



Quality Fluctuations Simulation Method by using Multi Agent System in Large Scale Load Setting of Heat Treatment

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Agenda



- ✓ Why use Heat Treatment Simulation
- ✓ Difficulty to Simulate Fluctuation of Heat Treatment
- ✓ What is Multi Agent Simulation
- ✓ Result and Future Development



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DX in Car Manufacturing



Needs for simulation to replace experiments



Assist by CAD/CAE for drawings and strength design



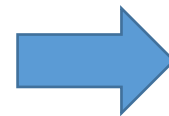
Autonomous Driving etc...



MBD (Model Based Development) is the core technology of development to thoroughly verify all risks.



Total products development is shifting to MBD (Model Based Development)

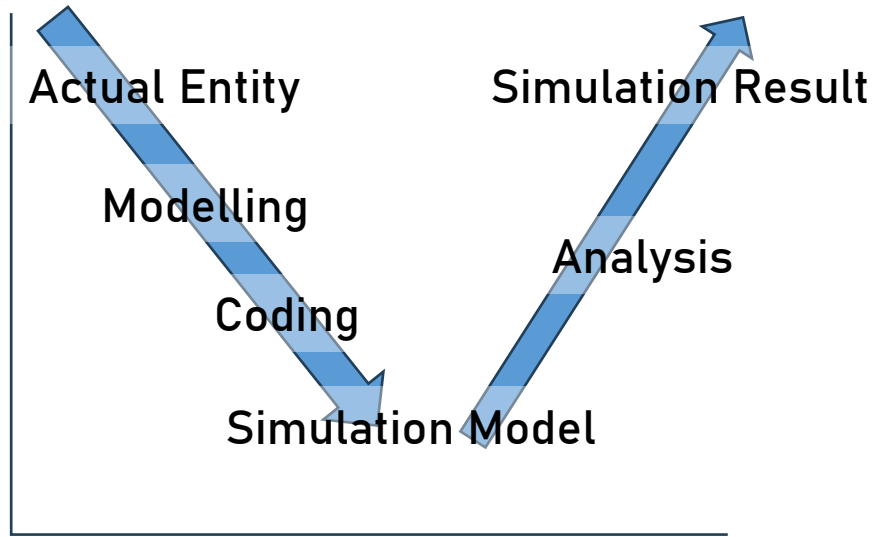


Material and Process development is needed to shift for MBD



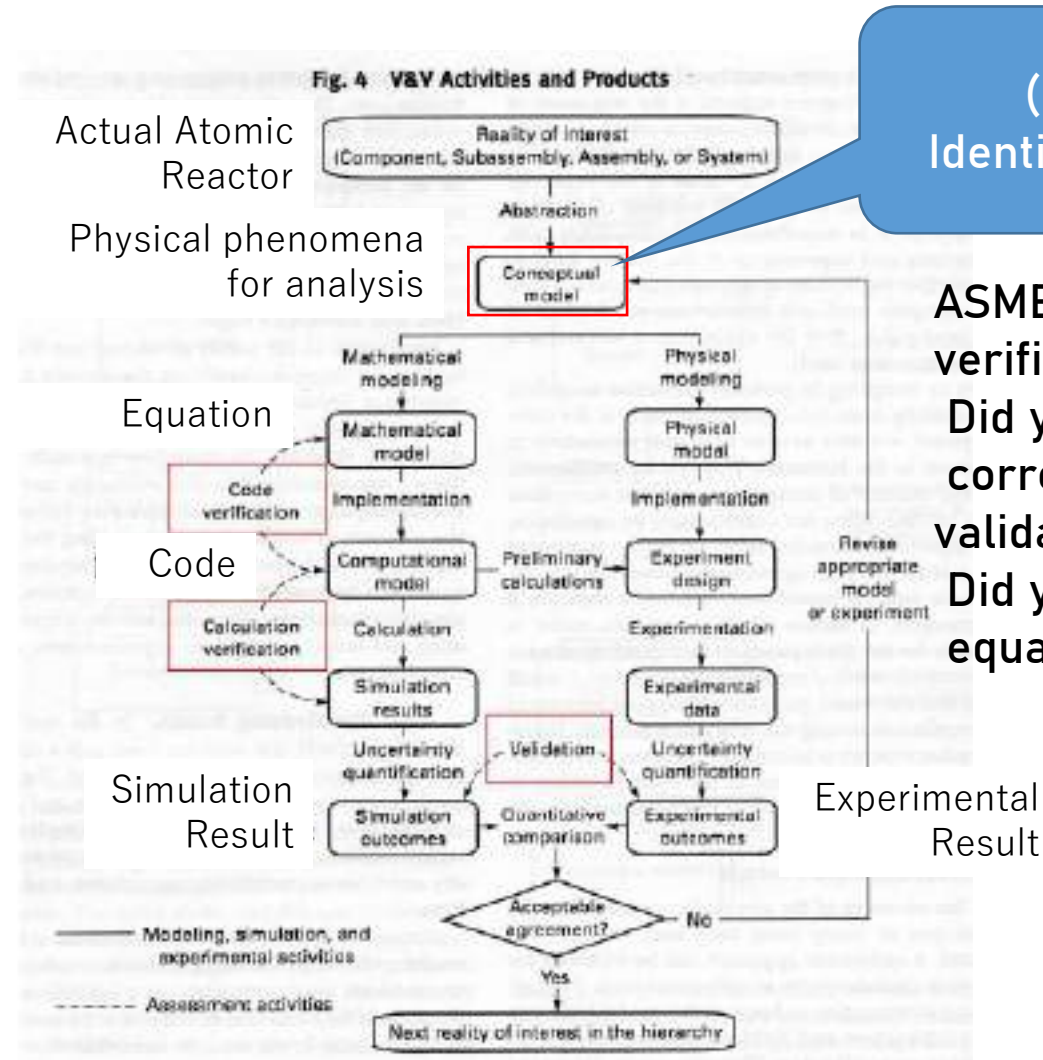


What is MBD (Model Based Development)



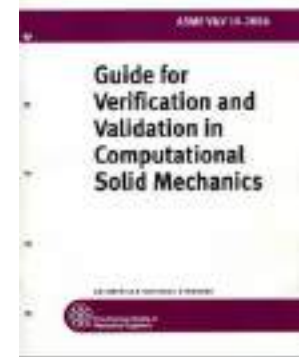
Development through modelling and simulation

Model Based Development, MBD



PIRT
(Phenomena
Identification Ranking
Table)

ASME V&V 10-2006
verification:
Did you solve the equation
correctly?
validation:
Did you solve the right
equation?

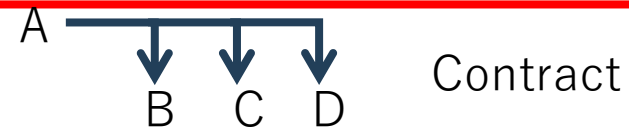


Changes in the DX environment in manufacturing



	Adjustment type (Vertical dividing of tasks)	Assembly type (Horizontal dividing of tasks)
Common sense in Manufacturing	Optimization for Overall Product (Adding Culture, Mutual Complementation)	Combination of Standardized Modules (Multiplication culture, Single Defect is System Defect)
For Designer	Communi Achieve Perform	Process is decided in
For Production Engineer	Coordin Flexibili	
Company Culture	Inter department negotiation	Achievement with outside world
Marketing	Technology driven, Hardware driven	Software driven, Market driven

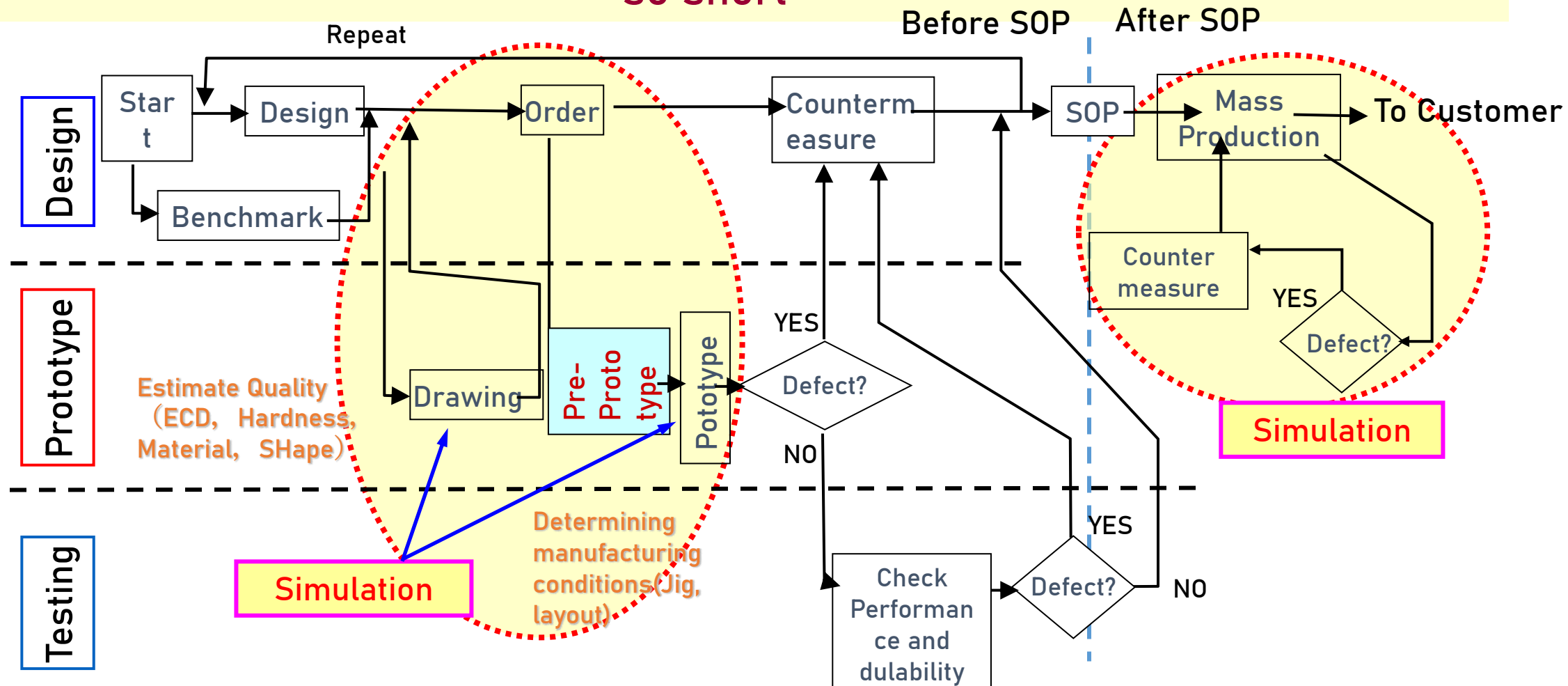
**Performance contract-based
manufacturing
→ Simulation and Prediction**



How to use the simulation



Simulations are used before and after SOP, the time to respond to requests is so short





- ✓ The simulation that contain complex phenomena include interactions between processes and jig layouts of mass production with short solving time are required.



Agenda

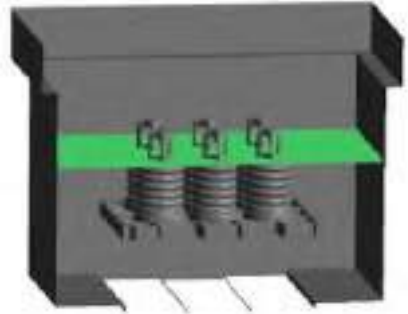


- ✓ Why use Heat Treatment Simulation
- ✓ **Difficulty to Simulate Fluctuation of Heat Treatment**
- ✓ What is Multi Agent Simulation
- ✓ Result and Future Development

