

# Multiscale Imaging of Carbonate Rocks and Upscaling for Digital Rock Physics

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## Motivations

- **Plenty of pores at sub-micron scale** (nano-pores) in shales and carbonate rocks have become increasingly important for emerging problems such as unconventional gas and oil resources, geologic storage of CO<sub>2</sub> and nuclear waste disposal
- **Advances in analytical capabilities** with laser, X-ray, electron, and ion beams offer emerging tools for characterizing pore structures, mineralogy, and reactions at the sub-micron scale
- **Multiscale imaging capabilities** – integration of experimental and numerical tools to probe the structure and properties of materials across scales (e.g., core to nanometer scale) are rapidly advanced
- **Digital rock physics** – data interrogation about how to take nanometer scale information and apply it to the thin-section or larger scale for accurate prediction of coupled geophysical, mechanical, and chemical processes

## Objectives

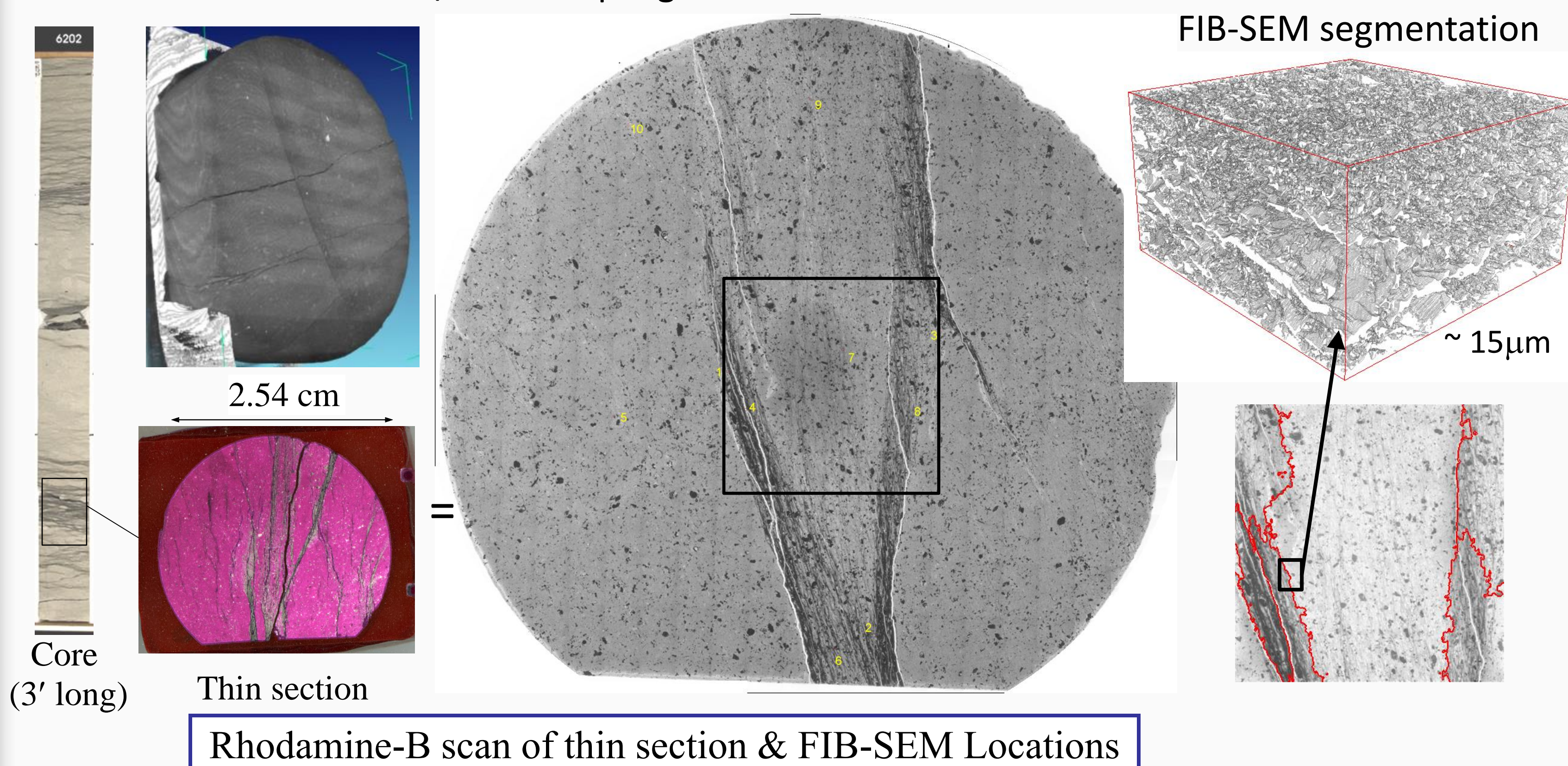
- Reconstruct 3-D stochastic pore structures based on multiscale images and reduce the number of ensemble members through dimension reduction methods
- Develop a workflow for digital rock physics to upscale petrophysical and elastic properties for multiphase flow and reactive transport

