



Sensitivity Study of Multiscale and Phenomenological Elasto- Viscoplastic Grade 91 Material Models for Component-Scale Response

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Changing the World's Energy Future

Lynn Brendon Munday, Benjamin W Spencer, Aaron Tallman, M. Arul Kumar, Mark Messner, Aritra Chakraborty, Laurent Capolungo, Topher Matthews



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**Idaho National Laboratory
Idaho Falls, Idaho 83415**

<http://www.inl.gov>

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Presenting: Lynn Munday^a

Benjamin Spencer^a, Laurent Capolungo^b, Aaron Tallman^b, M. Arul Kumar^b,
Topher Matthews^b, Mark Messner^c, Aritra Chakraborty^c

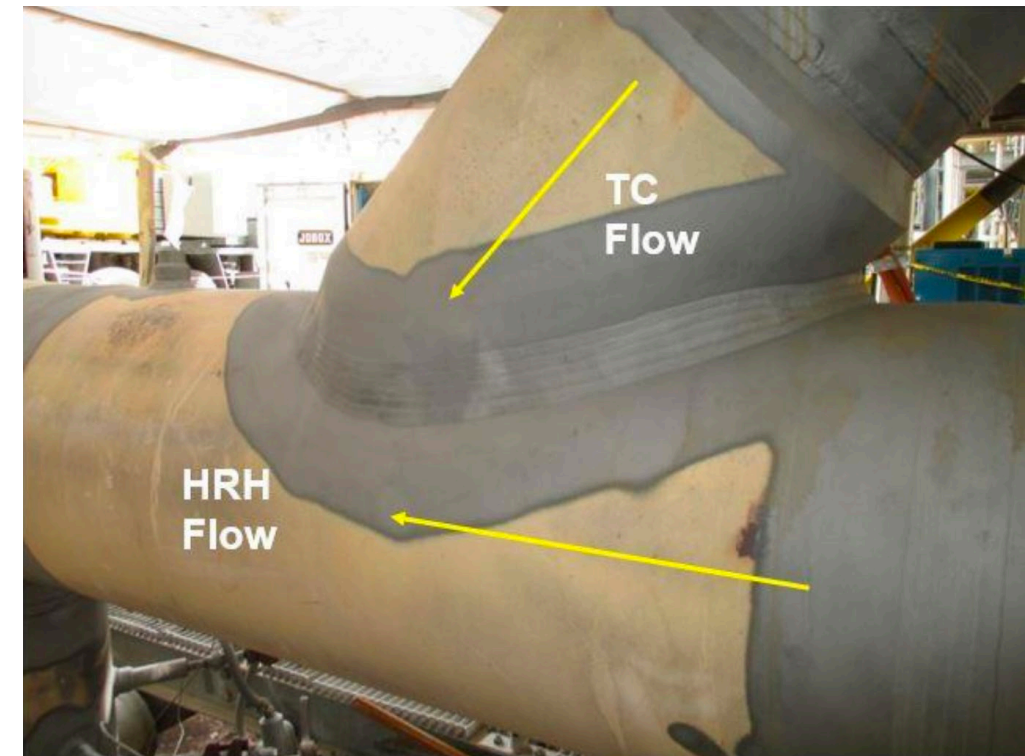
^aFuel Modeling and Simulation, Idaho National Laboratory

^bMaterials Science and Technology Division, Los Alamos National Laboratory

^cApplied Materials Division, Argonne National Laboratory

Elasto-Viscoplastic Grade 91 Material Models

- Develop simulation capabilities for high temperature design and life-cycle prediction
- NEML - models for probabilistic design:
 - Phenomelological
 - Fast running to provide large samples
 - Provide statistics of failure based on design criteria, e.g. ASME BVP code
- LAROMANCE - models for component life:
 - Incorporate microstructural data
 - Run at engineering length and time scales
 - Robust over range of stresses and temperatures



NEML model overview

- Nuclear Engineering Material model Library (NEML)¹
- Phenomological model fit to range of experimental data using Bayesian Markhov Chain Monte Carlo²
- Developed for monotonic loading

Flow Rule

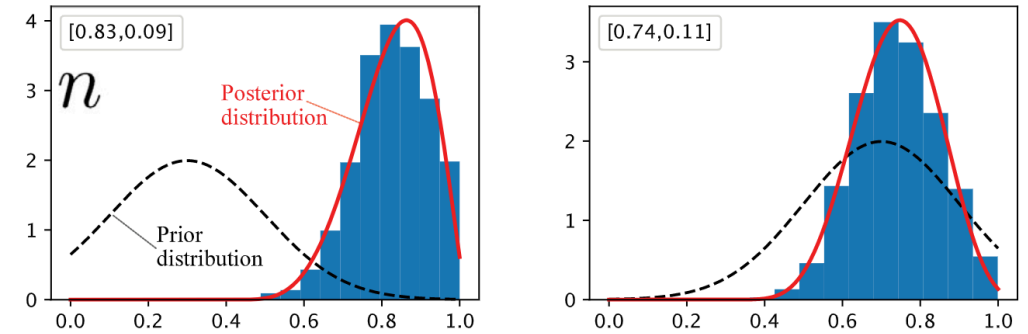
$$\dot{\epsilon}_{vp} = \left\langle \frac{\frac{\sigma}{1-\omega} - \sigma_0 - R}{\eta} \right\rangle^n$$

Hardening Parameter

$$R = Q \left[1 - \exp \left(-b |\epsilon_{vp}(t)| \right) \right]$$

Damage Rate (fixed)

$$\dot{\omega} = \left(\frac{\sigma}{A} \right)^\zeta (1 - \omega)^{-\phi}$$



parameter	550 ° C		600 ° C		
	(μ, σ)	Bounds	(μ, σ)	Bounds	
<i>n</i>	(11.09, 0.37)	[9, 13]	(8.455, 0.47)	[7, 10]	
<i>η</i>	(832.4, 23)	[700, 950]	(750.6, 41.9)	[600, 900]	
<i>σ</i> ₀	(3.769, 0.83)	[2, 10]	(3.547, 0.66)	[2, 5]	
<i>Q</i>	(106.9, 8.7)	[80, 130]	(112.6, 8.19)	[80, 130]	
<i>b</i>	(47.99, 7.7)	[30, 70]	(44.00, 8.28)	[20, 70]	
<i>A</i>	517	—	650	—	
<i>ζ</i>	12.5	—	10	—	
<i>φ</i>	2.5	—	2.0	—	
<i>E</i>	174000	—	168000	—	Elastic Constants
<i>ν</i>	0.31	—	0.31	—	

(a) Truncated normal distributions for NEML model parameters [4]. Units are MPa, mm, s.

¹<https://neml.readthedocs.io/en/dev/#>

²Chakraborty A, Messner MC. Bayesian analysis for estimating statistical parameter distributions of elasto-viscoplastic material models. Probabilistic Engineering Mechanics. 2021 Oct 1;66:103153.