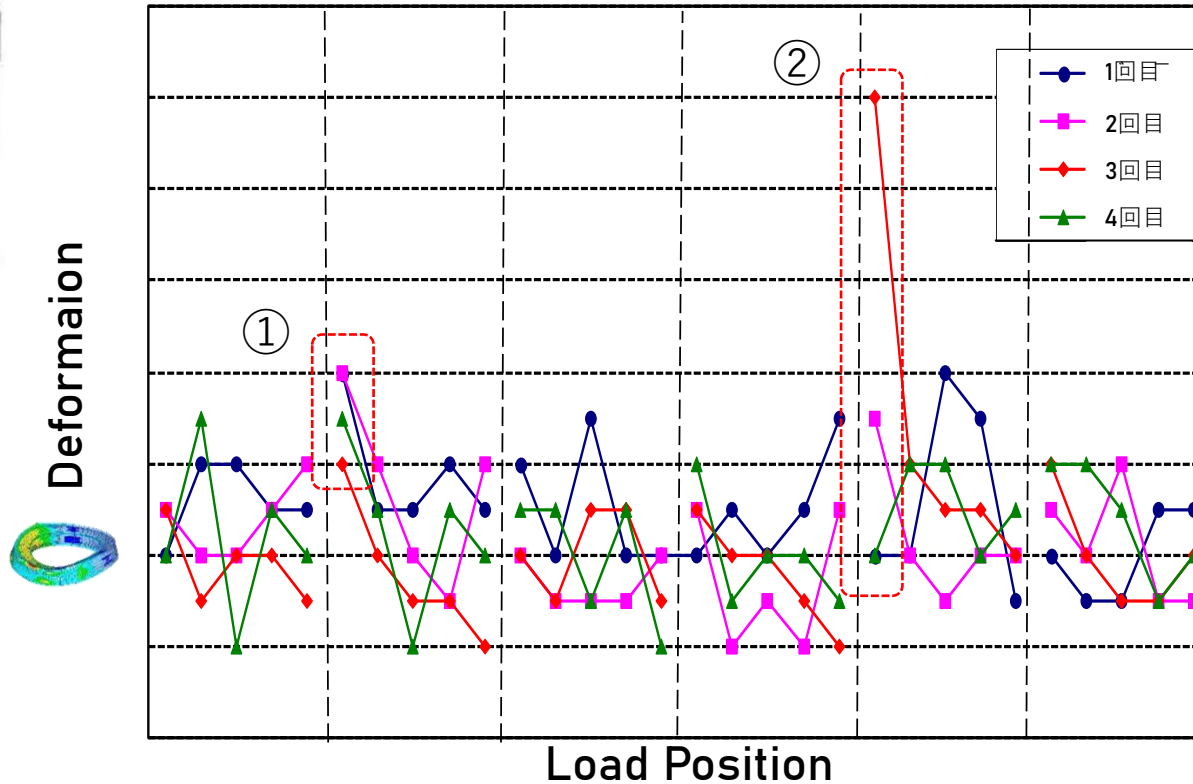




Heat Treatment Deformation Fluctuation in Actual Process



Mass Production



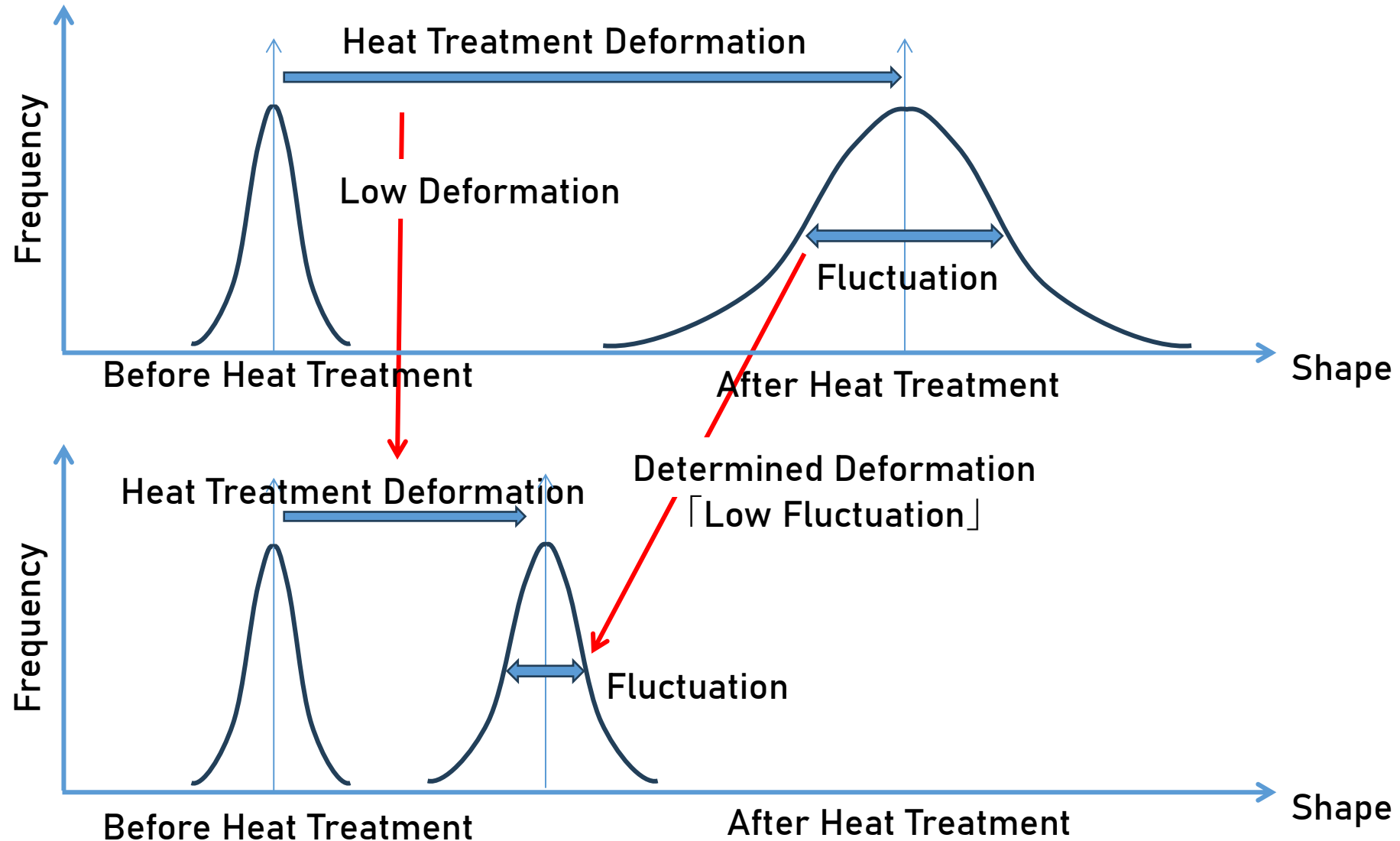
① Constantly Large Deformation

② Large Fluctuation

Change of Heat Treatment Deformation in Actual Process



Occurrence of Fluctuation in Heat Treatment Deformation



Purpose of this research



How can heat treatment simulation be made more widely applicable?

- Easy to use. Simulation model preparation:
Heat treatment contractors \Leftrightarrow Designers
 \Leftrightarrow End users Materials and coolant database
- Fluctuation must be addressed.



Why does Fluctuation Occur?



Fluctuation of Heat Treatment Deformation



Design

Shape

Material

Segmentation

Material Fluctuation

Contents

Cutting

Residual Stress, Metal Structure

Roughness

Carburizing

Carburizing depth Fluctuation

Surface c% Fluctuation

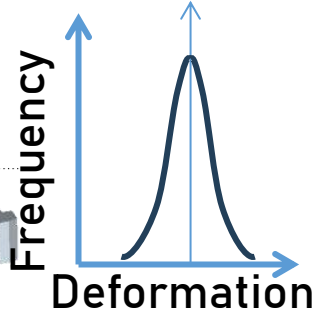
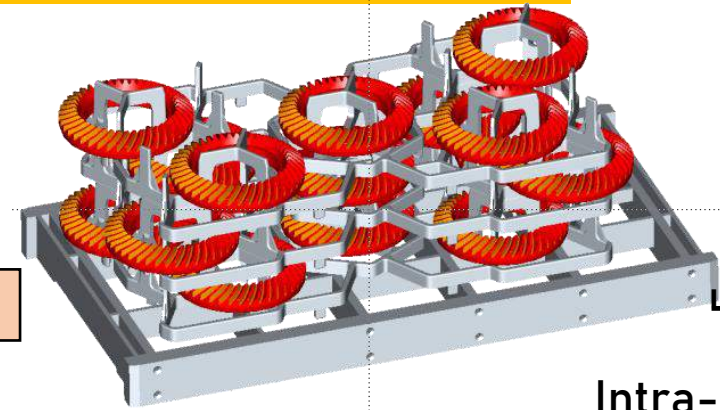
Quenching

Oil Temperature Fluctuation

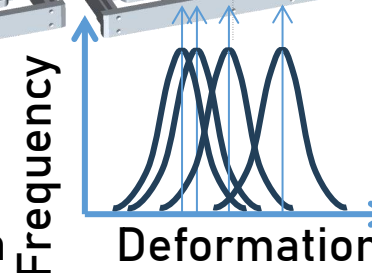
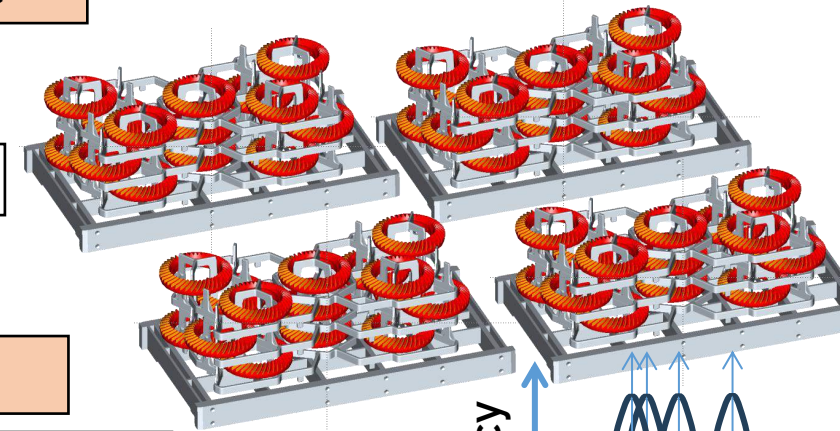
Quenching Temperature Fluctuation

Cooling Speed Fluctuation

Important Factor



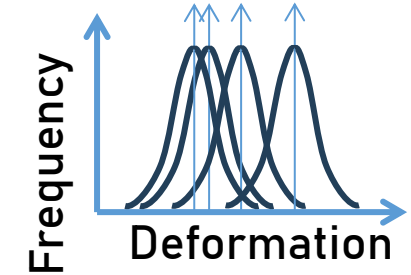
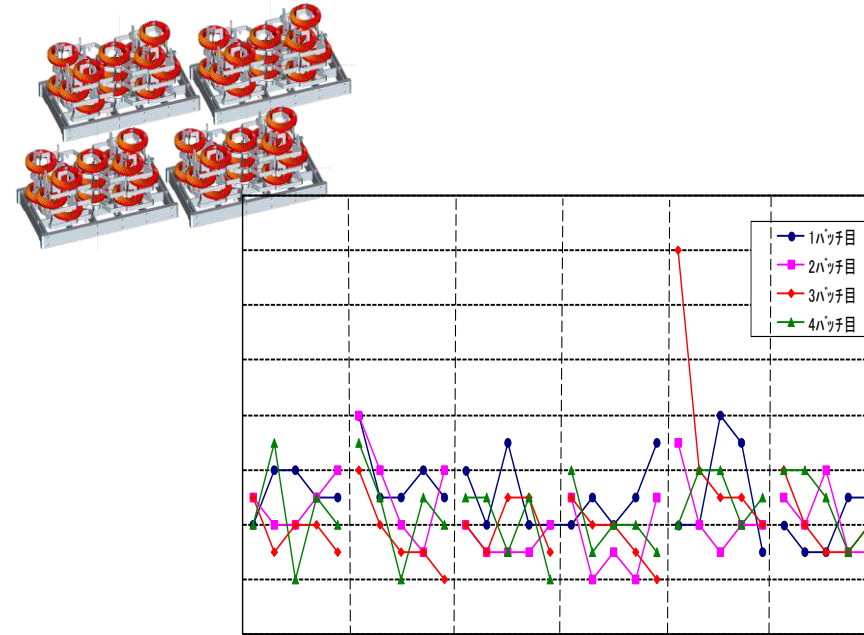
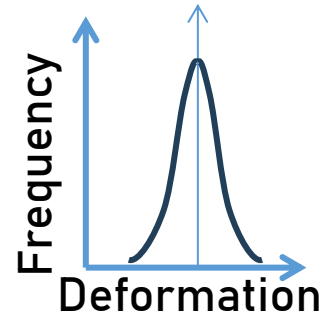
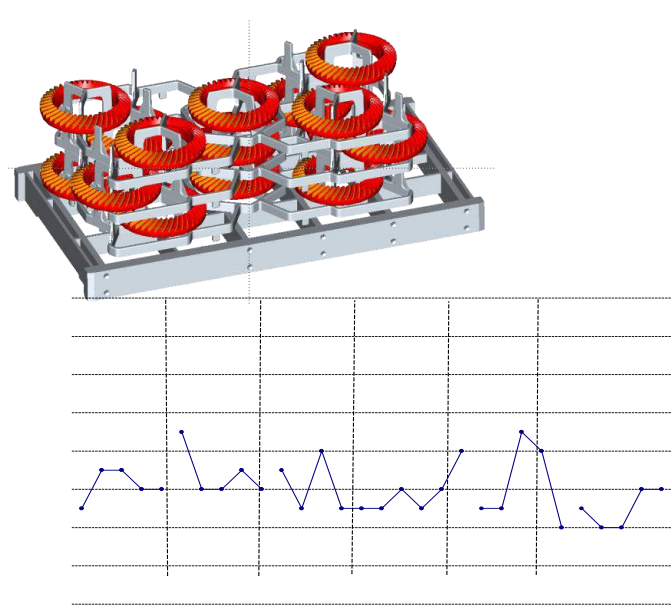
Intra-lot Fluctuation