## Multiscale Imaging and Analysis

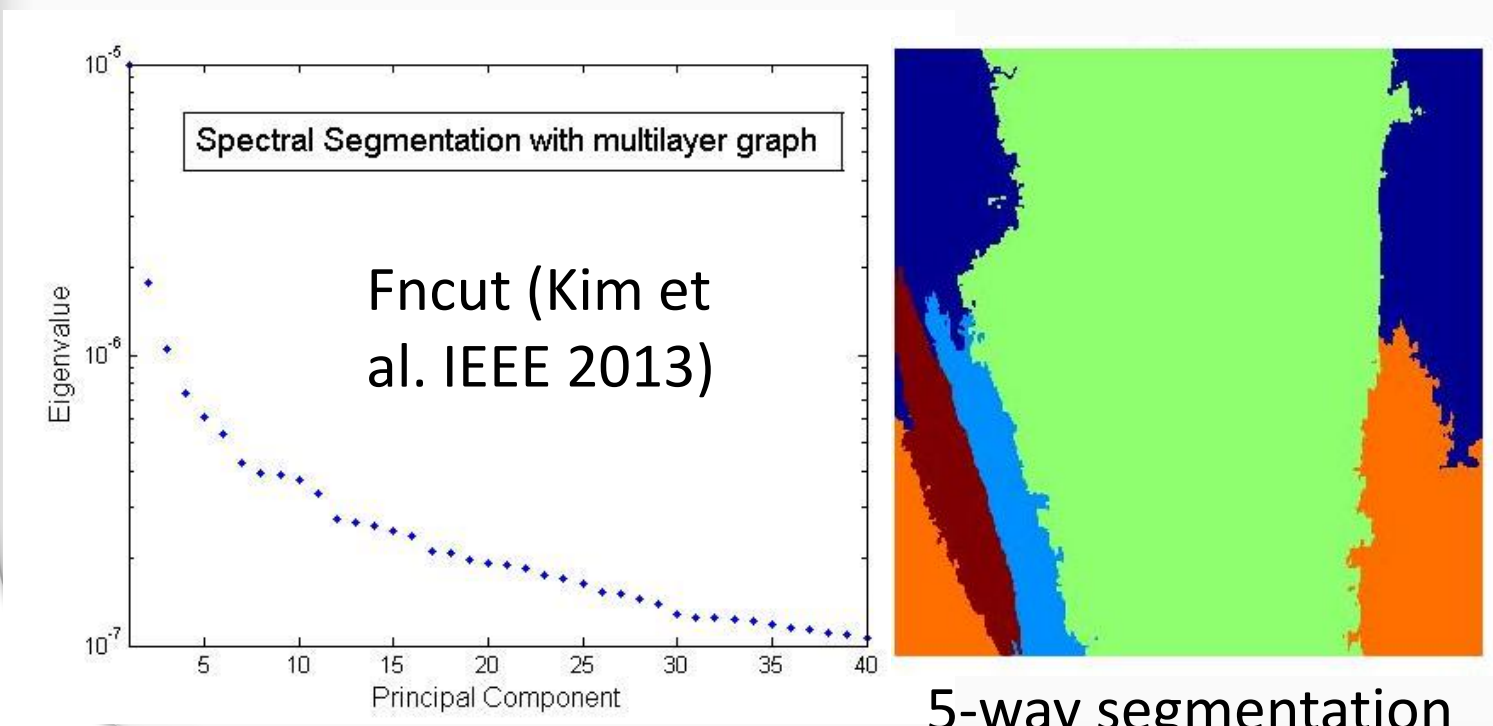
- Characterization of pore structures, compositional distribution, and surface properties using multiscale imaging techniques (optical and confocal microscopy, QEMSCAN, micro-CT, FIB-SEM, BIB-SEM, TEM, EDS)

