



## **ADVANCED SIMULATION MODEL FOR BATTERY MANUFACTURING USING EDEM AND ROMAI**

Dr. Jungkil Shim / Altair Korea

# Introduction to EDEM

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Jungkil Shim / Altair Korea

## 1 Outline of EDEM

Multiphysics, Powder DB

## 2 Particle modeling

DEM theory, Calibration

## 3 Calendering process

Compressing electrode, foil deformation

## 4 Deep learning for Battery

Porosity, Tortuosity

## 5 Summary

Unique features

# OUTLINE OF EDEM

# Particles around us

**Natural**



**Artificial**



**Agriculture**



**Food**



**Mineral**



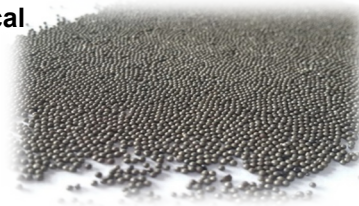
**Ground**



**Battery Powder**



**Mechanical**



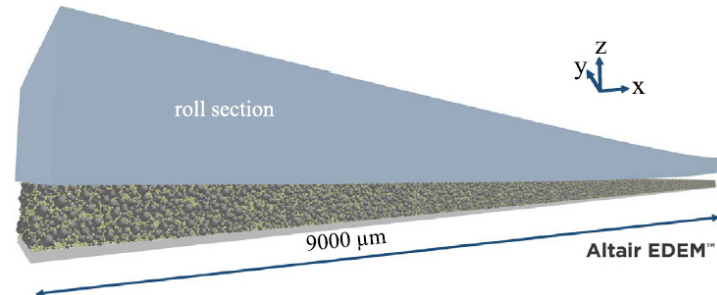
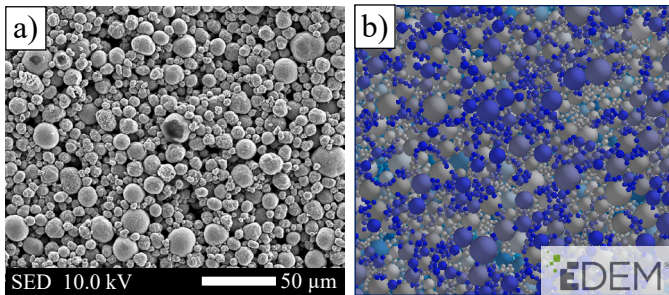
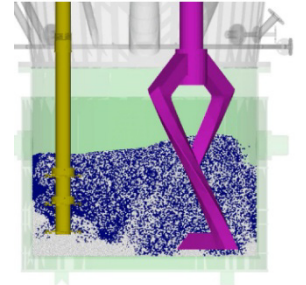
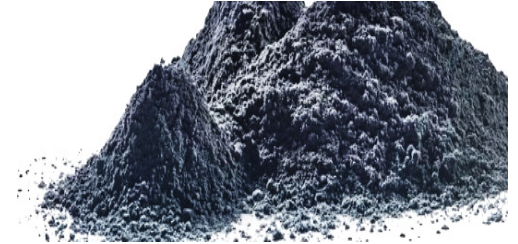
**Pharmaceutical**





# Introducing EDEM simulation technology

- Simulates behaviour of particulate materials at the particle scale
- Powered by the **Discrete Element Method** (DEM)
- **Fundamental investigation** of process mechanics at macro and micro scales
- **Virtual prototyping and optimization** of equipment and process operation
  - **Understand how the electrode microstructure is affected during manufacturing**
  - **Simulate different materials and process conditions**
  - **Control the microstructure to optimize electrode performance**



Schreiner, D., Klinger, A. and Reinhart, G. (2020) 'Modeling of the calendaring process for lithium-ion batteries with DEM simulation', *Procedia CIRP*. Elsevier B.V., 93, pp. 149–155

# Expanding the World First Powder Database

15,000 new material models for powders

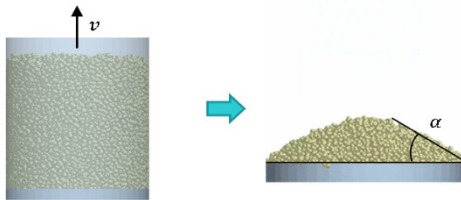
## BENEFITS :

- Eliminate manual calibration of the powder
- Understand powder flow and behavior

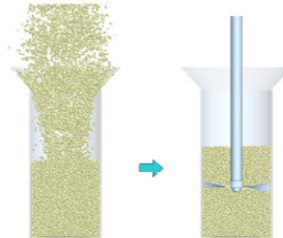
## Key Industries

Batteries  
Pharmaceutical  
Process Manufacturing

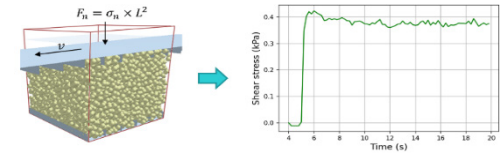
### Static Angle of Repose



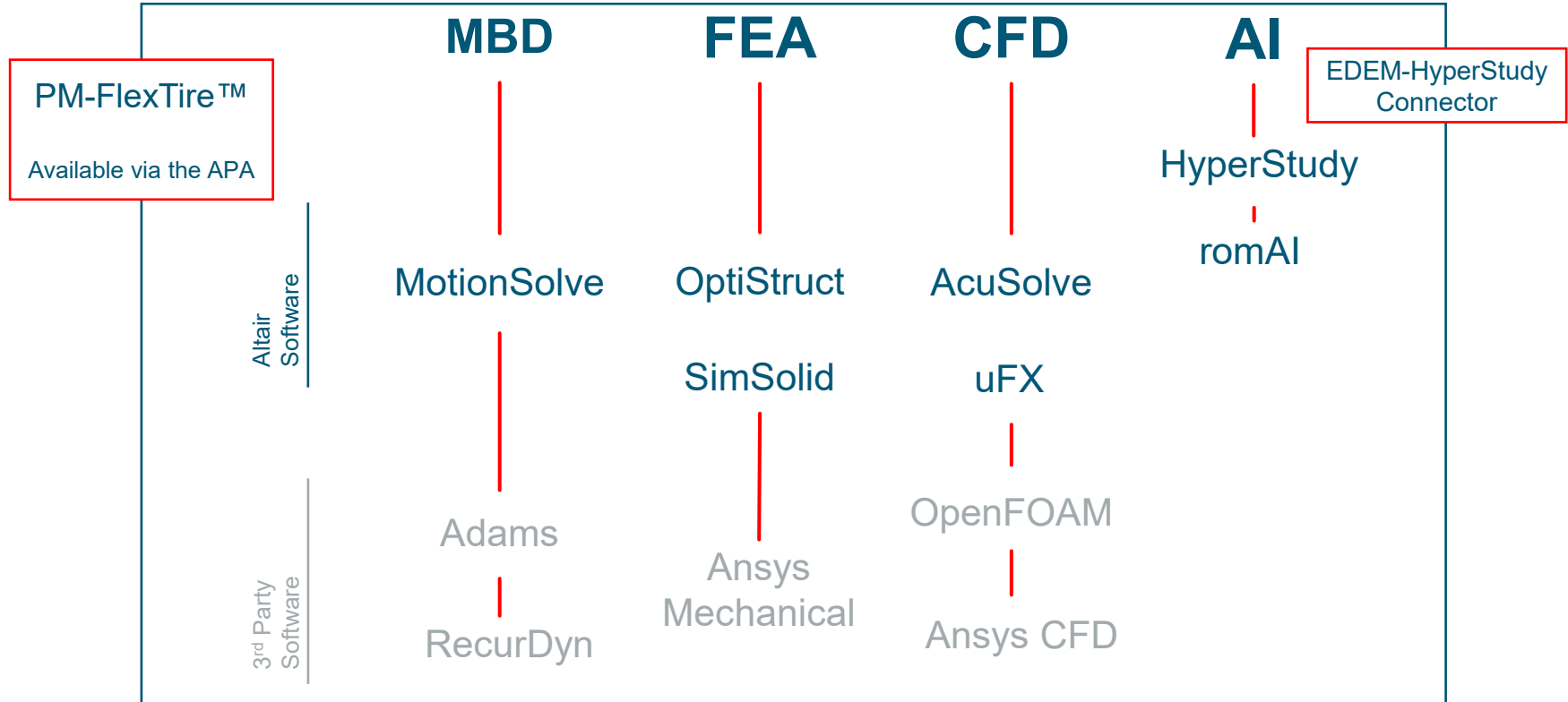
### FT4 Powder Rheometer



### Direct Shear tester



# Integration Ready for Multiphysics & AI



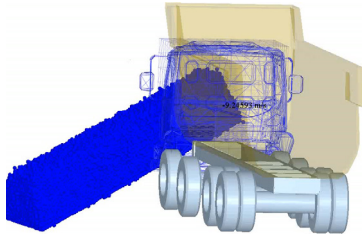
# Integration Ready for Multiphysics & AI

PM-FlexTire™

Available via the APA

**MBD**

MotionSolve



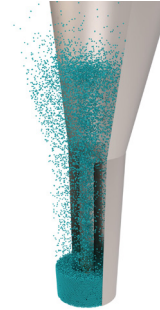
**FEA**

OptiStruct



**CFD**

AcuSolve



**AI**

HyperStudy

romAI



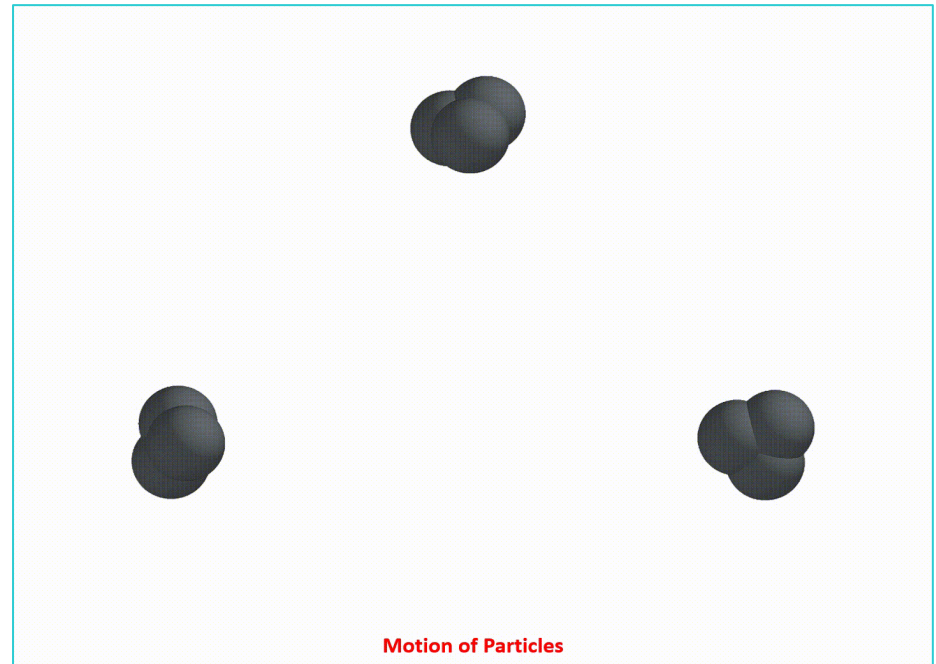
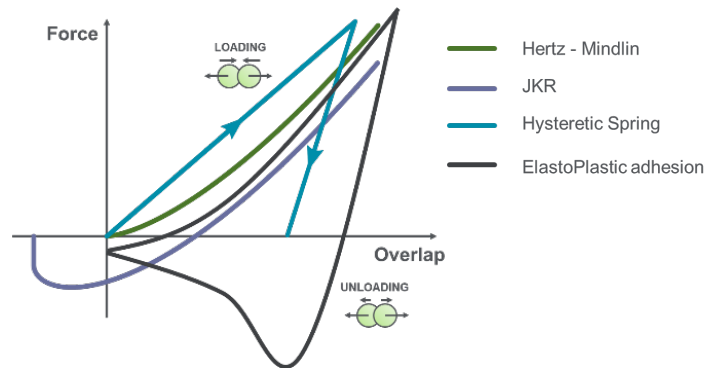
# PARTICLE MODELING

# What is DEM?

- Discrete Element Modelling – a way of simulating discrete matter
- The bulk behavior emerges from the collective interaction of each individual object

## Soft-sphere Method

Rigid particles but small overlaps allowed  
Evaluates forces accurately



# The DEM Method

## Contact model

determines forces  
acting on particles

## Bulk behavior

emerges from the  
collective interaction of  
particles

Normal overlaps  
Tangential overlaps

Resultant forces  
and moments

Update  
velocities  
and  
positions

Normal forces  
Tangential  
forces

Solve Newton  
equations of motion to  
get accelerations

# How Particle modeling?

## Micro Mechanical properties

Morphology:

