



# Battery Electrode Simulation Toolkit using MFEM (BESFEM)

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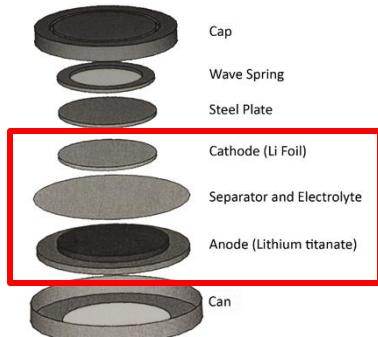
2. Department of Chemical Engineering & Materials Science

Michigan State University

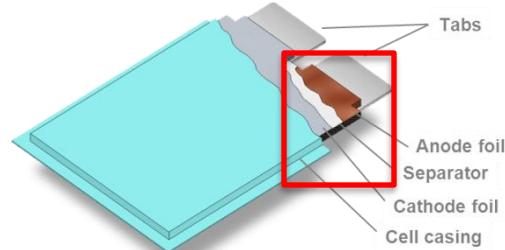




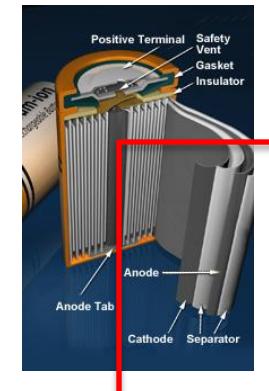
## Coin cell



## Pouch cell

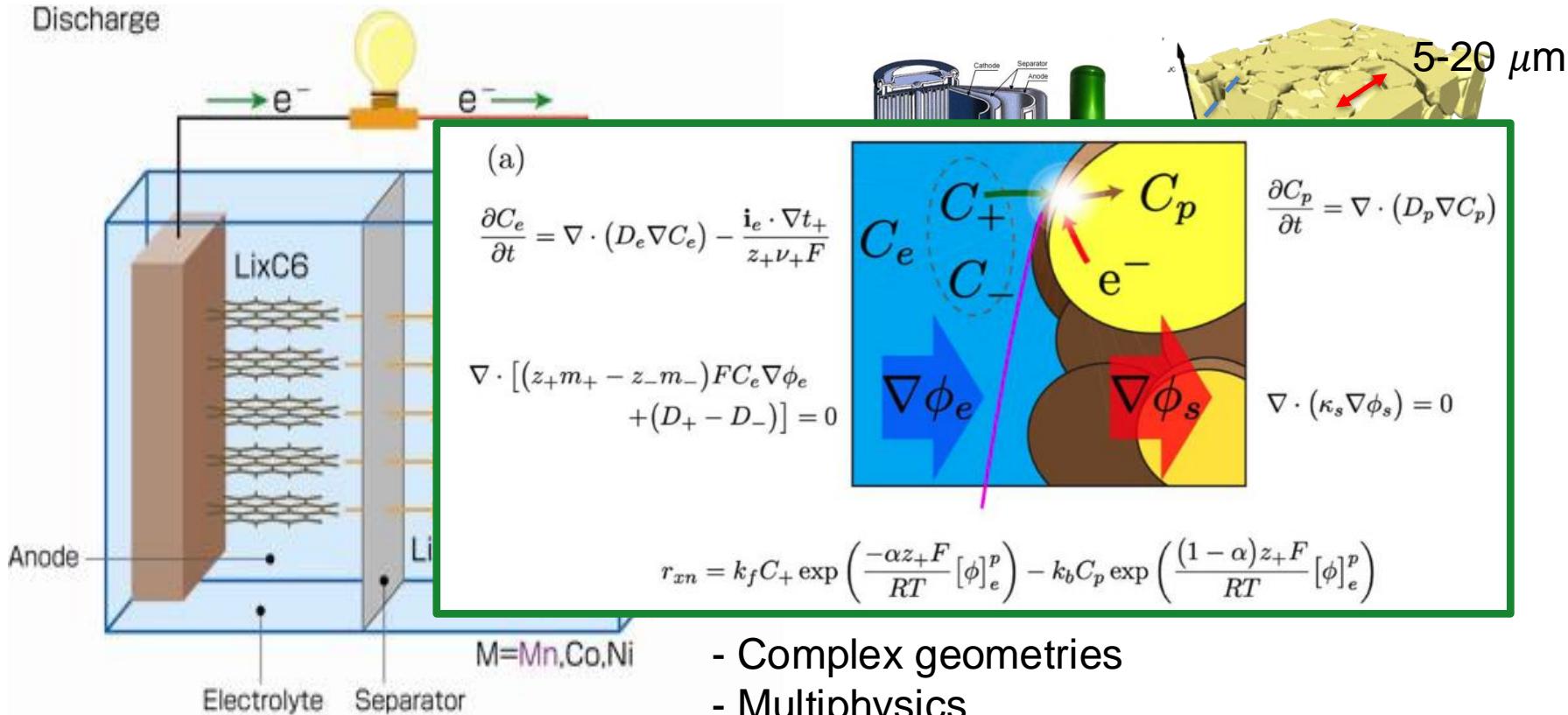


## Swiss-roll cells



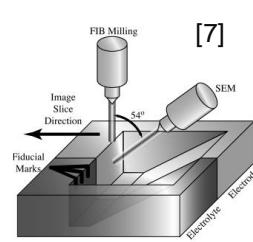


Discharge

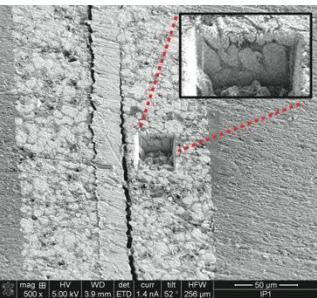




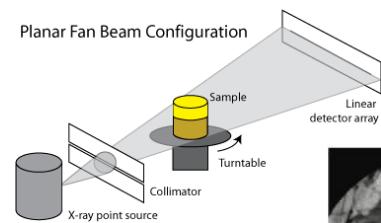
### FIB-SEM



[7]

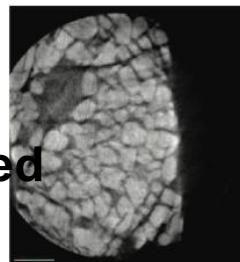


### X-ray computed tomography

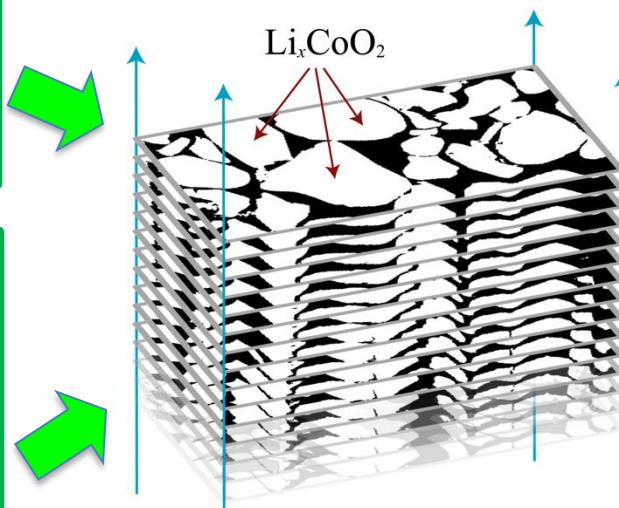


[8]