### Fluorescence mapping and feature classification

- Thin section analysis and micro-CT imaging
- Identify distinctive features (e.g., micro-fractures, clay seam, matrix) from 2D thin section using feature selection algorithm (e.g., spectral segmentation (Kim et al. 2013))
- Used as a basis for FIB/SEM sampling



### Graph-based Spectral Segmentation

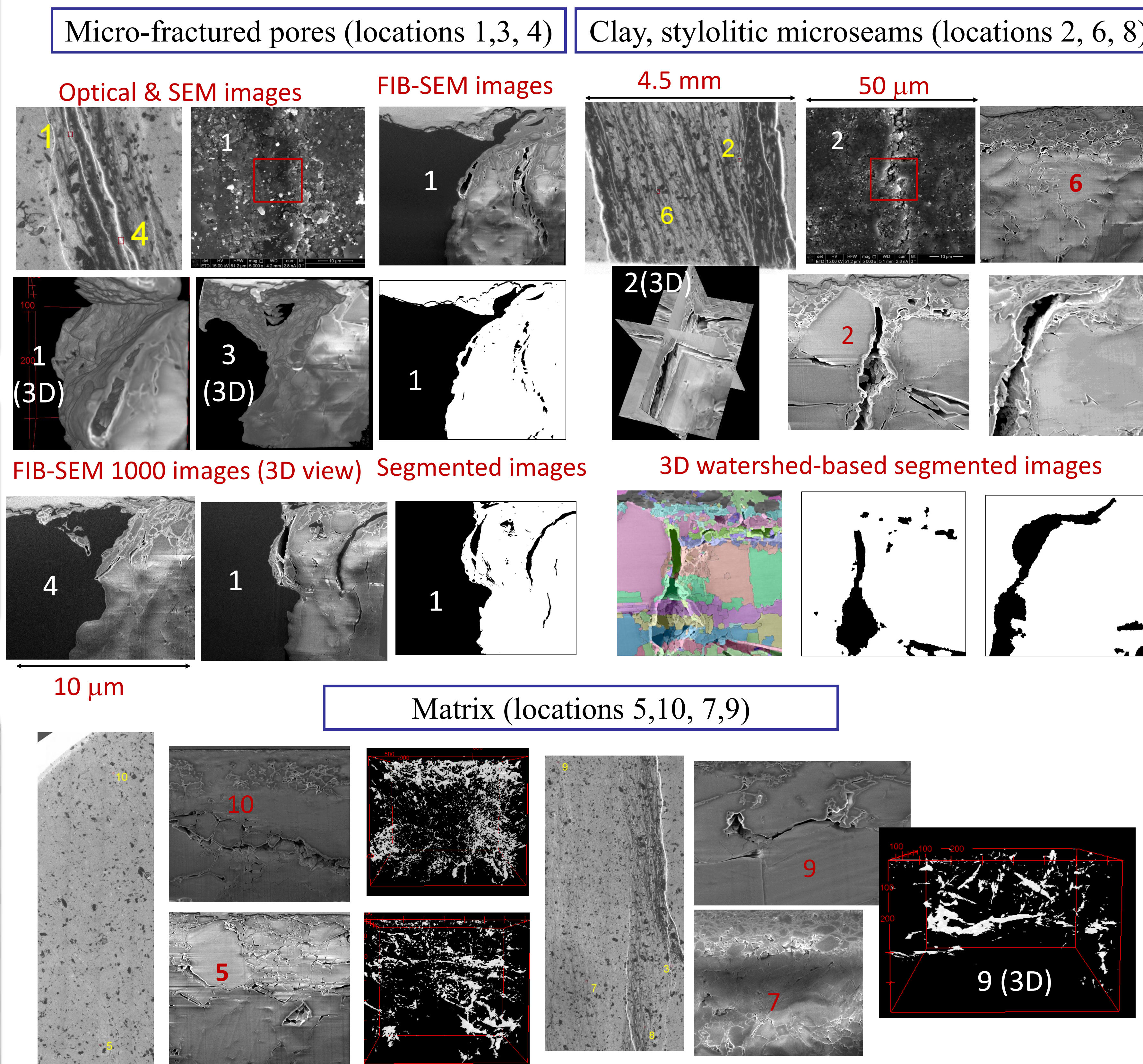


We proposed a “two-scale” approach:

