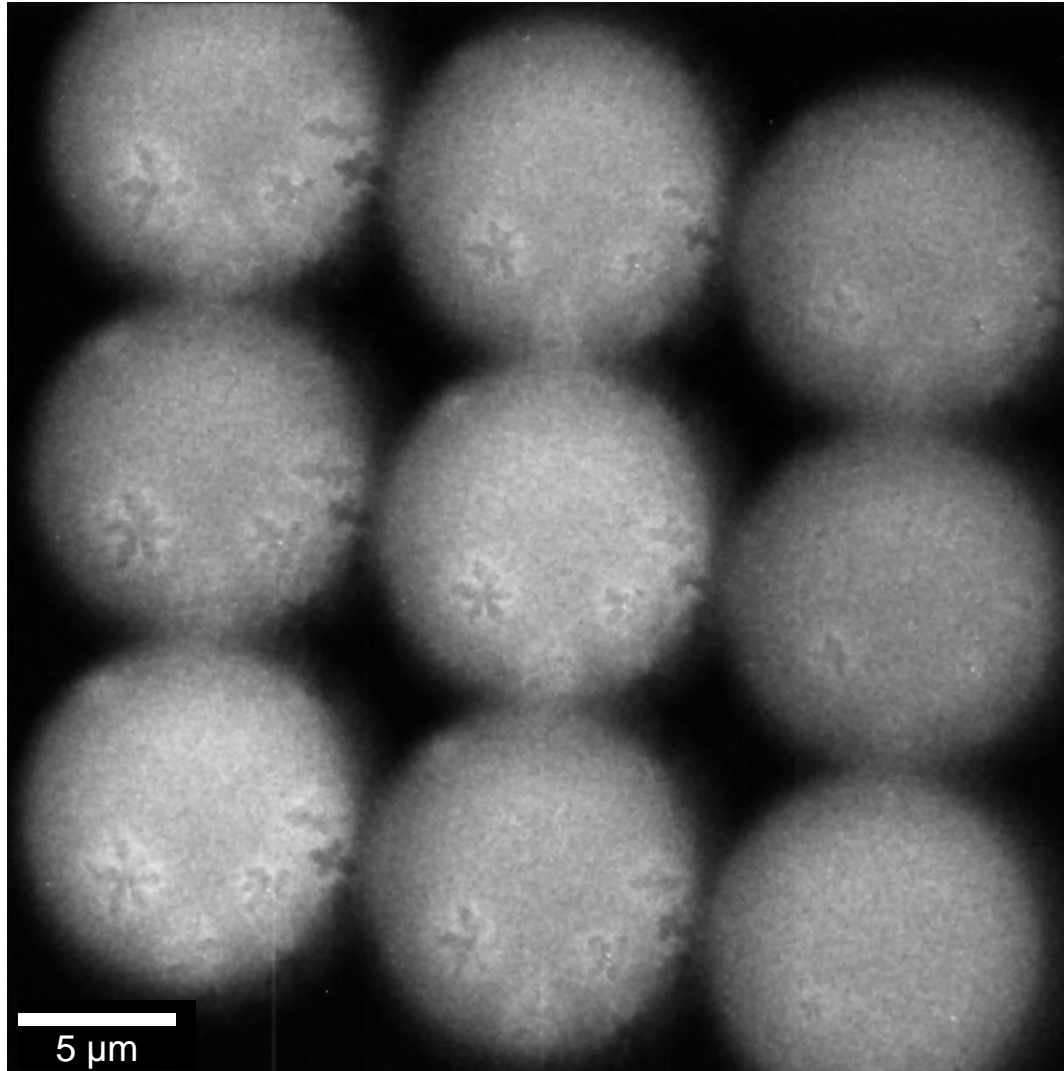
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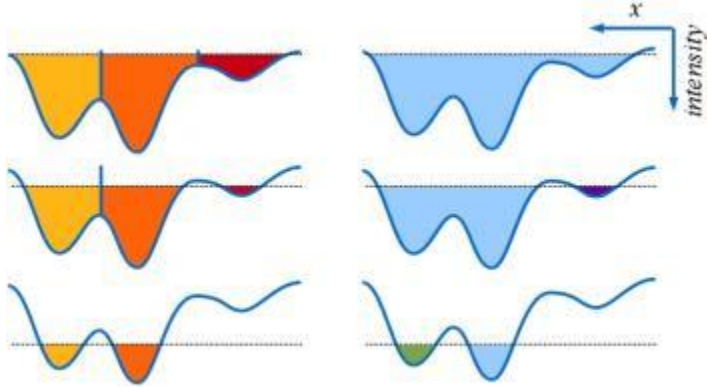
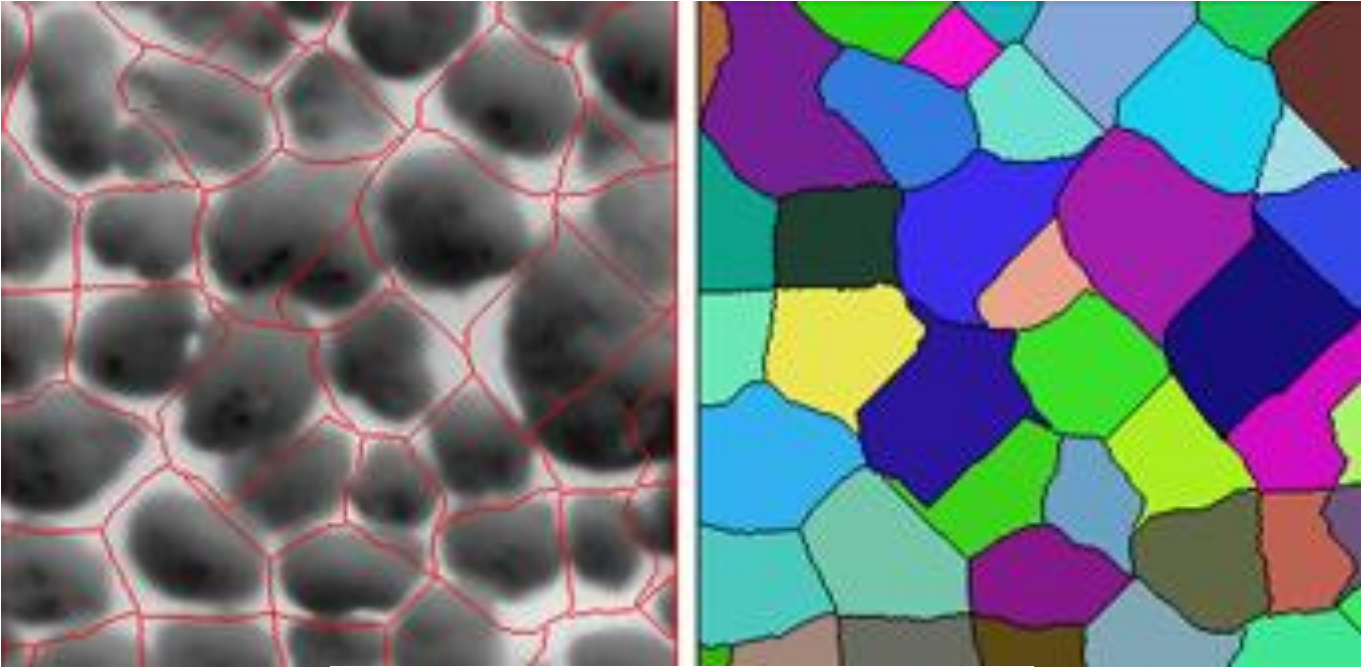