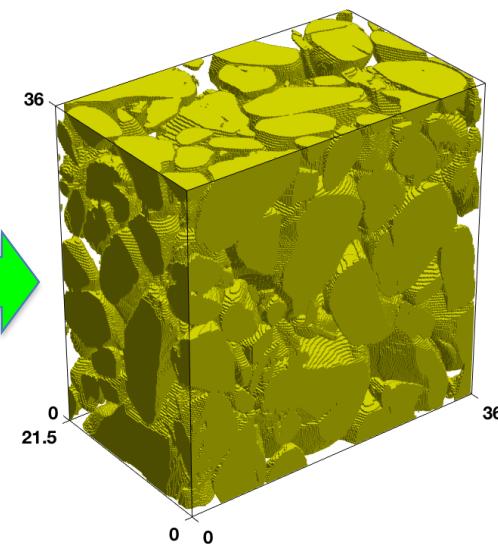
### X-ray computed tomography



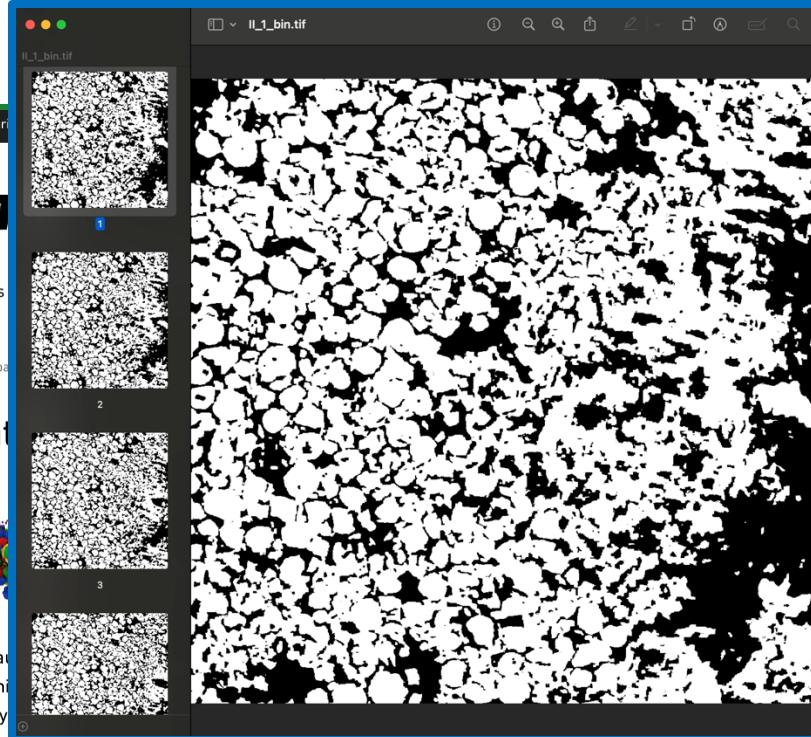
### Combining series of images



### Voxel microstructure

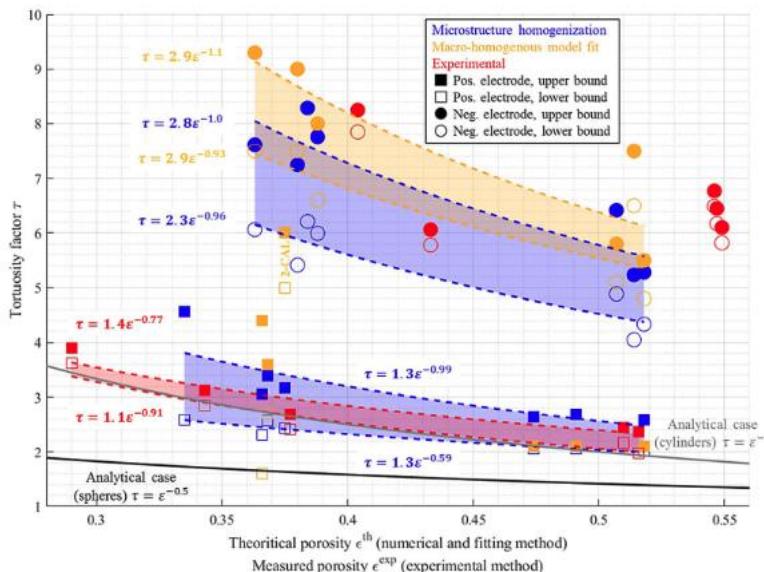


## Stacked-TIFF



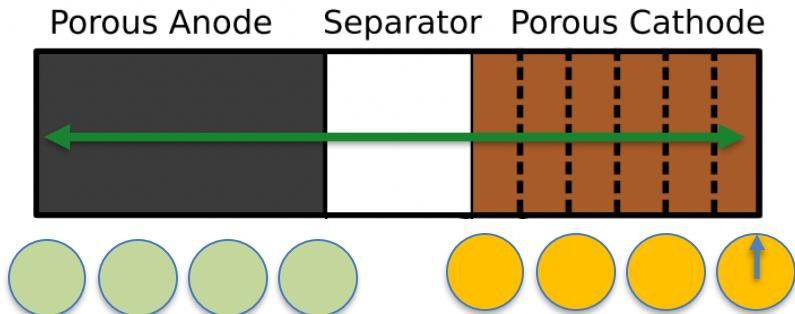
NREL  
Driving ENERGY  
Battery & Mobility Research  
Journal of The Electrochemical Society, 165 (14) A3403-A3426 (2018)

These microstructure data are used mostly for structure analysis, hardly for electrochemical simulations.



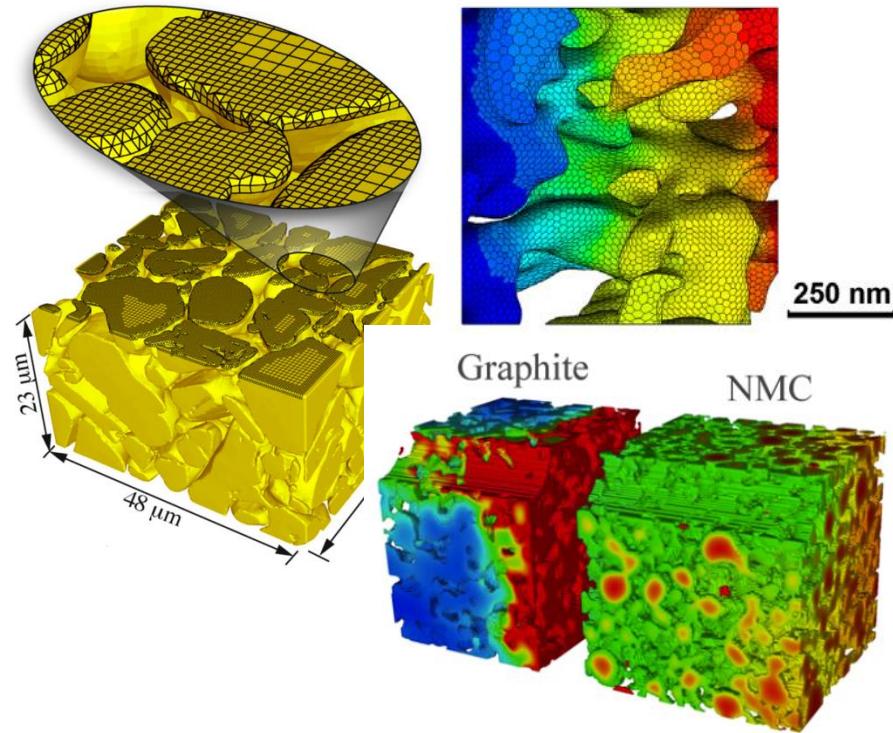


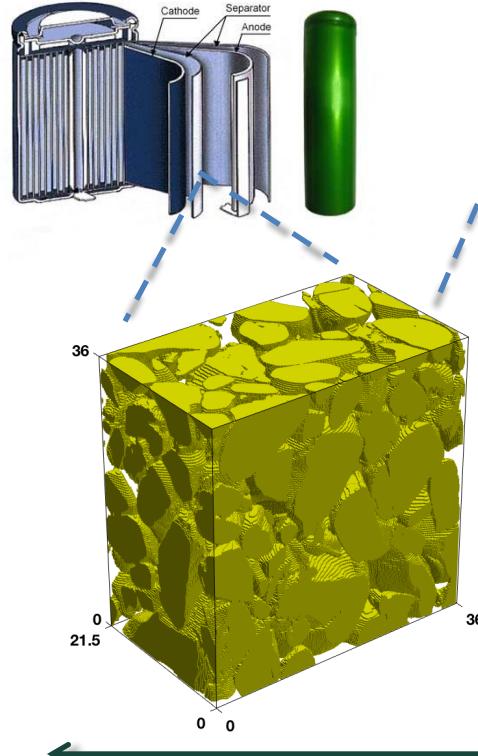
Porous electrode theory, PET  
(pseudo-2D, P2D) model, pioneered  
by J Newman.



- 1D equation (longitudinal) for  $C_e$ ,  $\phi_e$ ,  $\phi_s$ .  
Using **homogeneous effect properties**:  
 $D_e^{eff}$ ,  $\kappa_e^{eff}$ ,  $\kappa_s^{eff}$ .
- 1D equation (radial) for  $C_s$

Conventional 3D simulations





$$R_{xn} = k_f^a a_+ \exp\left(\frac{-\alpha z_+ F}{RT} [F]_e^p\right) - k_b^a a_p \exp\left(\frac{(1-\alpha) z_+ F}{RT} [F]_e^p\right)$$

$$\frac{\partial C_e}{\partial t} = \frac{1}{1-y} \nabla \cdot [(1-y) D_e \nabla C_e] - \frac{|\nabla y| R_{xn} t_-}{1-y} n_+ - \frac{\mathbf{i}_e \cdot \nabla t_+}{z_+ n_+ F}$$

$$\nabla \cdot [(1-y)(z_+ m_+ - z_- m_-) F C_e \nabla F_e] = |\nabla y| \frac{R_{xn}}{n_+} + \nabla \cdot [(1-y)(D_- - D_+) \nabla C_e]$$

$$\frac{\nabla C_p}{\nabla t} = \frac{1}{y} \tilde{N} \times (y M_p \tilde{N} m_p) + \frac{|\tilde{N} y|}{y} \frac{R_{xn}}{r_p}$$

$$\nabla \cdot (y k_s \nabla F_s) = -|\nabla y| z_+ F R_{xn}$$

$y = 1$   
electrode  
 $y = 0$   
electrolyte

$y = 1$   
electrode

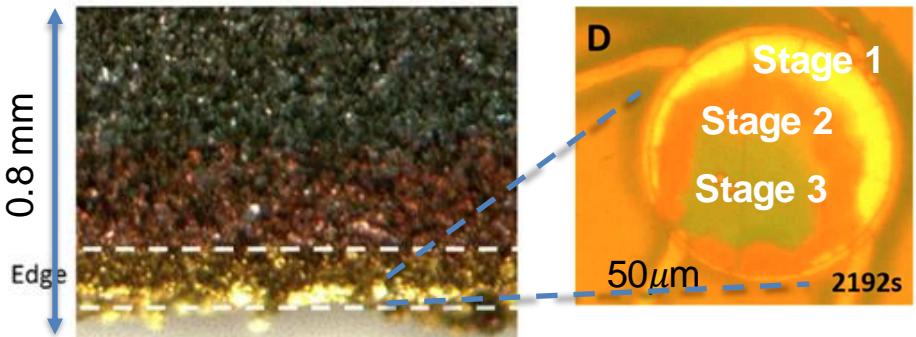
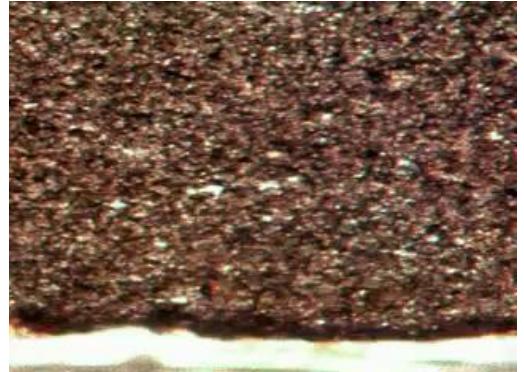
interface

# Phase separating electrode (graphite)



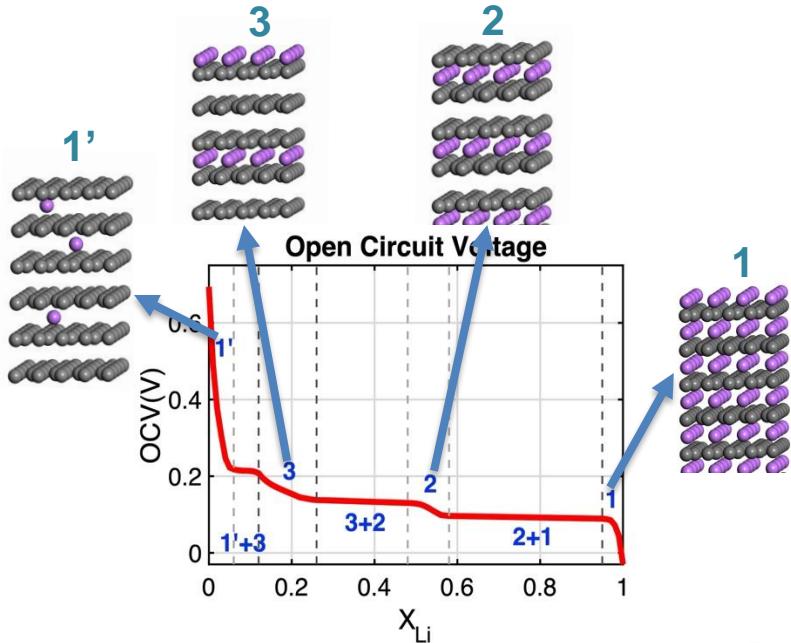
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As more and more Li gets intercalated into Graphite, it goes through **phase transformations**.