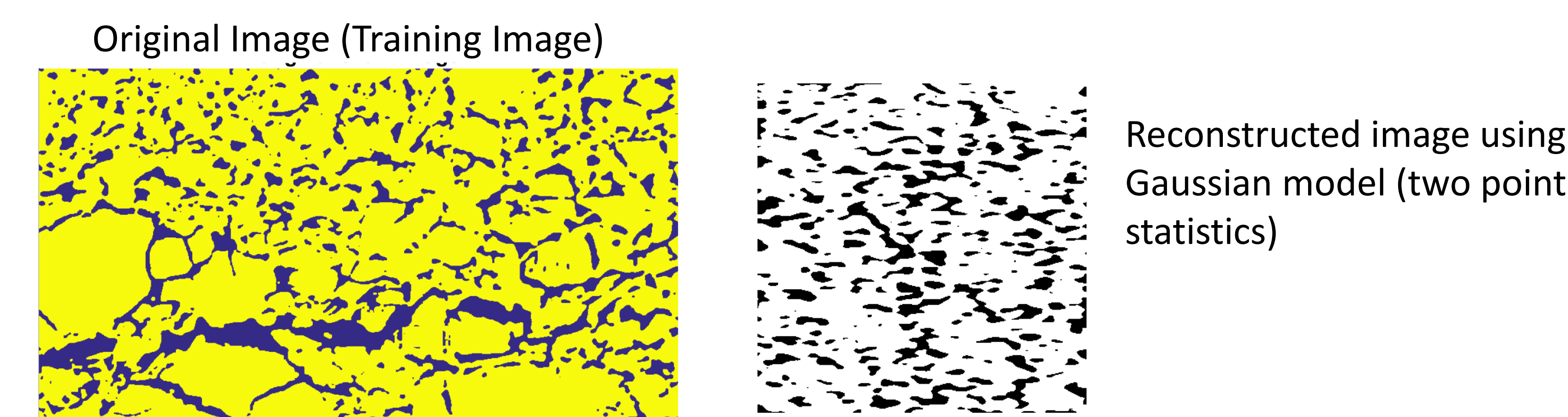
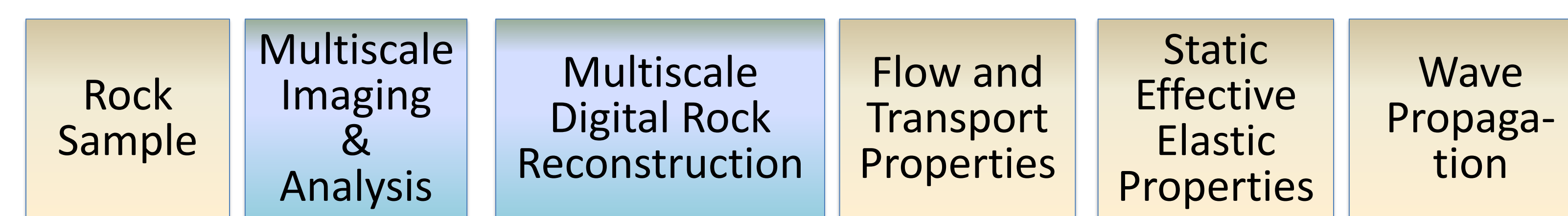
- 1) Multiple FIB-SEM analysis to characterize nano-porous structures
- 2) Perform pore scale simulations using reconstructed 3D digital rock ensemble members
- 3) Assign effective permeability or response function for flow and transport modeling at Darcy-scale images (e.g., thin section/micro-CT)

## Multiple Focus Ion Beam - SEM Analysis

- Representative microfacies based on FIB-SEM images (10 nm resolution in 3D)