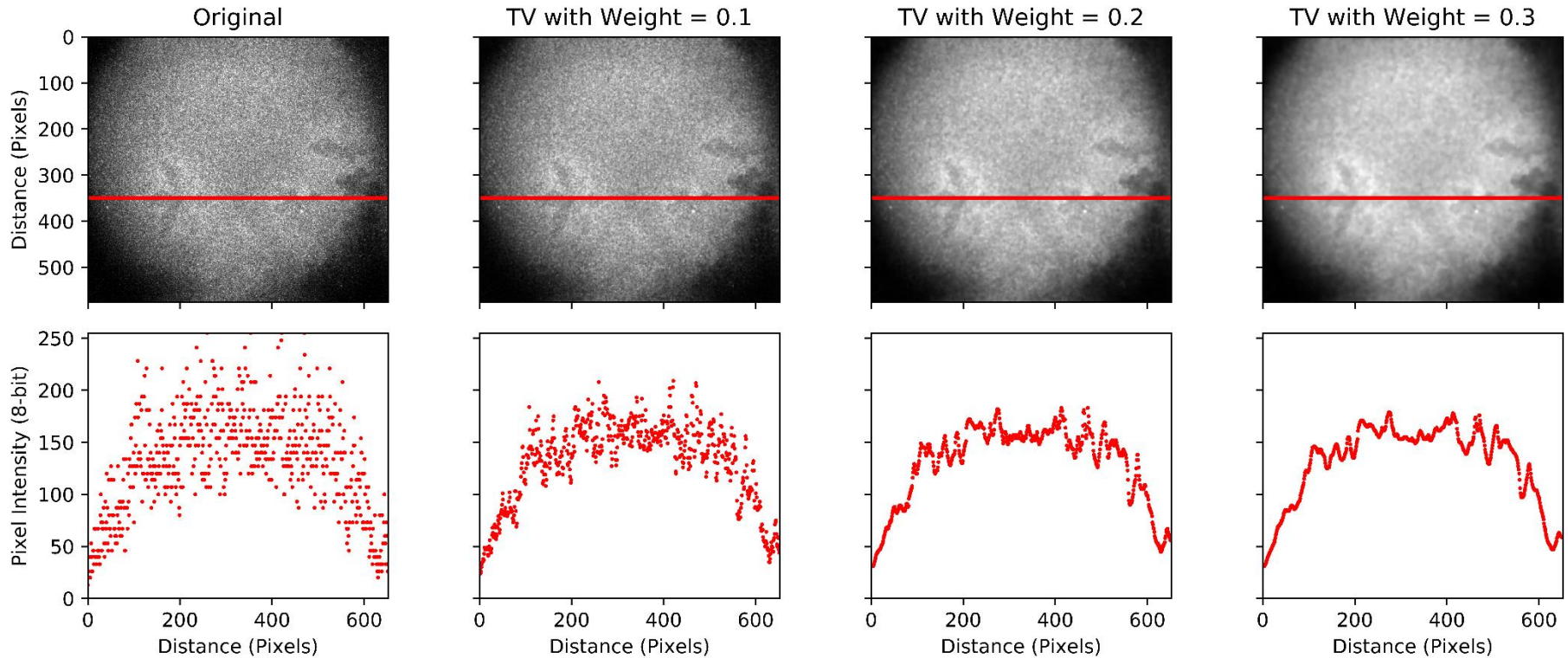
Separating Frames in DTEM Images



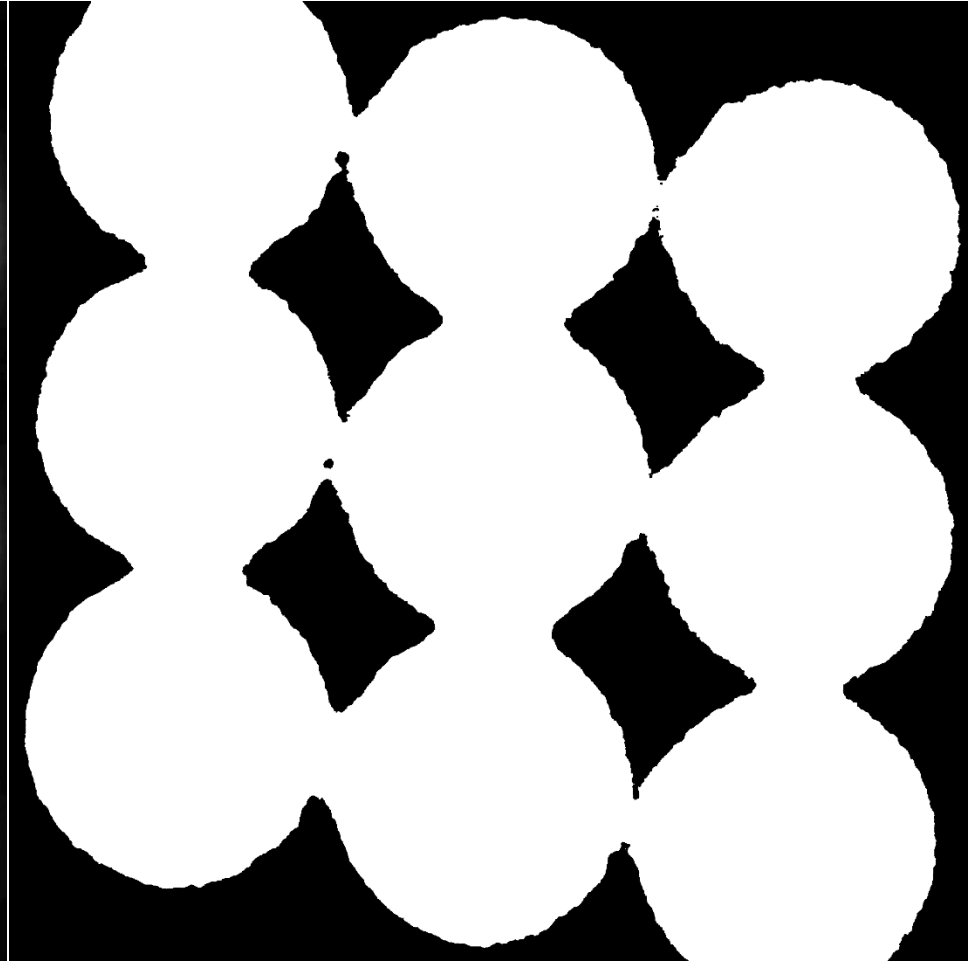
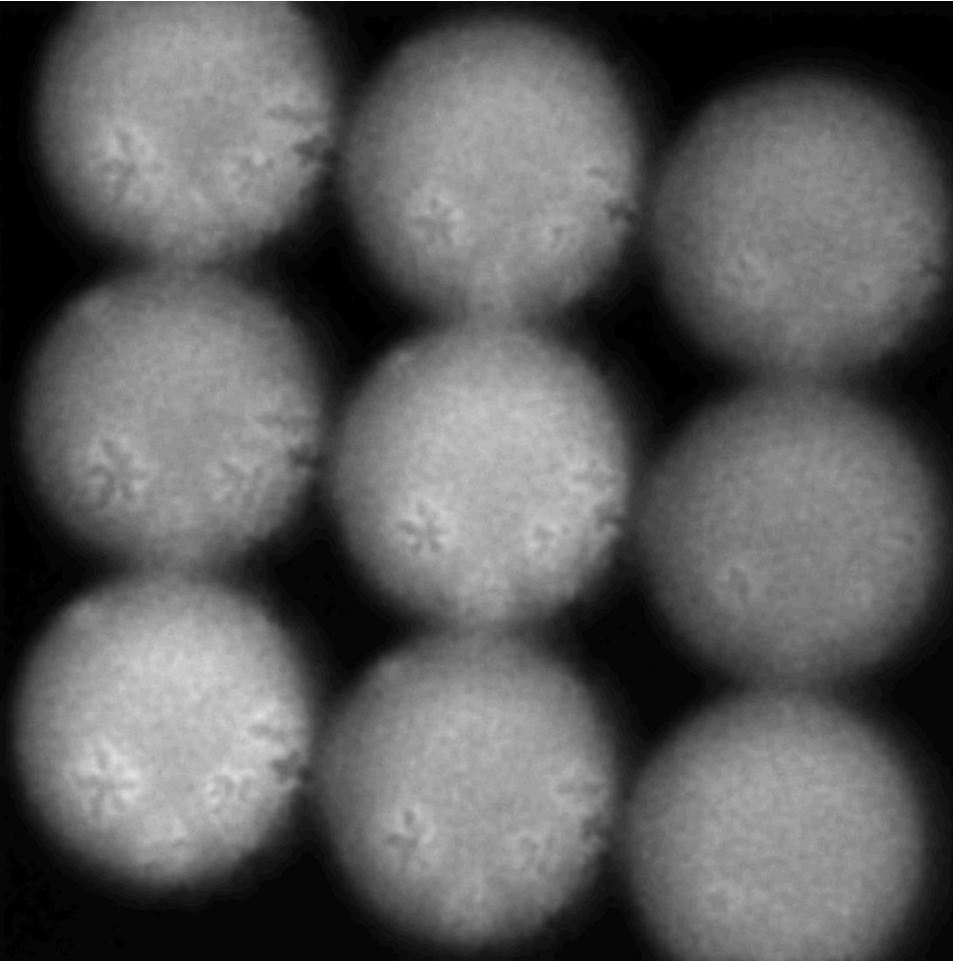
Watershed Segmentation