LAROMANCE model overview

- Surrogate model database generated from crystal plasticity model^{1,2}
 - Viscoplastic self consistent CP framework
 - Inelastic strain from dislocation glide, climb and coble creep
 - For polynomial degree 2, α has 729 terms
 - Sigmoid function to interpolate between tiles

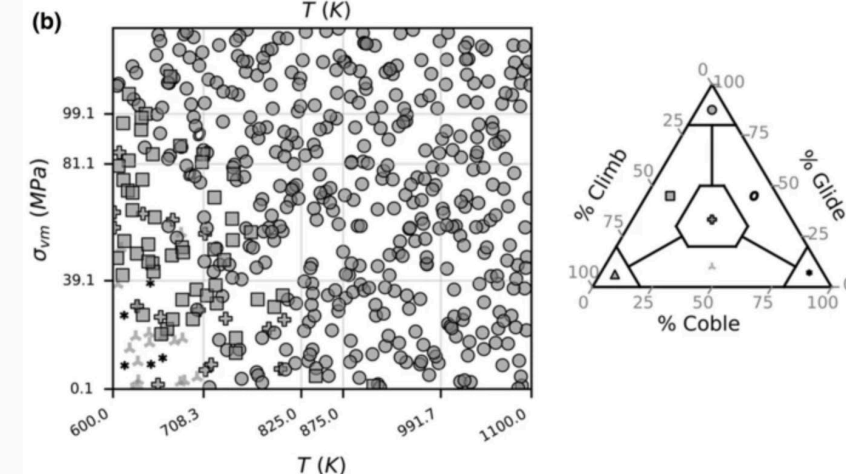
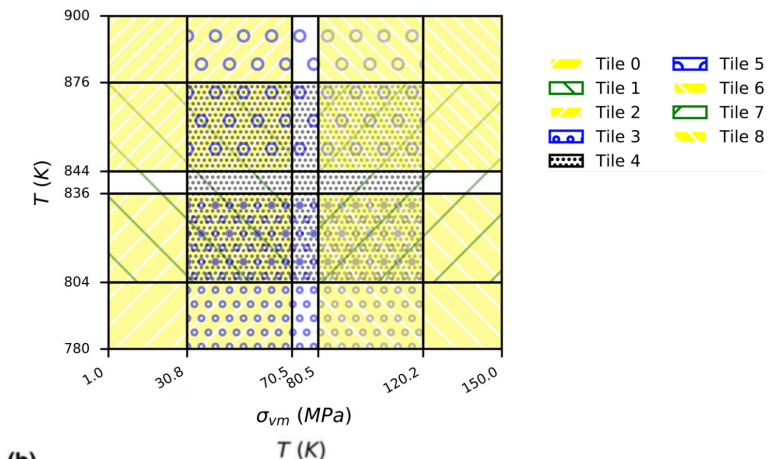
$$\dot{\epsilon}_{ij} = \dot{\epsilon}_{vm} \frac{3}{2} \frac{S_{ij}}{\bar{\sigma}_{vm}}$$

$$\dot{\epsilon}_{vm}^{**} \sim \sum_{0 \leq i \dots n \leq N_{deg}} \alpha_{\epsilon}^{ijklmn} P^i(\bar{\rho}_{cell}^*) P^j(\bar{\rho}_w^*) P^k(T^*) P^l(\sigma_{vm}^*) P^m(\epsilon_{vm}^*) P^n(\phi_{MX}^*)$$

$$\dot{\rho}_{cell}^{**} \sim \sum_{0 \leq i \dots n \leq N_{deg}} \alpha_{\rho_{cell}}^{ijklmn} P^i(\bar{\rho}_{cell}^*) P^j(\bar{\rho}_w^*) P^k(T^*) P^l(\sigma_{vm}^*) P^m(\epsilon_{vm}^*) P^n(\phi_{MX}^*)$$

$$\dot{\rho}_w^{**} \sim \sum_{0 \leq i \dots n \leq N_{deg}} \alpha_{\rho_w}^{ijklmn} P^i(\bar{\rho}_{cell}^*) P^j(\bar{\rho}_w^*) P^k(T^*) P^l(\sigma_{vm}^*) P^m(\epsilon_{vm}^*) P^n(\phi_{MX}^*)$$

parameter	Bounds
Cell Dislocation Density (10^{12}m^{-2})	[1, 3.5]
Wall Dislocation Density (10^{12}m^{-2})	[6, 18]
MX Phase Fraction (ϕ_{MX})	[0.008, 0.1]
von Mises Stress (MPa)	[1, 150]
Effective Strain (m/m)	[0.0, 0.08]
Temperature ($^{\circ}\text{C}$)	[507, 627]

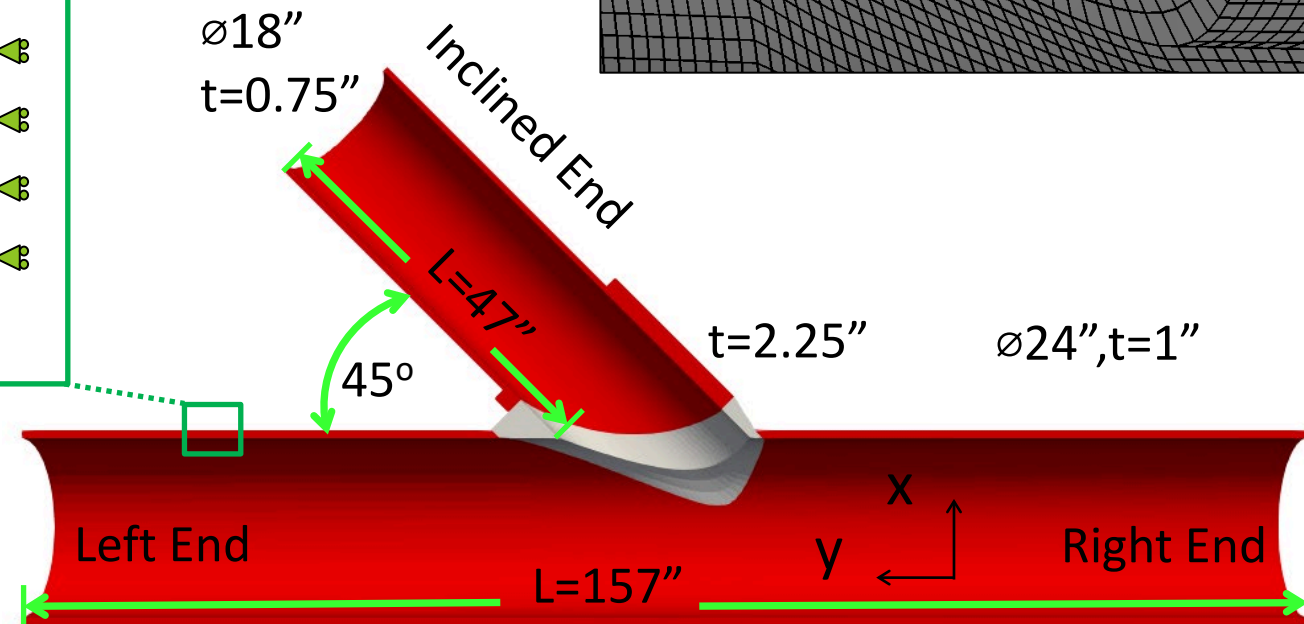
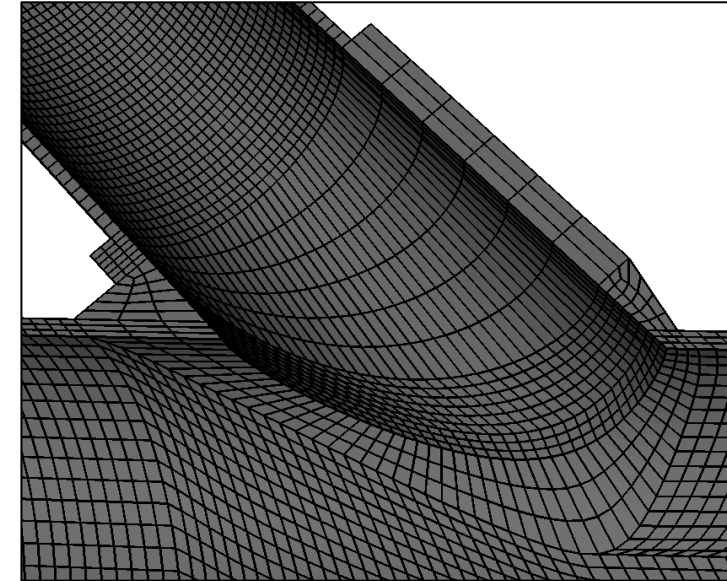
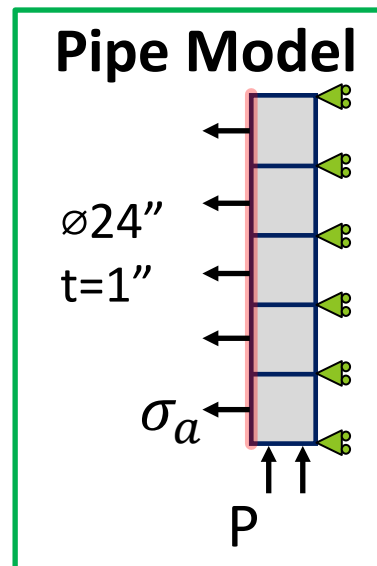
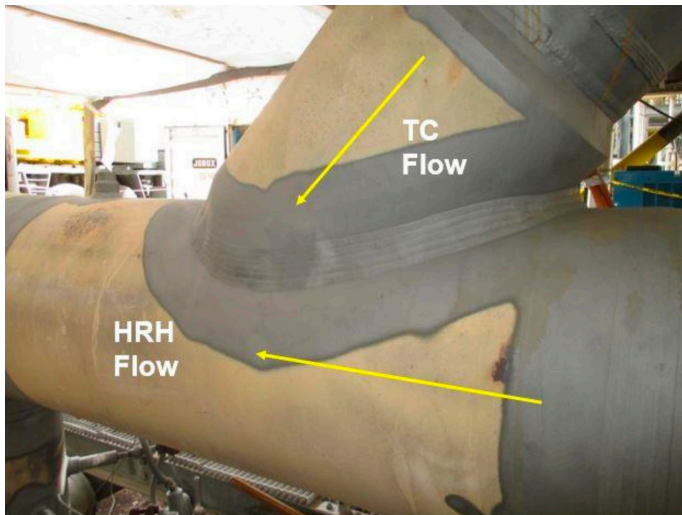