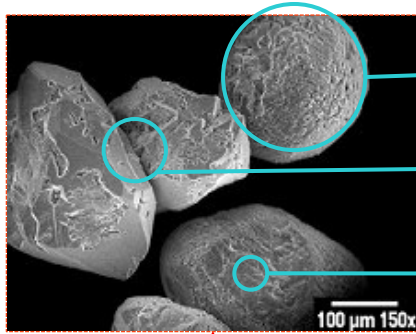
- Shape & Size

Interaction forces

- Friction, repulsion, adhesion

Material properties:

- $\nu, \rho, G$

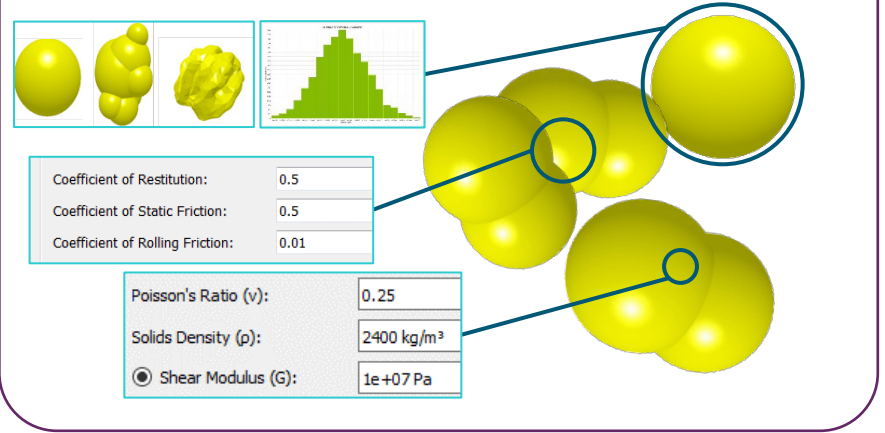


## Macro behaviors

- Capture the macro-mechanical behaviour by CALIBRATION
- Achieve high computational efficiency



## Meso-scopic modeling



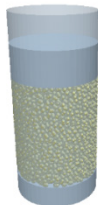


# Standard Test for Battery process

## Quasi-static flow regime

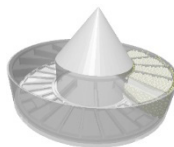
Non-critical state consolidation

Uniaxial compression



Critical state consolidation

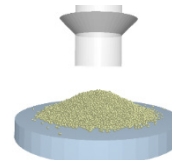
Direct shear



## Dynamic flow regime

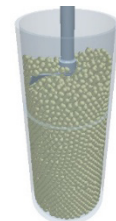
Low stress free surface flows

Angle of repose



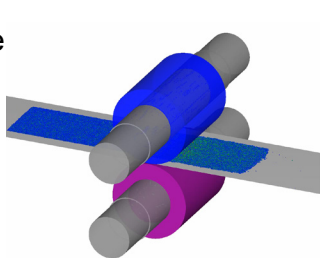
Highly dynamic systems

FT4 Flow Energy

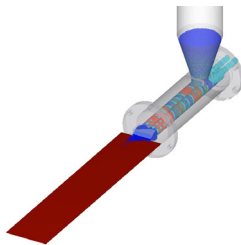


lab-scale

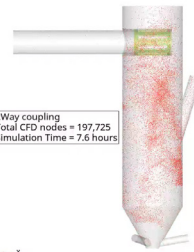
Industrial-scale



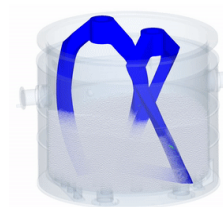
- Calendering



- Hopper
- Screw granulation

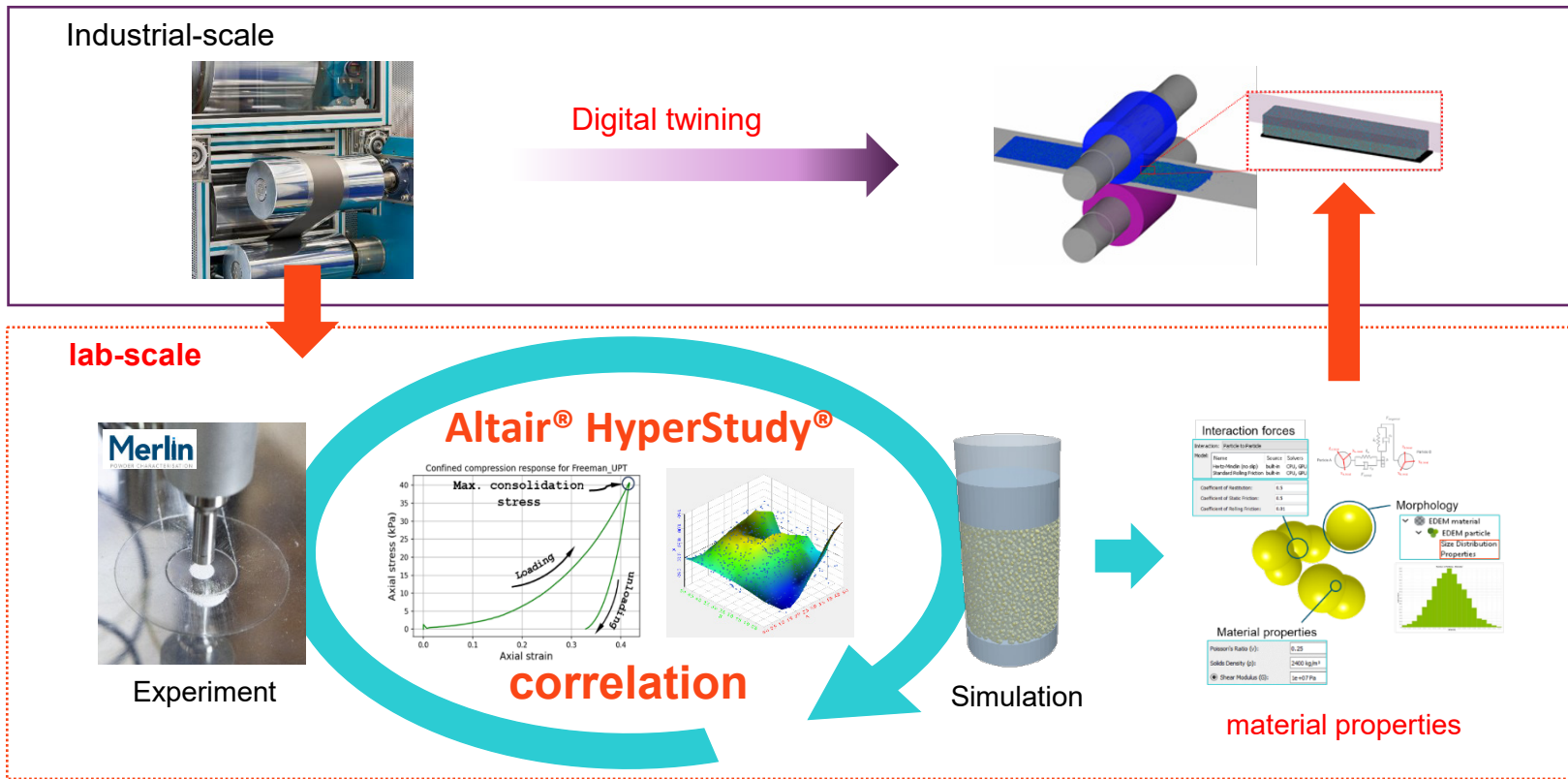


- Jet milling
- Powder drying



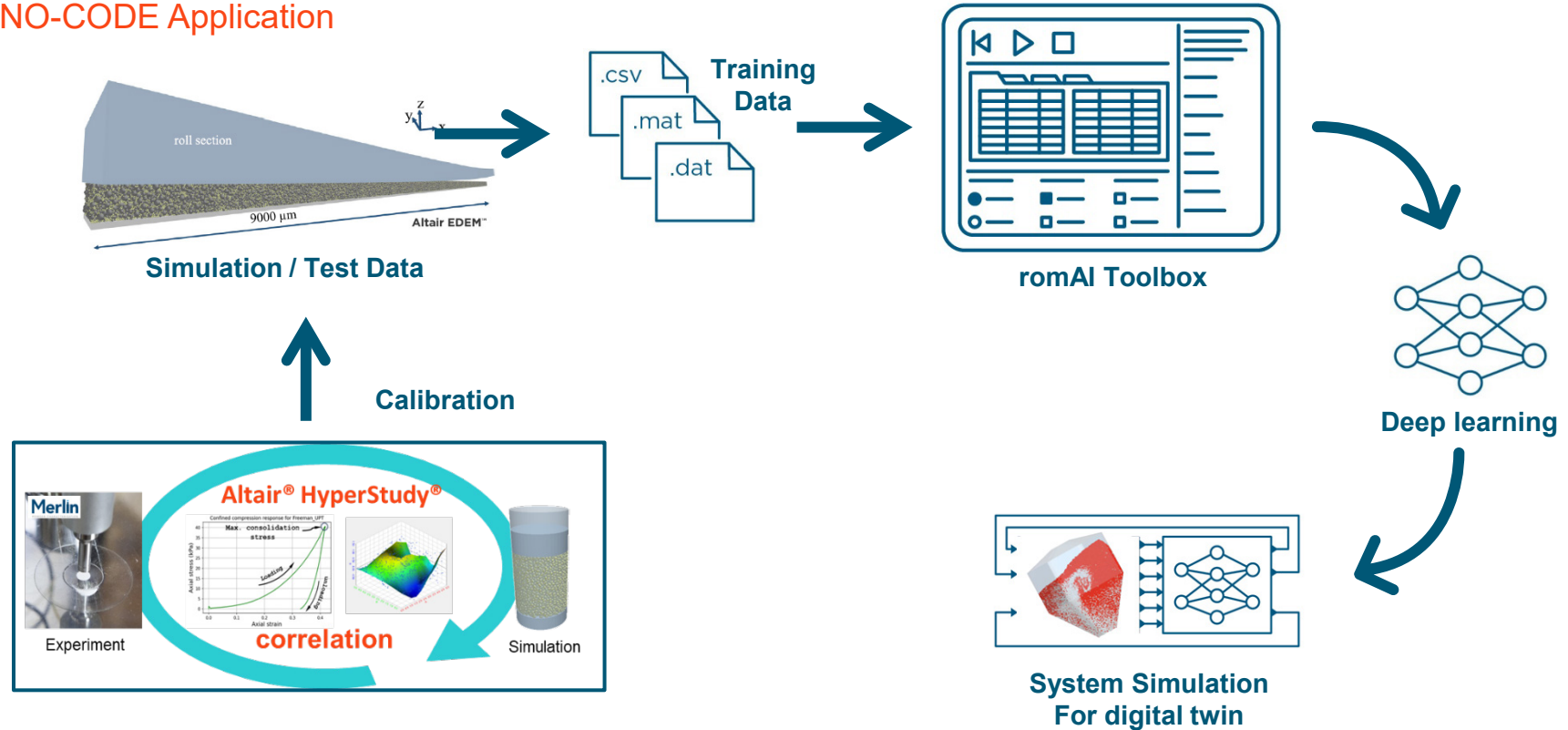
- Mixing
- Granulation

# Automation for calibration using EDEM+HyperStudy



# AI model generation with Altair® romAI™

## NO-CODE Application



# CALENDERING PROCESS USING EDEM + OPTISTRUCT



# Particle Level Simulation for Battery Manufacturing Process

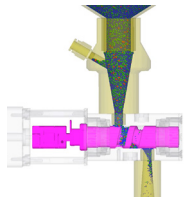
- DEM is the most suitable tool for simulating the battery cell manufacturing process.