Noise Reduction in DTEM Images

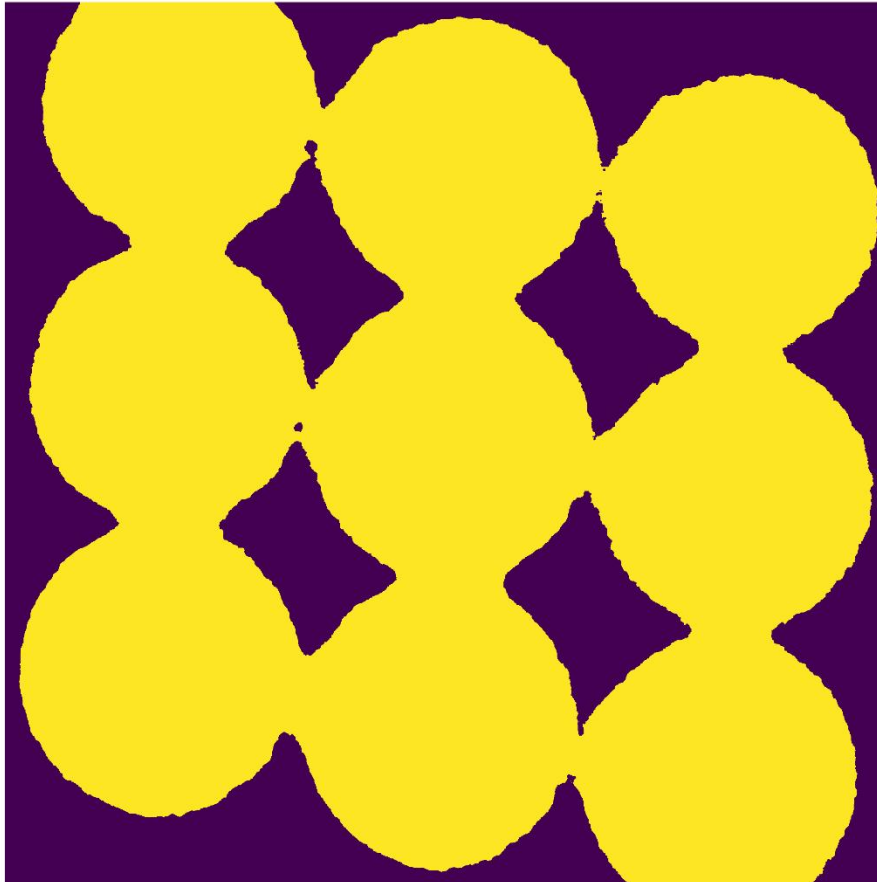


Binary Mask

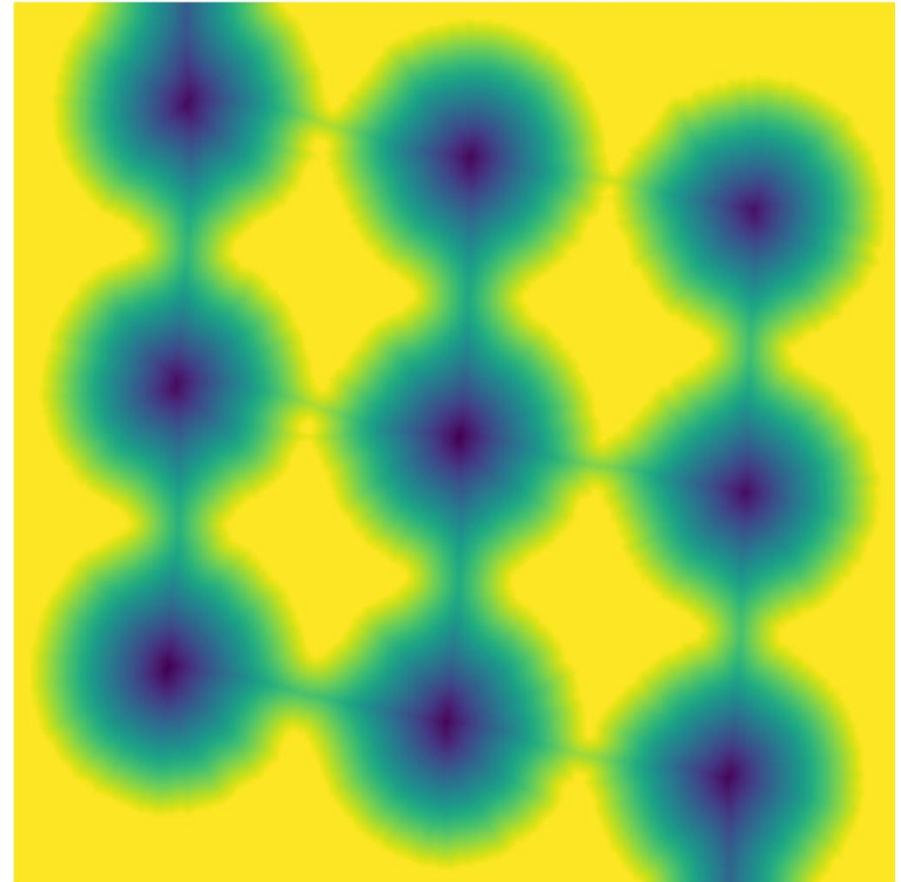


Watershed Segmentation