$$\frac{\partial X_g}{\partial t} = \nabla \cdot \left[ M_g(X_g) \nabla \left( \frac{\partial f}{\partial X_g} - \varepsilon \nabla^2 X_g \right) \right]$$

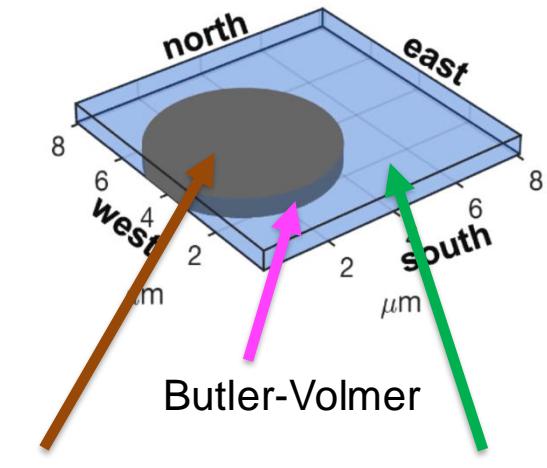
Cahn-Hilliard Eq (phase-field model)



[1] Harris et al., Direct in-situ measurements of Li transport in Li-ion battery negative electrodes, 2009; [2] Ender et al., Anode microstructures from high-energy and high-power lithium-ion cylindrical cells obtained by X-ray nano-tomography, 2014



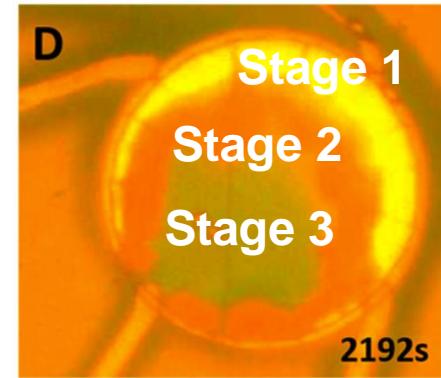
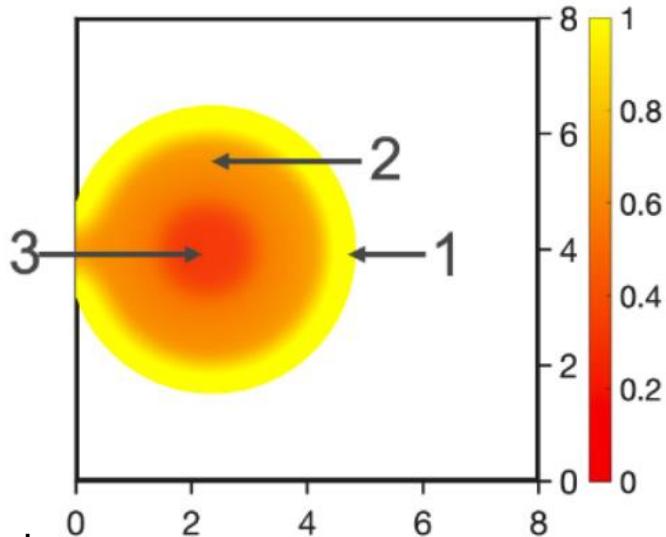
## Single Disk simulation



Phase transition      Salt diffusion  
Electropotential      Electropotential

$$X_p \quad \phi_p$$

$$C_e \quad \phi_e$$



Phases in a single graphitic disk



## Open voxel microstructure data.

ETH Zurich > D-ITET > IIE > MaDE Group



Materials and Device Engineering Group

News & Events   The Group   People   Education   Research   Publications

Homepage > Research > Open Source Data and Software > Battery Microstructure Project

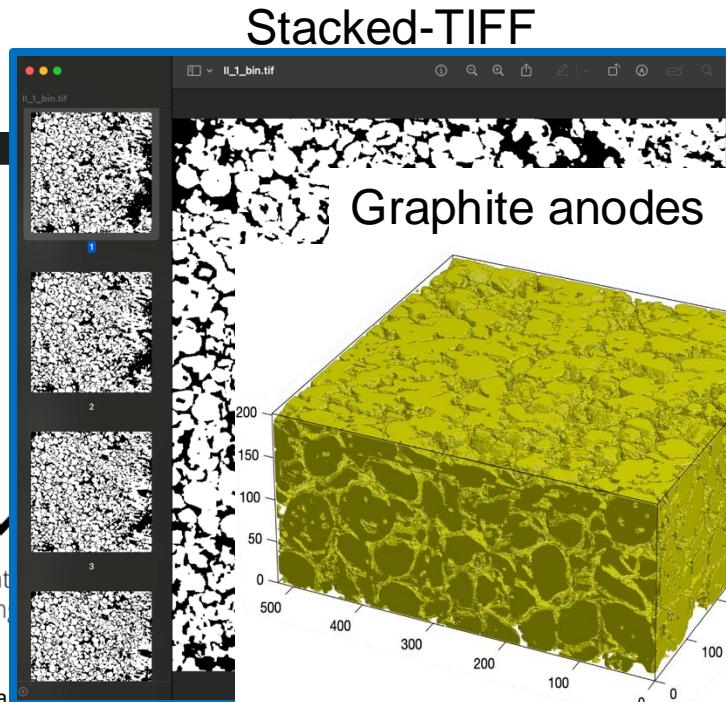
## Battery Microstructure Project



The microstructure of lithium ion battery (LIB) electrodes and separators can influence battery performance. The LIB community has traditionally relied on a simplified picture of microstructure or computer generated microstructures due to a lack of available experimental microstructural data.

We launched the **Battery Microstructure Project** to provide 3D microstructural and electrochemical data on porous electrodes and separators. The following microstructures are currently available.

### 1. NMC-based Porous Electrodes



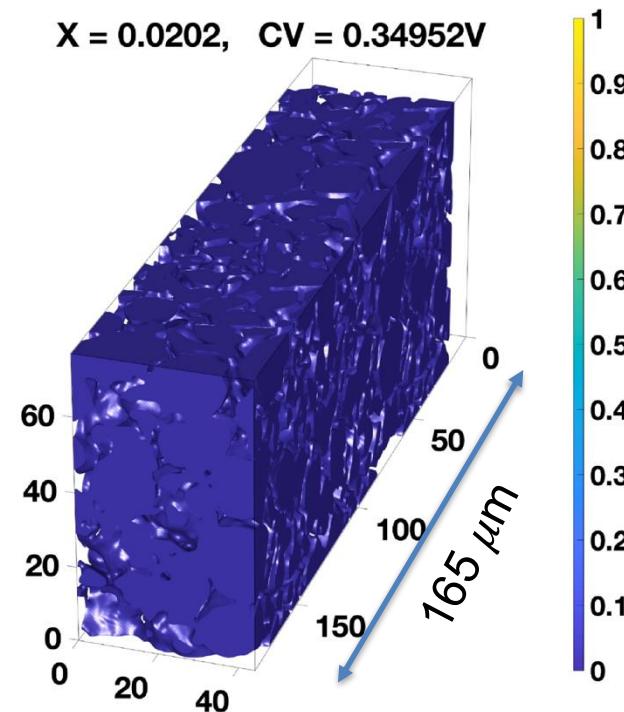
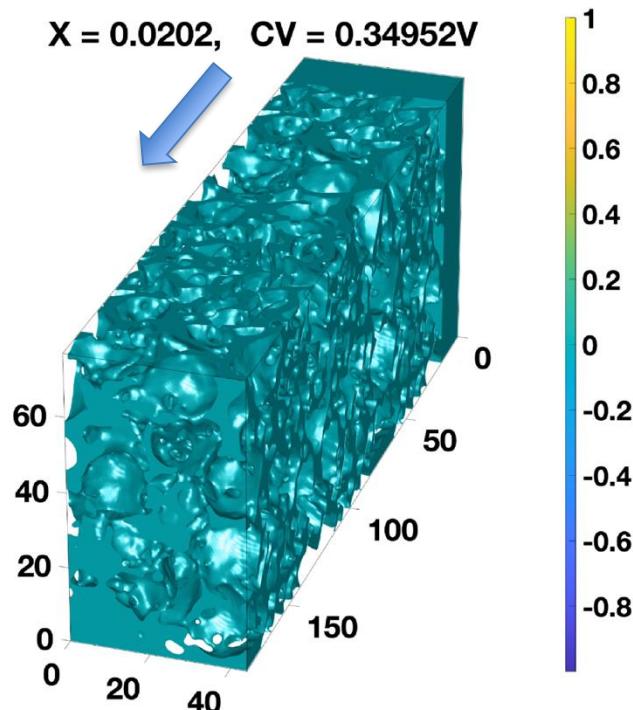
Prof. Dr. Vanessa Wood  
VP Knowledge Transfer and  
Corporate Relations