## Cell manufacturing process

Source : Altair EDEM



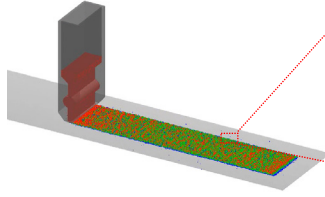
Powder Mixing



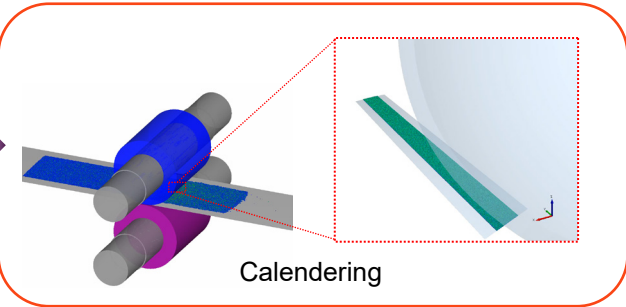
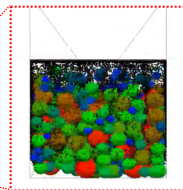
Feeding process



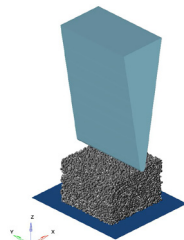
Wet mixing



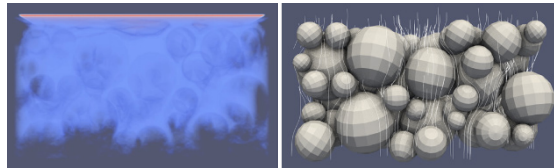
Slurry coating and Drying



Calendaring



Notching



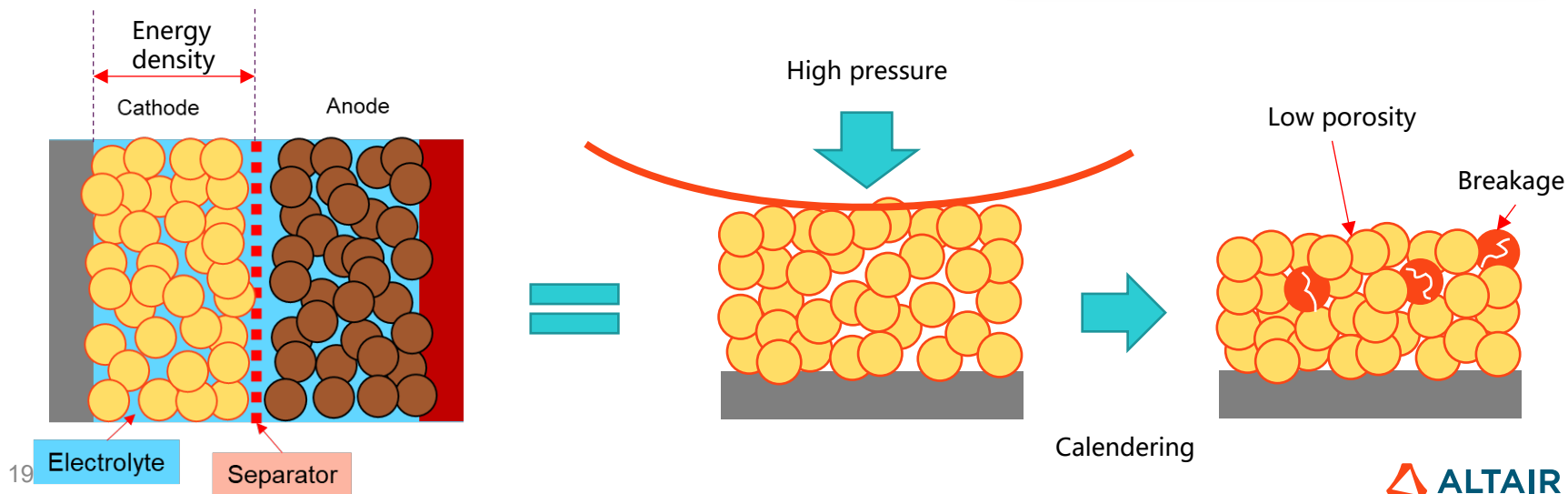
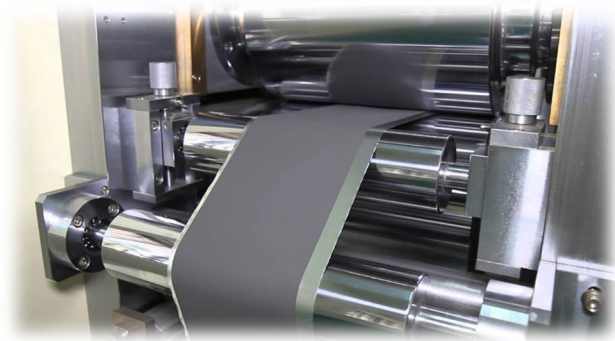
Electrolyte injection

# Use Cases of LIB manufacturing process

Process	Calibration method	KPI	Value to customer	Results from simulation	Solutions
<b>Packing</b>	Bulk density Angle of repose	Maximizing the bulk density for high energy density	Minimizing experiments with material variations	Packing density	EDEM
<b>Calendering</b>	Bulk density 1axis compression	Optimizing the process condition for the Optimal microstructure		Porosity tortuosity Connectivity	EDEM Optistruct
<b>New material</b>	Bulk density 1axis compression	Optimizing the blending ratio and PSD for high energy density		Mass ratio PSD Shear modulus	EDEM, AI
<b>Mixing</b>	Rheometer	Optimizing the process condition for mixing uniformity	Higher efficiency, lower losses, better quality	Mixing index	EDEM, AI
<b>Multi roll mill (No solvent)</b>	Bulk density Direct shear test	Optimizing the process condition for the uniform thickness & film strength		Thickness of film Stress of particles	EDEM, AI

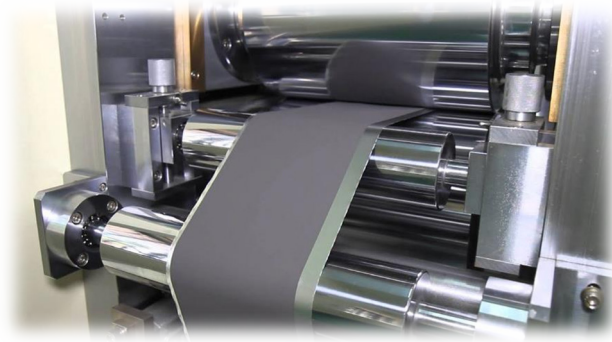
# Importance of Calendering

- The high energy density of the cell results from the high compressive density of the electrode.
- High pressure Calendering is required for high compression density.
- Particle density increases with high pressure, but efficiency decreases due to particle breakage or reduced voids.

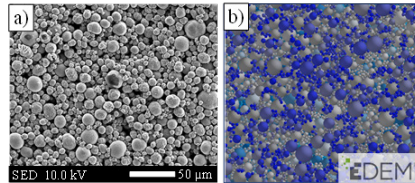
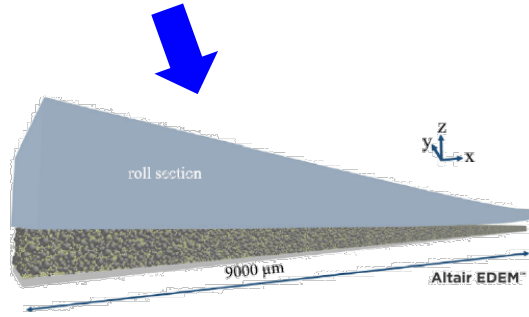


# Importance of Calendering

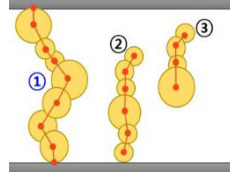
- Particle properties
- Rheology
- Process parameters



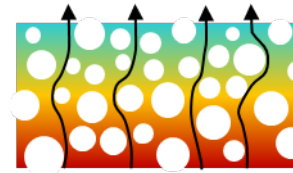
- Energy density
- Resistivity
- Discharge rate
- Service life etc...



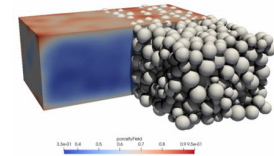
Connectivity



Tortuosity



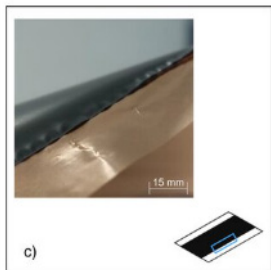
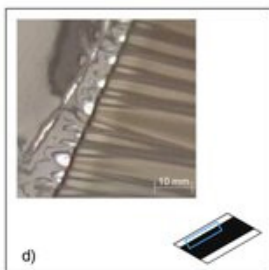
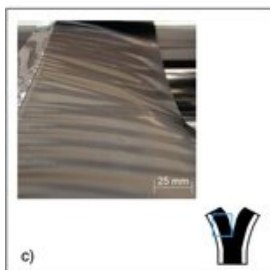
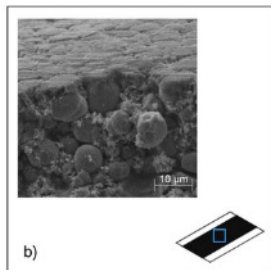
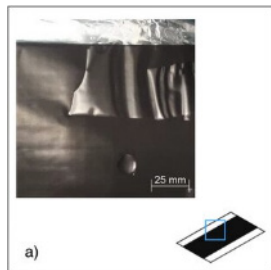
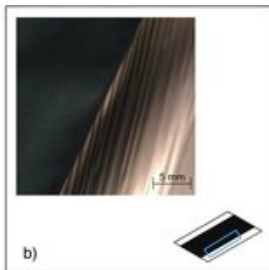
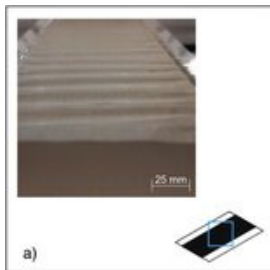
Porosity





# Electrode Defects

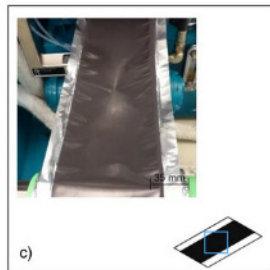
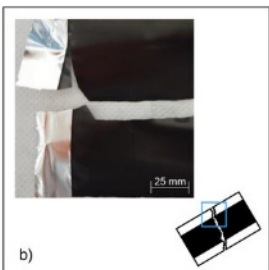
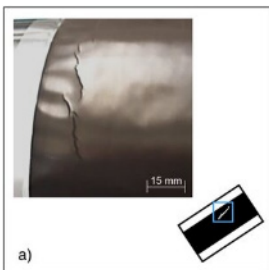
## Defect related to geometrical defects



a) electrode corrugation, b) foil embossing,  
c) saber effect d) corrugations at the coating edge.

a) local thickness and density fluctuations  
b) sealed surface pores c) coating detachment.

## Defect related to mechanical defects



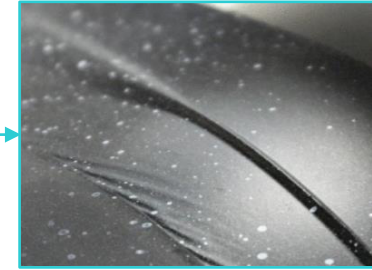
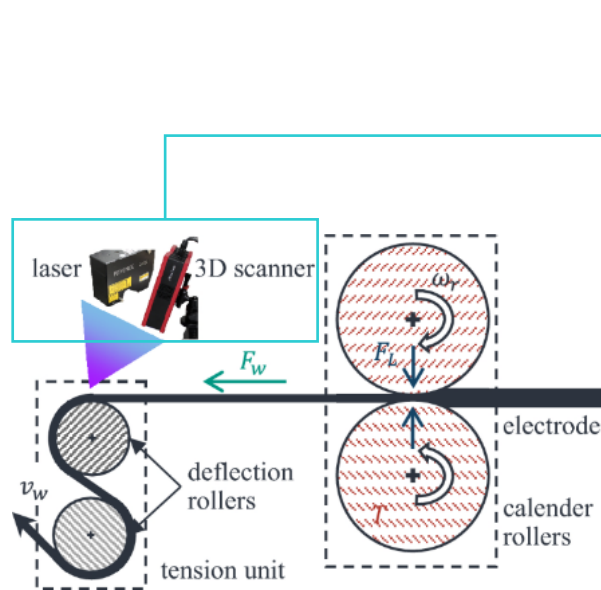
a) crack formation in electrode, b) foil tear  
c) embrittlement of the electrode.