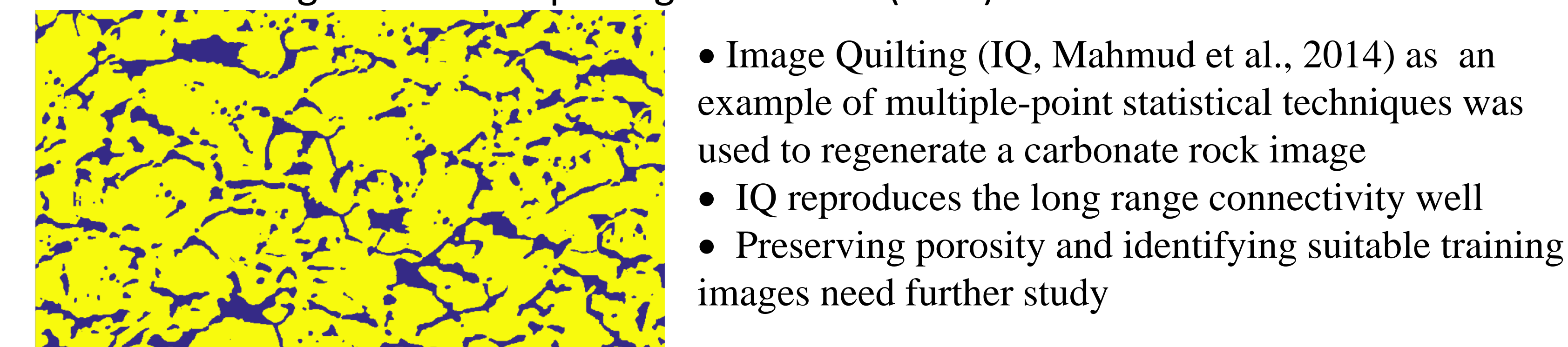


## Workflow for Digital Rock Physics



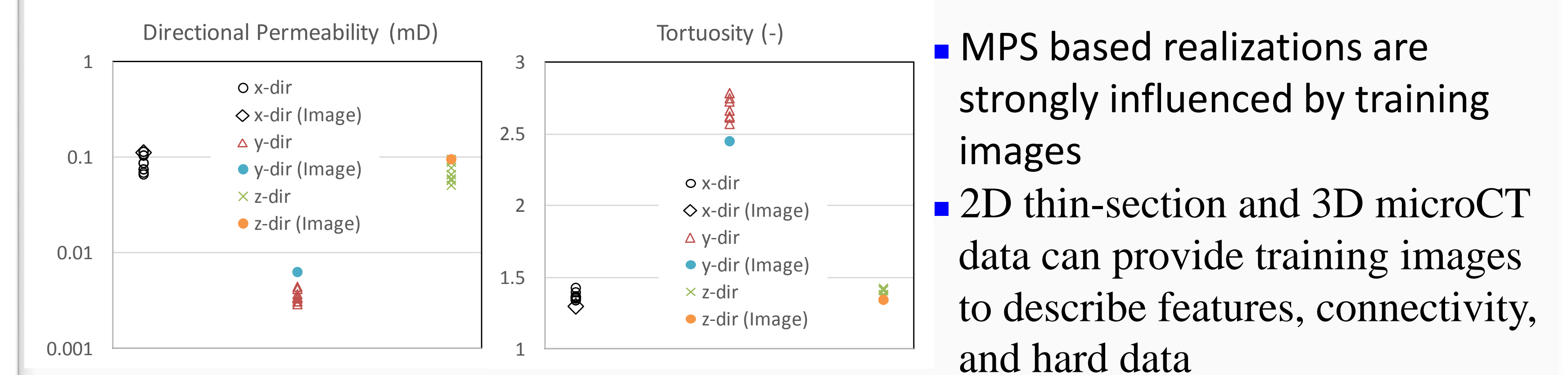
Traditional two-point statistics is not enough to characterize the long-range connectivity  
A prior geological interpretation is required and it is NOT multi-Gaussian

Generated image with multi-point geostatistics (MPS)