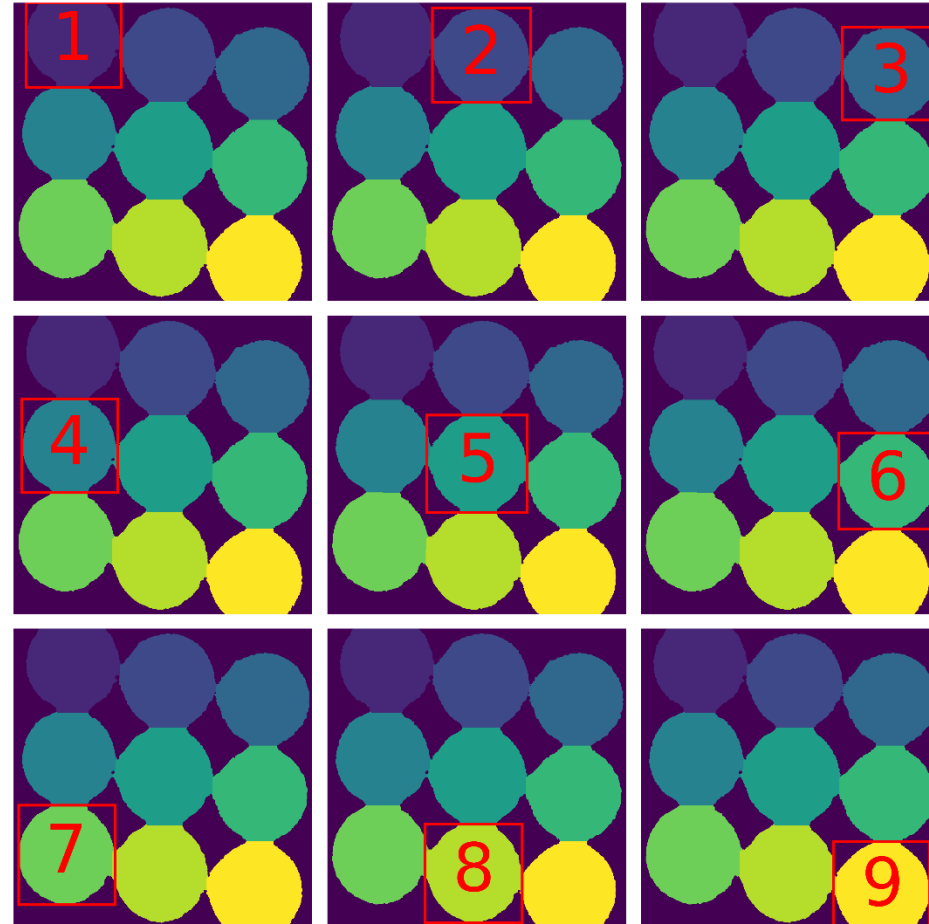
Image Binary



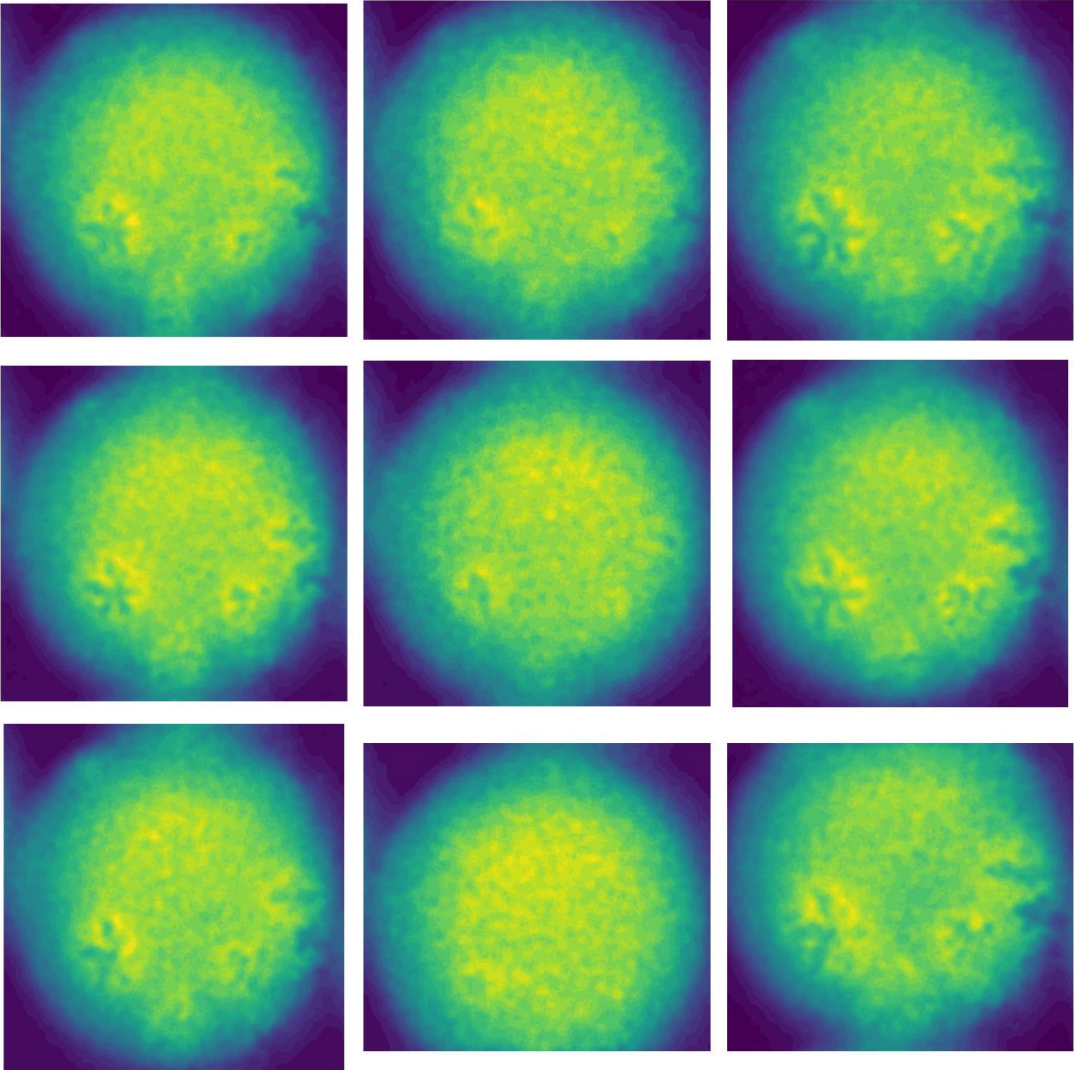
Distance to Edge



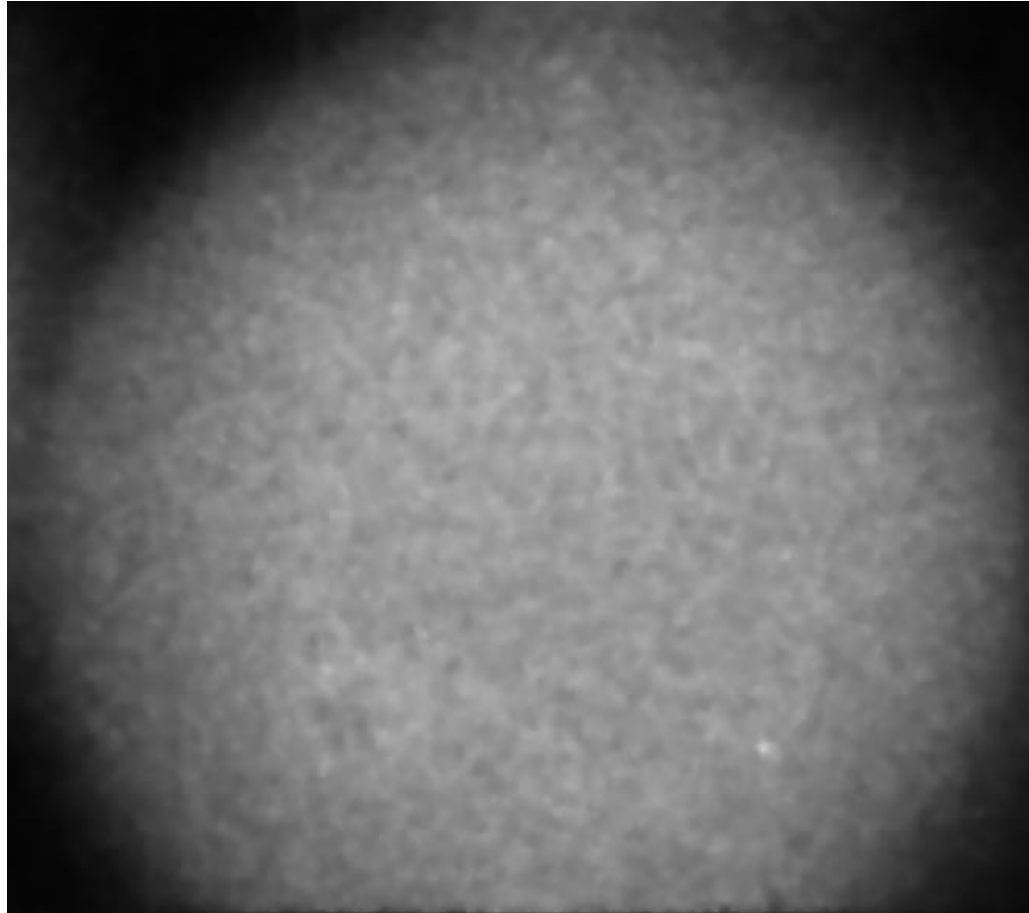
Watershed Transformation