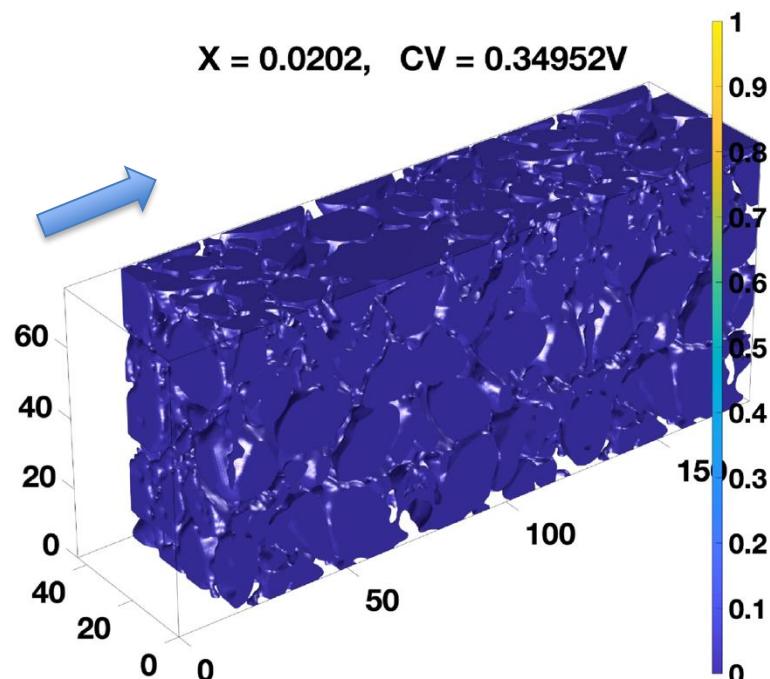
## Electrode IIa



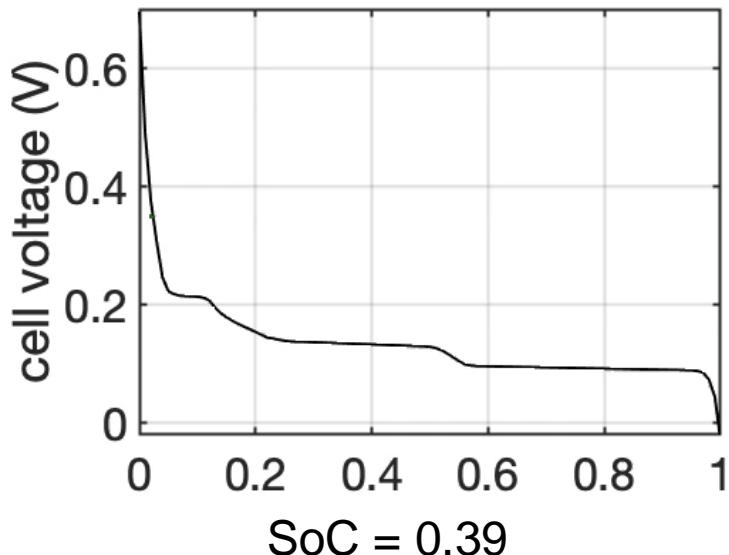
## Simulated Li concentration in electrolyte and graphite particles

**6C charge:** complete charge 6 times in 1 hour, i.e., 10 mins per complete charge





Simulated cell voltage



**Li plating:**  $\phi_p - \phi_e < 0$ , fire/explode. Only a small fraction of thick electrode is utilized.





## PROGRESS REPORT

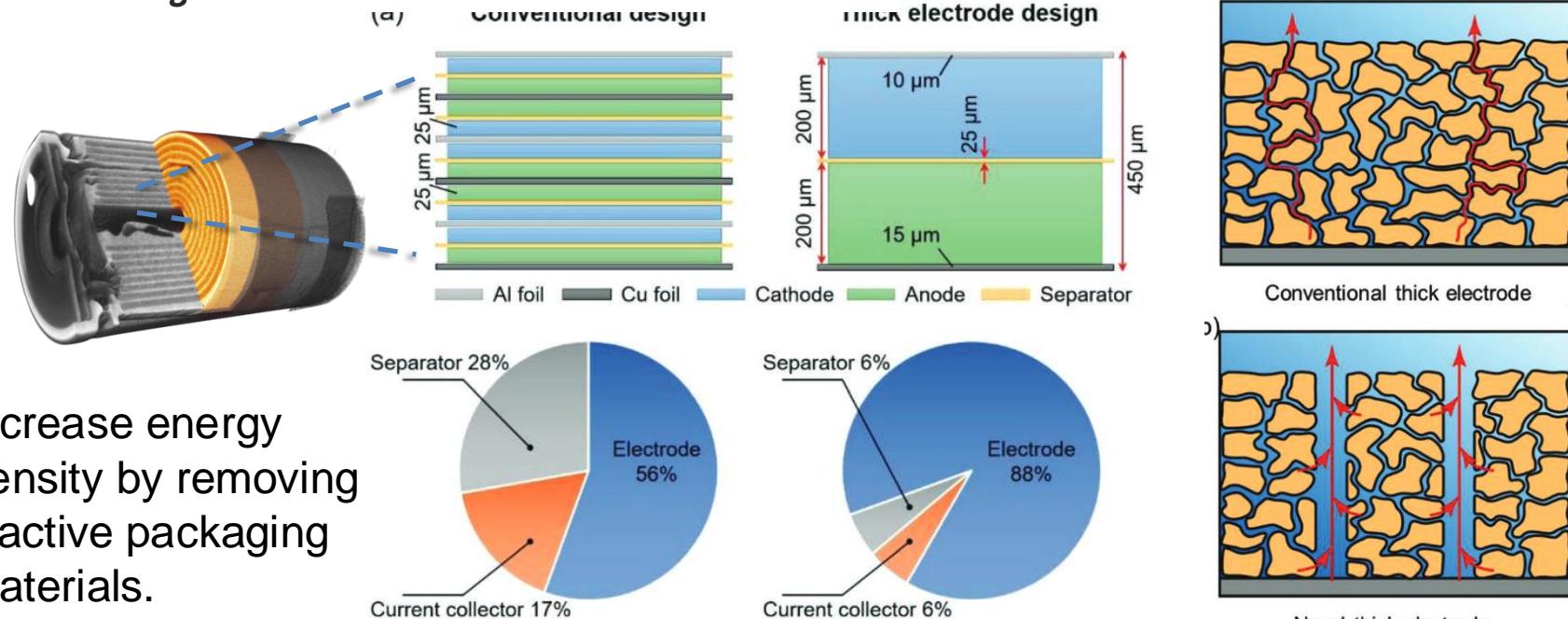
Electrode Materials

ADVANCED  
ENERGY  
MATERIALS

[www.advenergymat.de](http://www.advenergymat.de)

## Thick Electrode Batteries: Principles, Opportunities, and Challenges

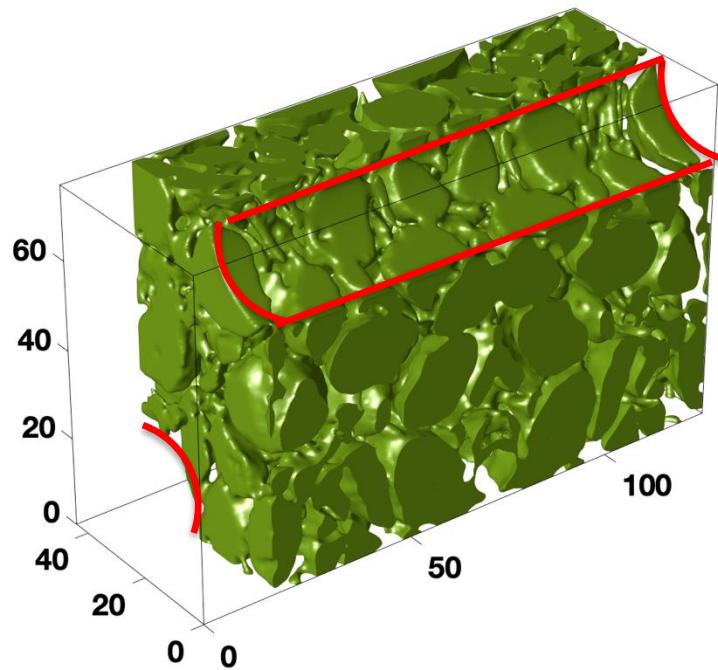
Yudi Kuang, Chaoji Chen,\* Dylan Kirsch, and Liangbing Hu\*



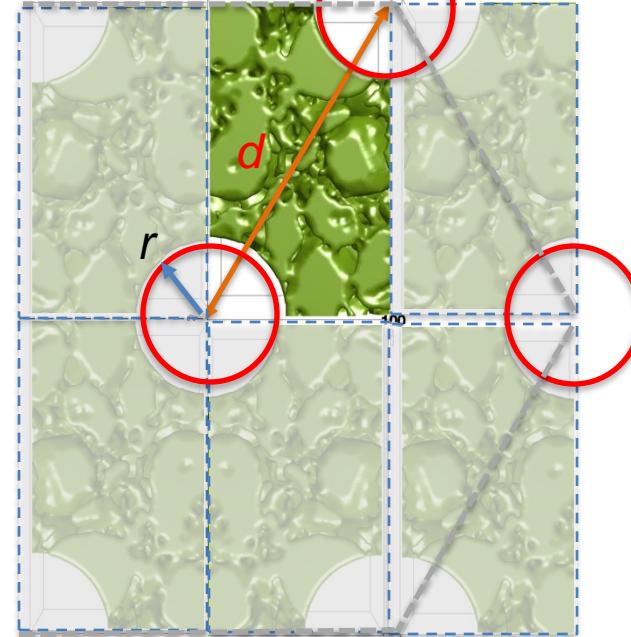
Create tunnels on voxel microstructures: **setting voxel value to be zero.**