Inter-Lot Fluctuation

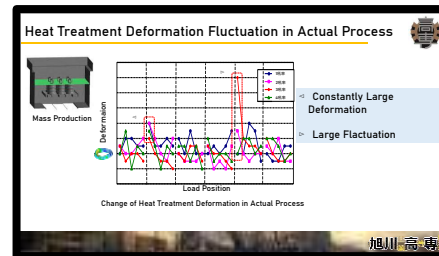


Two type Fluctuations

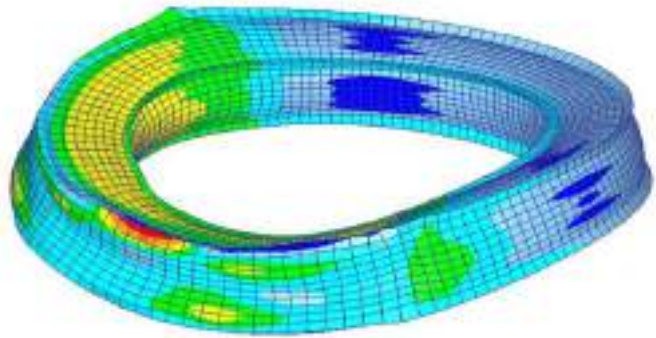


Intra-lot Fluctuation
(Space Dependent Fluctuation)

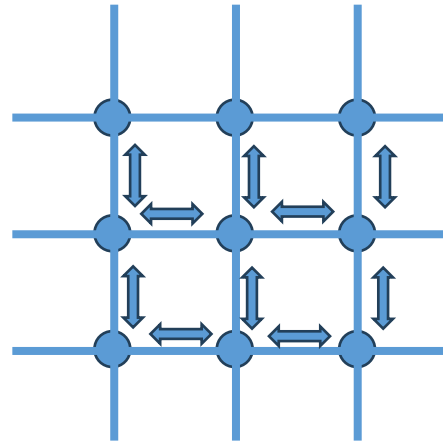
Inter-lot Fluctuation
(Time Dependent Fluctuation)



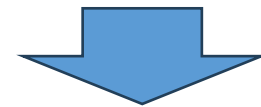
Computational Load to Calculate Fluctuations in FEM



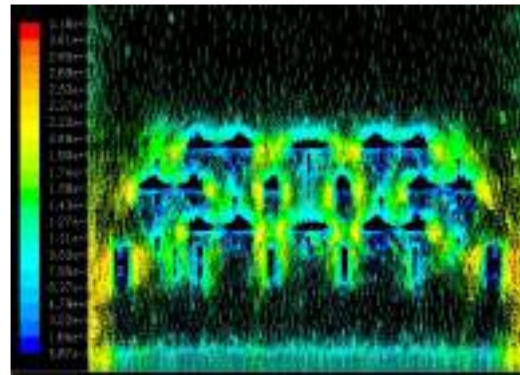
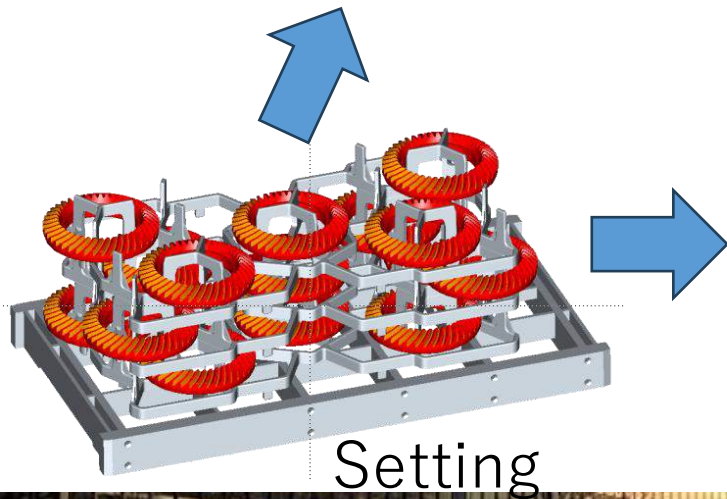
Inside Phenomena



The computational load is proportional to the cube of the analysis size



Fluctuation simulation by FEM is Difficult



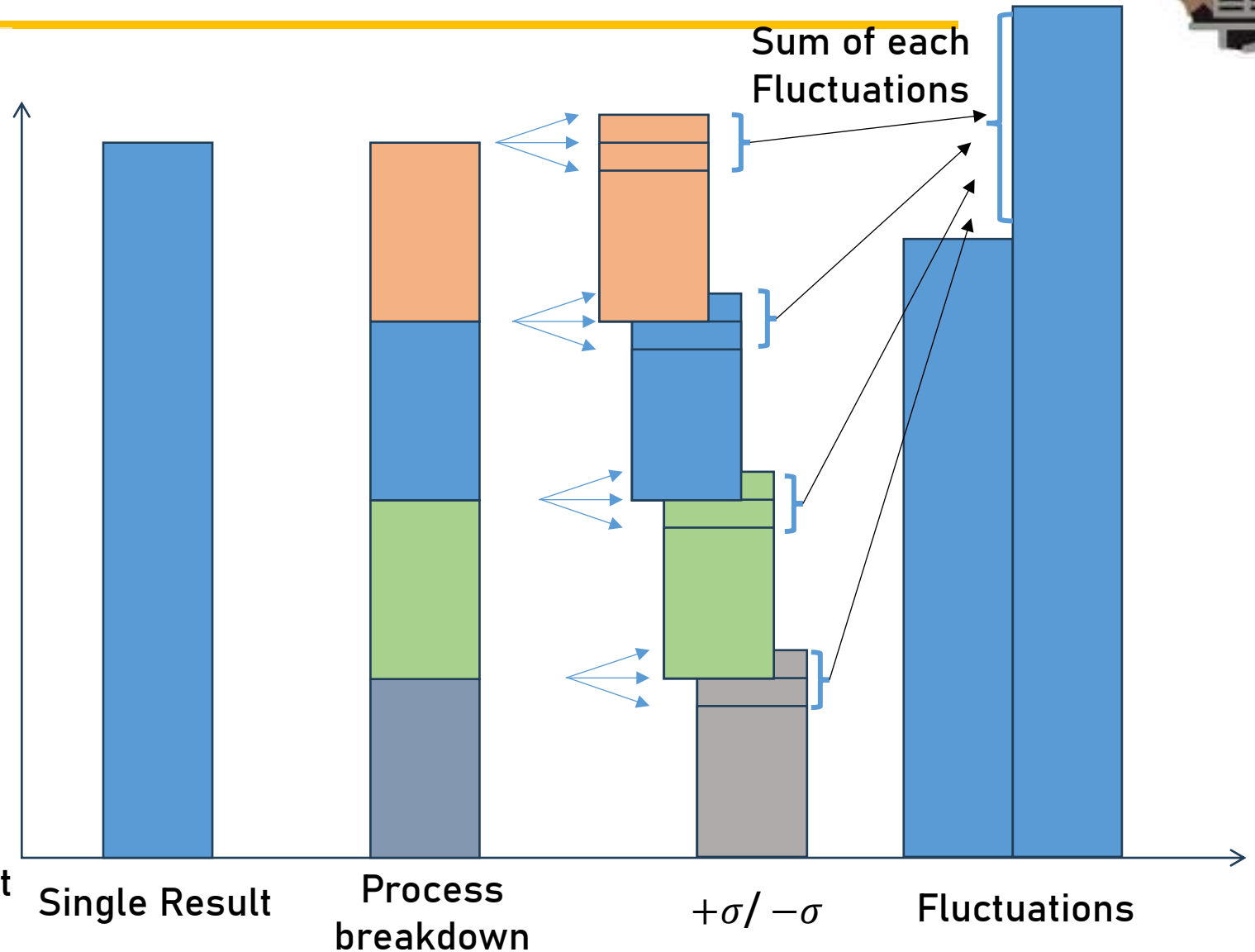
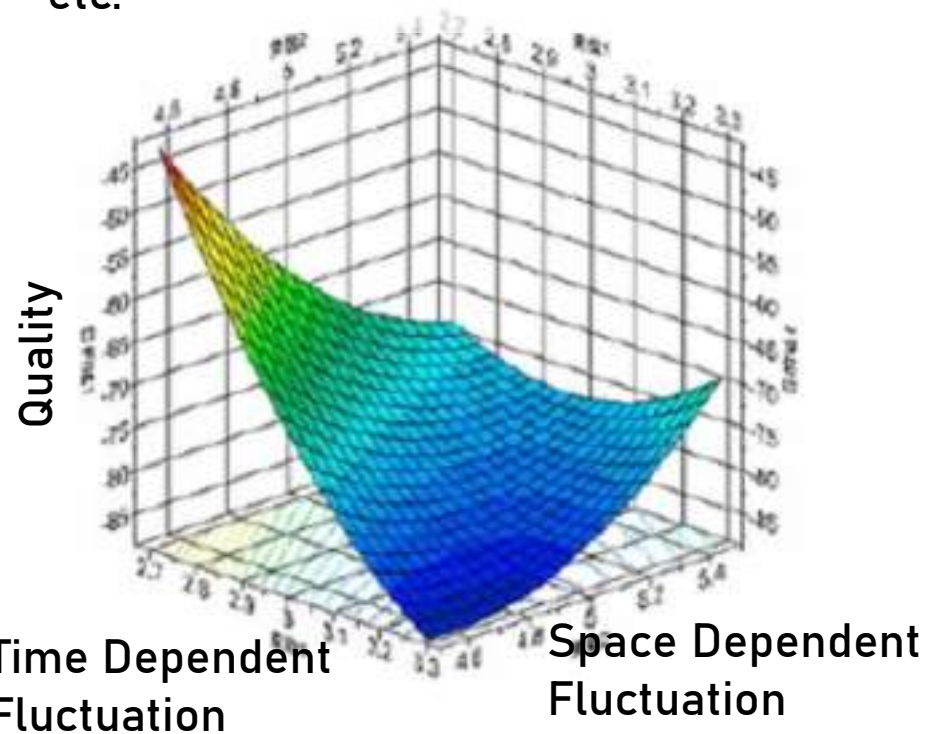
Outside Phenomena





Calculation Method for Fluctuations

- ✓ Accumulate variation for each factor at each process.
- ✓ **Monte Carlo simulation** method and the **system moment method**.
- ✓ At each process, materials, process conditions, pre-processing conditions, etc.



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Quality calculation using multi-agents simulation



conditions

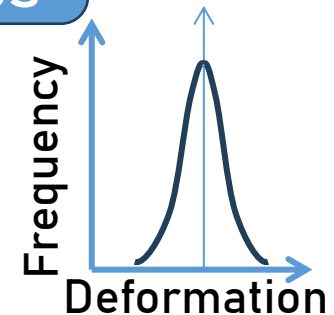


People
→ Work Piece

Multi-agent simulation
is a method for
investigating
crowd behaviour

Local
Interrelationships

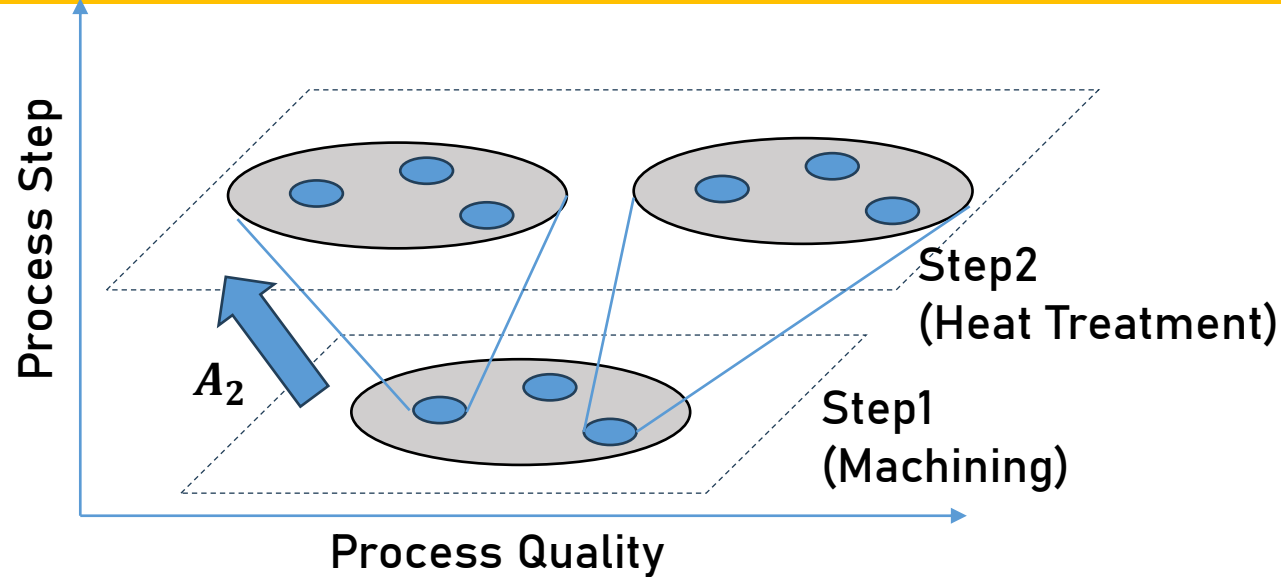
Spontaneous
Movement



Crowd behavior
→ Quality Distribution



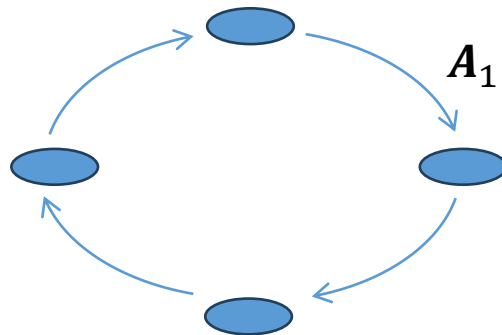
Hierarchical Multi-agent Systems in Multiple Process



$$\dot{x} = (P - I)x \quad (1)$$

The $P - I$ dealing with the cycles within a process is defined as A_1 . Similarly, the matrix solving for the dynamics between processes is A_2 and can be expressed as in Eq. (2).