*"Classification of Calendering-Induced Electrode Defects and Their Influence on Subsequent Processes of Lithium-Ion Battery Production",  
Till Günther, David Schreiner, Ajinkya Ganesh Metkar, Gunther Reinhart*

# Process variable analysis

- Main parameters

- Bulk density of electrode  $\rho$
- web speed  $v_w$
- angular speed of the rollers  $\omega_r$
- temperature  $T$  of the rollers
- line load  $F_L$
- web tension  $F_w$

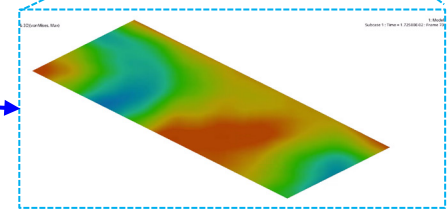
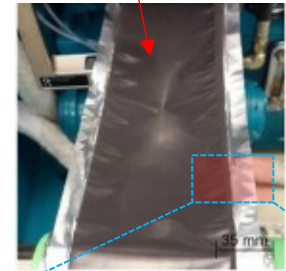
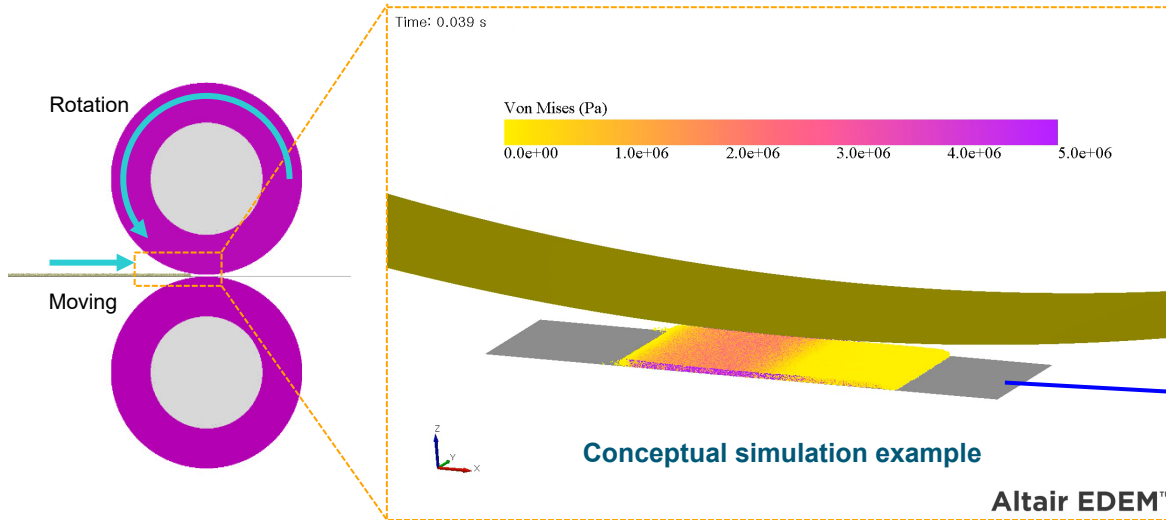


Formation of a longitudinal wrinkle with the coating edge on the left side

*"Analysis of longitudinal wrinkle formation during calendering of NMC811 cathodes under variation of different process parameters" Ann-Kathrin Wurba, Lennart Altmann, Jürgen Fleischer*

# Calendering – concept

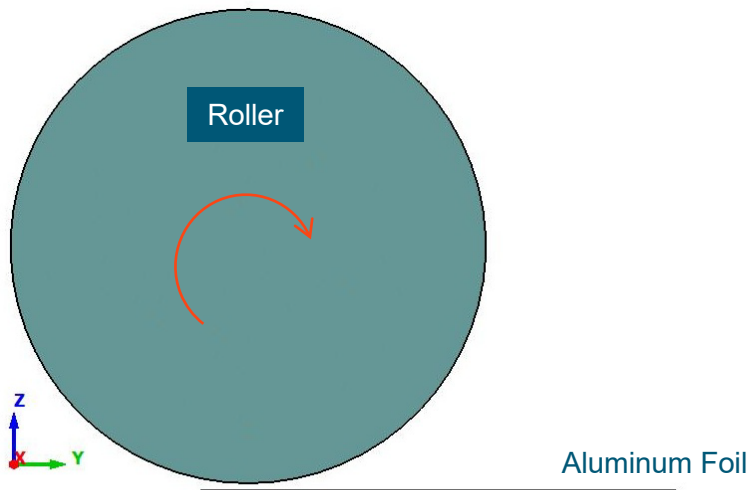
- EDEM can provide the evolution of microstructure during press process
- Deformation of foil can be simulated using DEM-FEM 2way coupling
- Easy to optimize the process parameters of press process using Hyperstudy



Foil deformation

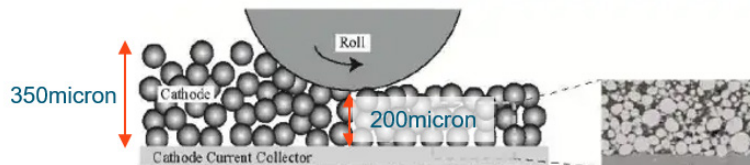
## Calendering – outline

- Calendering using **EDEM-FEA coupling** involves modeling the interaction between particulate materials and deformable structures.
- This coupling allows detailed analysis of material behavior under compression such as
  - ✓ Roll force
  - ✓ Stress distributions
  - ✓ Structural deformations



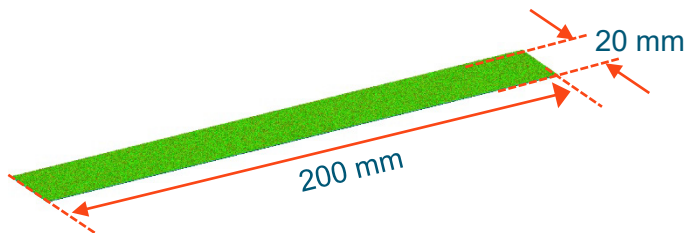
## Modeling detail

- Cathode particles are modelled for the dimension such as
- Length = 200 mm
- Width = 20 mm
- Depth = 0.35 mm (350 micron)
- Roller is moved to compact the cathode material to a depth of 200 micron
- Aluminum foil is fixed in vertical (Z-axis) and free in other two axis
- Aluminum modelled using Solid (Hexa) elements

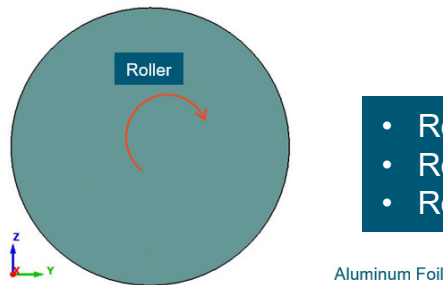


<https://iestbattery.com/>

Roll press

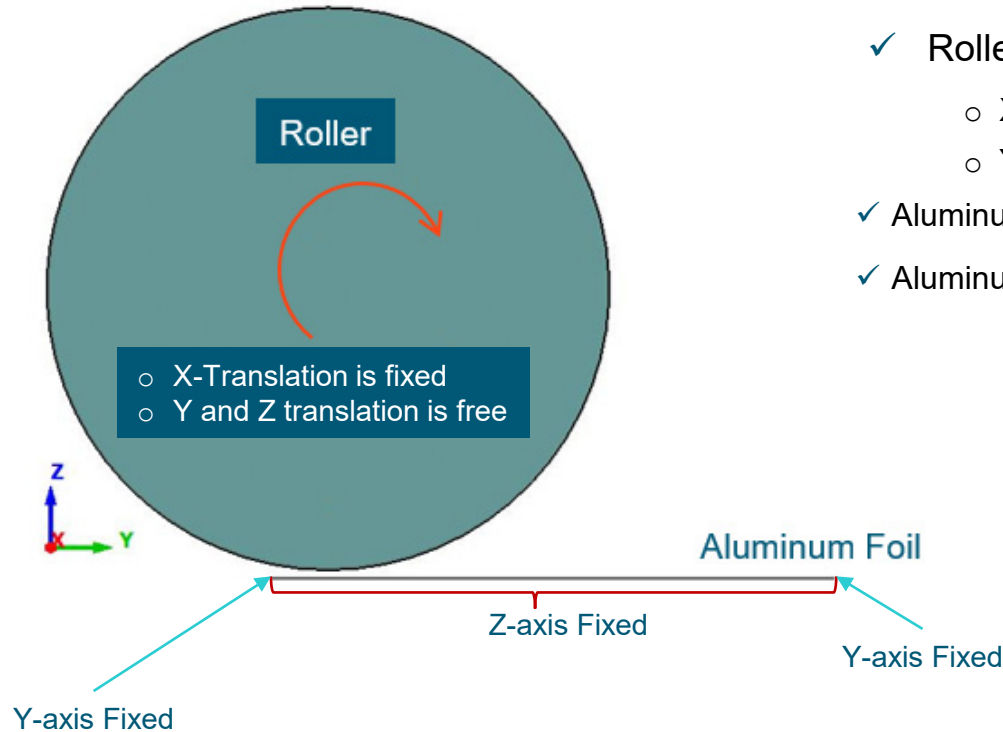


0.35 mm



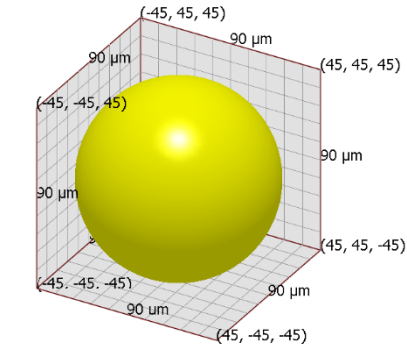
- Roller rotates at 3 rad/s
- Roller translational velocity is 0.3 m/s
- Roller Diameter is 200mm

# Boundary condition



- ✓ Roller Constrain:
  - X-Translation is fixed
  - Y and Z translation is free
- ✓ Aluminum Foil bottom face is constrained in Z- axis
- ✓ Aluminum Foil Side face is constrained in Y- axis

# EDEM setting



Size Distribution

normal

☒ Number of Particles ☐ Mass

Normal Size Distribution Parameters

Mean: 1

Std Dev: 0.05

☐ Cap

Scale By

☒ Radius ☐ Volume

Lower: 0.85

Upper: 1.15

electrode Properties

Poisson's Ratio ( $\nu$ ): 0.28

Solids Density ( $\rho$ ):  $3e+07 \text{ kg/m}^3$

☒ Shear Modulus ( $G$ ):  $1e+07 \text{ Pa}$

☐ Young's Modulus ( $E$ ):  $2.56e+07 \text{ Pa}$

Interactions

Interaction: All

Coefficient of Restitution: 0.1

Coefficient of Static Friction: 1.8

Coefficient of Rolling Friction: 1

Particle Generation

Factory Type: dynamic

☐ Unlimited Number

☒ Total Number: 1900000

☐ Total Mass: 100 kg

Generation Rate

☒ Target Number (per second) ☐ Target Mass

$1e+07$

☐ Mass Flow Equation  $f(t) [\text{kg}]$  0

Start Time:  $1e-12 \text{ s}$

Max Attempts to Place Particle: 20

Overlap Check Based on: ☒ Physical Radius ☐ Contact Radius

## Physics for particle to particle

Active Interactions

electrode:electrode

Model Parameters Input

Constant pull-off force: 0 N

Surface Energy:  $0.1 \text{ J/m}^2$

Contact Plasticity Ratio: 0.95

Slope Exp: 1

Tensile Exp: 1.5

Tangential Stiff Multiplier: 0.666667

Estimated Properties

Bond Number: 0.01325 ( Low Cohesion )

Current Interaction Timestep:  $4.374e-06 \text{ s}$

Recommended Simulation Timestep:  $4.374e-06 \text{ s}$

Critical Timestep Interaction: electrode:electrode



# Simlab(Optistruct) setting

- Nonlinear material properties for Al foil

Create Material

Name: Aluminium\_2219  
Material ID: 1000  
Category: Solid  
Class: Metal  
Model: Isotropic

**Common Properties**

Name	Value	Table
Density	2840 kg/m3	none

**Mechanical Properties**

**Elastic**

Name	Value	Table
Youngs_modulus	7.32e10 Pa	none
Poissons_ratio	0.331	none
Shear_modulus		none
Thermal_Expansion		none
Reference_Temperature		none
Damping_coefficient		none

**Plastic**

Method: Stress strain curve

Yield stress-strain table: Table

Hardening rule: Isotropic Hardening 0.15

Yield Criterion: NONE

**Failure Model**

**Biquad failure**

BIQUAD parameters: ☐ False

**Element based material**

Equivalent layer information: none

Element Vs Material Parameters: none

Description:

OK Cancel

Stress-PlasticStrain

Name: Table 7

Name	Stress (Pa)	Plastic Strain
1	3.581e+08	0
2	3.624e+08	0.001
3	3.666e+08	0.002
4	3.706e+08	0.003
5	3.746e+08	0.004
6	3.785e+08	0.005