¹Wen W, Kohnert A, Kumar MA, Capolungo L, Tomé CN. Mechanism-based modeling of thermal and irradiation creep behavior: An application to ferritic/martensitic HT9 steel. International Journal of Plasticity. 2020 ;126:102633.

²Tallman AE, Arul Kumar M, Matthews C, Capolungo L. Surrogate modeling of viscoplasticity in steels: Application to thermal, irradiation creep and transient loading in HT-9 cladding. JOM. 2021;73(1):126-37.

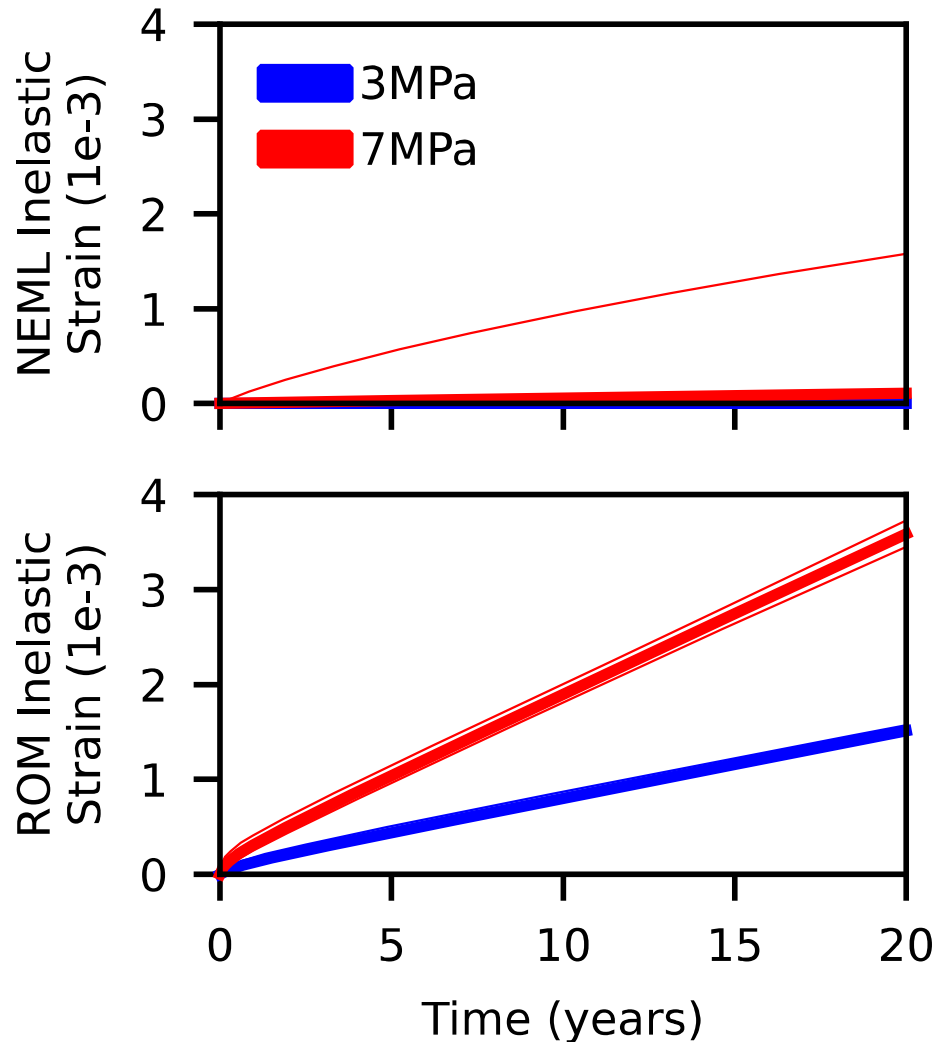
Geometry engineering models

- Show stresses, etc. Show pipe model.
- Show