$$A_2 = \begin{pmatrix} A_1 - I & \Delta & 0 \\ 0 & A_1 - I & \Delta \\ \Delta & 0 & A_1 - I \end{pmatrix} \quad (2)$$



When defined as above, a multi-agent that crosses processes when it repeats a process and reaches process l can be defined as in Eq.(3), where Δ is the 'connection matrix' that interconnects the processes. where Δ is the 'connection matrix' interconnecting the processes.

$$A_l = \text{diag}(A_{l-1} - I) + P \otimes \Delta \quad (3)$$

Quality calculation using multi-agents simulation



$$\begin{array}{c} \text{Properties} \end{array} \left(\begin{array}{ccc} \text{Parts No.} & & \\ x_{11} & x_{i+1j} & \dots \\ & & x_{i1} \\ & & \vdots \\ x_{1j} & & x_{ij} \end{array} \right) = \left(\begin{array}{ccc} a_{11} & \dots & a_{i1} \\ \vdots & \ddots & \vdots \\ a_{1j} & \dots & a_{ij} \end{array} \right) \left(\begin{array}{ccc} A_1 - I & \Delta & 0 \\ 0 & A_1 - I & \Delta \\ \Delta & 0 & A_1 - I \end{array} \right) + \left(\begin{array}{ccc} & & \\ & & \\ & & \end{array} \right)$$

Effect of Pre-Process

Change ——— No Change

Process No. N+1

Connection Matrix
Process N to N+1

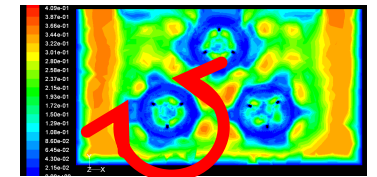
Process No. N

Rocking Parameter

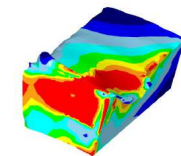
Anisotropic Boundary Conditions

$$a_{ij} = r_{ij}(\cos \theta + i \sin \theta)$$

CFD Result



Process
Simulation



Agenda

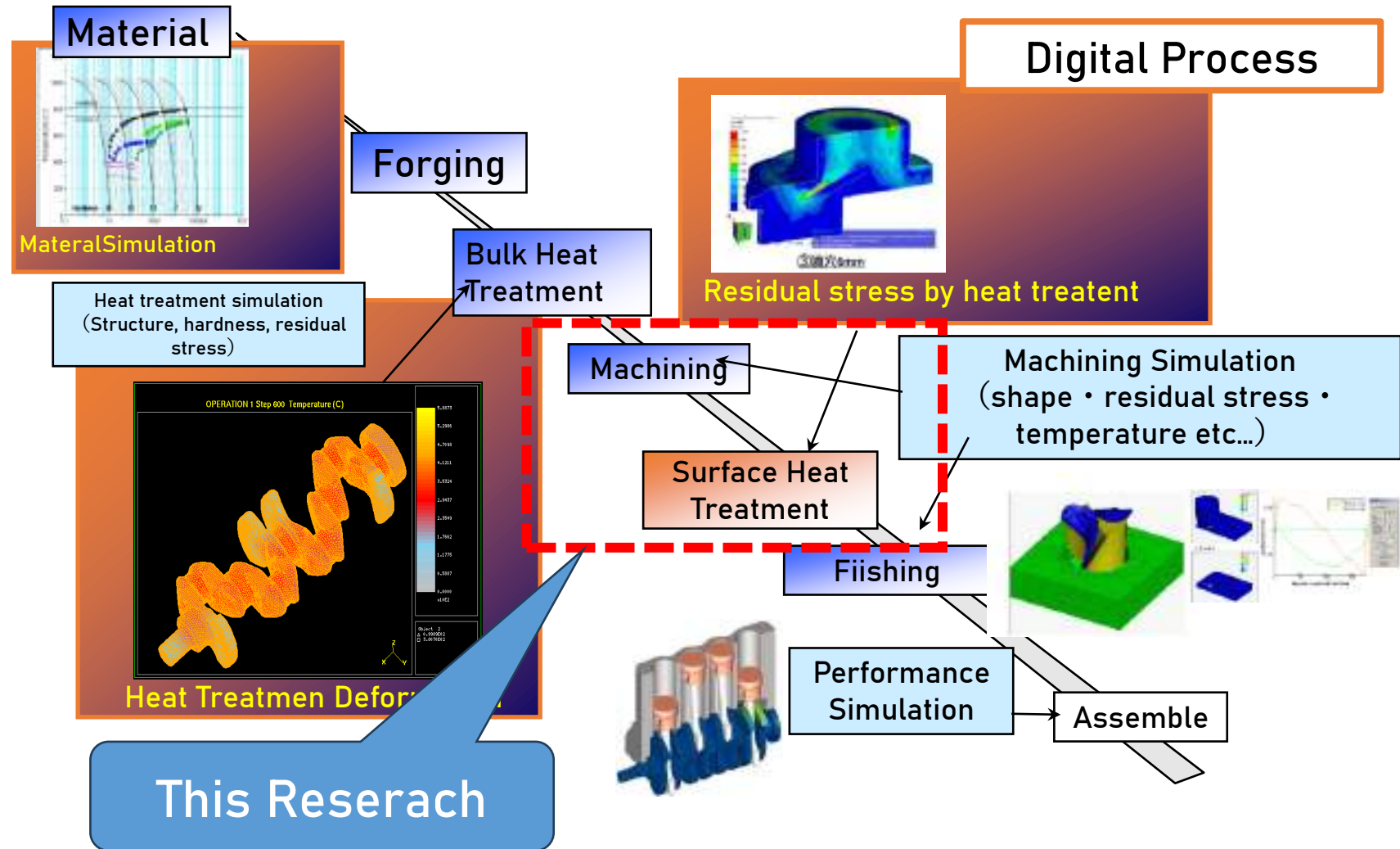


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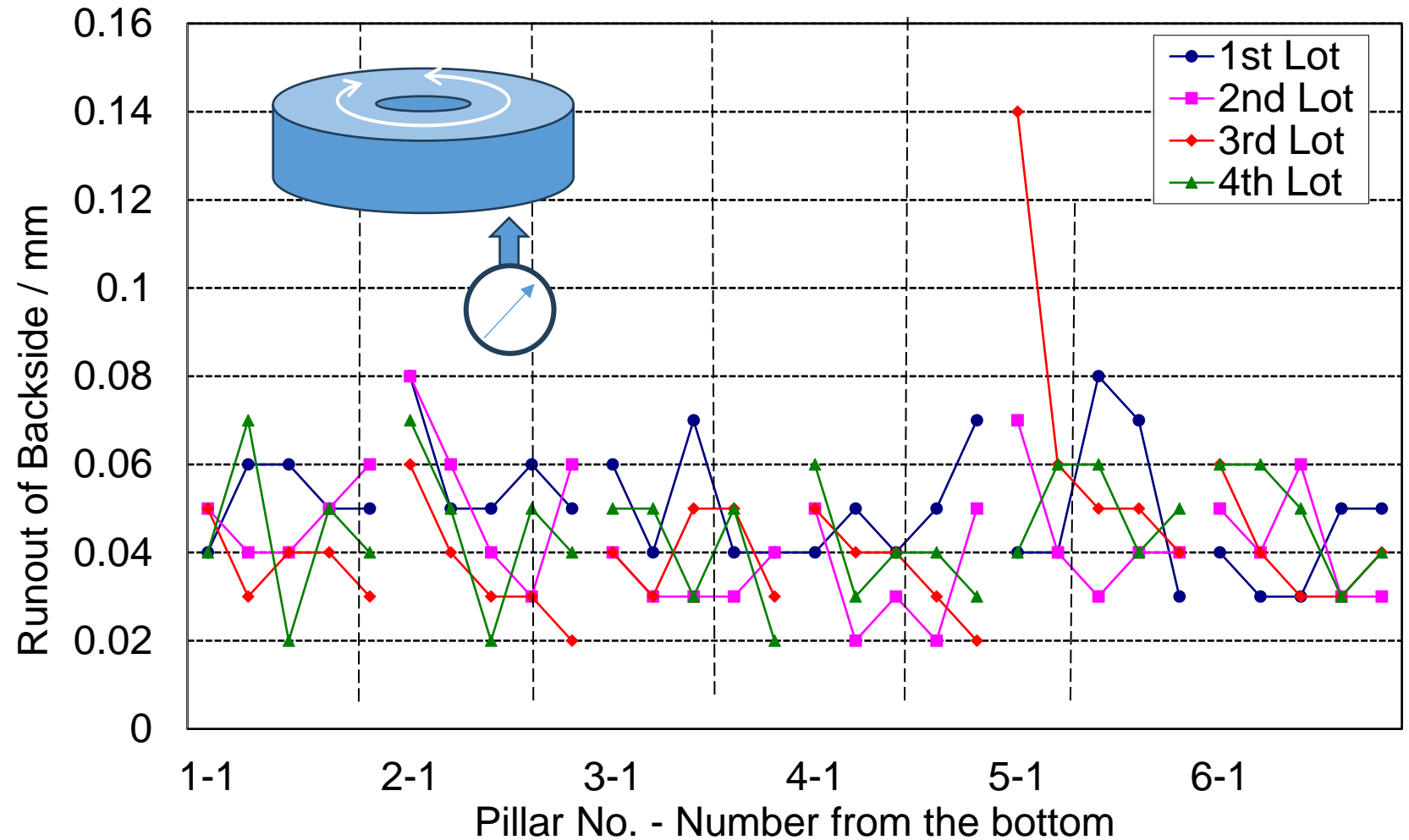
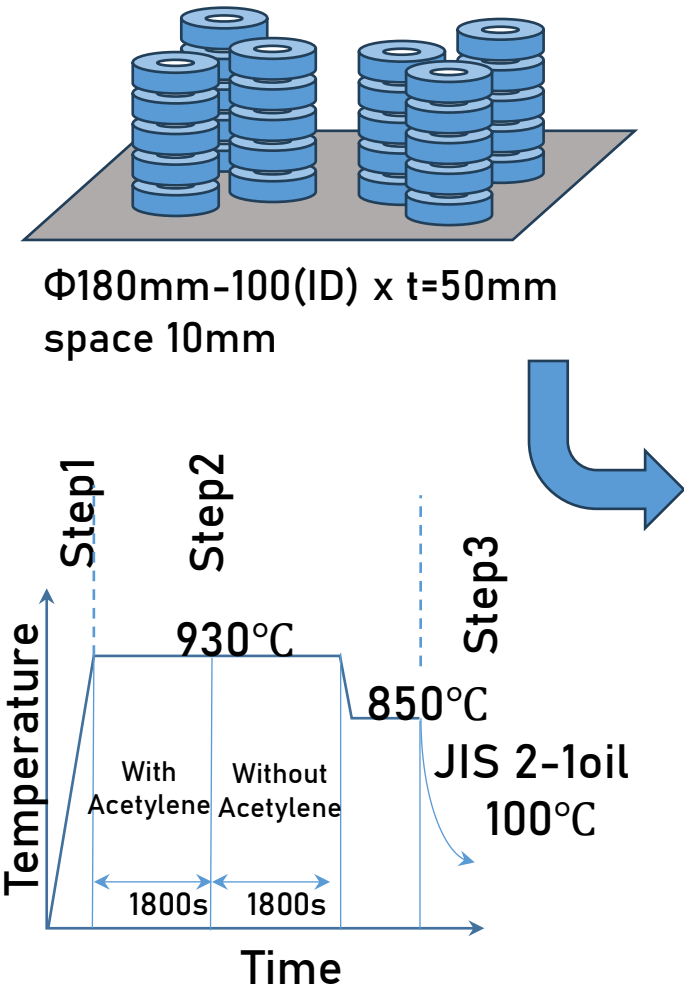