Plot 1: Stress Vs Plastic Strain

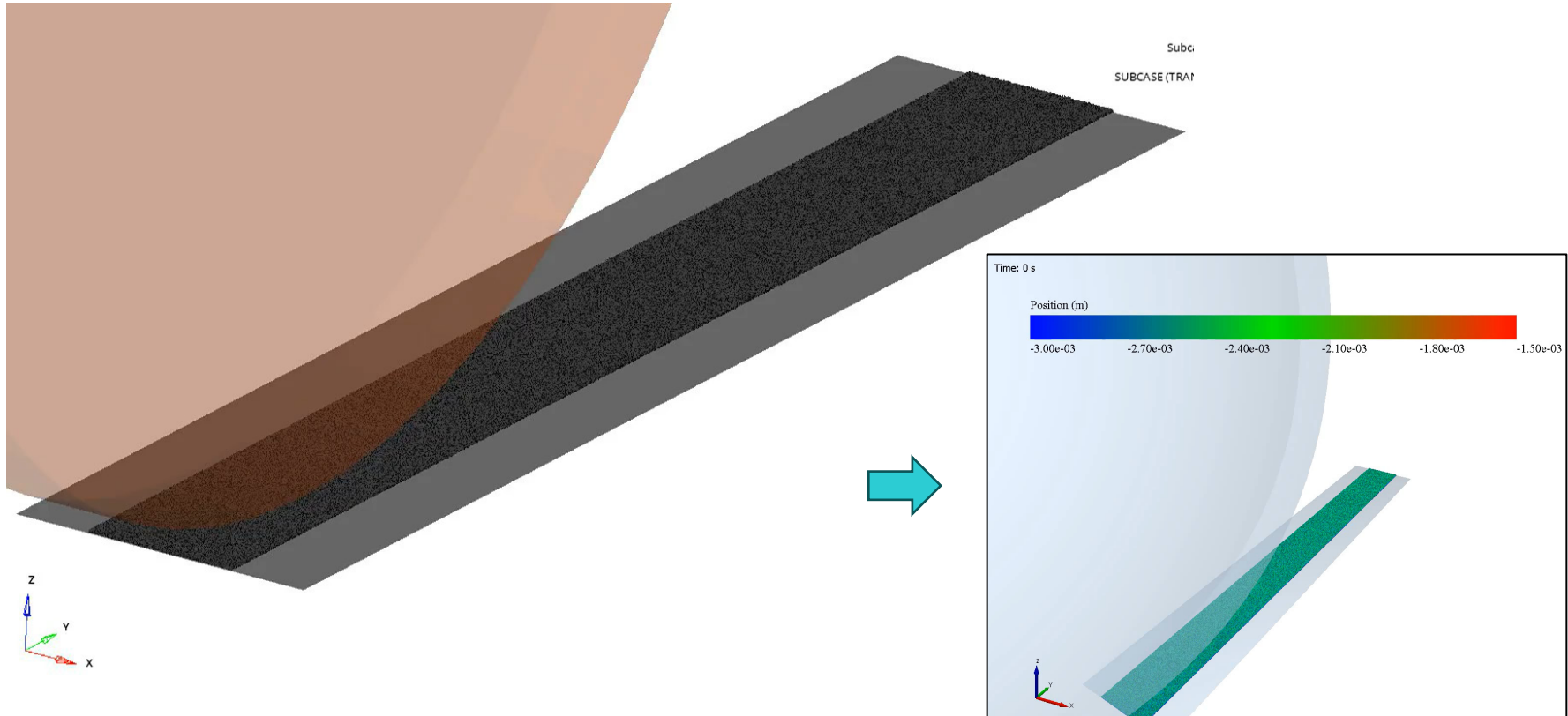
Import OK Cancel

Name	Card	Value
Termination Time for Geometric Nonlinear Analysis		
Termination time	TTERM	0.7 s
Adaptive Dynamic Relaxation		
Adaptive Dynamic Relaxation	DYREL	Yes
Solution Control Parameters(PARAM)		
Check Element Quality	CHECKEL	No
Element integration scheme	EXPISOP	Solver Default
Frequency for output control	NOUTCYC	100
Hourglass control parameters		
Hourglass type	HGTYP	Flanagan-Belytschko viscous fo
Scale factor for hourglass forces	HGFAC	0.1
Step Options for Explicit(TSTEPE)		
Explicit time step control types	TYPE	Minimum stable elemental time i
Scale factor for stable time increments	DFAC	0.9
Minimum allowed time increment	DTMIN	2e-08 s
Include Files		
Input Output Section File	--	
Bulk Data Section File	--	

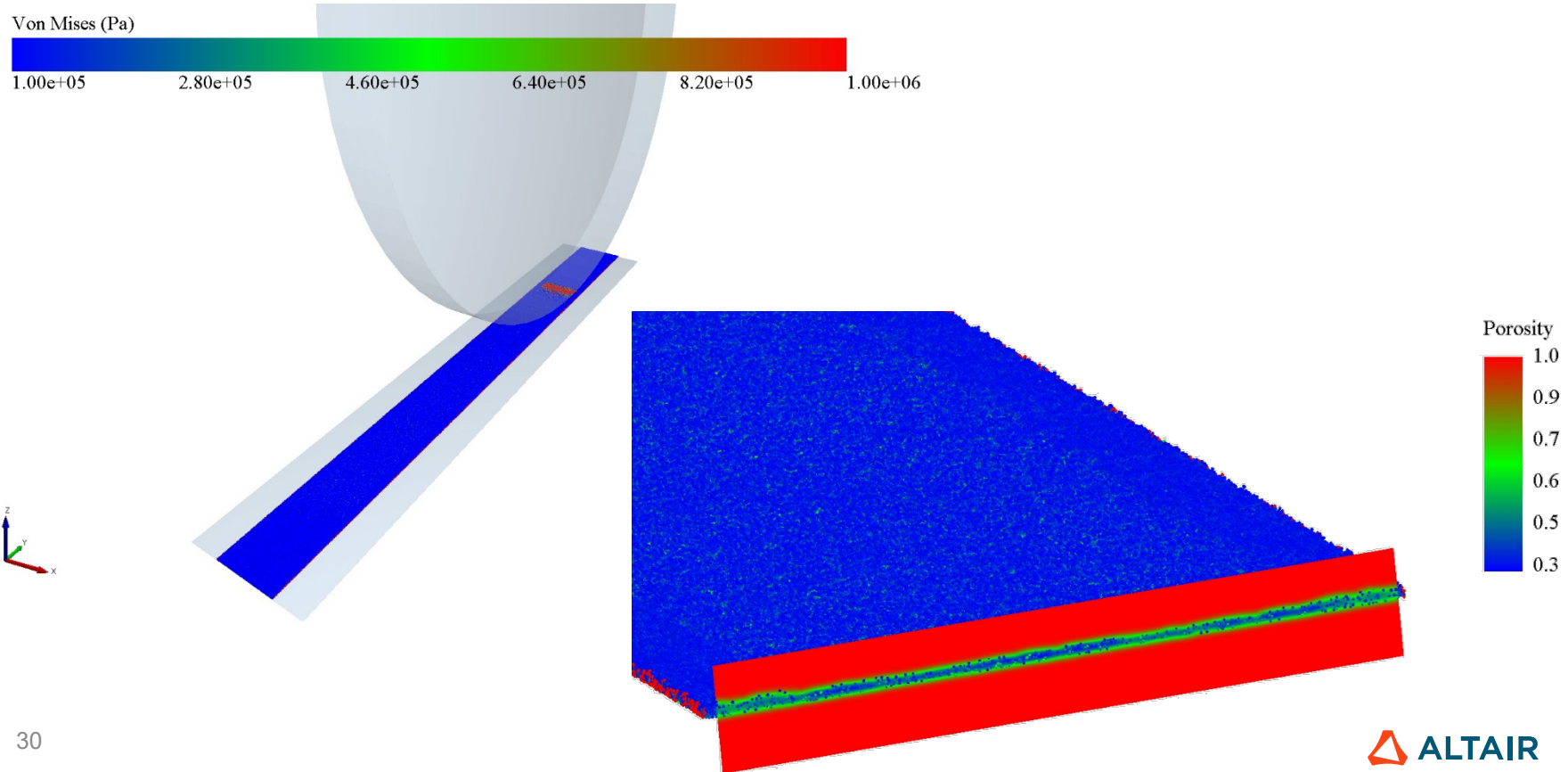
Solver Settings

Name	Value
Structural options	
Coupling timestep	<input checked="" type="checkbox"/> 1e-05 s
Filtering Interval by time period	<input type="checkbox"/> 0.15 s

# Simulation Overview



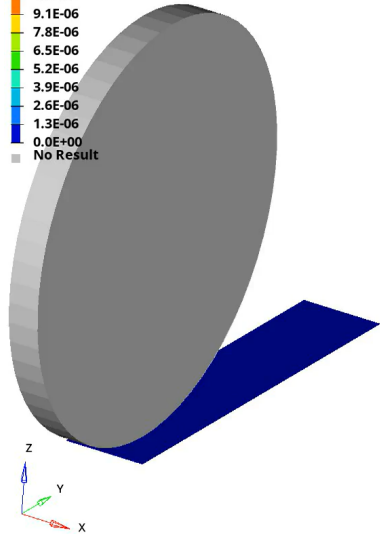
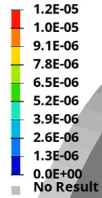
# Particle Stress & Porosity



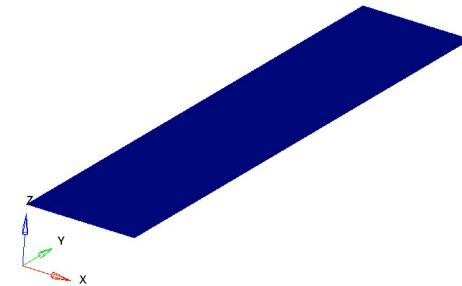
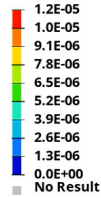
# Aluminium Foil

## Displacement

Contour Plot  
Displacement(Mag)  
Analysis system



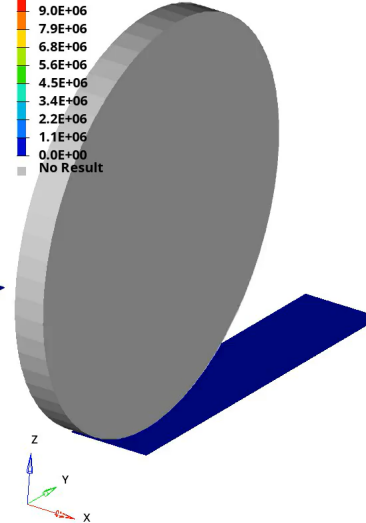
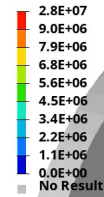
Contour Plot  
Displacement(Mag)  
Analysis system



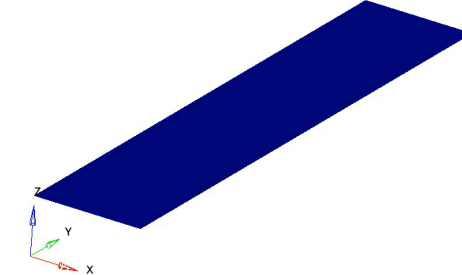
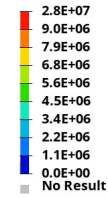
Roller is Hidden

## VonMises Stress

Contour Plot  
Element Stresses (2D & 3D)(vonMises)  
Analysis system  
Simple Average

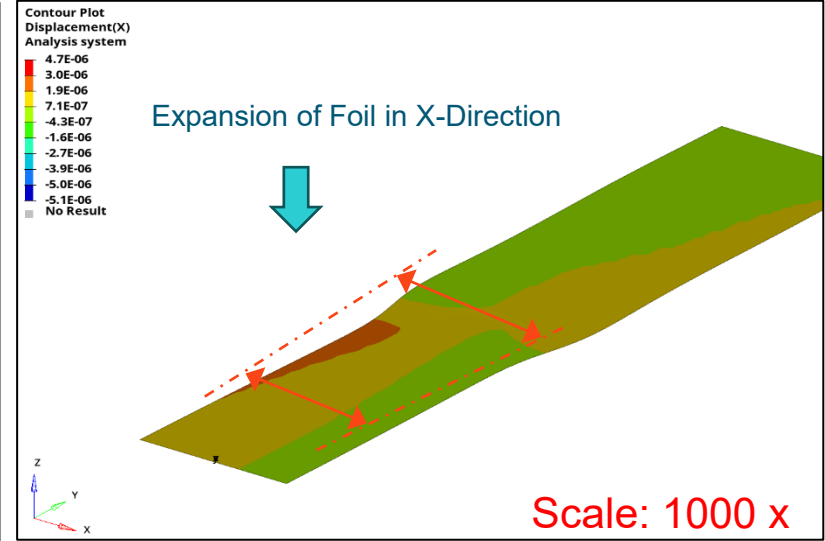
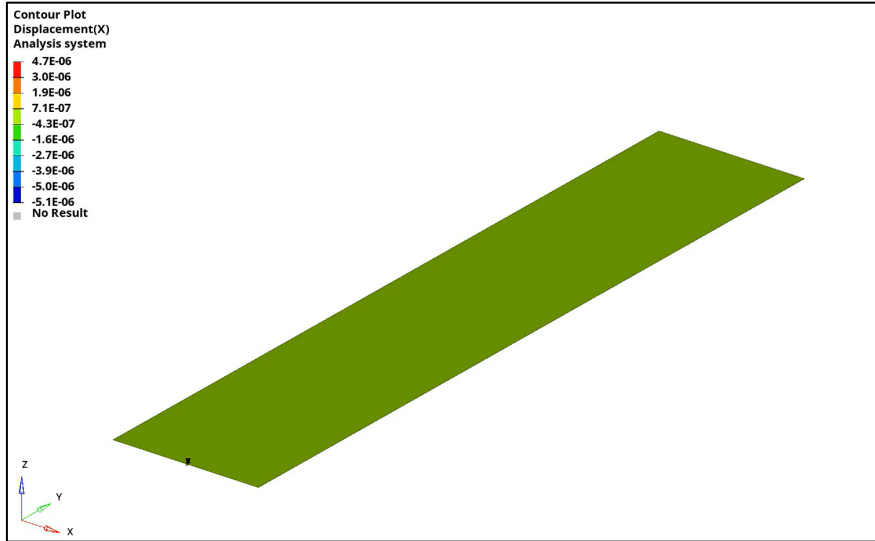