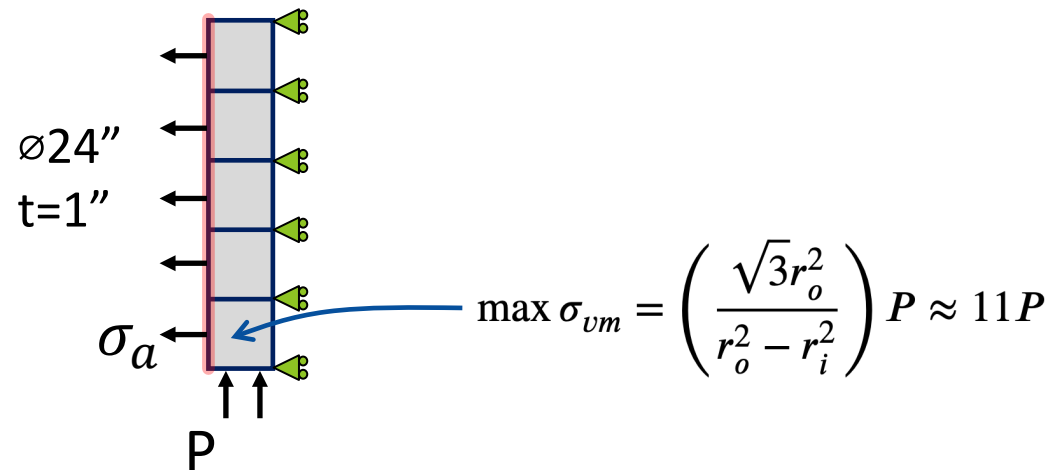


Pipe Results: Stress-Strain History for T=550C

T=550C

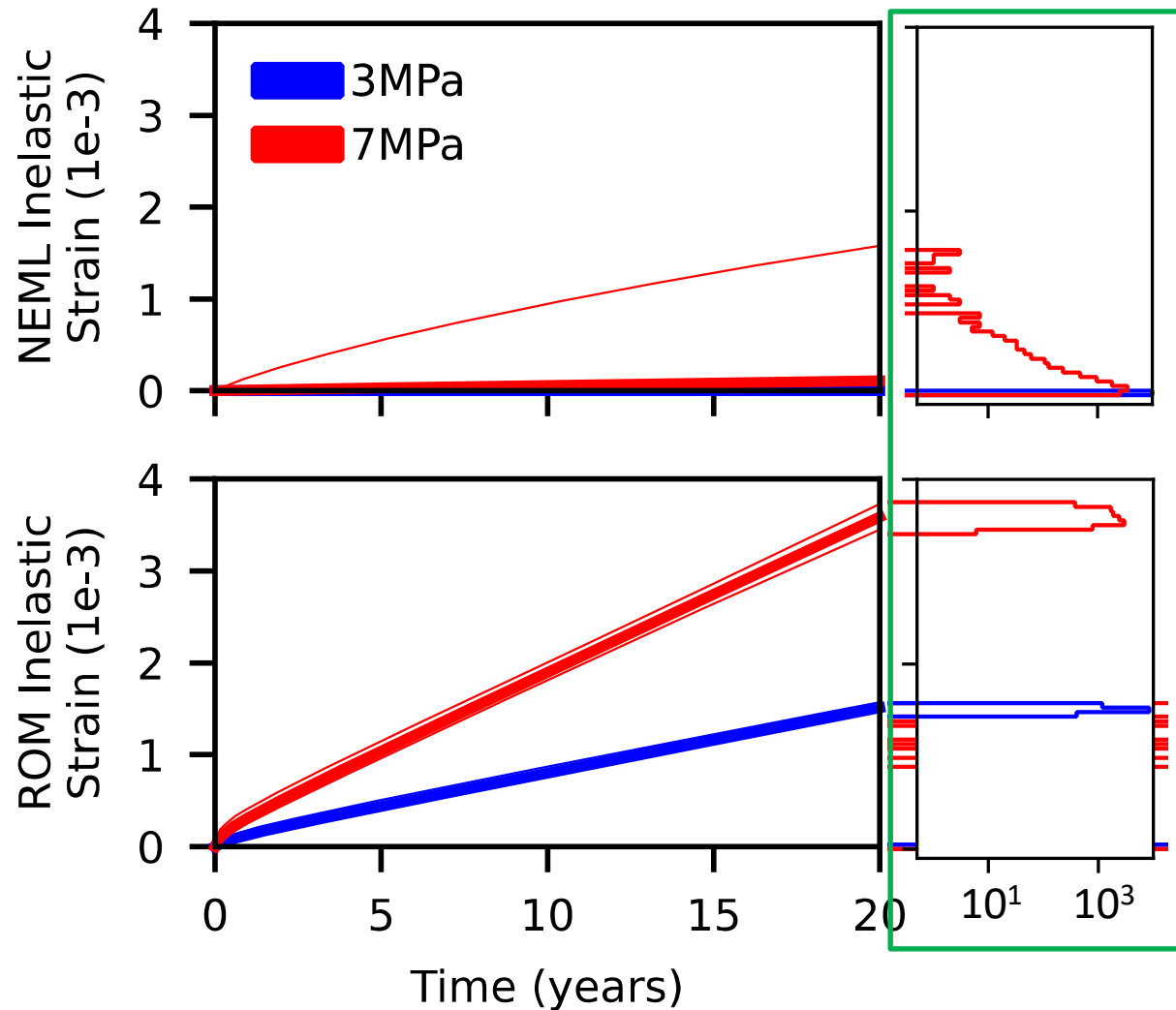


- 10,000 Parameters samples at each pressure
 - NEML sampled from truncated normal distributions
 - LAROMANCE sampled from uniform distributions over valid parameter range



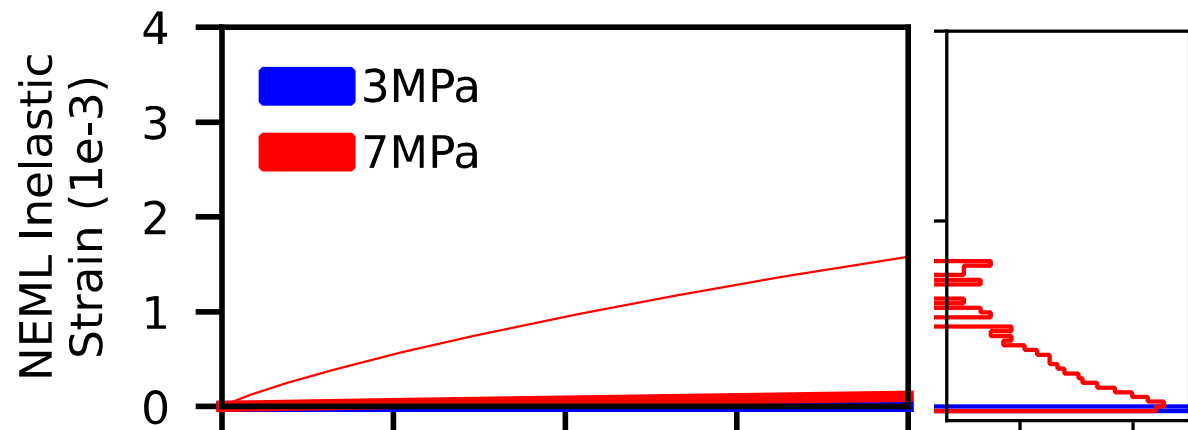
Pipe Results: Inelastic Strain Histogram at 20 yrs

T=550C

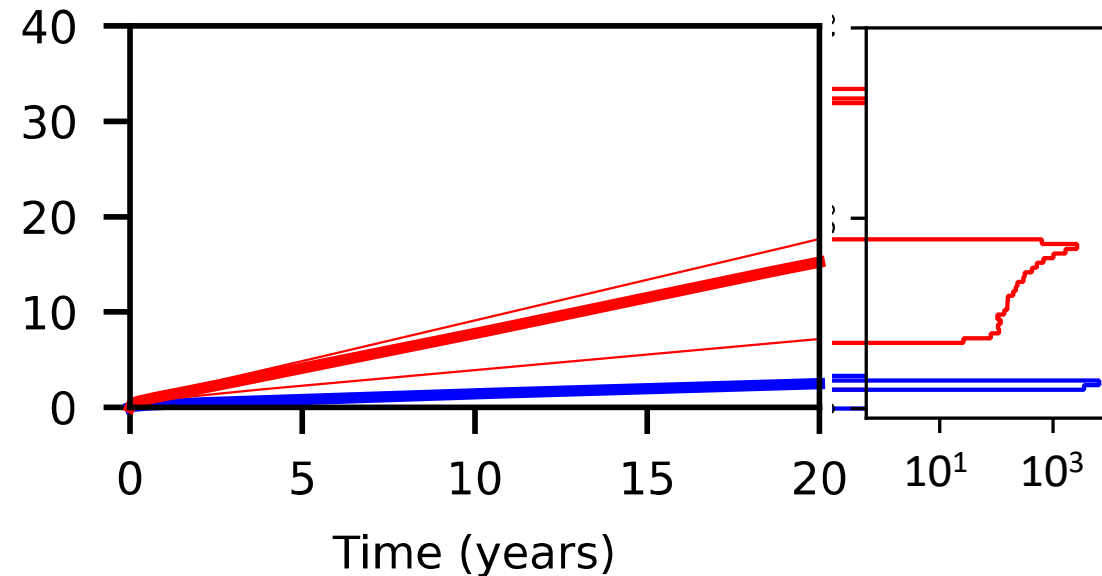
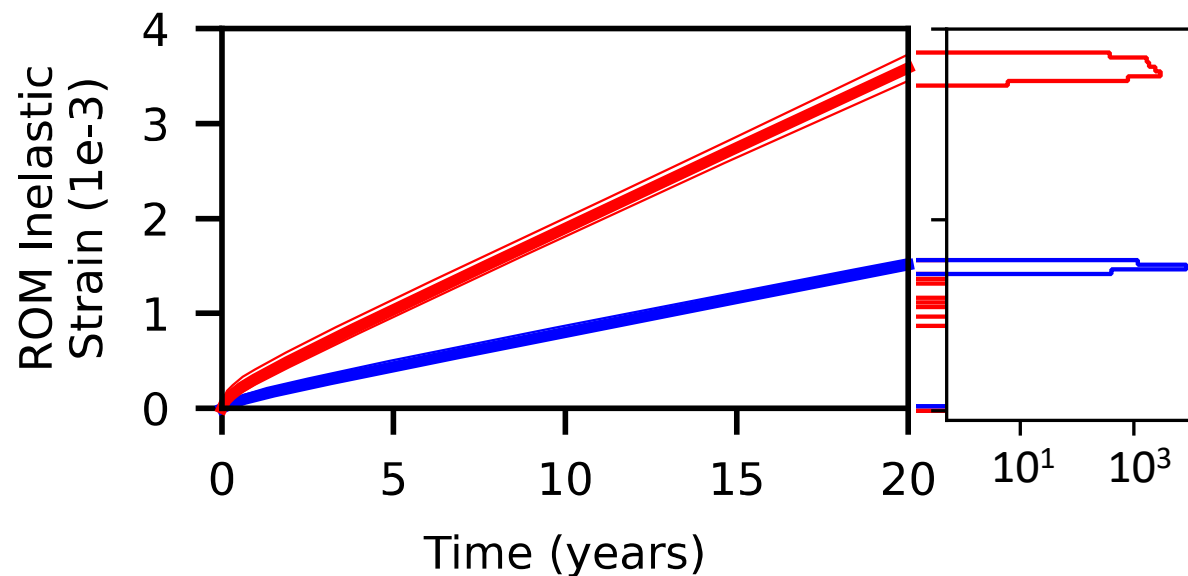
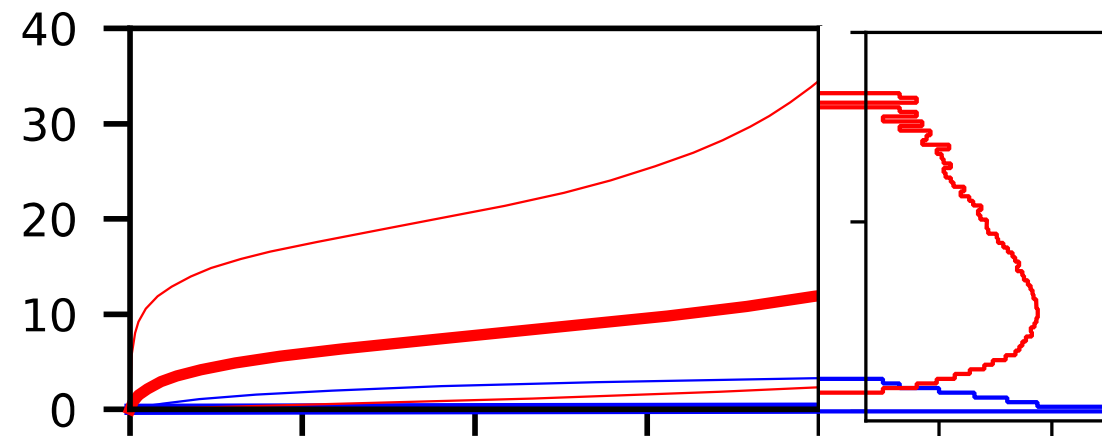