Process Through Simulation



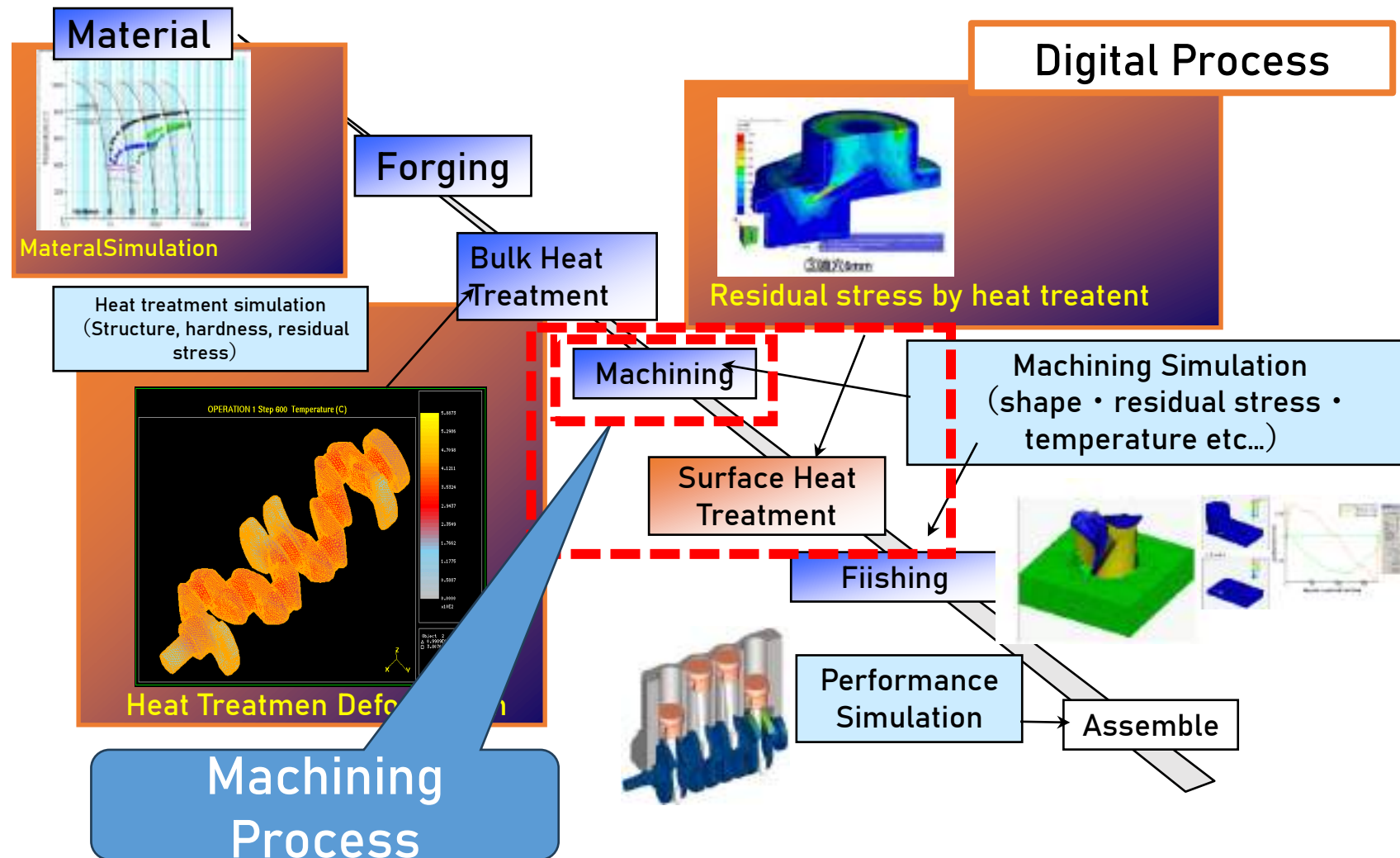


Result of Actual Experiment



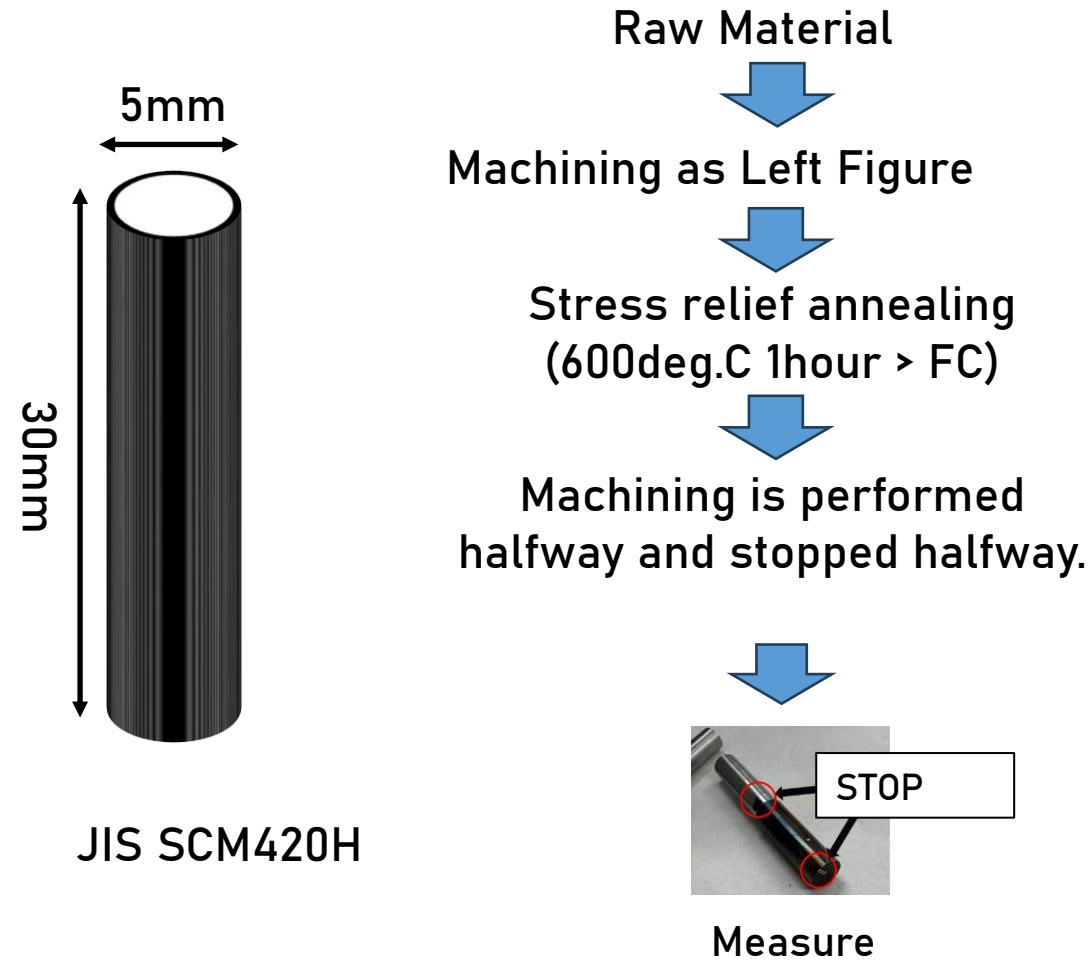


Process Through Simulation



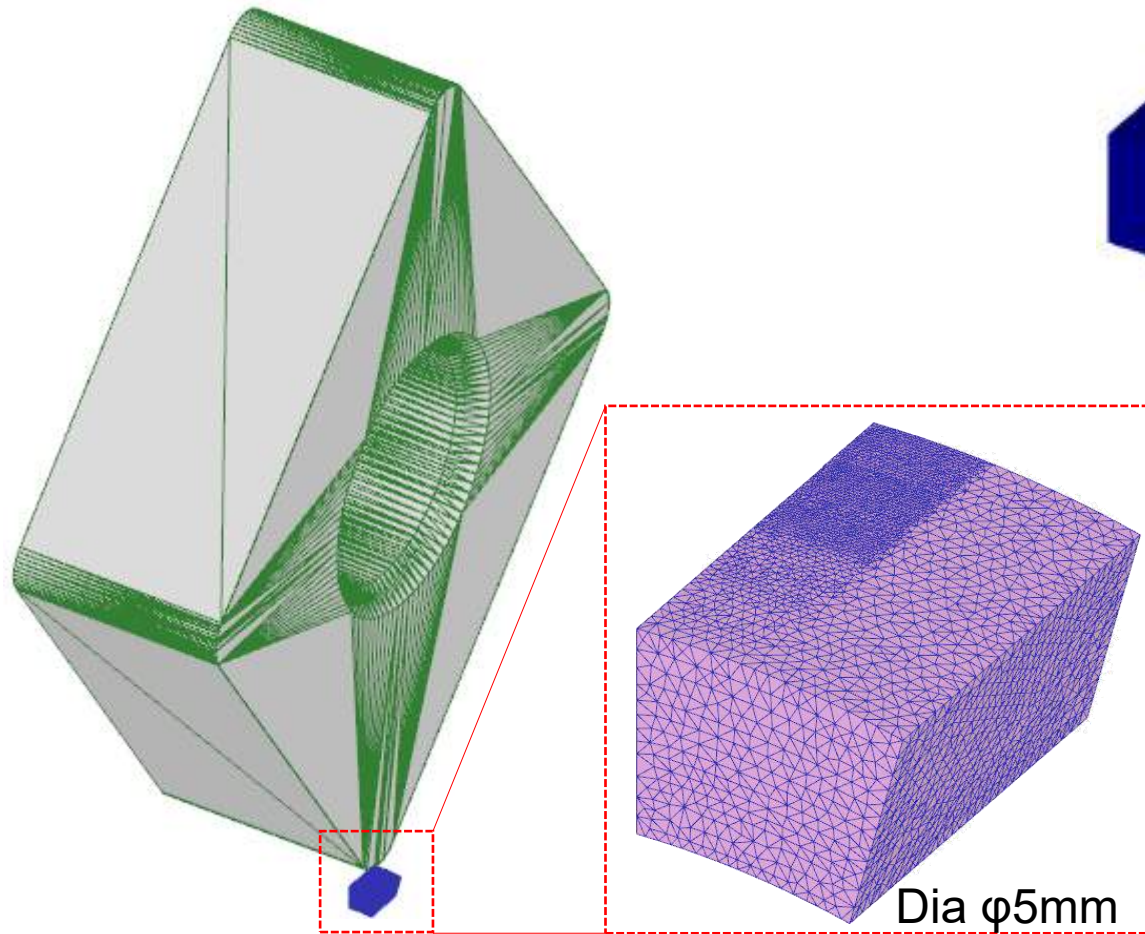


Check the Effect of Machining

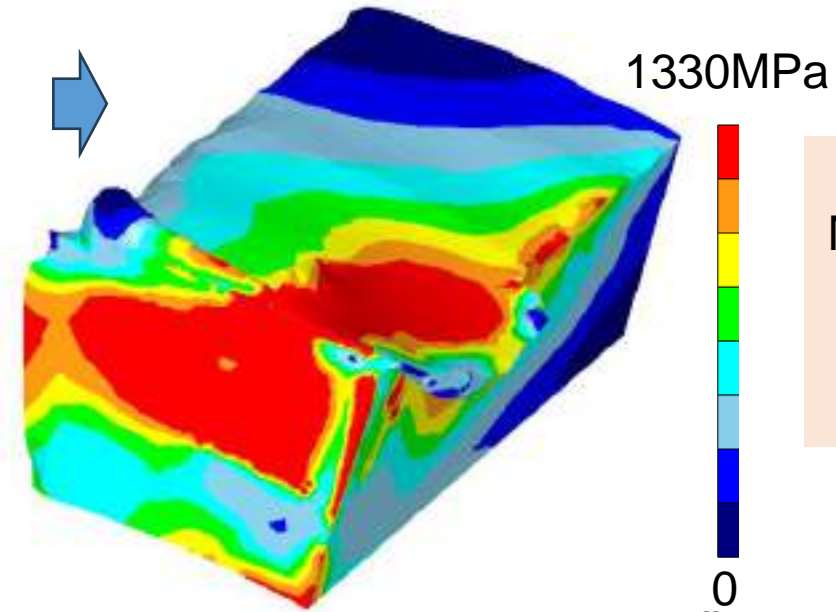
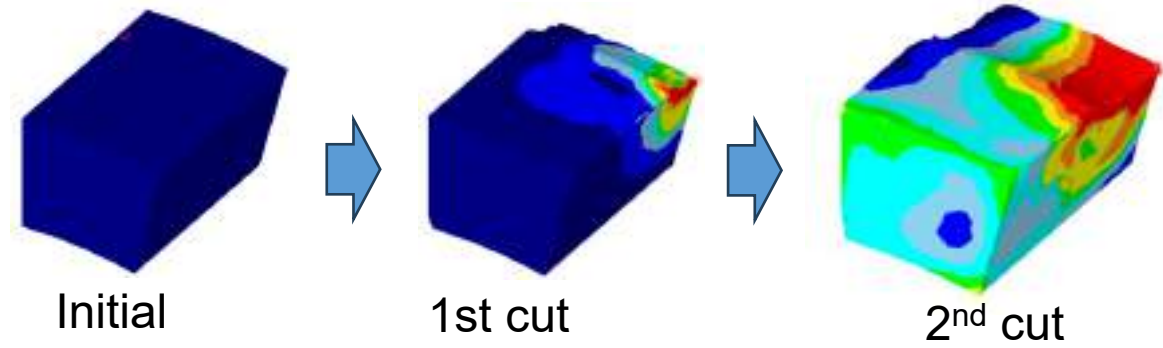




Machining Simulation



DEFORM Ver 14.0
Material JIS SCM420HC
Elements 55330, Nodes 12228(Adaptive)