Contour Plot  
Element Stresses (2D & 3D)(vonMises)  
Analysis system  
Simple Average



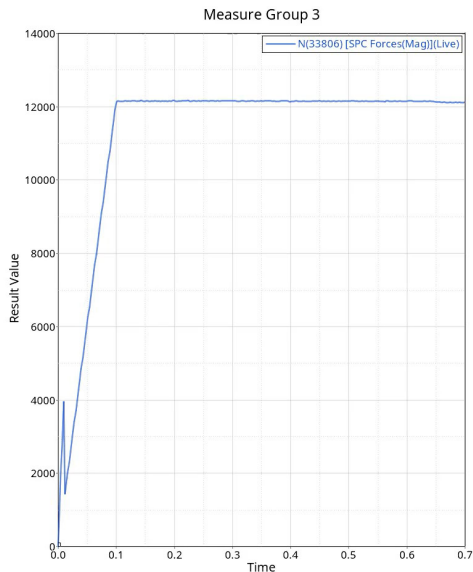
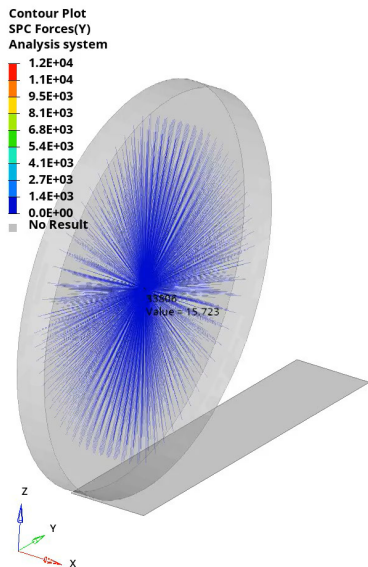
Roller is Hidden

# Aluminium Foil Displacement

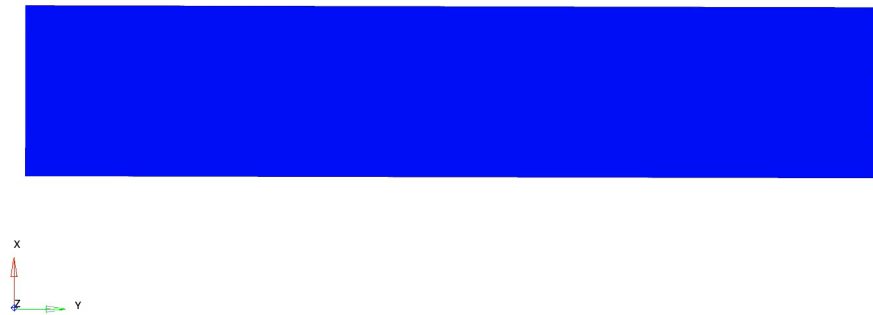
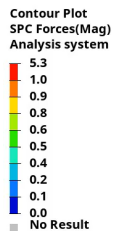


# Force

## Roller Reaction Force



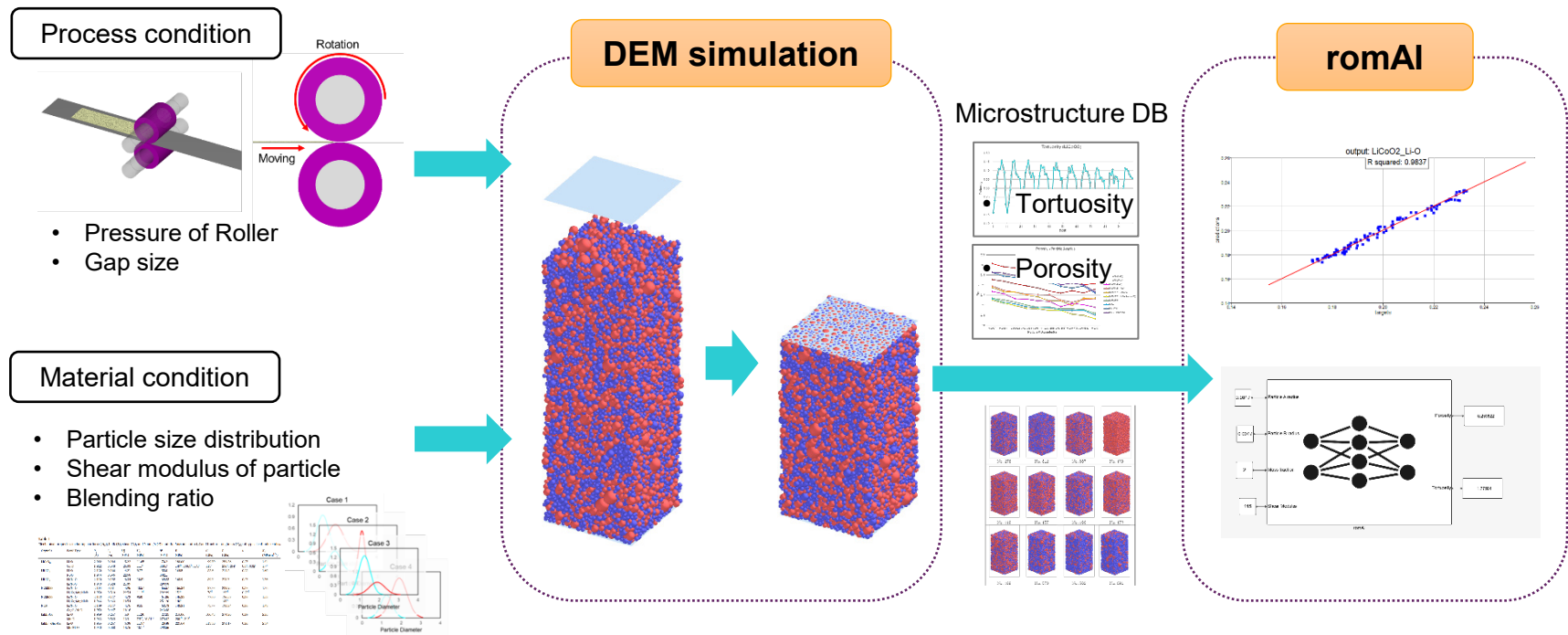
## Aluminium Foil Reaction Force



# **ROLL PRESSING PROCESS USING EDEM + ROMAI**

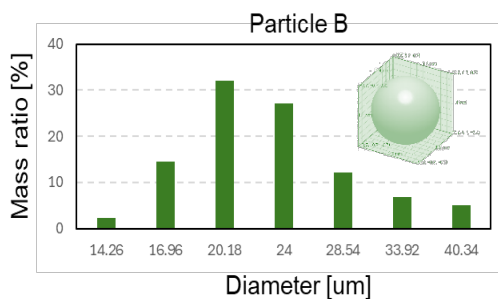
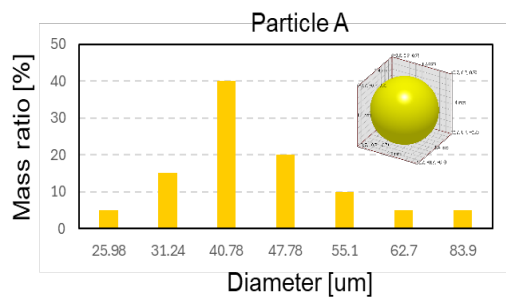


# Overall process



# Particle size distribution

- Variable parameters
  - Mass ratio of A and B
  - Scale of D50 of each particle
  - Shear modulus, Poisson's ratio of each particles
- Fixed parameters
  - Total mass of particles
  - PSD of each particle



Crystals	Bond Type	G (GPa)	E (GPa)	$\nu$
LiCoO <sub>2</sub>	Li-O	99.79	254.36	0.27
	Co-O	115 <sup>c</sup>	236 <sup>d</sup> , 264 <sup>e</sup>	0.3 <sup>a</sup> , 0.32 <sup>e</sup>
LiNiO <sub>2</sub>	Li-O	83.5	214.3	0.28
	Ni-O			
LiNiO <sub>2</sub>	Li/Ni-O	89.7	228.7	0.27
	Li/Ni-O			
NCM333	Li/Ni-O	87.78	223.95	0.28
	Li/Co/Mn/Ni-O	78 <sup>d</sup>	199 <sup>d</sup>	0.25 <sup>d</sup>
NCM622	Li/Ni-O	77.00	196.53	0.28
	Li/Co/Mn/Ni-O		180 <sup>e</sup>	
NCA	Li/Ni-O	75.77	193.24	0.28
	Co/Al/Ni-O			
LiMn <sub>2</sub> O <sub>4</sub>	Li-O	106.43	274.26	0.29
	Mn-O			
LiMn <sub>1.5</sub> Ni <sub>0.5</sub> O <sub>4</sub>	Li-O	113.30	291.17	0.28
	Mn/Ni-O			

Liu Xiao (2024), *Mechanical properties modeling of cathode materials for lithium-ion batteries based on bond valence model*, Materials Today Communications, vol 39

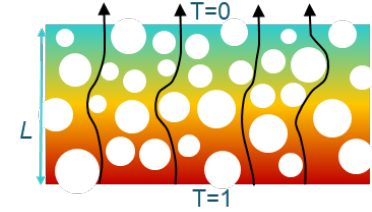
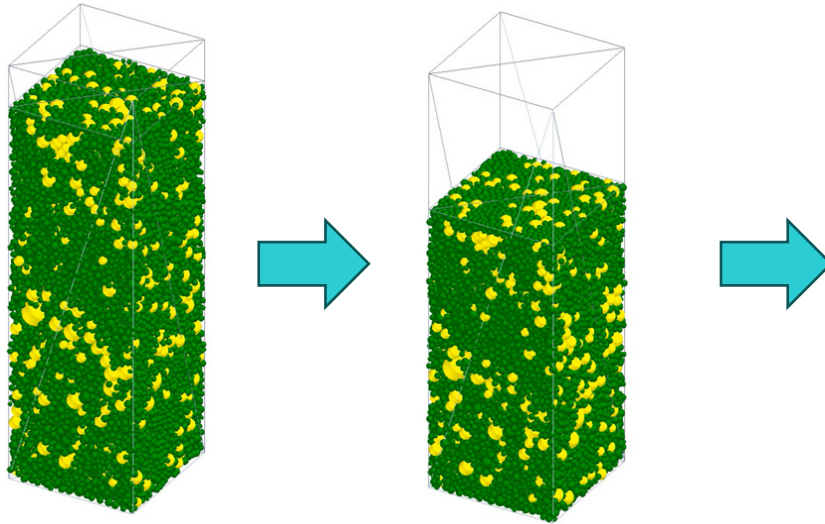
## DOE space - full factorial

- 4 factor, 10 level : 10000 cases for simulation
- 4 factor, 3 level : 81 cases for deep learning

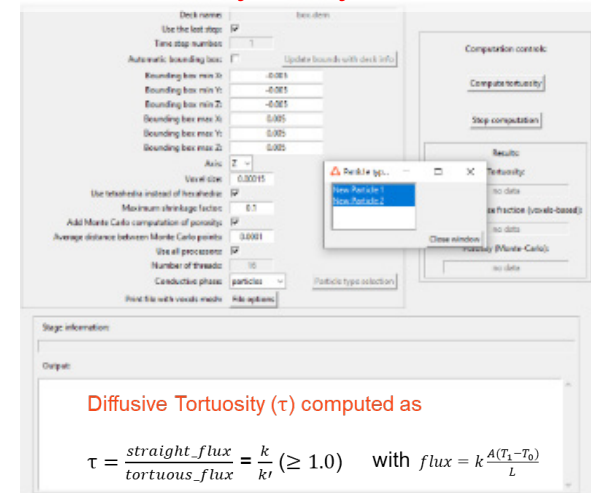
# of Level	10	10	10	10	
Properties	Particle A Scale	Particle B Scale	Mass fraction	Shear Modulus	Poisson's ratio
Level	0.7	0.7	1:9	75.8	0.28
	0.811	0.811	2:8	77.0	0.28
	0.922	0.922	3:7	78.0	0.25
	1.033	1.1033	4:6	83.5	0.28
	1.144	1.144	4.5:5.5	87.8	0.28
	1.256	1.256	5:5	89.7	0.27
	1.367	1.367	6:4	99.8	0.27
	1.478	1.478	7:3	106.4	0.29
	1.589	1.589	8:2	113.3	0.28
	1.7	1.7	9:1	115.0	0.32