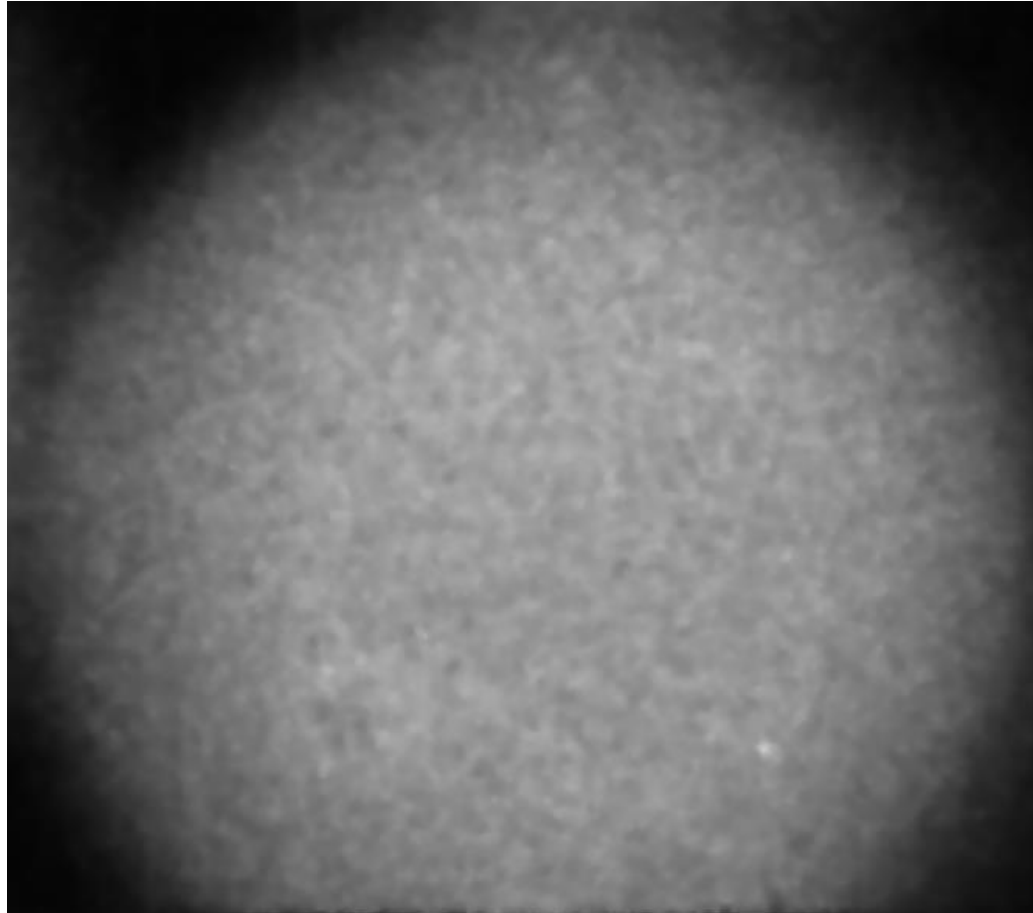
Cropping Regions



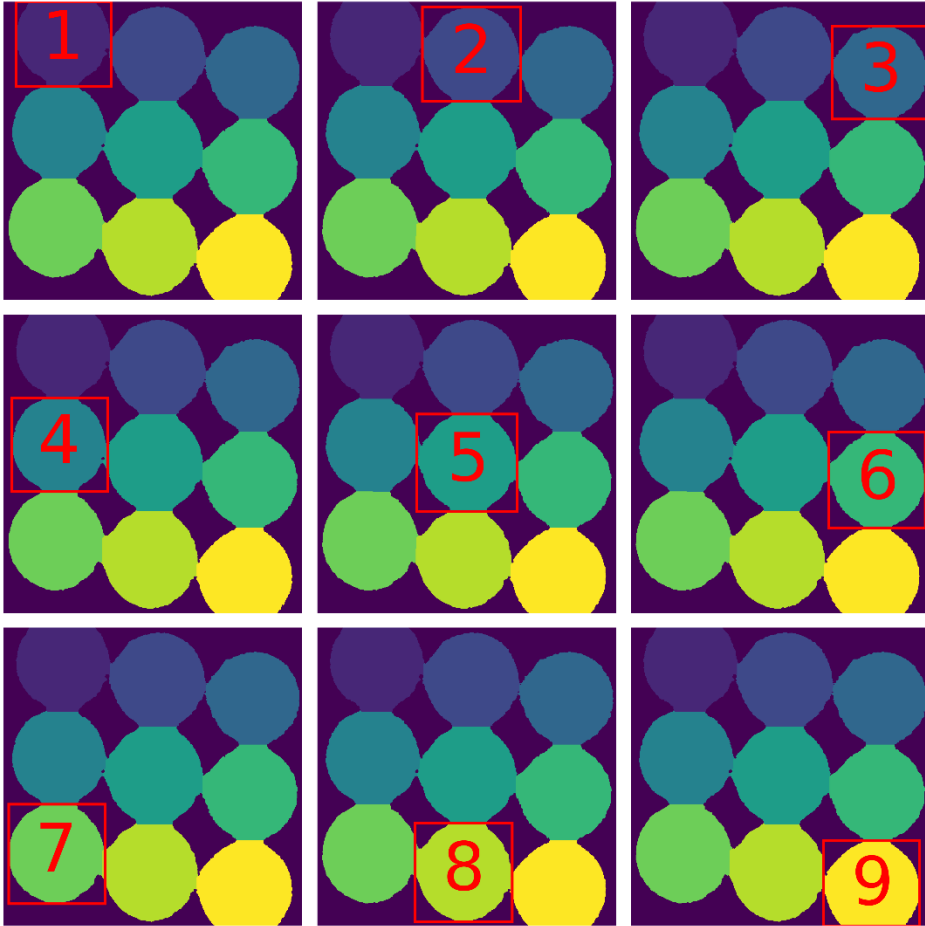
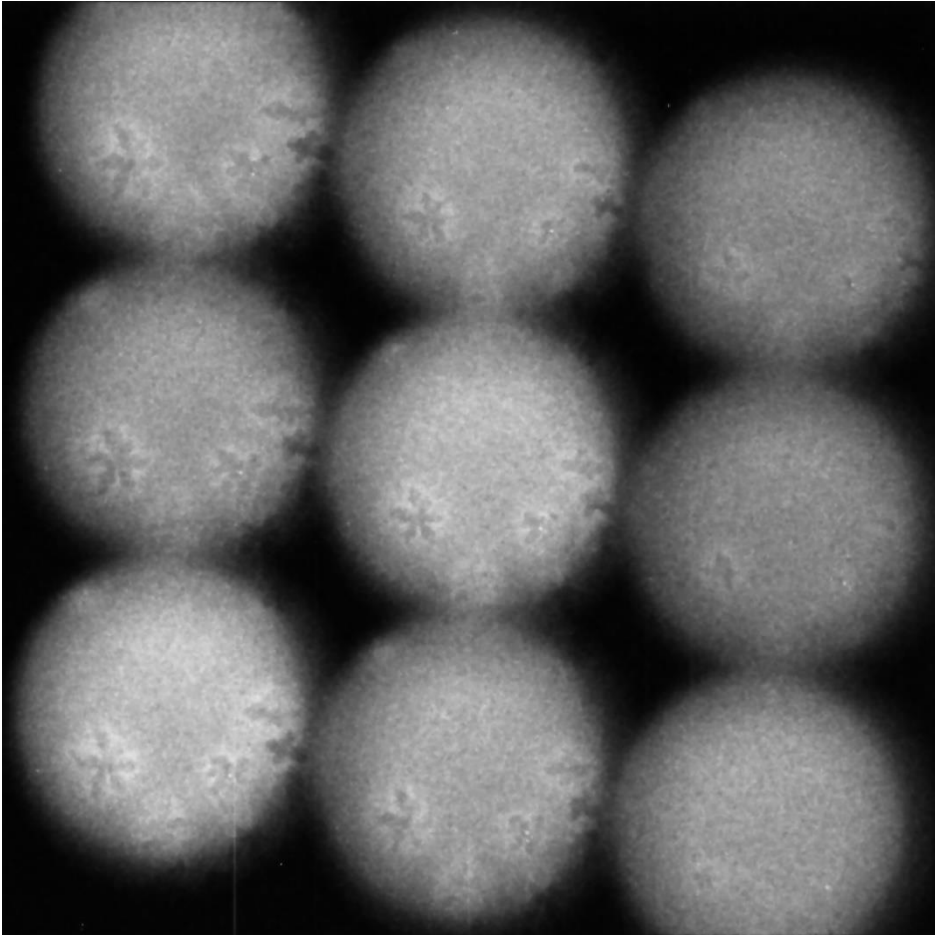
Animating Regions