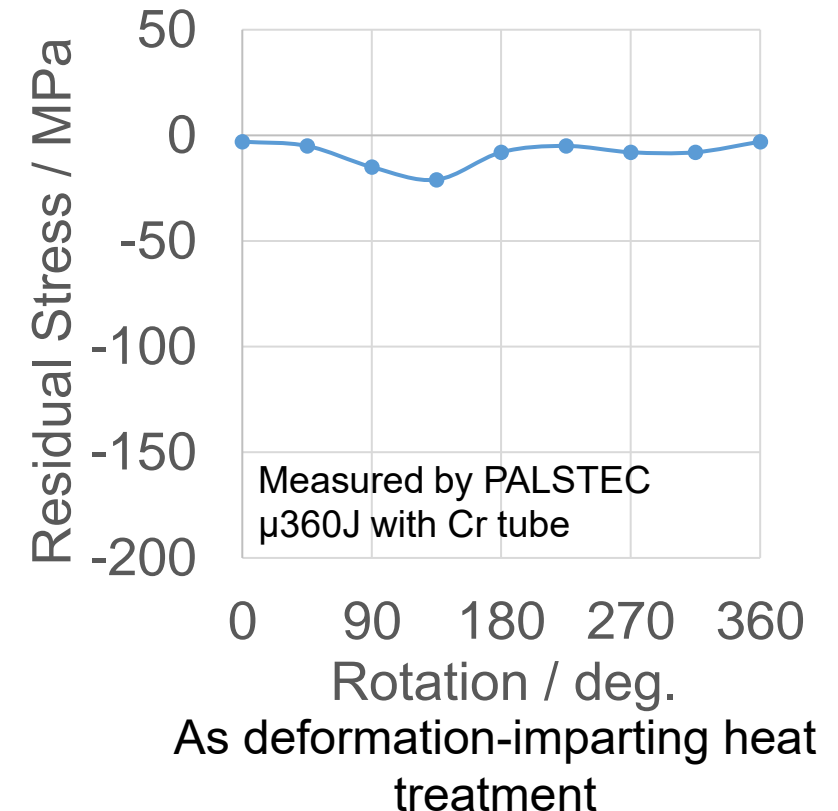
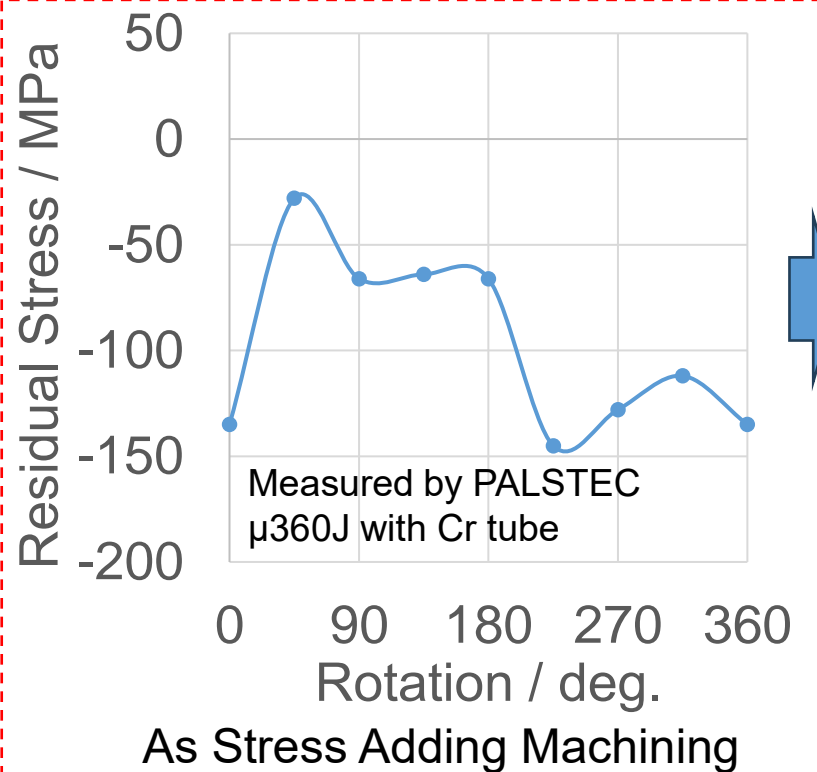
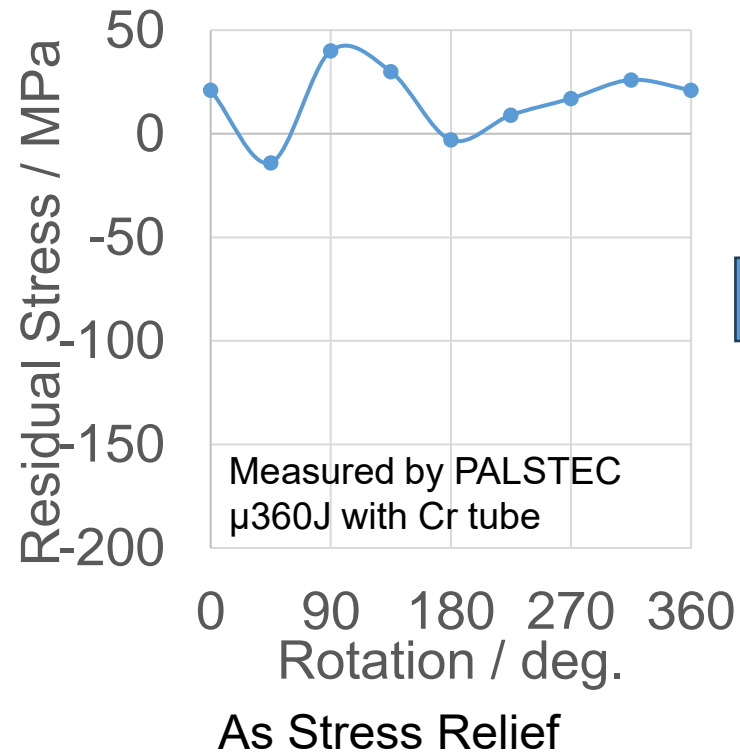
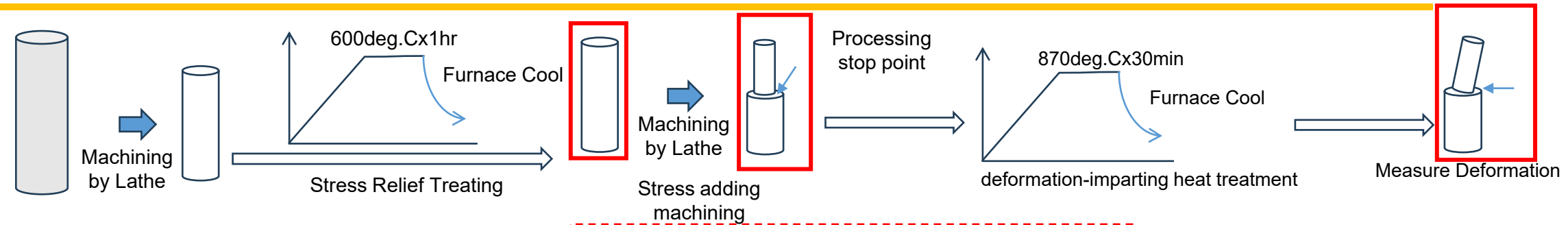


Stress of 1330 MPa was applied by repeated machining by lathe

0
Effective
Stress

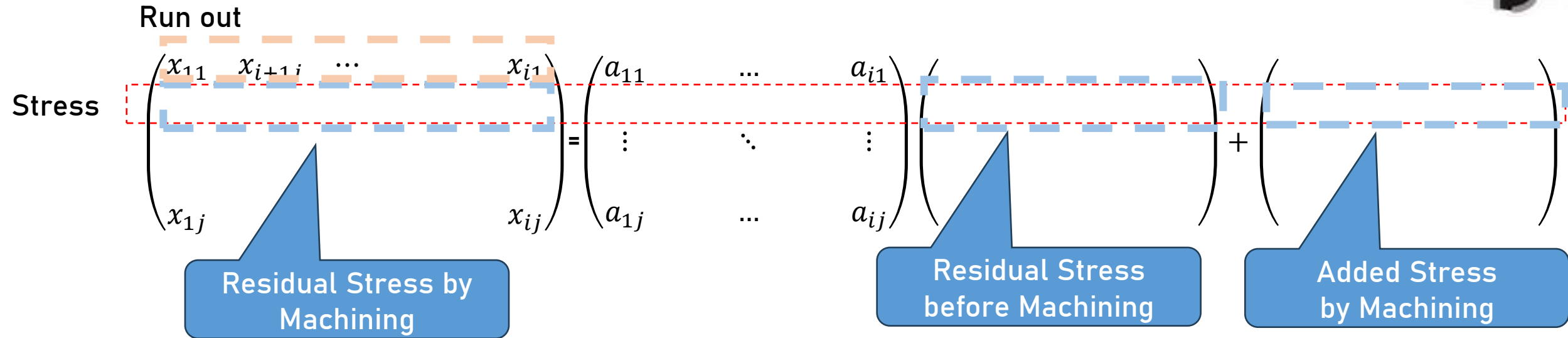


Effects of Residual Stress of Machining through Experiments





Calculation of Adding of Machining Stress



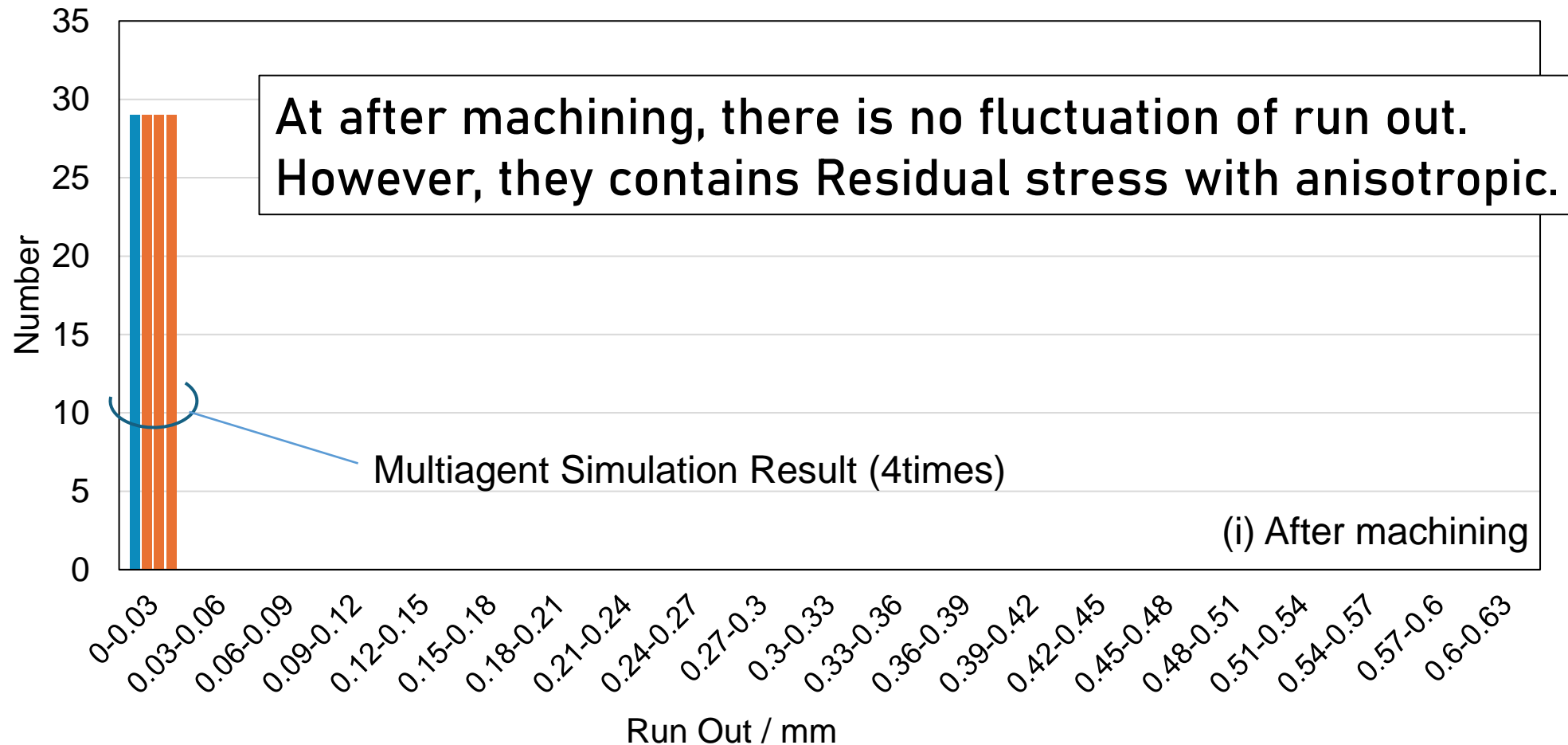
$$a_{ij} = r_{ij}(\cos \theta + i \sin \theta)$$

r_{ij} -150MPa(Effective)

θ random (Set direction is not defined in Process)