Pipe Results: Stress-Strain for T=550C and T=600C

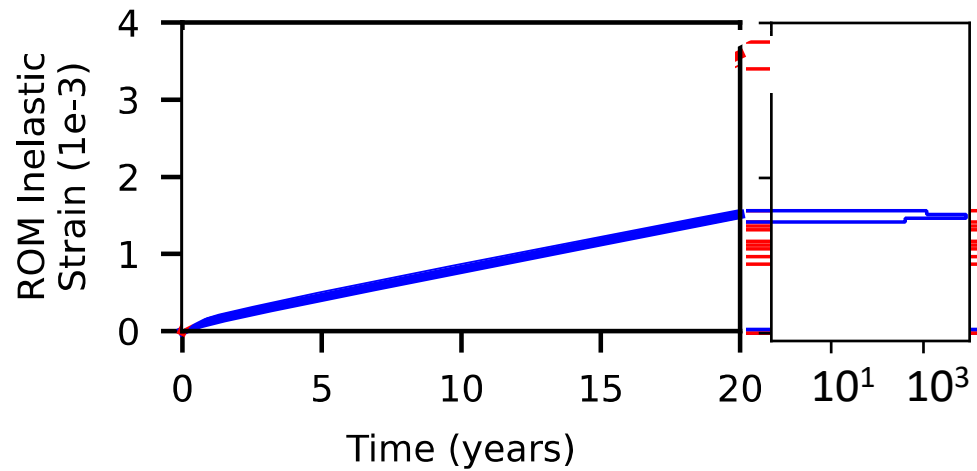
T=550C



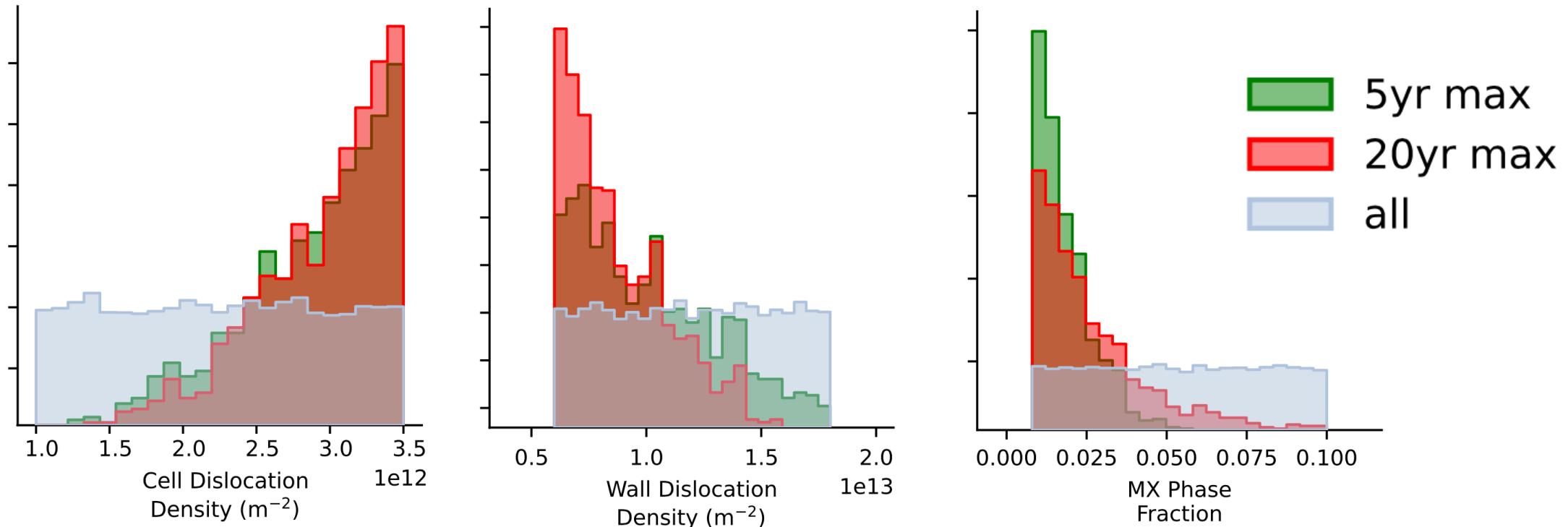
T=600C



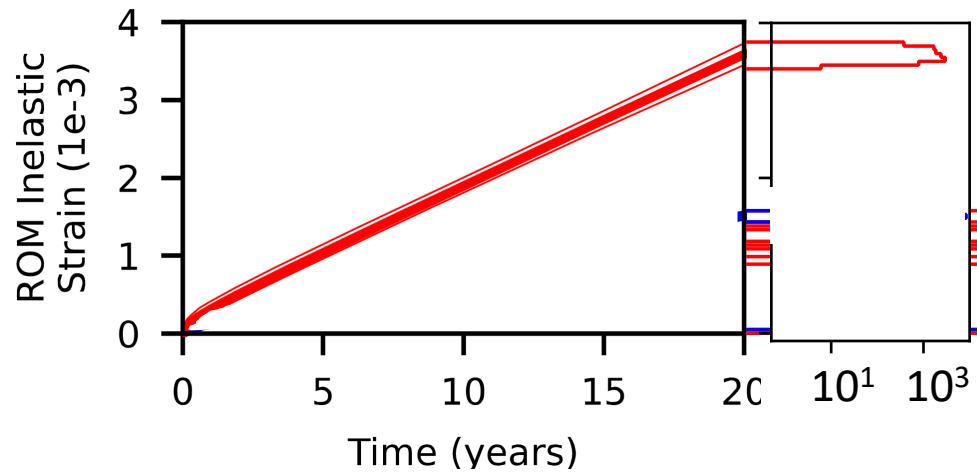
LAROMANCE MODEL: $T=550\text{C}$, $P=3\text{MPa}$ ($\sigma_{\text{max}}=33\text{MPa}$)