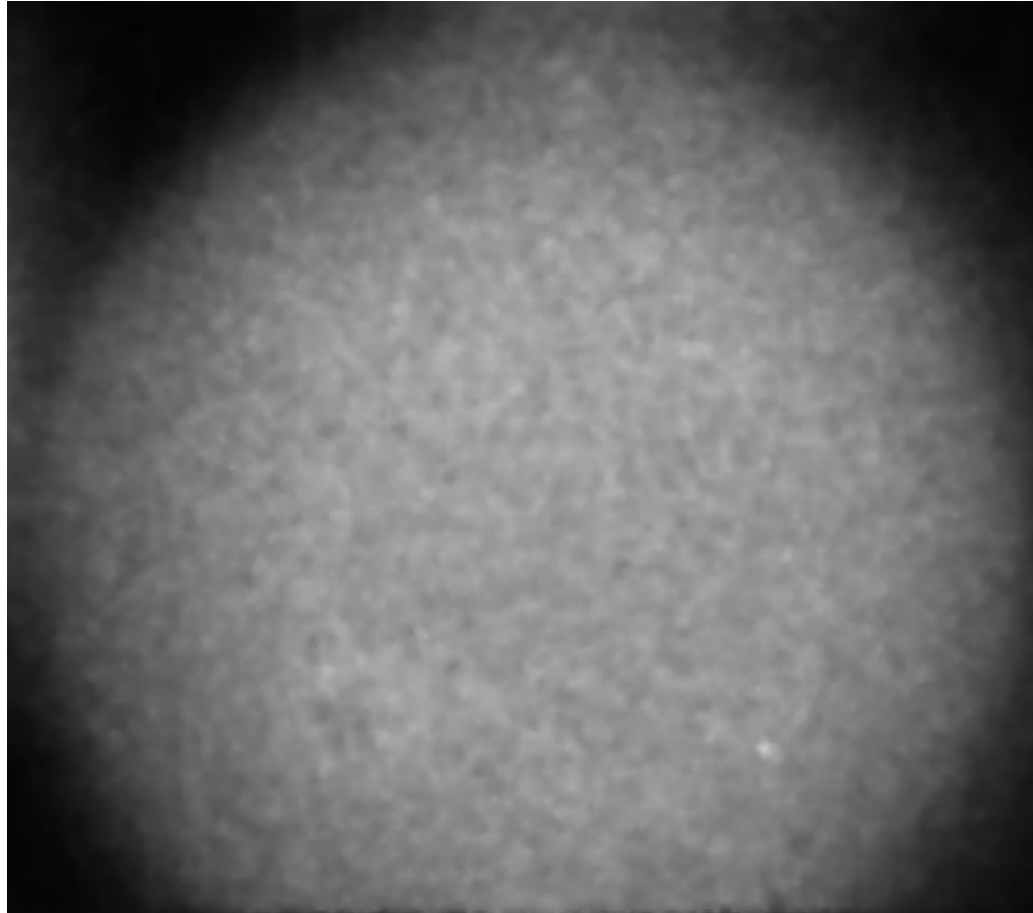
Animating Regions



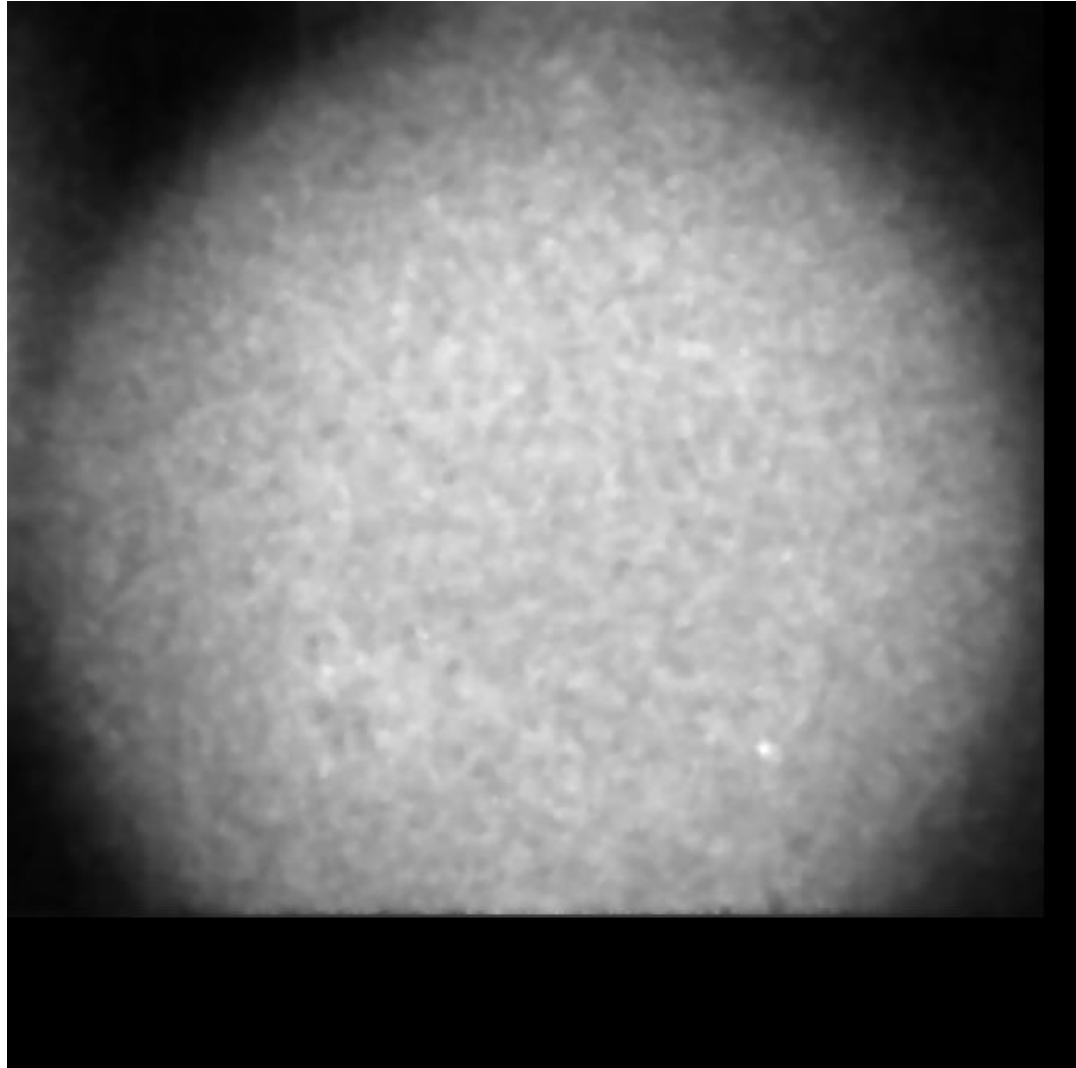
Watershed Transformation



Animating Regions

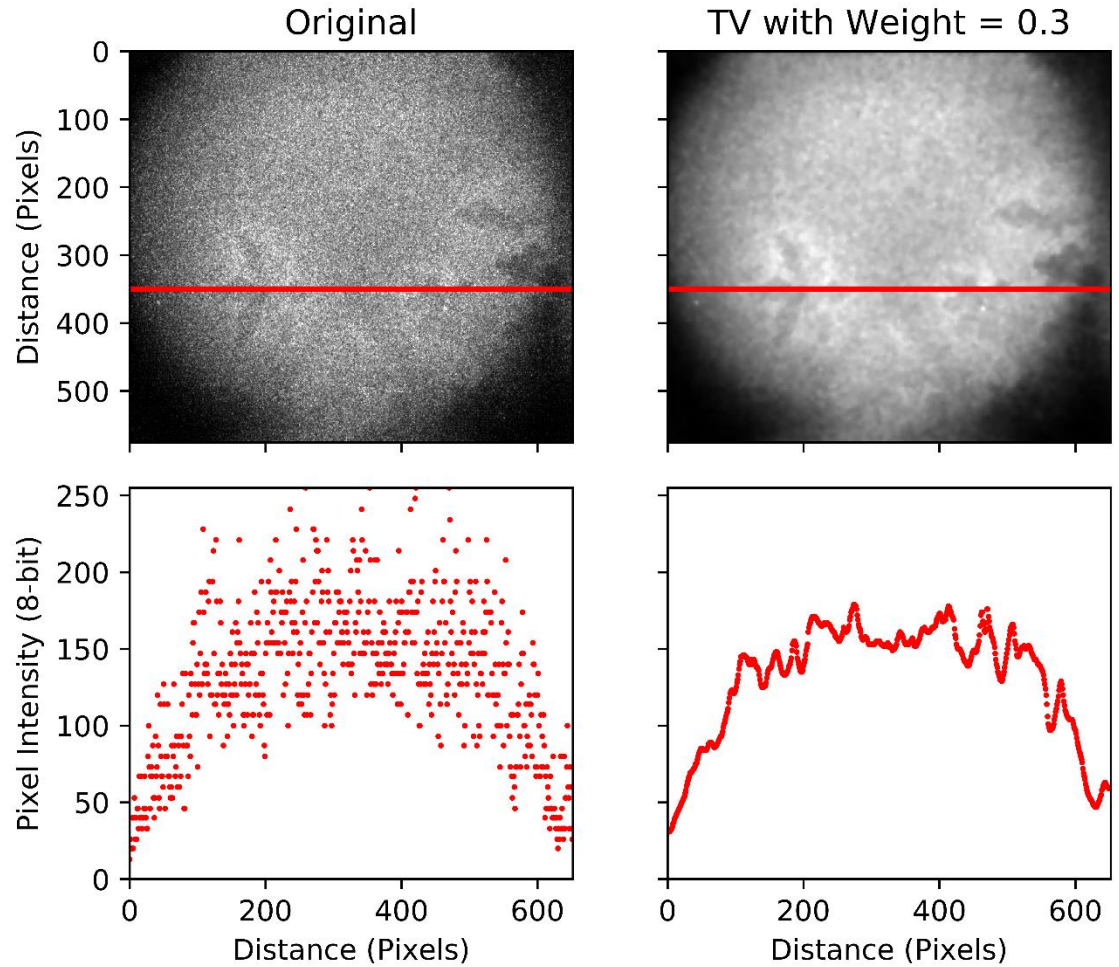


Animating Regions

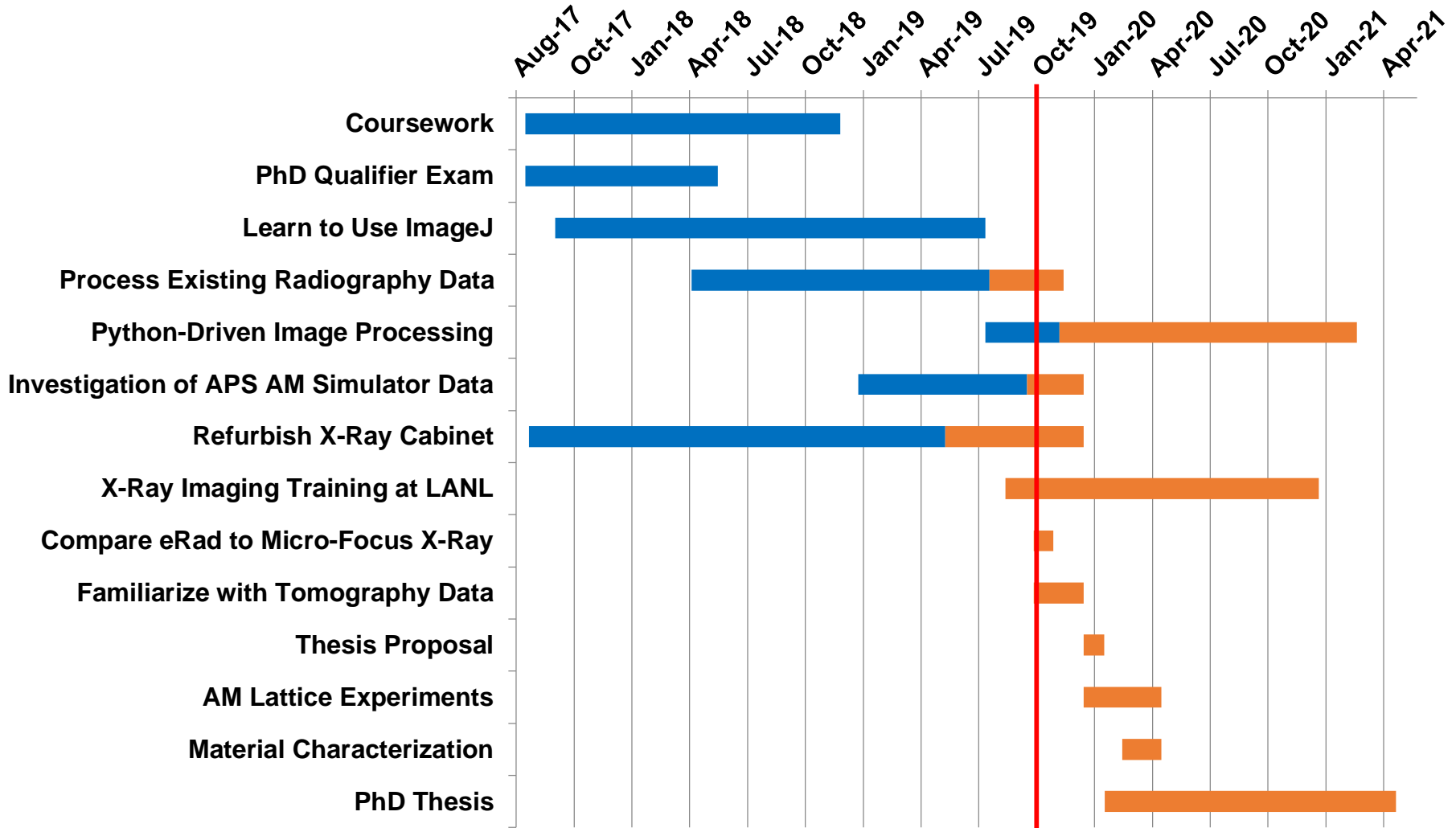


Moving Forward...

- Object detection
- Edge filters

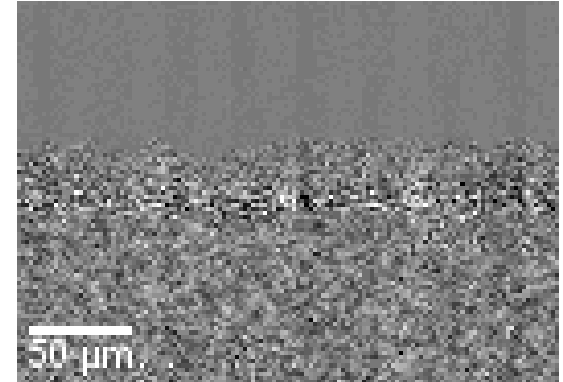


Progress



Challenges & Opportunities

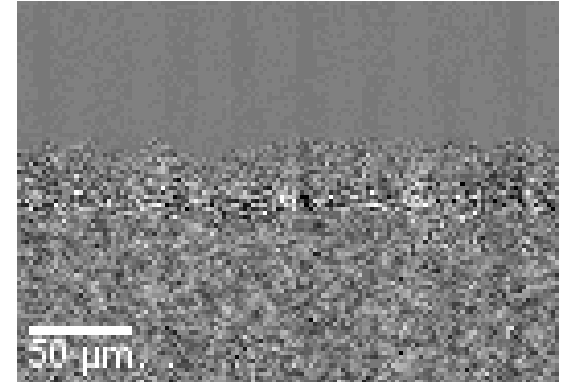
- Automation to reduce bias
- Object detection and quantification in images
- Identification of phase/composition from relative intensity



Thank you!
C. Gus Becker
chbecker@mines.edu

Challenges & Opportunities

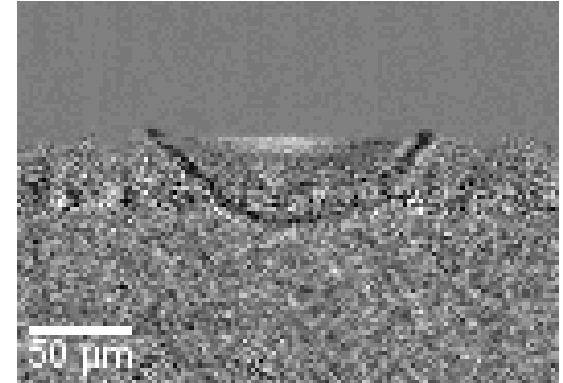
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Project 32-L – Development of Cabinet-Based X-Ray Computed Tomography Methods for Studies of Microstructures and Defects in Metals