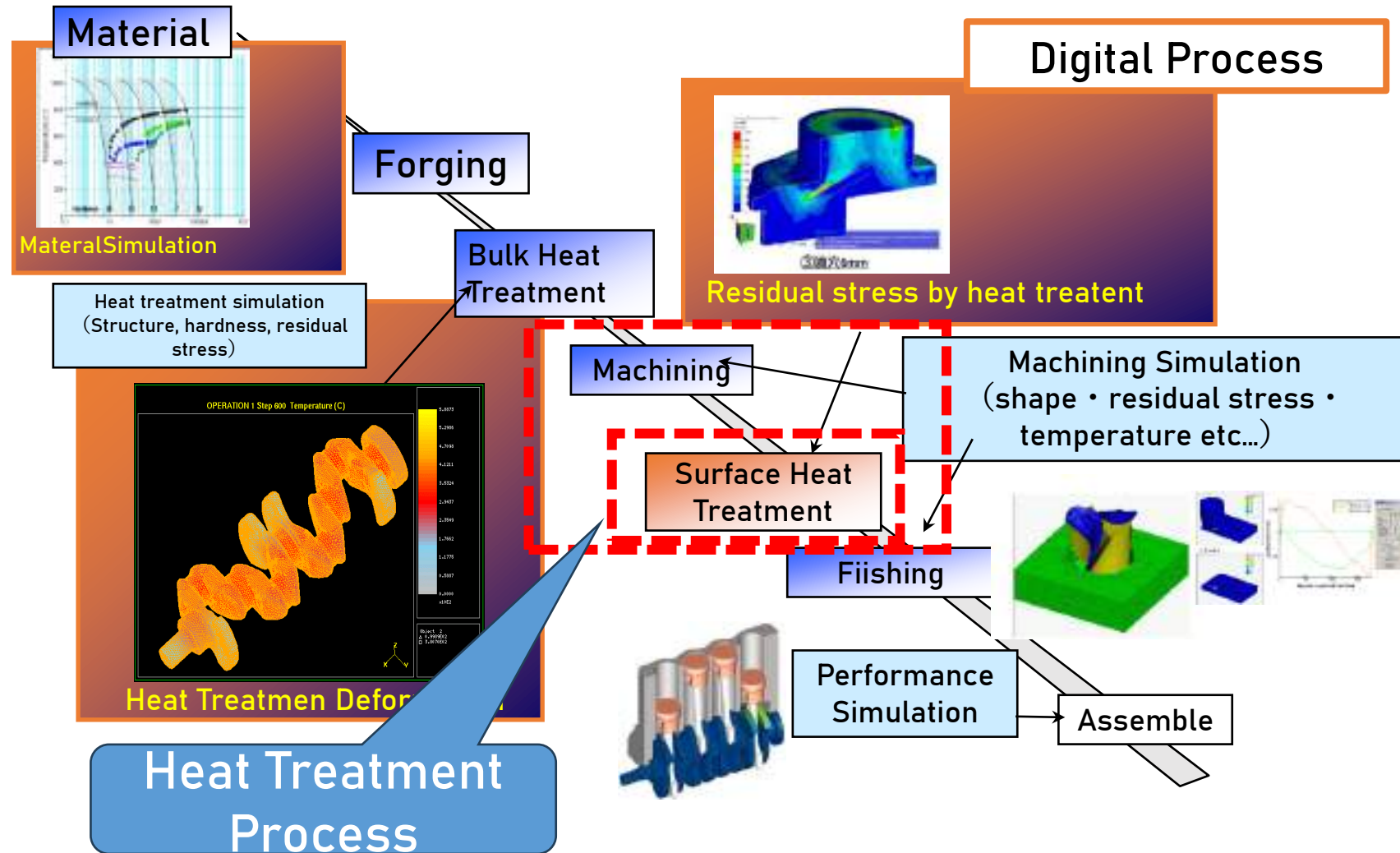


Run out after Machining



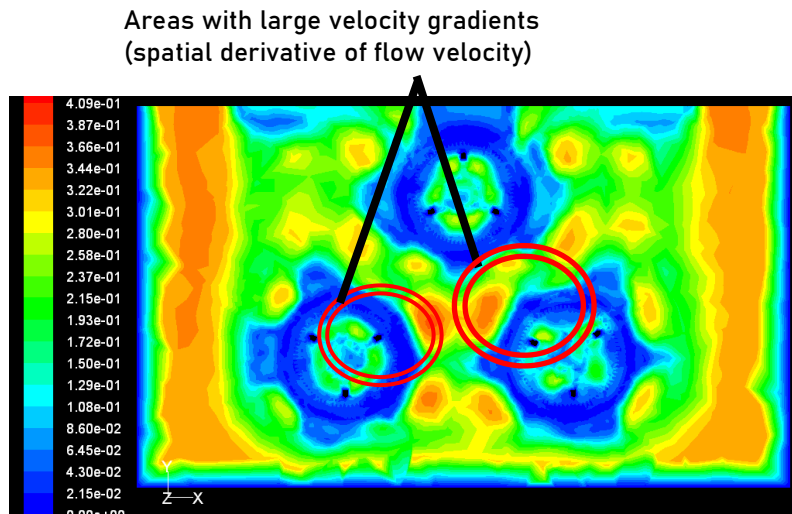


Process Through Simulation

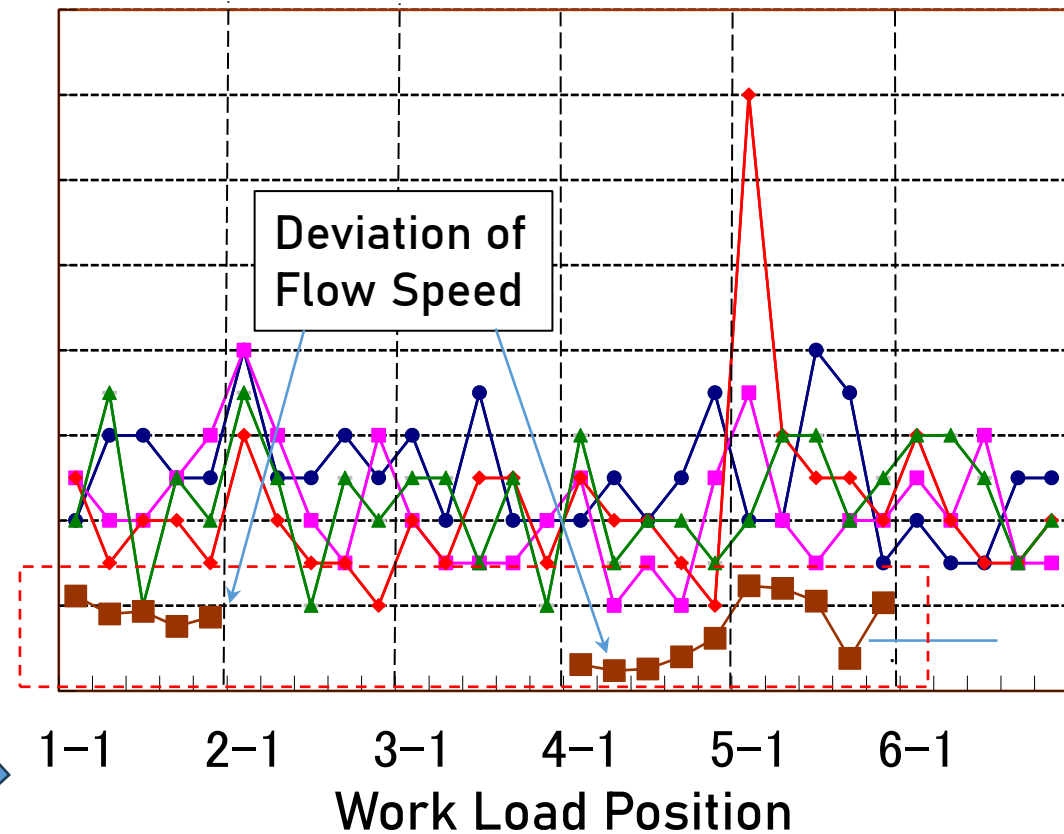




Cooling Anisotropy in Actual Setting



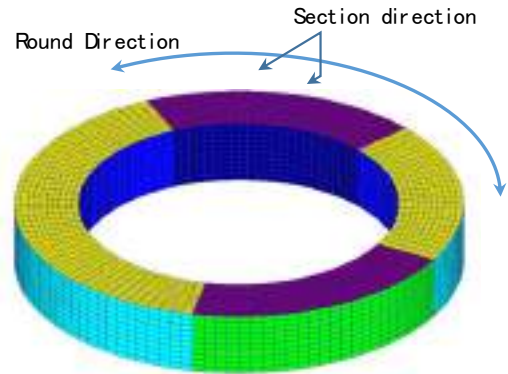
Runout / mm , Deviation of
Flow Speed in outer / 10m s⁻¹