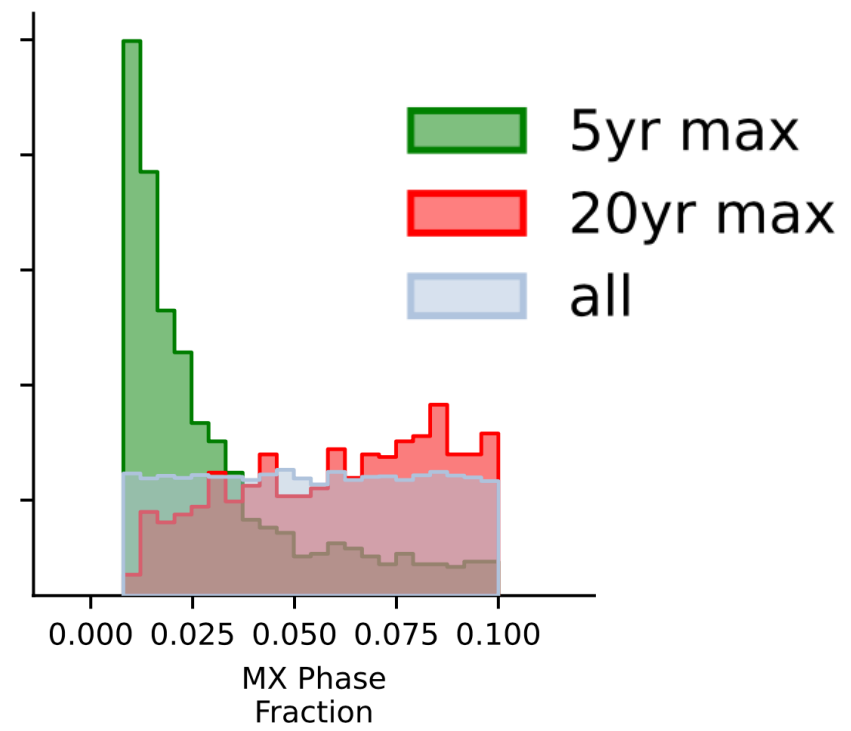
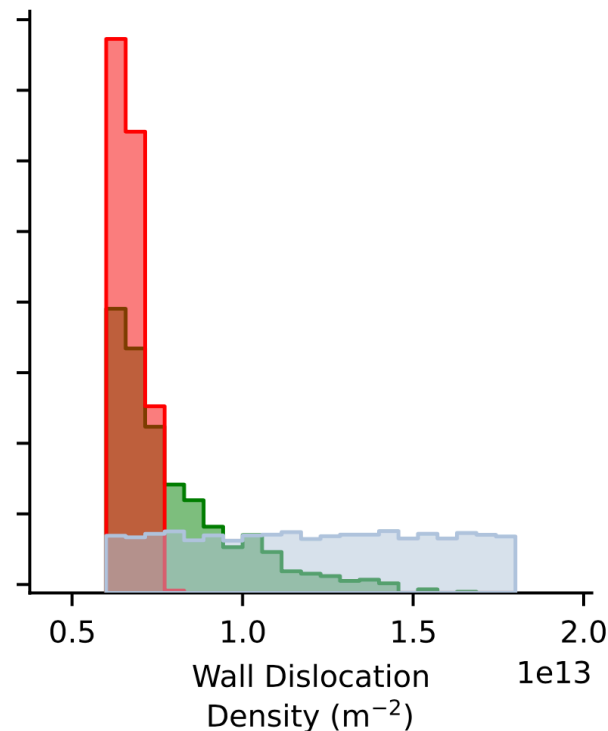
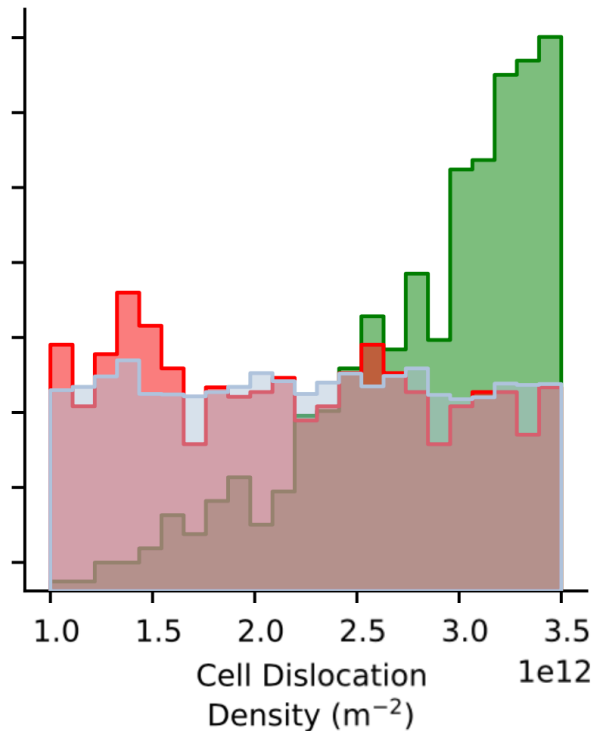
Parameters leading to top 10% of maximum inelastic strain after 20 years for $T=550\text{C}$, $P=3\text{MPa}$



LAROMANCE MODEL: $T=550\text{C}$, $P=7\text{MPa}$ ($\sigma_{\text{max}}=77\text{MPa}$)



Parameters leading to top 10% of maximum inelastic strain after 20 years for $T=550\text{C}$, $P=7\text{MPa}$



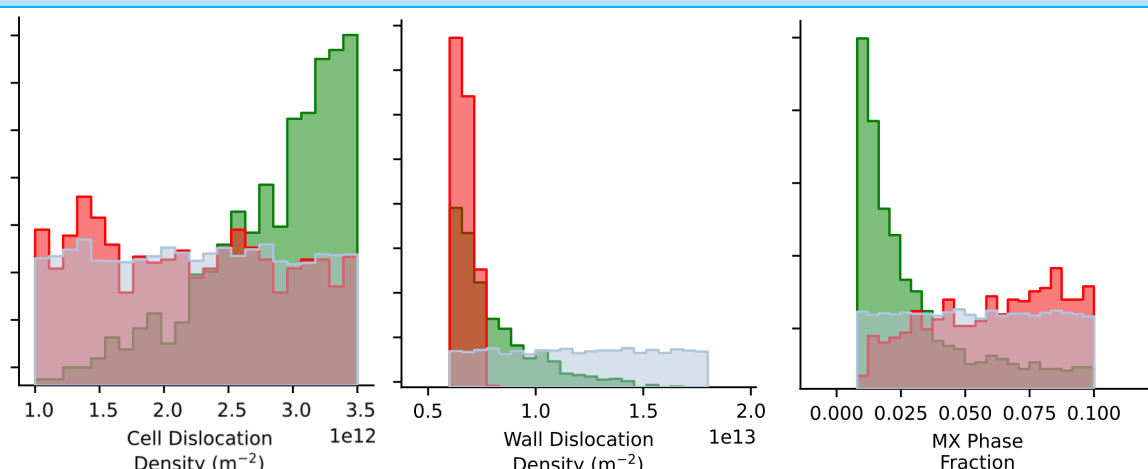
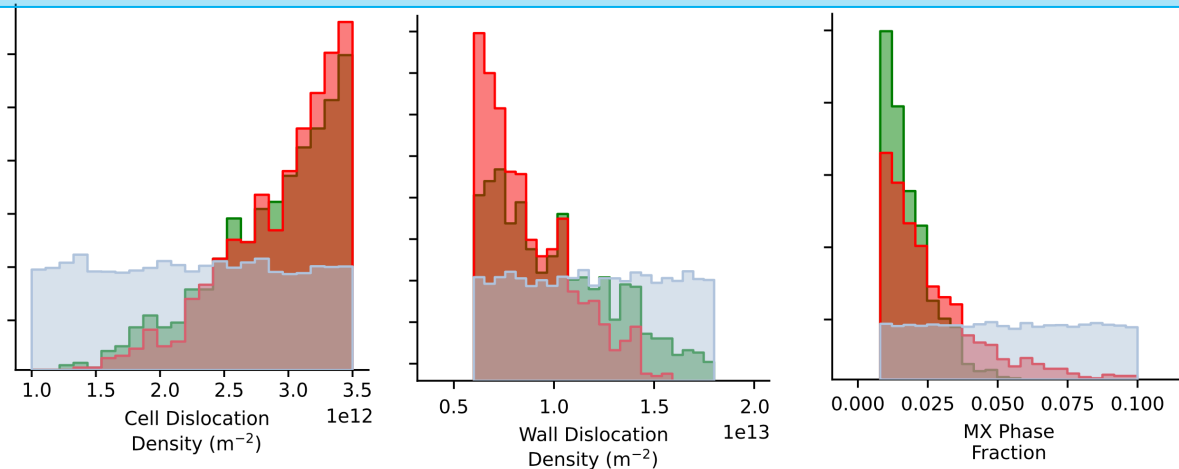
LAROMANCE MODEL