Student: *C. Gus Becker*

Faculty: *Amy Clarke*

Industrial Partners: *LANL (Michelle Espy)*

Project Duration: *Aug. 2017 – May 2021*

High-energy micro-focus x-ray cabinet for use in laboratory setting.

Mines cabinet will achieve energies up to 150 keV.



Achievement

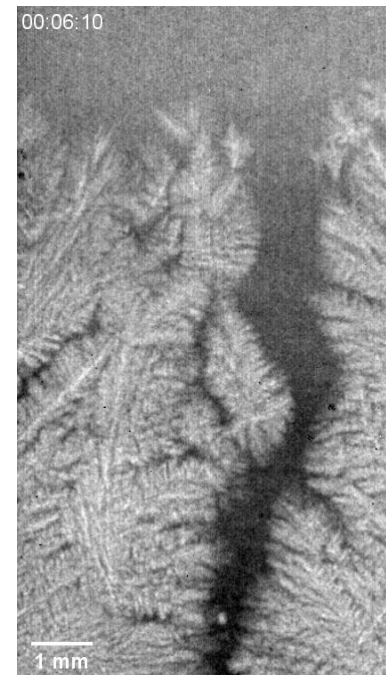
- Processing of radiography data from laboratory high-energy micro-focus and synchrotron x-ray sources

Significance and Impact

- Development of advanced image processing techniques allows for quantitative information to be extracted from image data

Research Details

- ImageJ and Python-based image processing techniques to explore 2D radiography data and 3D computed tomography (CT) reconstructions



Micro-focus x-ray radiography of Al-Ag controlled directional solidification.