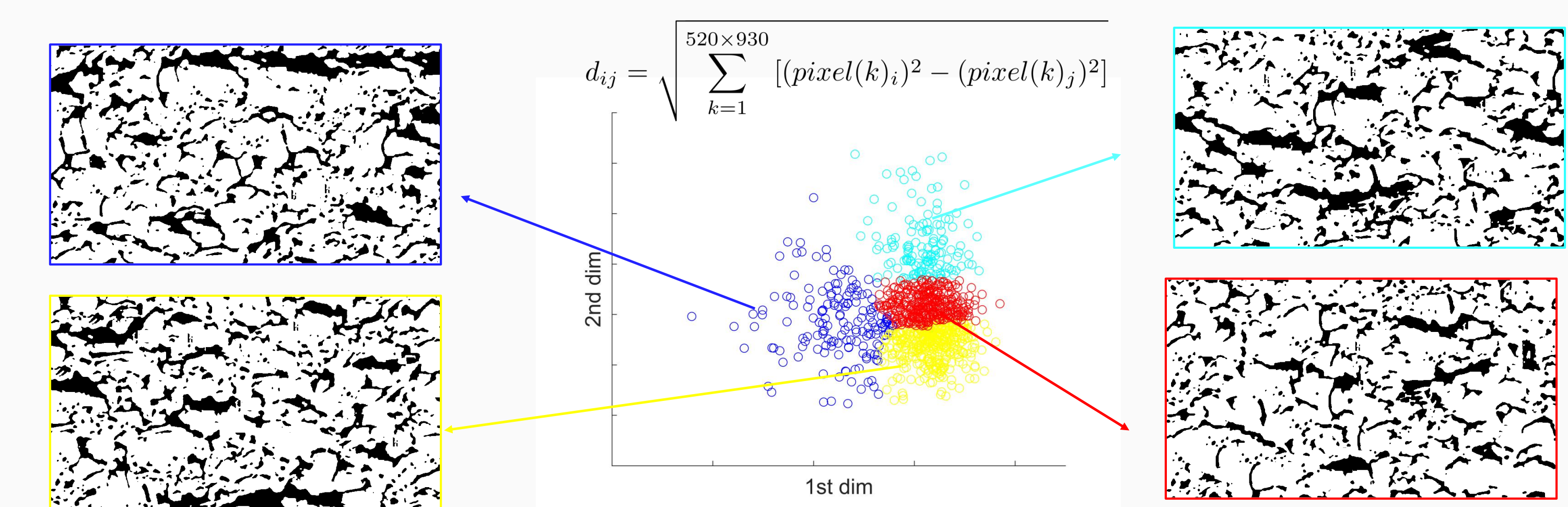
## Multipoint Statistics for Digital Rock Reconstruction

- Feature-based Conditional IQ from segmented FIB-SEM image stack (right)
- Porosity, correlation length, and Euler characteristics are consistent
- 10 realizations of 3D pore structure (1000 x 1000 x 1000 at 15 nm resolution)
- Lattice Boltzmann simulation of single phase flow (e.g., Yoon et al., 2013)
- Directional permeability and tortuosity are compared
- IQ based realizations have slightly less connected



## Dimension Reduction

- A large number of realizations are prohibitively expensive
- Dimension reduction can be applied to reduce the number of ensemble members to represent flow and elastic properties of chalk
- Multi-dimensional scaling based on the Euclidean distance measure is applied to demonstrate the linear dimension reduction approach



## Future Works

- Nonlinear dimension reduction will be applied to reduce the number of ensemble members to represent flow and elastic properties of geomaterials
- Pore scale single- and multi-phase flow modeling and reactive transport modeling will be performed to assess the accuracy and efficiency of MPS methods
- Effective properties based on pore scale analysis (e.g., permeability or response function for reactive transport parameters) will be mapped over thin-section (2D) and micro-CT images (3D) for upscaling from pore- to Darcy-scales

## References

- Yoon, H. and Dewers, T., 2013, Nanopore structures, statistically representative elementary volumes, and transport properties of chalk, Geophys. Res. Lett., 40, 4294-4298
- T.H. Kim, K.M. Lee, and S.U. Lee, "Learning Full Pairwise Affinities for Spectral Segmentation," IEEE Transactions on Pattern Analysis and Machine Intelligence, 2013
- Mahmud et al. "Simulation of Earth textures by conditional image quilting." Water Resources Research (2014): 3088-3107

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