5yr max
20yr max
all

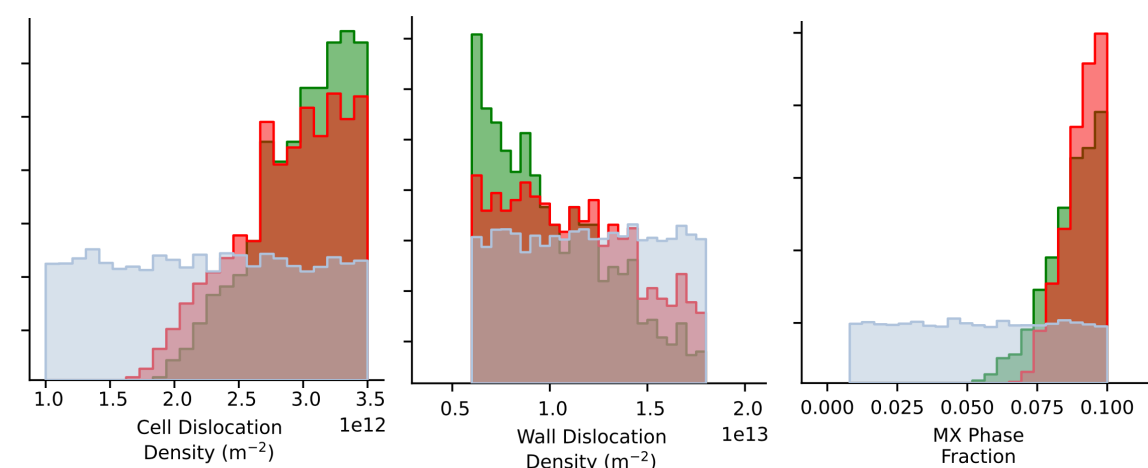
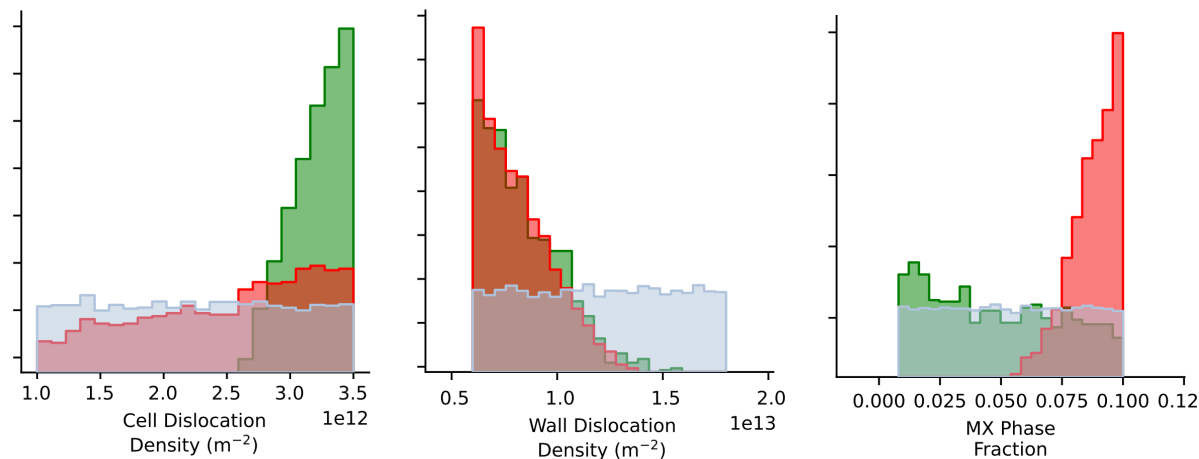
P=3MPa (σ_{\max} =33MPa)

P=7MPa (σ_{\max} =77MPa)