$d$ : inter-tunnel distance

$r$ : tunnel radius



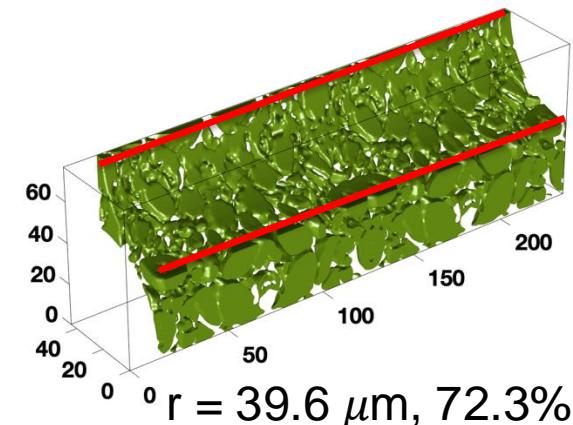
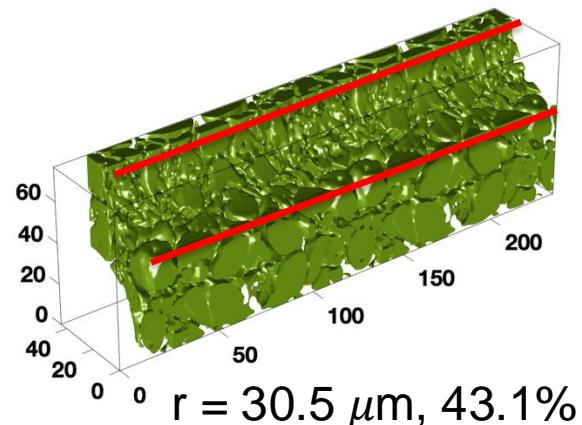
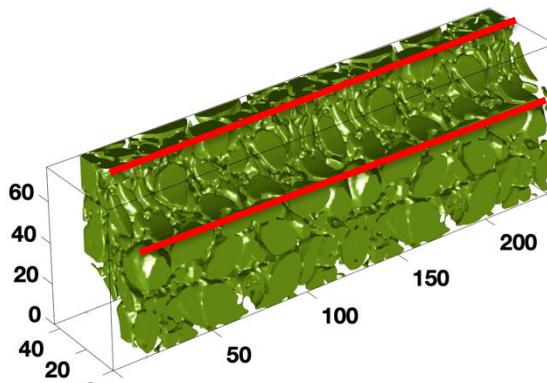
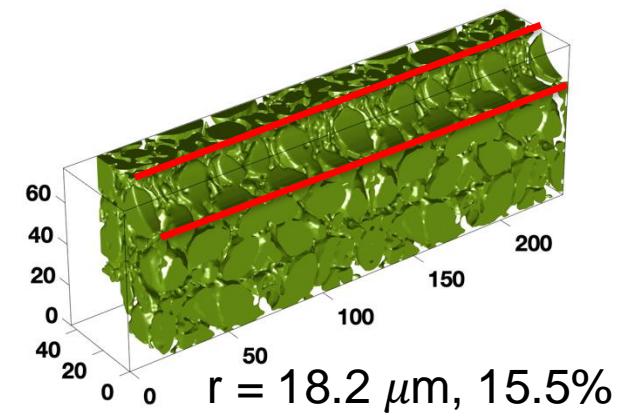
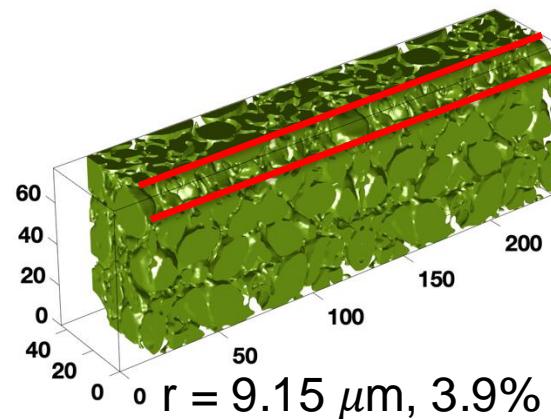
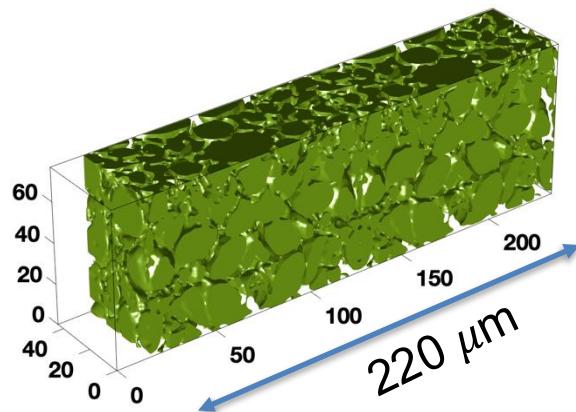
Hexagonal-patterned tunnel array

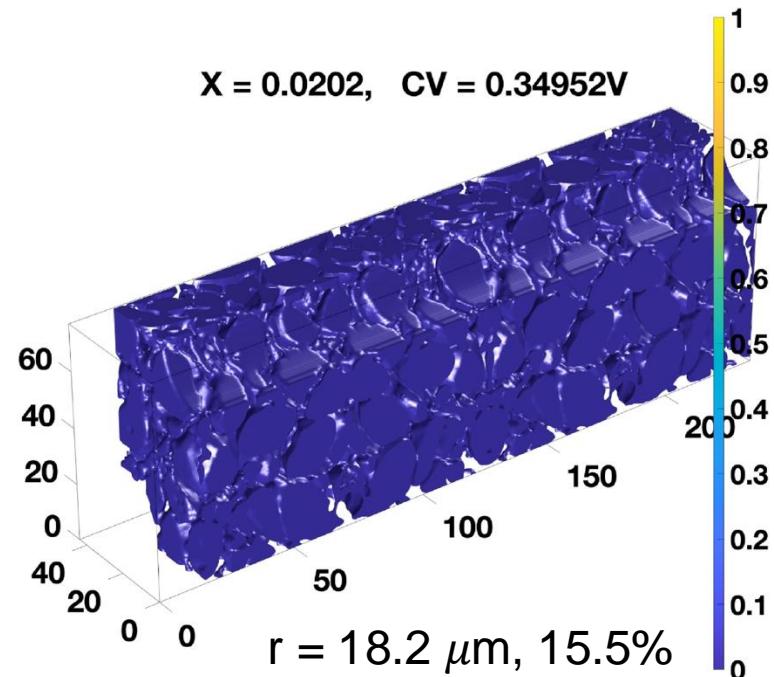
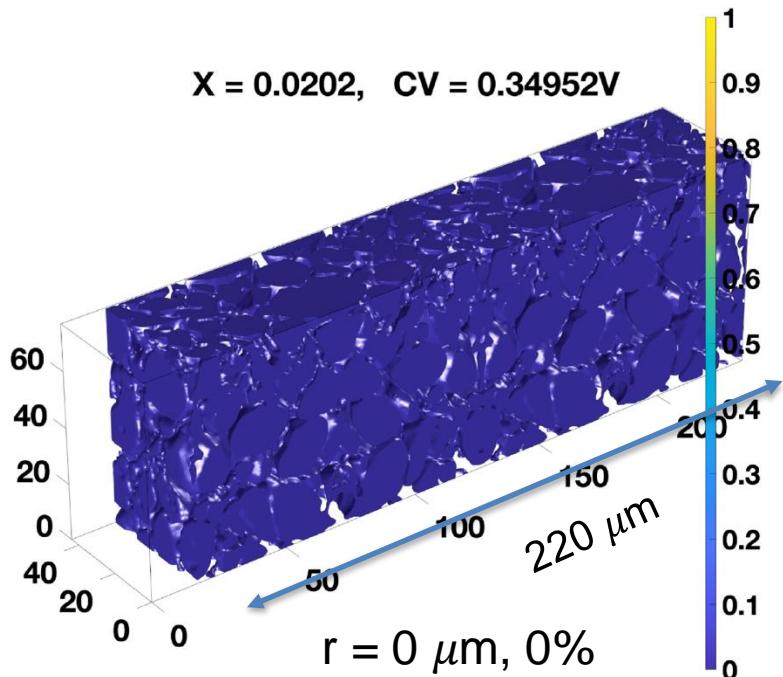