# Simulation Modeling

- Periodic boundary is used
- Particle is generated by using volume packing
- Pressing condition is from the actual roll pressing process

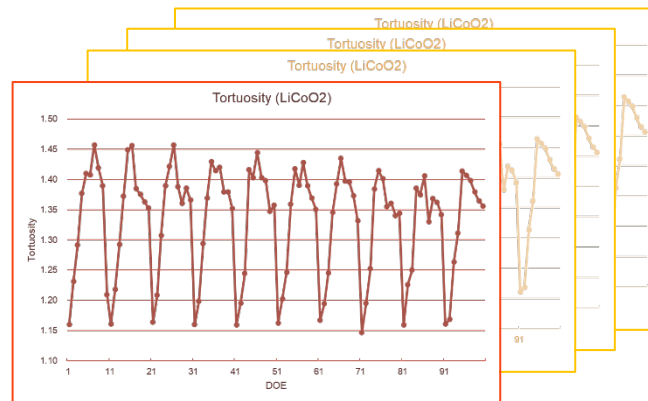
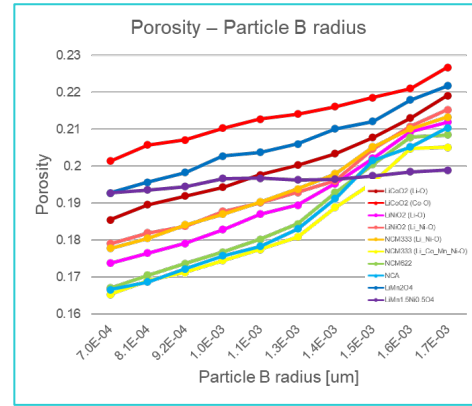


## Battery Analysis Tool



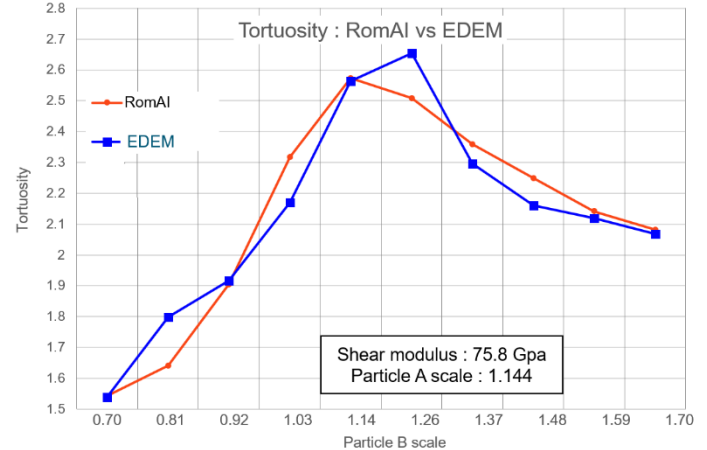
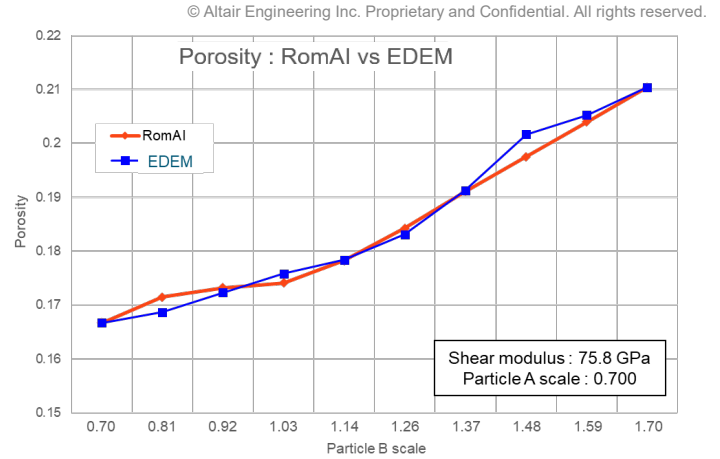
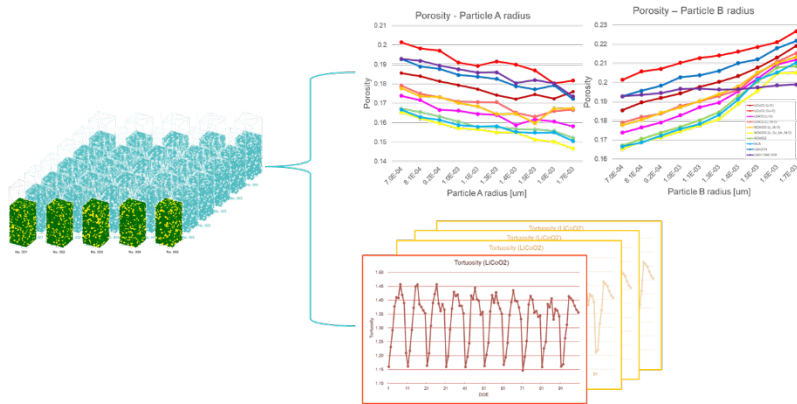
- 

## Microstructure



# Deep learning - romAI

- R square : 0.93 for Tortuosity, 0.98 for Porosity
- By reducing simulation cases from 10,000 to 81, less than 1% of the initial time cost was required



# SUMMARY



# Advanced feature of EDEM for battery

## ❖ Unique Physics model

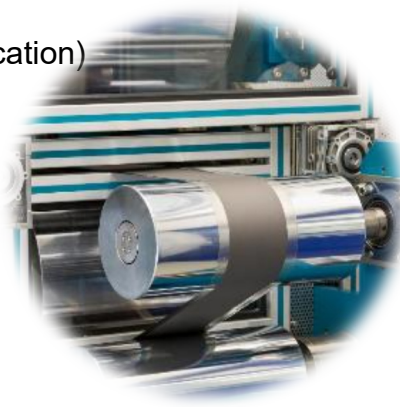
1. Edinburgh-Elasto-Plastic-Adhesive Model
2. Liquid Bridge and Transfer Model
3. Slurry model (Hydrodynamic Lubrication)
4. Breakage model

## ❖ Battery Analysis tools

1. Porosity, permeability, connectivity
2. Easy to connect with Data Analytics
3. Tortuosity Analysis

## ❖ Pre-Processing

1. Powder Database
2. Material Calibration tool



## ❖ Multi-physics

1. DEM-CFD : EDEM-AcuSolve
2. DEM-FEM : EDEM-Optistruct

## ❖ AI convergence

1. romAI
2. HyperStudy ML



# THANK YOU

[altair.com](https://altair.com)

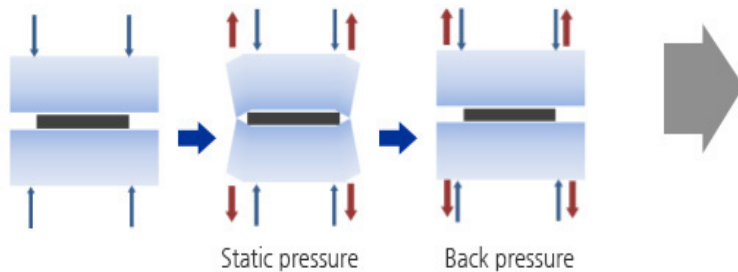


#ONLYFORWARD

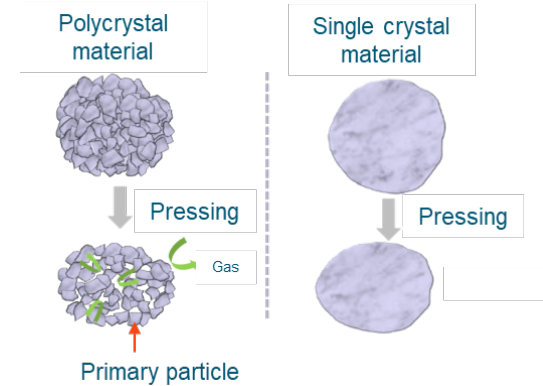
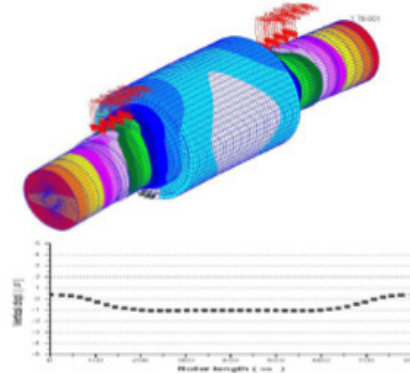
# BACK DATA

# Future

- Modeling closer to the actual process scale.
- Additional research on the actual **boundary conditions** is needed.
- The **anisotropy** of aluminum foil needs to be considered.
- The **profile of roller** can be considered for structural analysis.
- And **Heat transfer** between electrode and roller can be considered

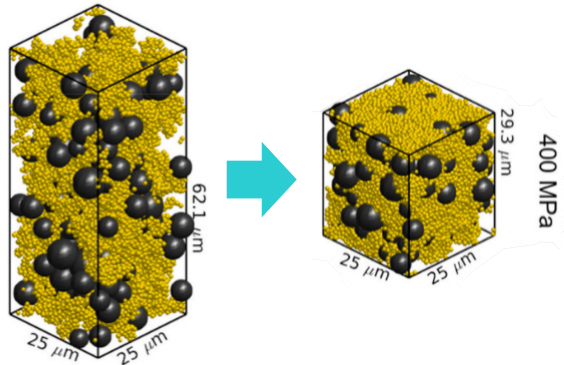


<http://www.cisro.co.kr/>

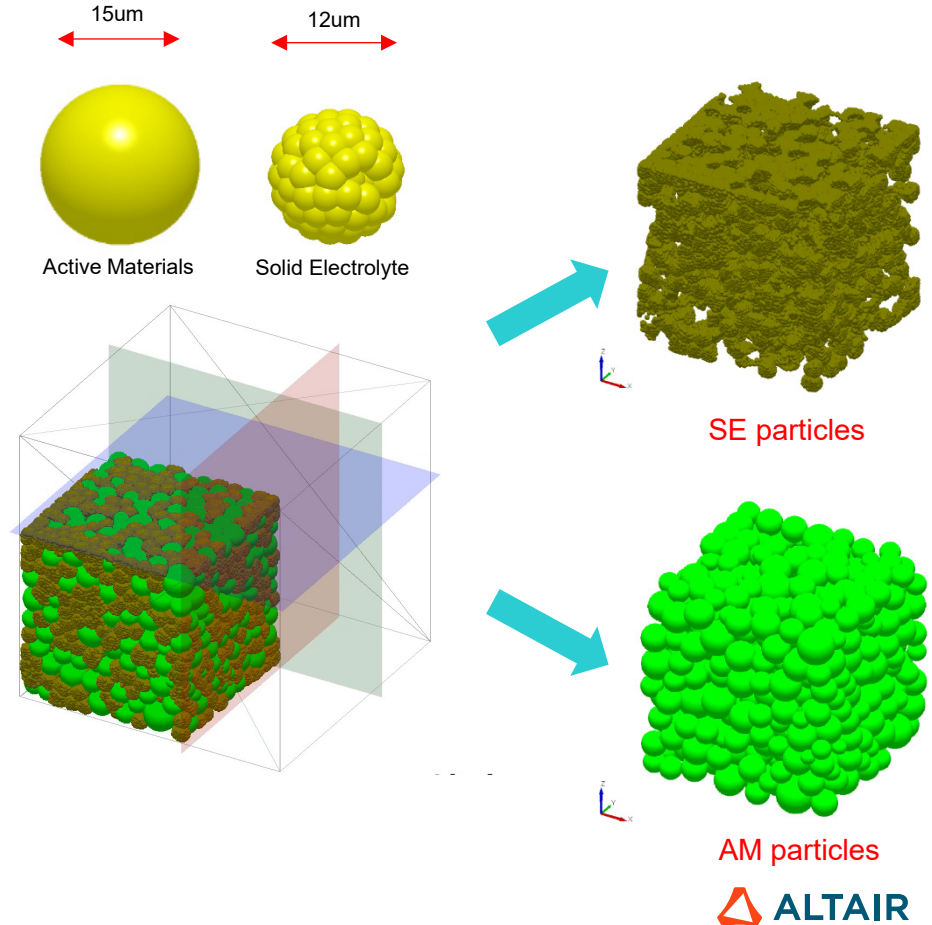


# All Solid-State Battery

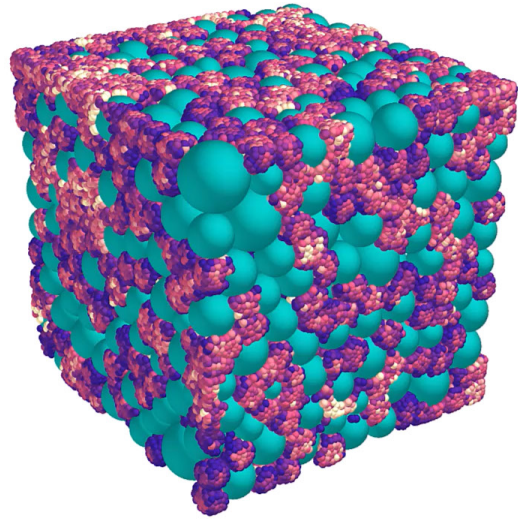
- Simulation of isotropic pressurization process
- Simulation of deformation of solid electrolyte
- Reference paper