Segregation of Ag-rich solute from Al-rich dendrites is seen as dark region towards the bottom of the large channel.

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Program Goal

- Industrial processes of metals such as casting and additive manufacturing can benefit from radiography studies performed in the laboratory

Approach

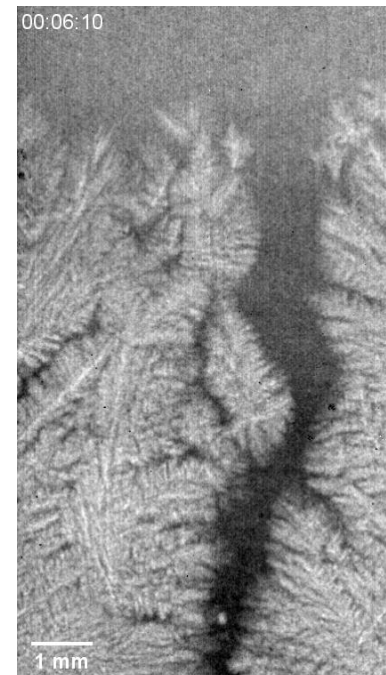
- Analyze current radiography data and establish cabinet-based x-ray radiography capabilities at Mines for further experimentation

Benefits

- Defect identification in AM metals and studies of solidification microstructure to inform casting models

High-energy micro-focus x-ray cabinet for use in laboratory setting.

Mines cabinet will achieve energies up to 150 keV.



Micro-focus x-ray radiography of Al-Ag controlled directional solidification.

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