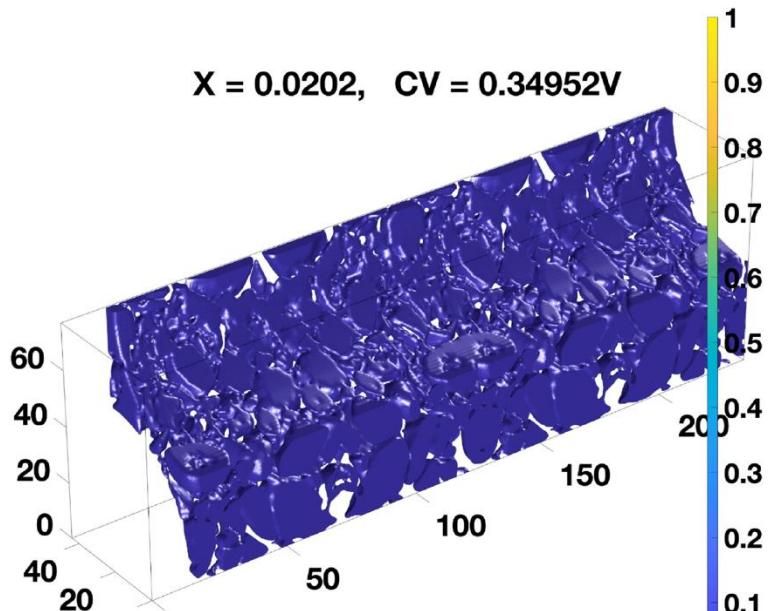
# Perforated microstructures



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X = 0.0202, CV = 0.34952V

r = 39.6  $\mu\text{m}$ , 72.3%

SoC: 0.71; 2.68e-9 mol



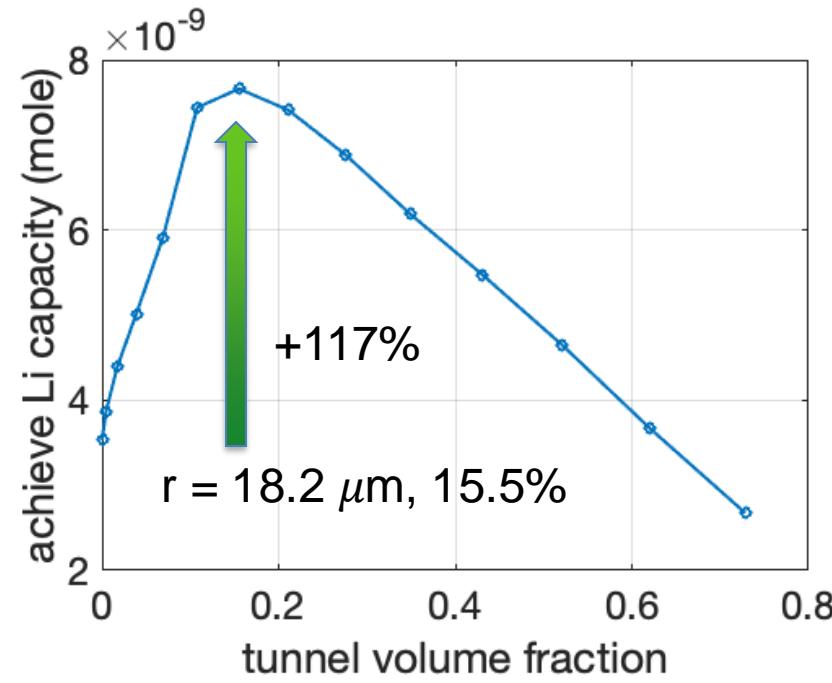
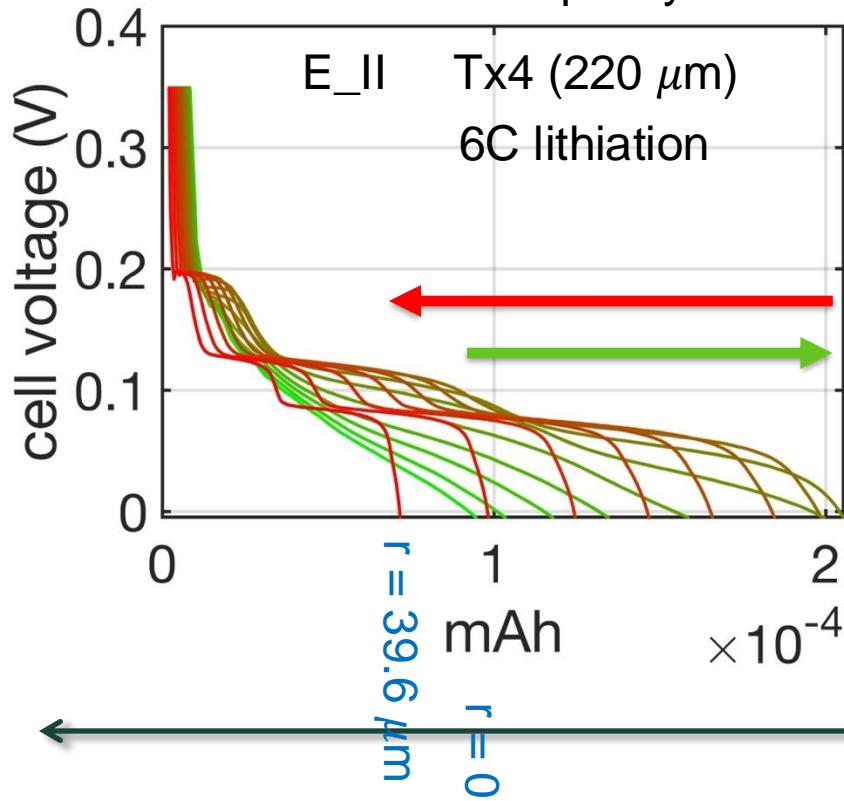
# Optimal achieved capacity



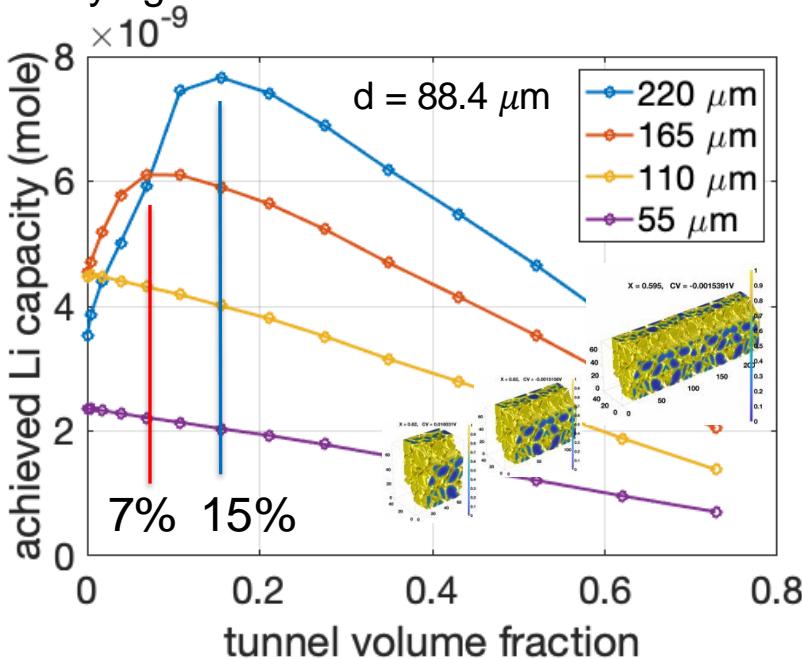
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Hexagonal arrang.,  $d = 87.7 \mu\text{m}$

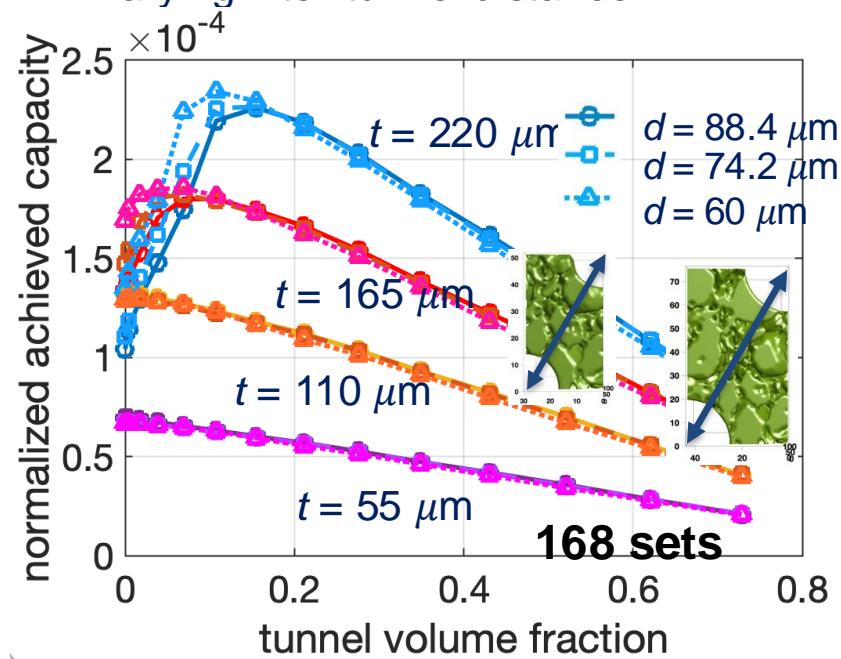
Plotted vs capacity



## Varying electrode thickness



## Varying inter-tunnel distance



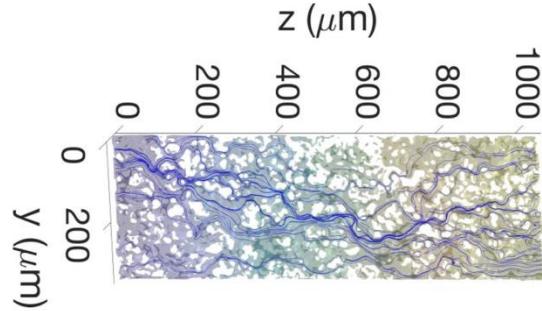
- For anodes of thickness  $< 110 \mu\text{m}$ , tunnels do not enhance electrode performance.
- A smaller  $d$  increases achieved capacity and it **decreases the optimal radius**.



Our group has been developing voxel-based simulation libraries

- In-house code:
  - FORTRAN 90, 08; MPI
  - Finite difference method
- BESFEM:
  - MFEM solver
  - Basic electrochemical process – battery electrodes

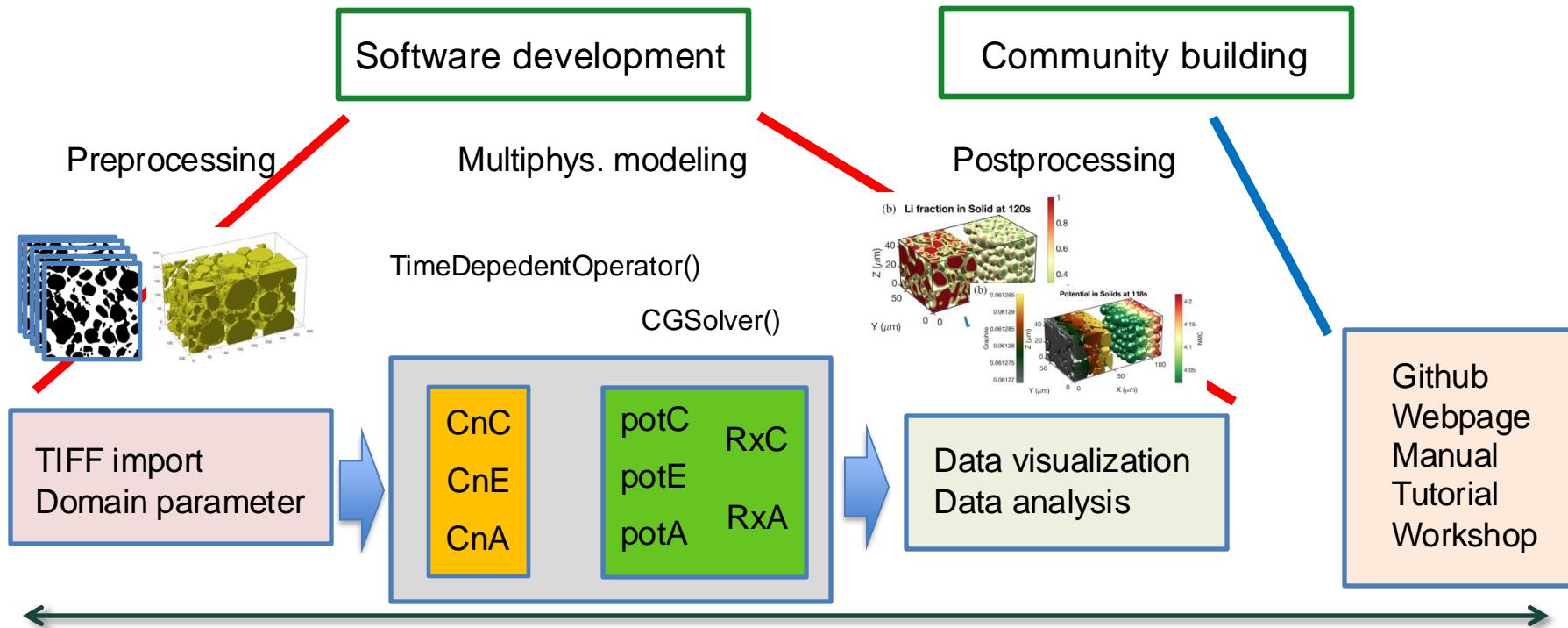
- A. Malik, K. Snyder, M. Liu, H.-C. Yu, *Journal of Energy Storage* **77**, 109937 (2024).
- A. Malik, H.-C. Yu, *Journal of the Electrochemical Society* **169**, 070527 (2022).
- D. Qu, H.-C. Yu, *Acs Appl Energy Mater* **6**, 3468–3485 (2023).
- R. Termuhlen, K. Fitzmaurice, H.-C. Yu, *Comput Method Appl M* **399**, 115312 (2022).
- D. Qu, R. Termuhlen, H.-C. Yu, *Journal of The Electrochemical Society* **167**, 140515–12 (2020).
- H.-C. Yu, D. Taha, T. Thompson, N. J. Taylor, A. Drews, J. Sakamoto, K. Thornton, *Journal of Power Sources* **440**, 227116 (2019).
- H.-C. Yu, M.-J. Choe, G. G. Amatucci, Y.-M. Chiang, K. Thornton, *Computational Materials Science* **121**, 14–22 (2016).