Able to calculate correlation
between Flow speed & runout

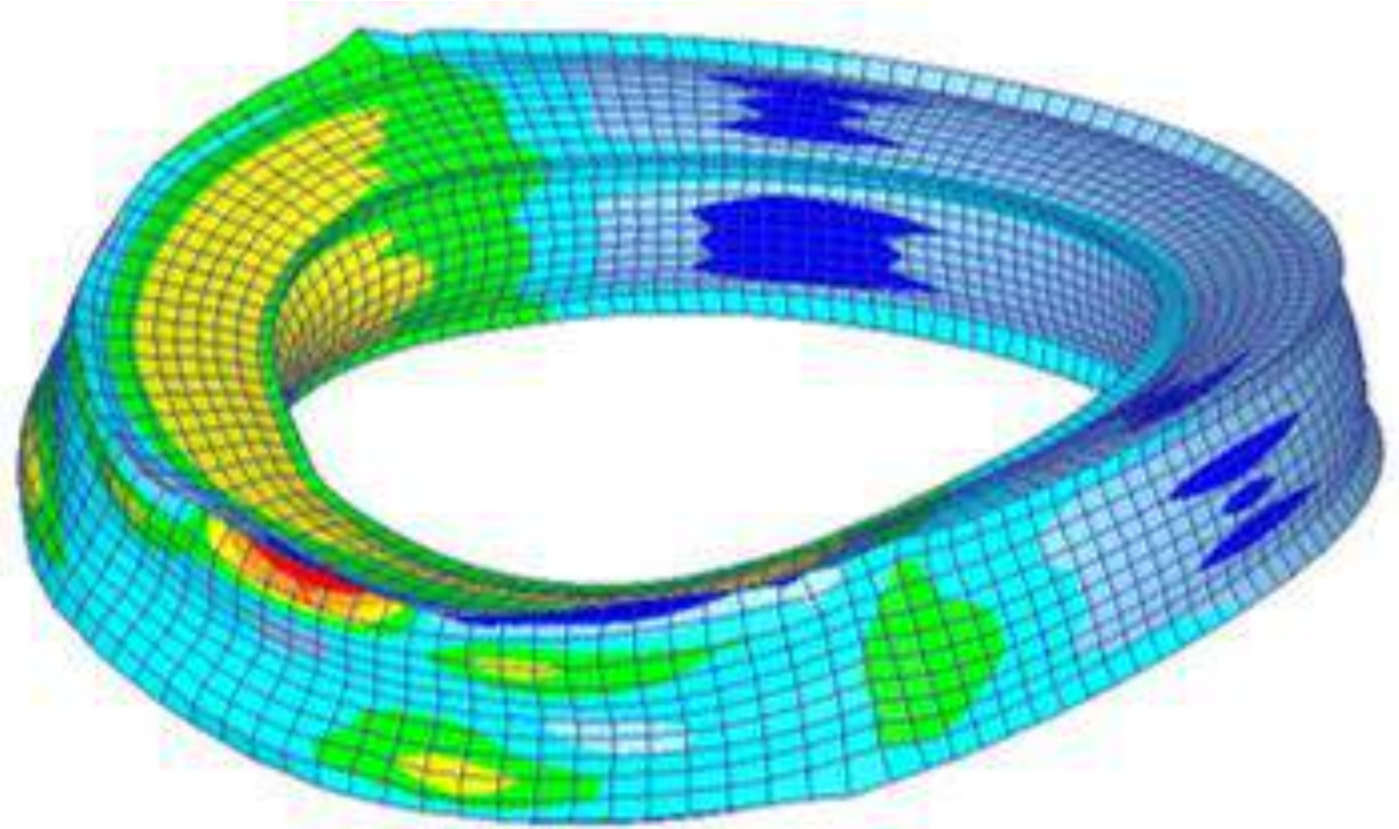


Deformation Calculation Result with Anisotropic Cooling



Calculation Condition

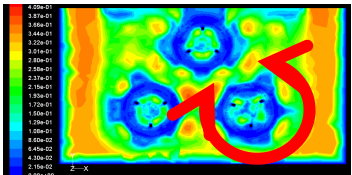
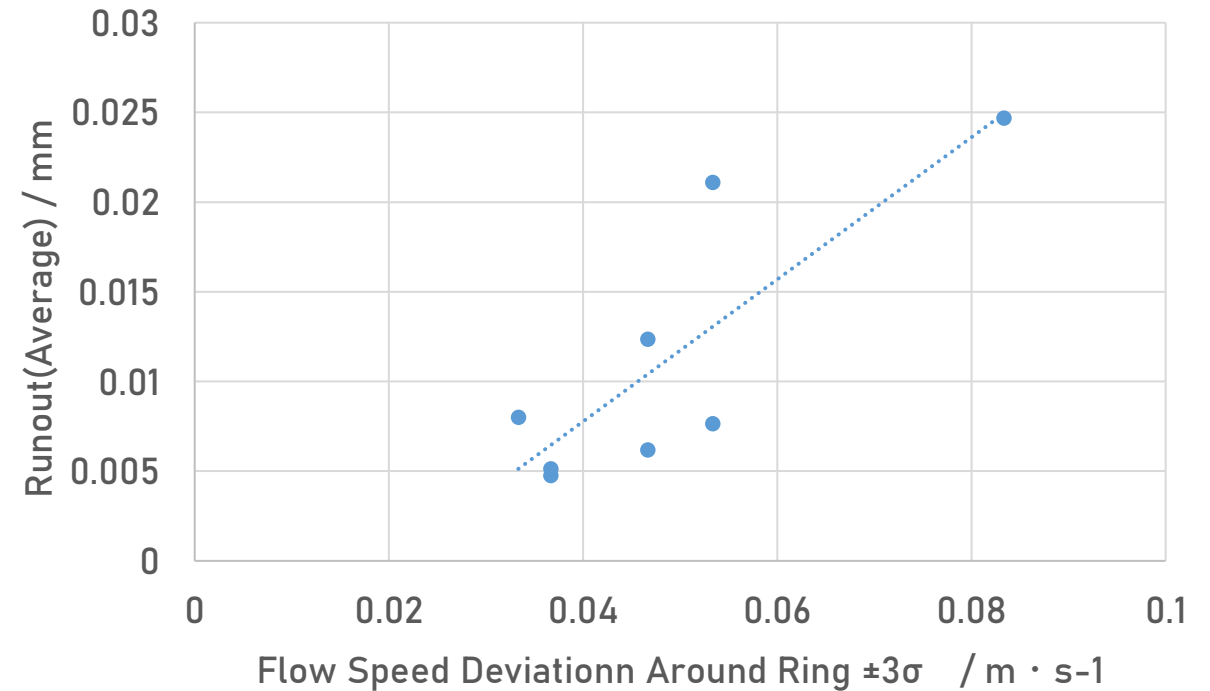
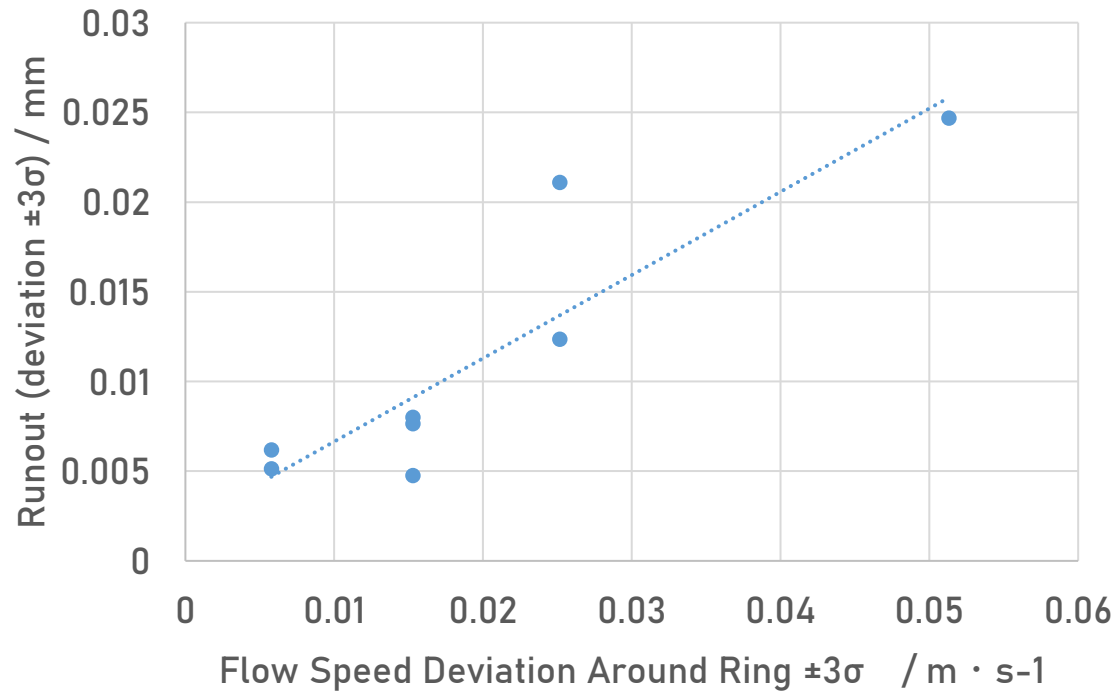
Solver	SFTC DEFORM-HT ver14.0
Nodes	14520
Elements	12000
Coating Mesh	0.1mm /per layer
Element shape	Hexagon





Correlation between Runout and Flow Speed

Flow Speed Dispersion and Run out have good correlation.





Calculation of Adding of Machining Stress

Run out

$$\begin{pmatrix} x_{11} & x_{i+1i} & \cdots & x_{i1} \\ \vdots & \vdots & \ddots & \vdots \\ x_{1j} & x_{ij} & \cdots & x_{ij} \end{pmatrix} = \begin{pmatrix} a_{11} & \cdots & a_{i1} \\ \vdots & \ddots & \vdots \\ a_{ij} & \cdots & a_{ij} \end{pmatrix} \begin{pmatrix} \text{Residual Stress before Heat Treatment} \\ \vdots \\ \text{Residual Stress before Heat Treatment} \end{pmatrix} + \begin{pmatrix} \text{Basic heat treatment deformation} \\ \vdots \\ \text{Basic heat treatment deformation} \end{pmatrix}$$

Diagram illustrating the calculation of adding of machining stress. The equation shows the relationship between the Total Run Out (matrix of x_{ij}), the Residual Stress Effect For Run out With anisotropic (matrix of a_{ij}), the Residual Stress before Heat Treatment (matrix of r_{ij}), and the Basic heat treatment deformation (matrix of d_{ij}).

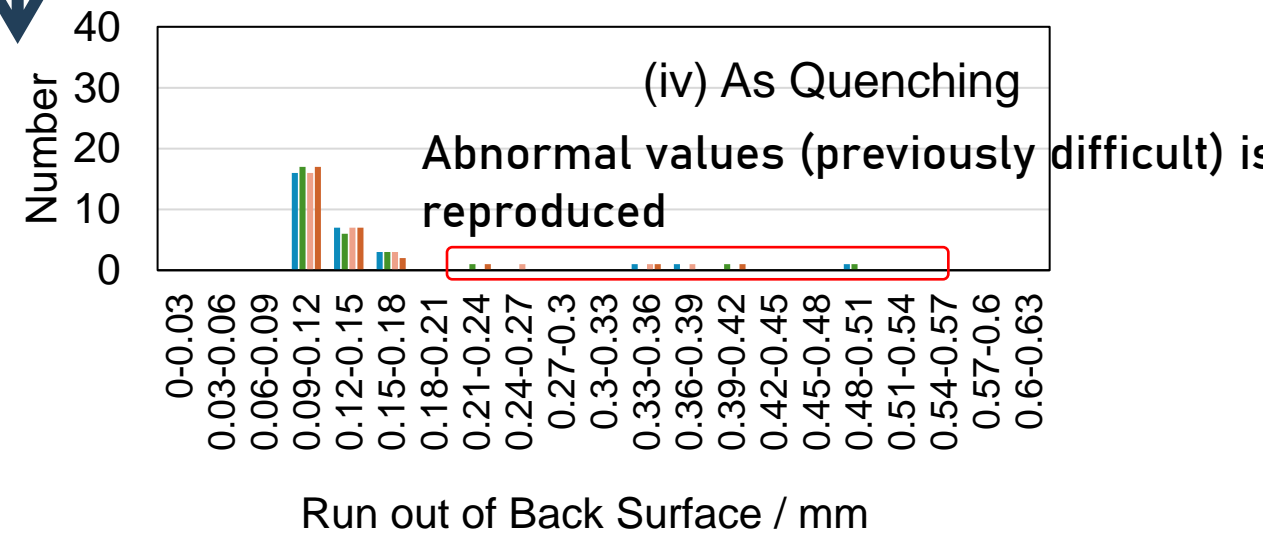
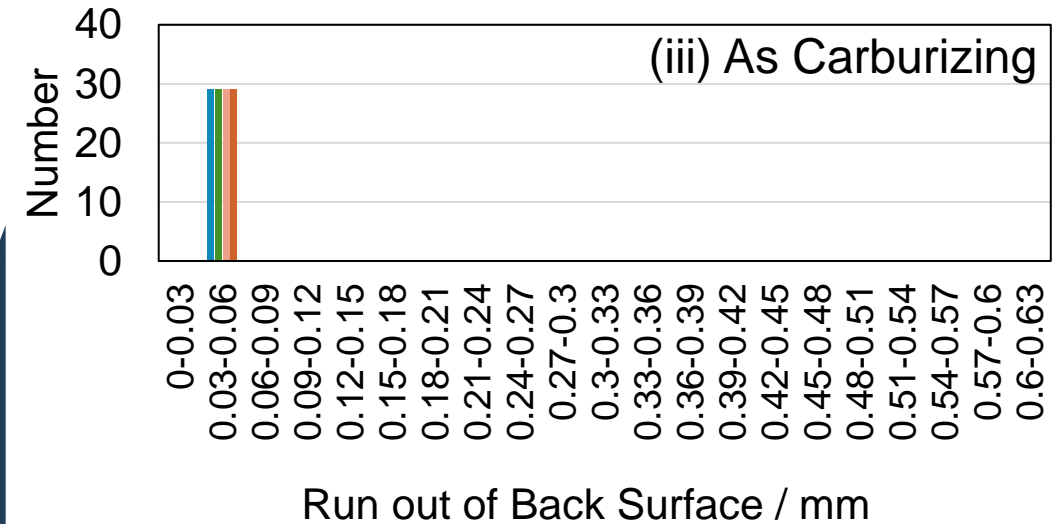
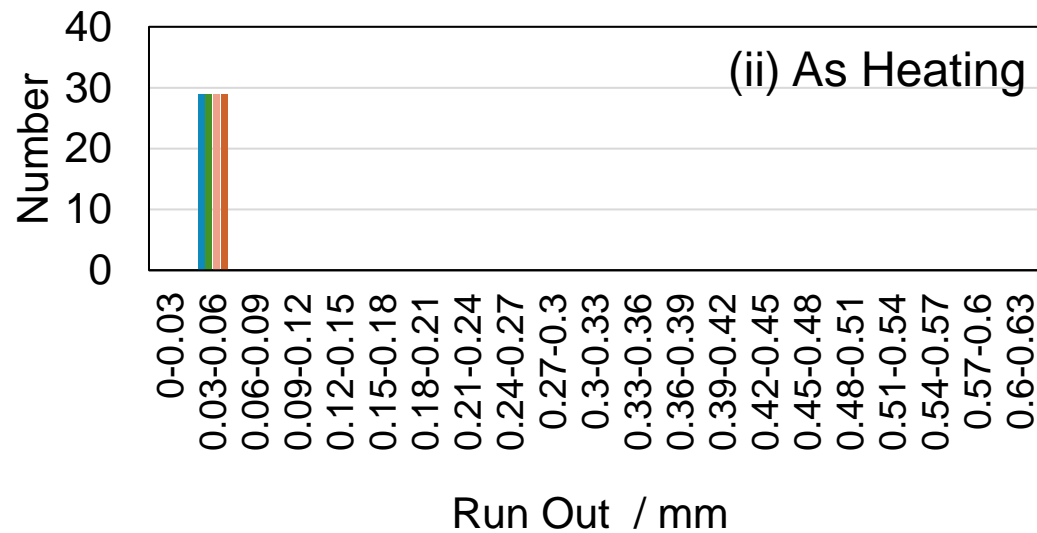
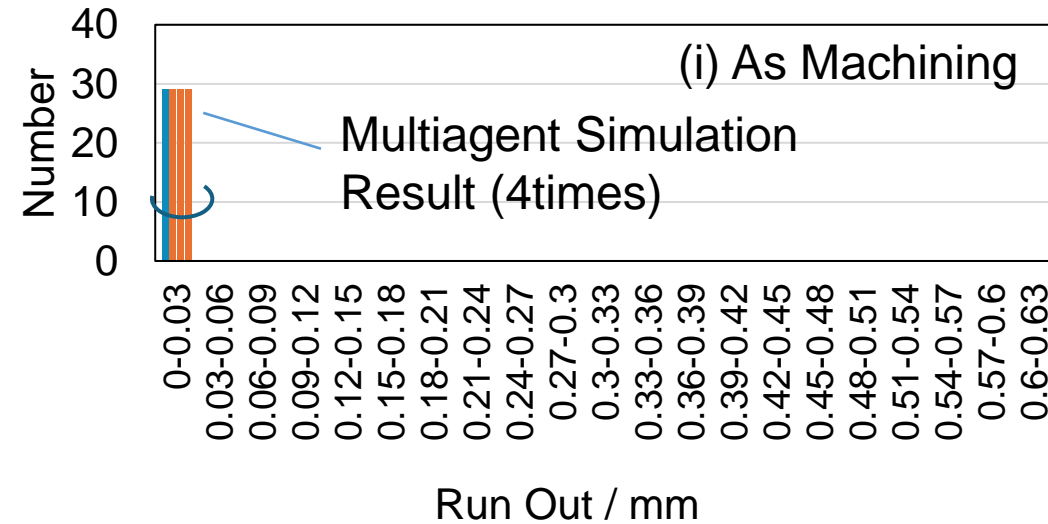
$$a_{ij} = r_{ij}(\cos \theta + i \sin \theta)$$

Contain Cooling Speed Anisotropy





Result of Heat Treatment Deformation Calculation





Conclusion

- ✓ A hierarchical multi-agent simulation including condition anisotropy was able to accurately reproduce the heat treatment quality distribution, including abnormal values.
- ✓ The connection matrix can be derived by repeating the heat treatment and related simulation.
- ✓ By performing multi-agent simulation for each characteristic shape part, it is possible to predict overall deformation and quality.

This research is supported by JSPS Grant No. Research 25K17526 "Heat treatment simulation considering machining- processing-induced variations that contribute to life cycle CO2"