*Effect of mold pressure on compaction and ion conductivity of all-solid-state batteries revealed by the discrete element method, October 2021 Journal of Power Sources, Magnus So, Gen Inoue, Ryusei Hirate, Keita Nunoshita, Shota Ishikawa, Yoshifumi Tsuge.*

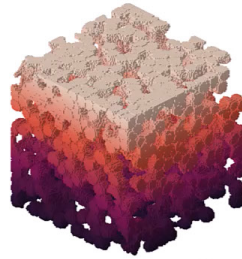


Maximize the battery performance when  
simulating its microstructure by:

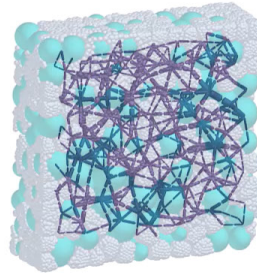


Von Mises (Pa)  
0.00e+00 7.00e+04 1.40e+05 2.10e+05 2.80e+05 3.50e+05

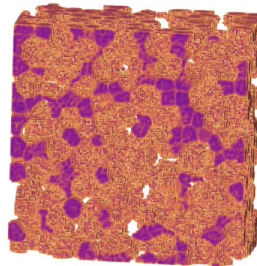
Obtain the components  
stress during compaction



Analyzing the microstructure tortuosity

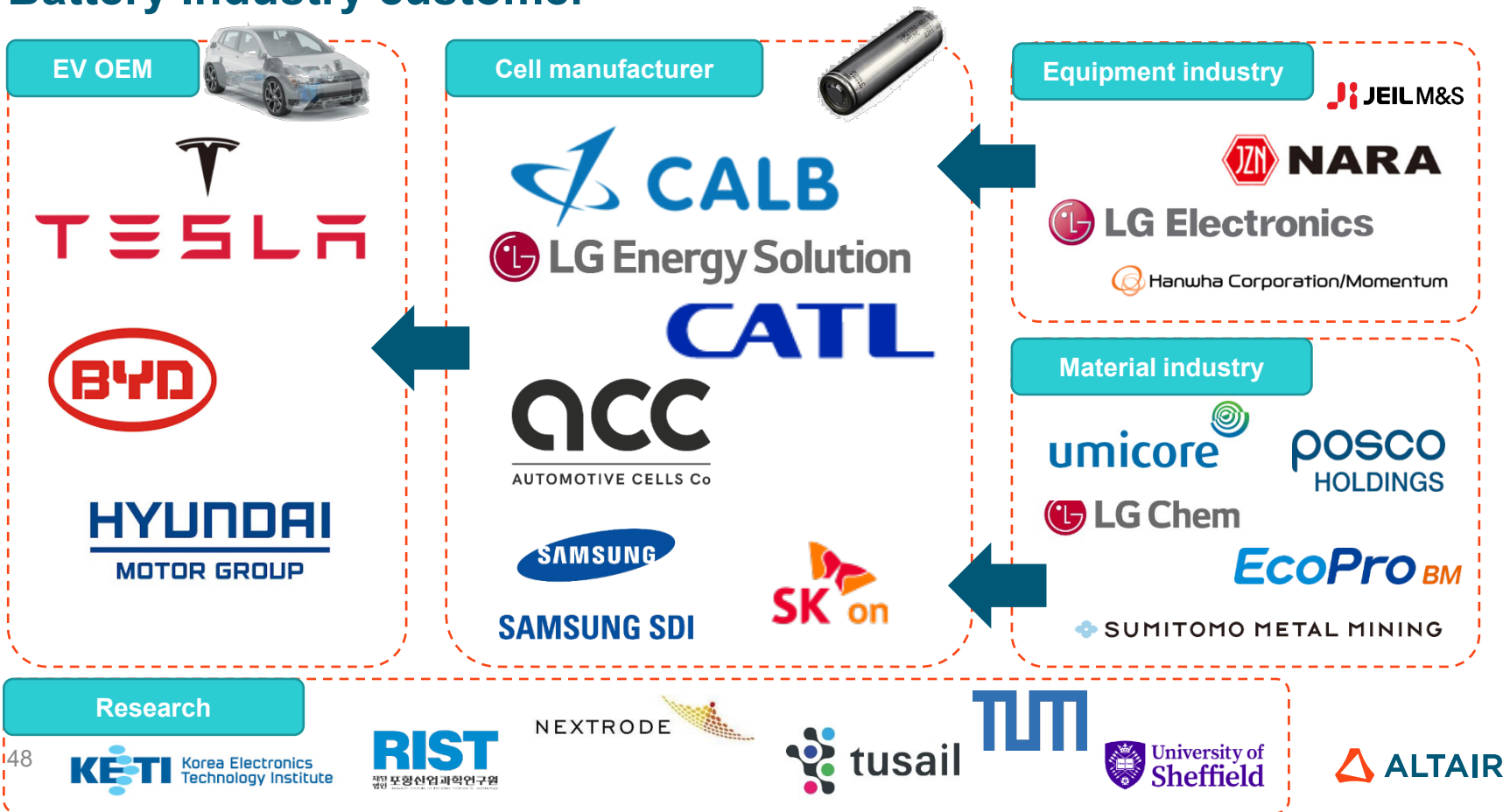


Predict the electrode percolation



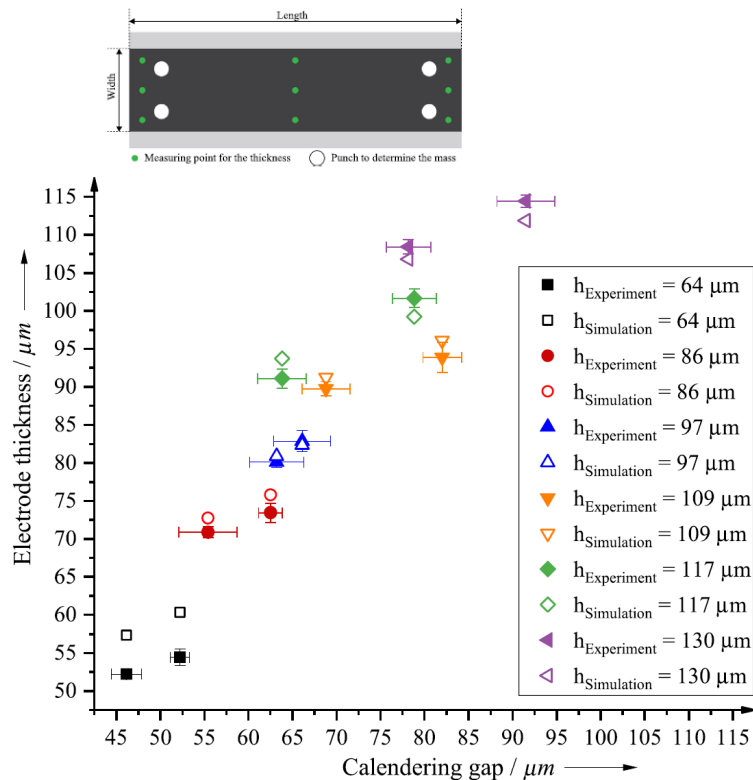
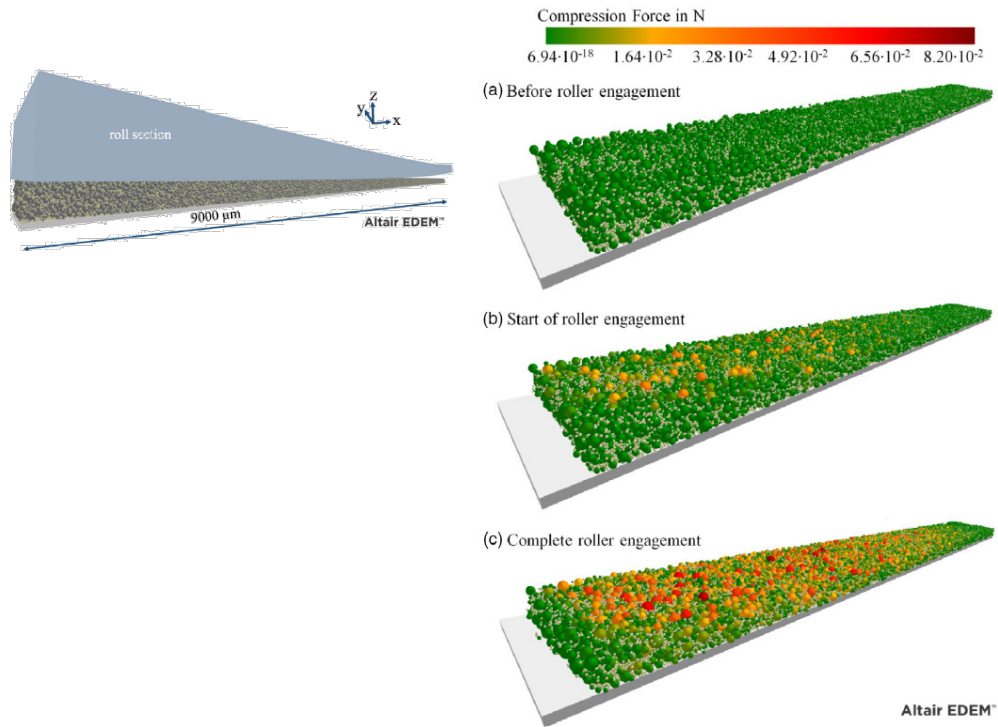
Identify the porosity distribution

# Battery Industry customer

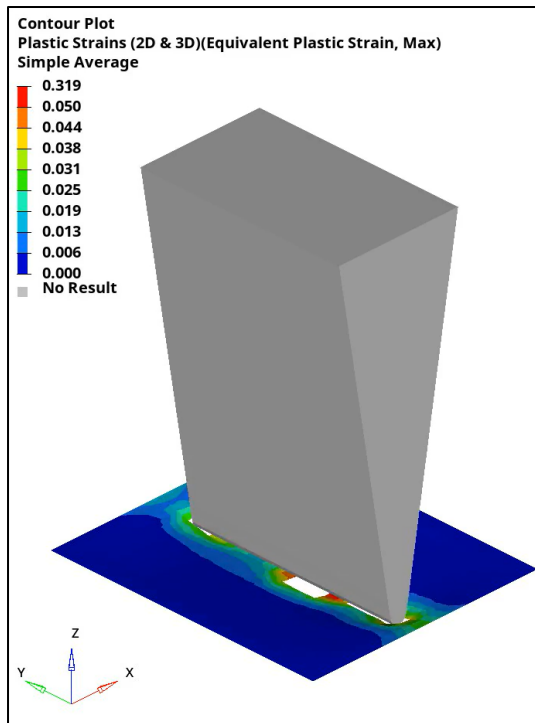




# Battery Manufacturing Simulation – calendering



# Notching: Plastic Strain



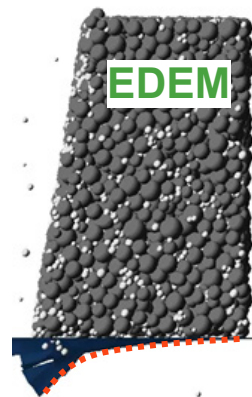
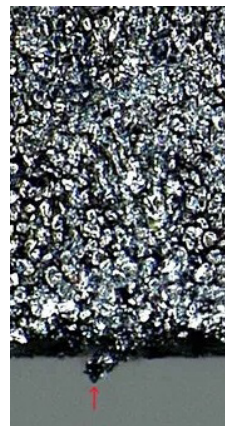
positive electrode  
(cathode)

separator

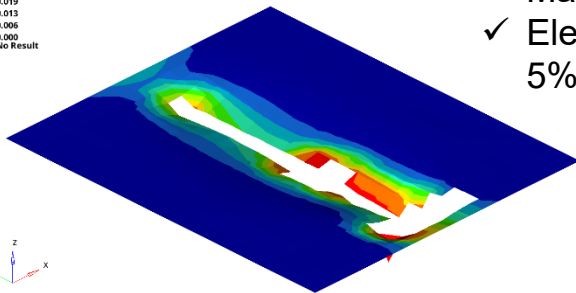
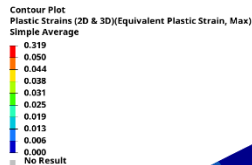
negative electrode  
(anode)



pd = penetration distance



<https://www.leica-microsystems.com/science-lab/industrial/burr-detection-during-battery-manufacturing/>



- ✓ Maximum Plastic Strain= 31.9%
- ✓ Elements exceeding plastic strain 5% is damaged