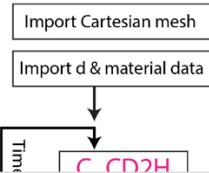
- **Phase transition** in complex microstructure.
- SBM with AMR
- **EIS** of complex microstructures
- SBM for **Navier-Stokes**
- **Diffuse double layer**
- **Linear elasticity**
- **Grain boundary diffusion**



Elements: Open-Source Battery Electrode Simulation Toolkit using MFEM (BESFEM)  
NSF CSSI, # OAC2311466



## flowchart



## In-house FORTRAN 90 code

```

68 !! --- initiate MPI
69 CALL MPI_INIT(errcode)
70 CALL MPI_COMM_RANK(MPI_COMM_WORLD,rank,errcode)
71 CALL MPI_COMM_SIZE(MPI_COMM_WORLD,np,errcode)
72
73 gy = 186 - 0
74 gx = 1128 - 0
75 gz = 320 - 0
76
77 !! =====
78 !! domain decomposition, only in Y and Z directions
79 rnb = 12 !! rows of ranks
80 cnb = 16 !! columns of ranks
81 CALL MyDmCmpn_YZ(rank,gy,gz,rnb,cnb,ddR,ny,lwy,upy,nz,lwz,upz)
82 !! y index along R; z index along C
83 nx = gx
84 !! =====

```

```

// Create local FE space.
H1_FECollection fec(order, pmesh.Dimension());
ParFiniteElementSpace fespace(&pmesh, &fec);
// HYPRE_BigInt total_num_dofs = fespace.GlobalTrueVSize();

// Map local to global element indices.
Array<HYPRE_BigInt> E_L2G;
pmesh.GetGlobalElementIndices(E_L2G);

Array<int> gVTX(nC);                                // global indices of corner vertices
Array<int> VTX(nC);                                // local indices of corner vertices
.
.
.

124 D0 = (De/2_598606299407882d-0e)*0_0006667
125 tcl = (2*t_minus-1.0)/(2*t_minus*(1.0-t_minus))
126 tc2 = 1.0/(2*t_minus*(1.0-t_minus))*Cst1

```

## C++ code using MFEM solver

```

65 // Create global FE space for distance function.
66 H1_FECollection fec(order, gmsh.Dimension());
67 FiniteElementSpace fespace(gmesh, &fec);
68
69 // Read global distance function
70 GridFunction gdsf(&fespace);
71 int nnn = gdsf.Size();
72 if (nnn == 0) {
73     myfile.open(dsF_file);
74     for (int gi = 0; gi < nnn; gi++) {
75         myfile >> gdsf(gi);
76     }
77     myfile.close();
78
79 // west boundary size
80 Vector Rmin, Rmax;
81 gmsh.GetBoundingBox(Rmin, Rmax);
82 double l_w = (Rmax(0) - Rmin(0))*(Rmax(1) - Rmin(1));

```

number of vertices  
number of elements  
number of corner vertices  
number of corner vertices

=====
[BEGIN]
.
.
.

```

120 Array<int> gVTX(nC);                                // global indices of corner vertices
121 Array<int> VTX(nC);                                // local indices of corner vertices
122 .
123 .
124 .
125 .
126 .

```

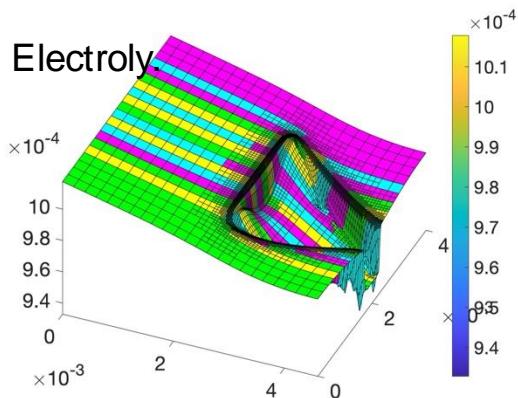


# Sequential BESFEM – 2D test

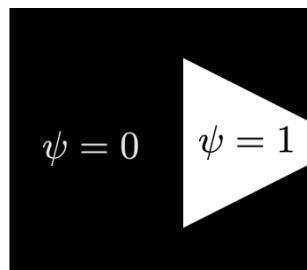


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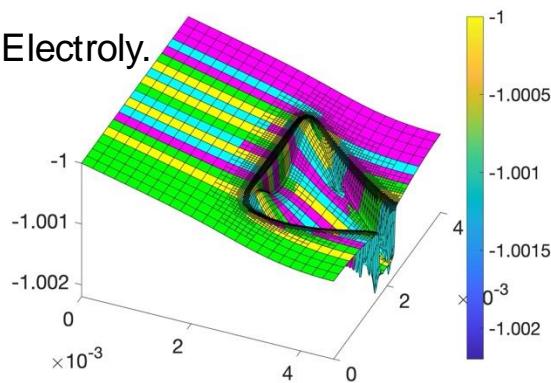
Conc. Electroly.



2D image: a single triangular particle

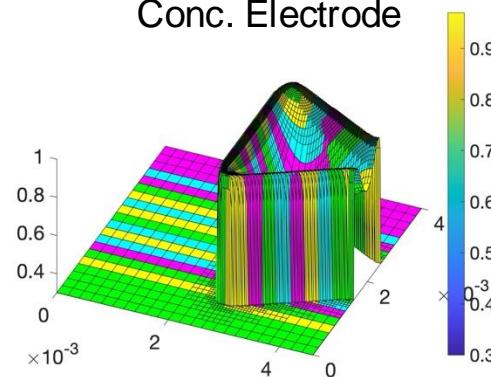


Pot. Electroly.

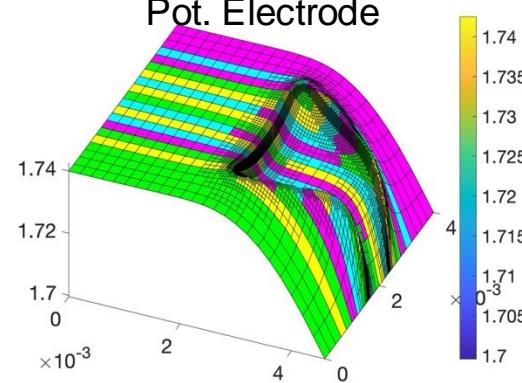


Pmesh()  
RefineByError()  
HypreParMatrix()  
HypreParVector()  
T\_Solver()  
CGSolver()

Conc. Electrode



Pot. Electrode

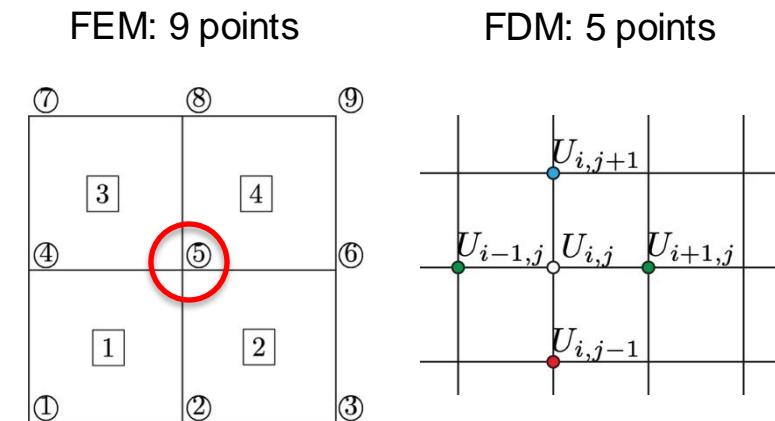




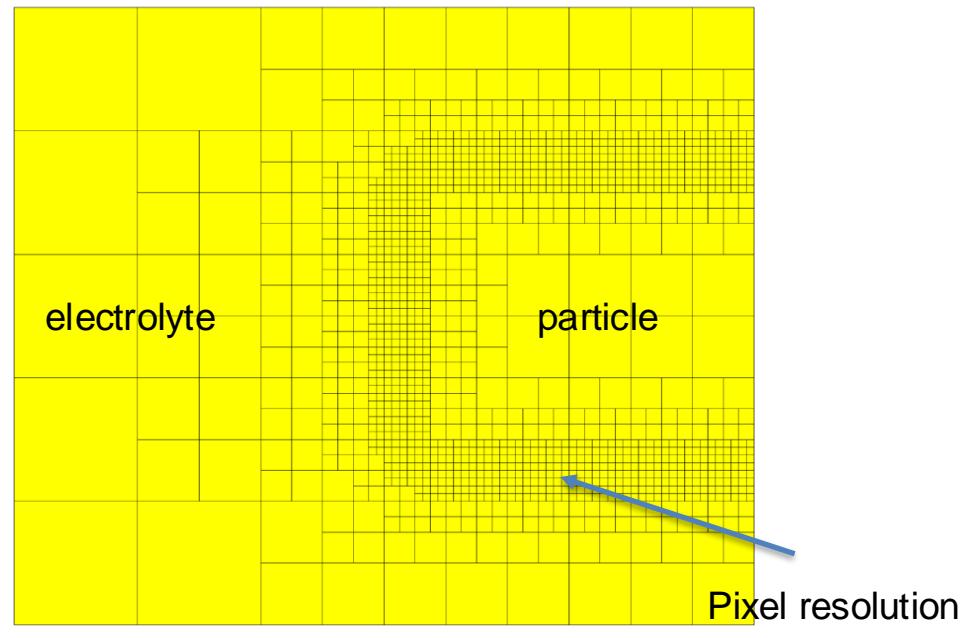
FEM:

- High accuracy
- High computational cost (slow)

e.g., default Laplace operator,  $\nabla^2$



- In terms of speed, MFEM is out-performed by in-house FDM code in original pixel resolution
- Strategy: use coarse mesh away from the bulk.
- Weighing computing costs against accuracy





## Work in progress

### Preprocessing units

- TIFF importer -- ✓
- Pixel intensity smoother
  - Sequential -- ✓
  - OOP – in progress
- Mesh coarsener

### Modeling units

Class:

- Concentration
- Electro-potential
- Reaction calc.

Use the following example codes

- Ex16p
- Ex6p



### Spin-off (potential miniapps)

- Macro-homogeneous PET simulation
- Microstructure tortuosity calculator



- Jan–May 2024: sequential code
- May—present: OOP

The screenshot shows a GitLab project page for 'BESFEM'. The sidebar on the left lists project management options like Manage, Plan, Code, Build, Secure, Deploy, Operate, Monitor, Analyze, and Settings. The main content area displays a list of files and their commit history:

Name	Last commit	Last update
Code_2D	adding a Command line ...	1 month ago
docs	Adding Doxygen support	1 month ago
.gitignore	Adding Doxygen support	1 month ago
README.md	Initial commit	4 months ago

Below the file list, there's a 'BESFEM' section with a 'Getting started' guide and a 'Add your files' section with options for creating or uploading files.

Project information on the right side of the page includes:

- 7 Commits
- 6 Branches
- 0 Tags
- 50.1 MiB Project size
- README
- Add LICENSE
- Add CHANGE
- Add CONTRIB
- Add Kubernetes
- Set up CI/CD
- Configure Inte

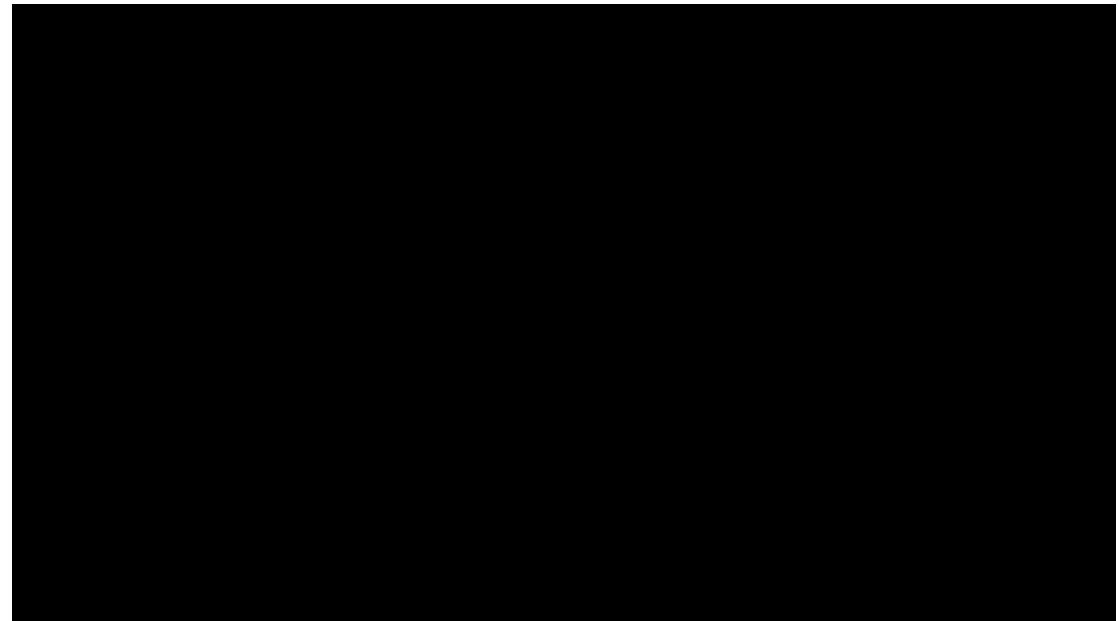
Created on May 30, 2024

Fun REU project

Sean Gibson,  
Sanika Kapre



VR set



VR visualization of battery electrode simulations



## Team members



- Ph.D. student: Anna Brandl (brandlan@msu.edu)
- Fixed term Asst. Prof. Robert Termuhlen (termuhle@msu.edu)
- Sr Specialist Dirk Colbry (colbryd@msu.edu)
- Asso. Prof. Hui-Chia Yu (hcy@msu.edu)

## Collaborators/co-developers are WELCOME!!

-- [hcy@msu.edu](mailto:hcy@msu.edu), [colbryd@msu.edu](mailto:colbryd@msu.edu)

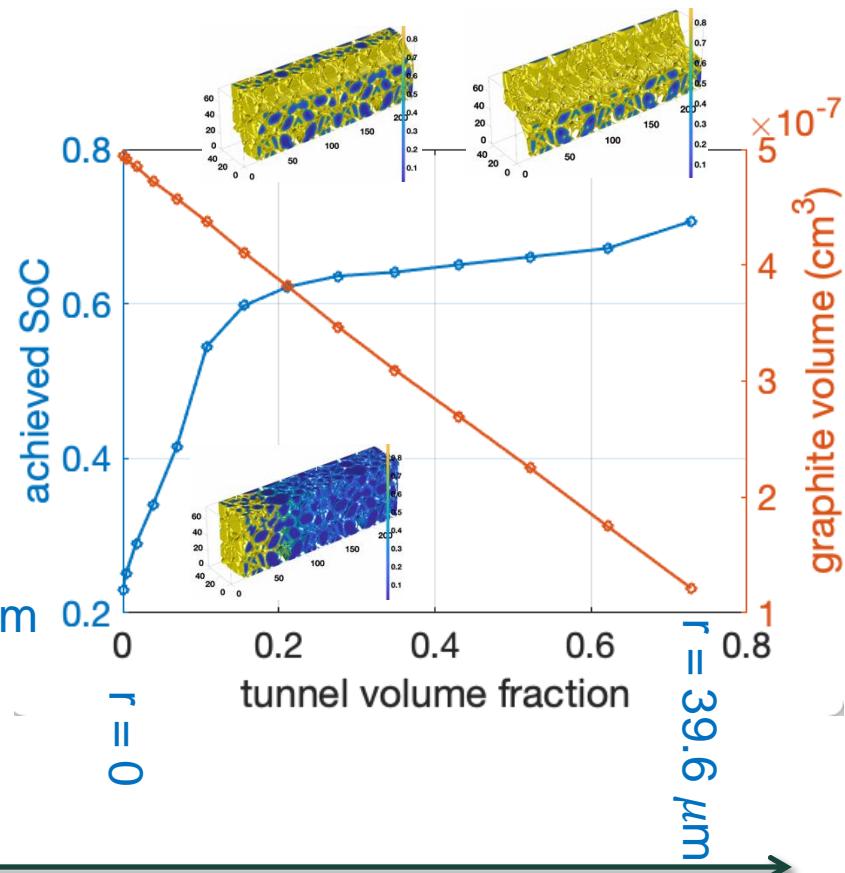
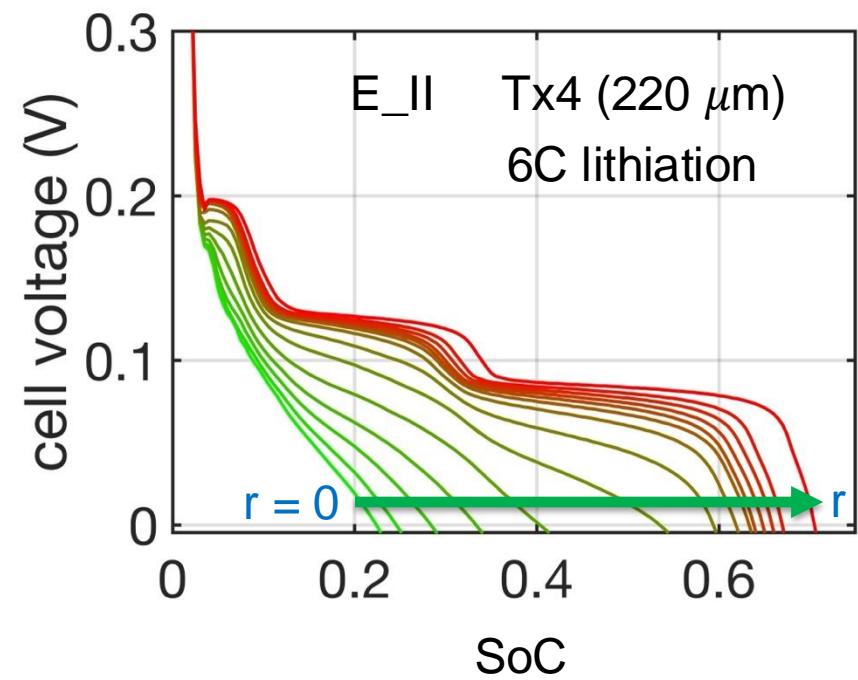
Potential add-ons:

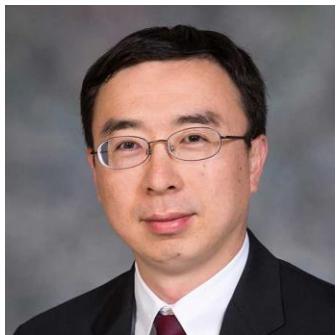
Aging model (side reaction), cycling stress, thermal simulations, Li metal plating, characterization (EIS), PET (P2D), etc.



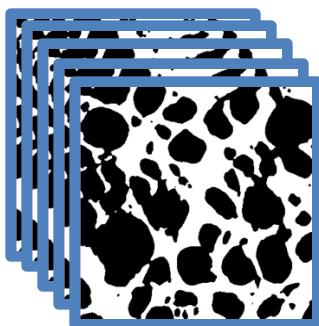


Hexagonal arrang.,  $d = 88.$   $\mu\text{m}$

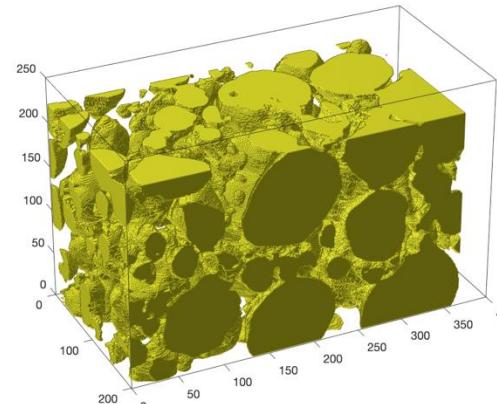




Ming Tang, Rice Univ



Stacked tiff file



Voxel representation of FIB-SEM reconstructed NMC cathode

### Image-based simulation