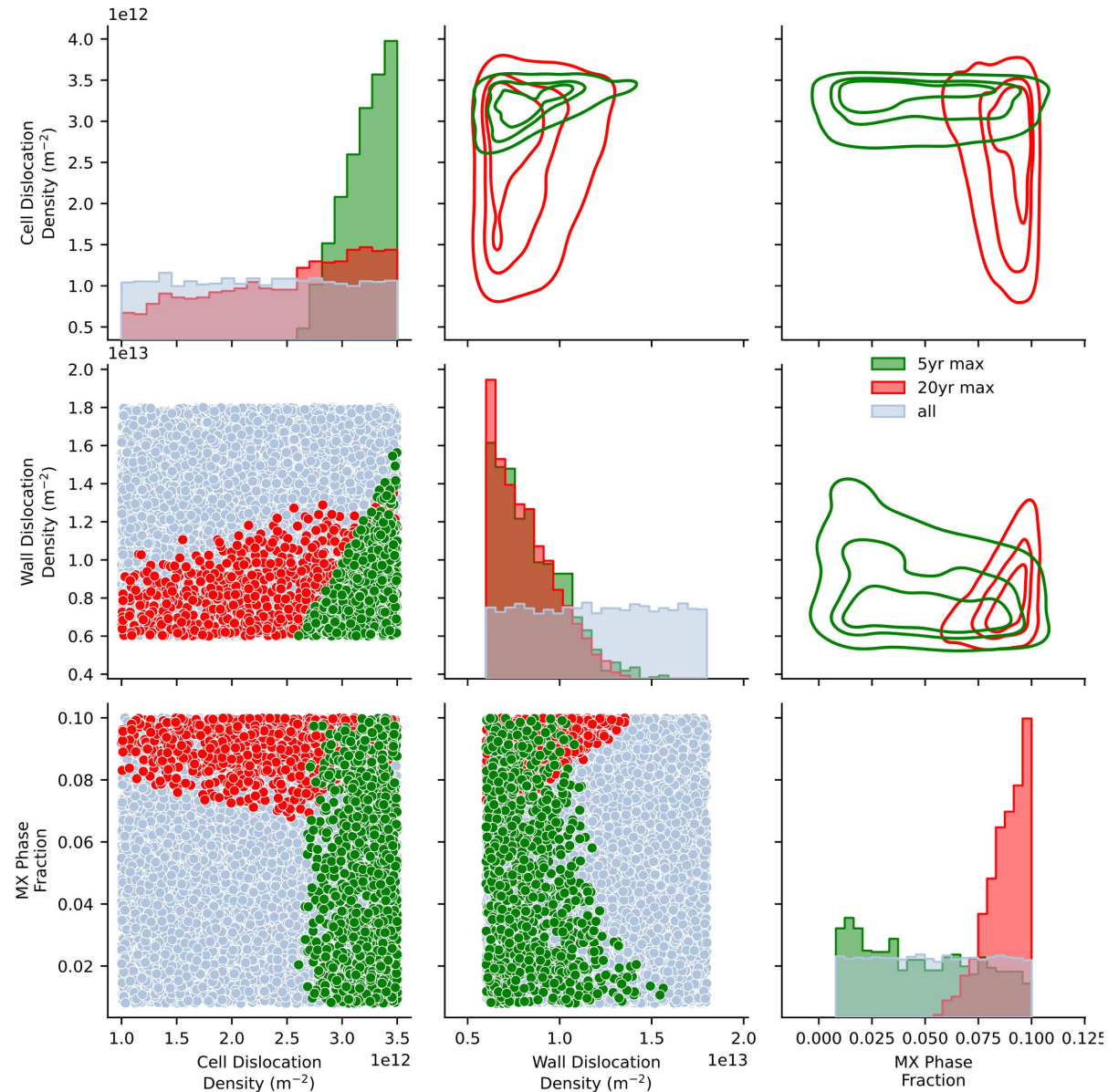
T=550C



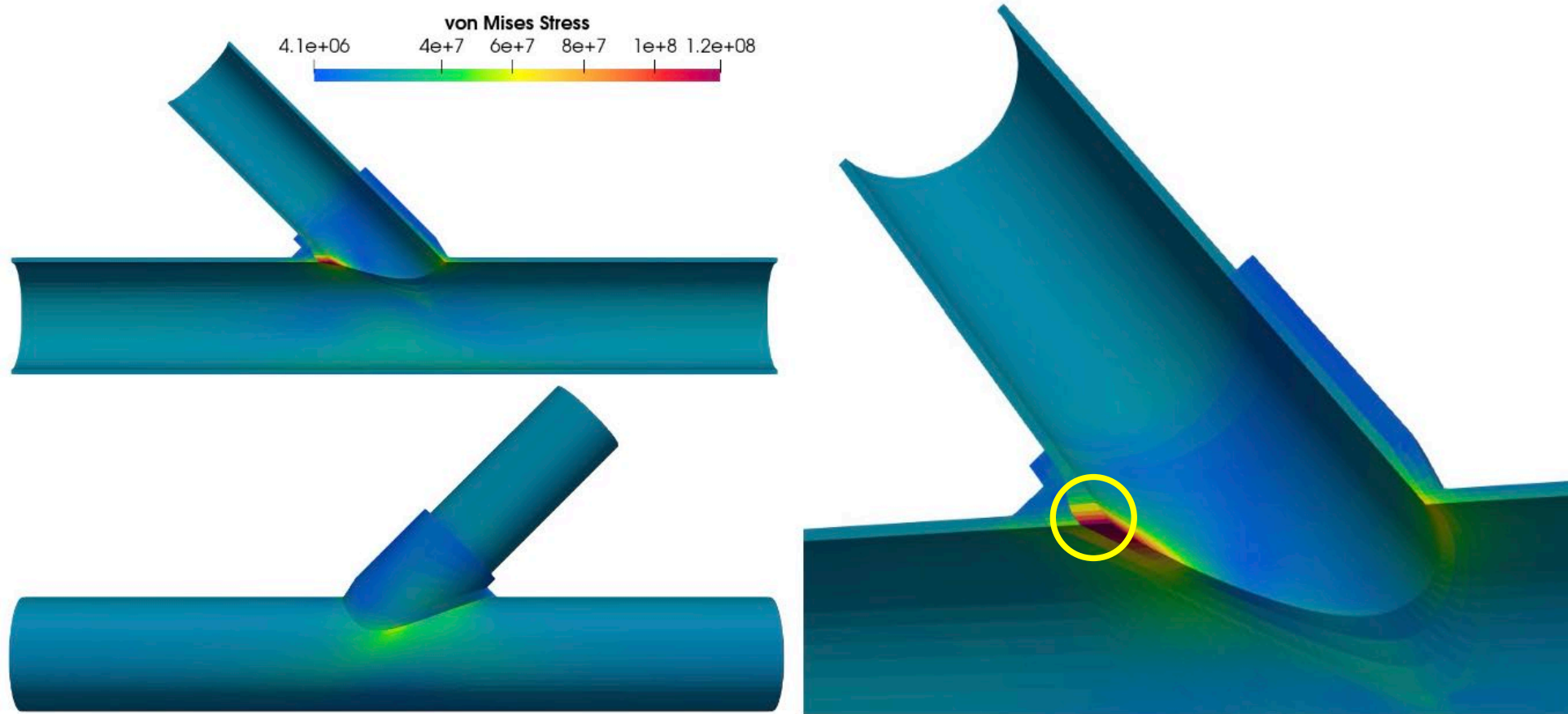
T=600C



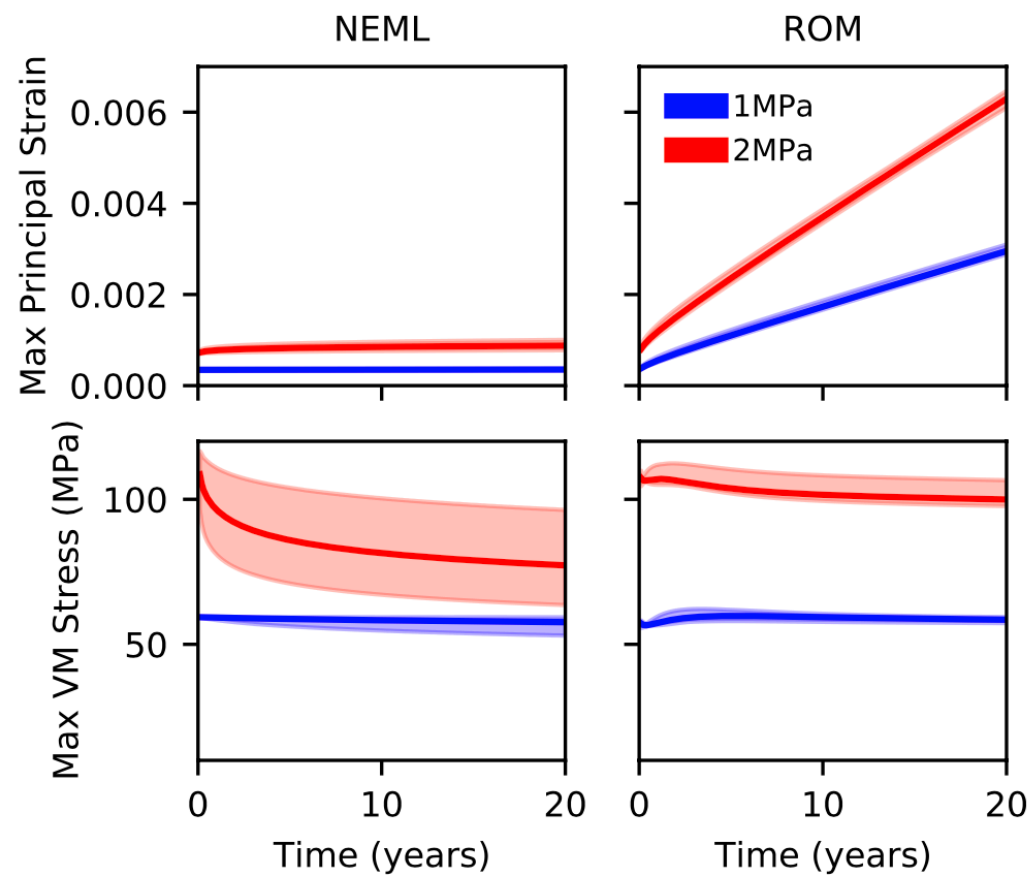
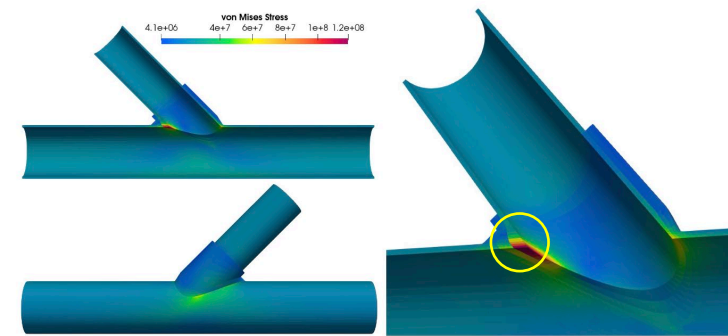
Pipe Results: Cross Correlation - T=600C, P=3MPa



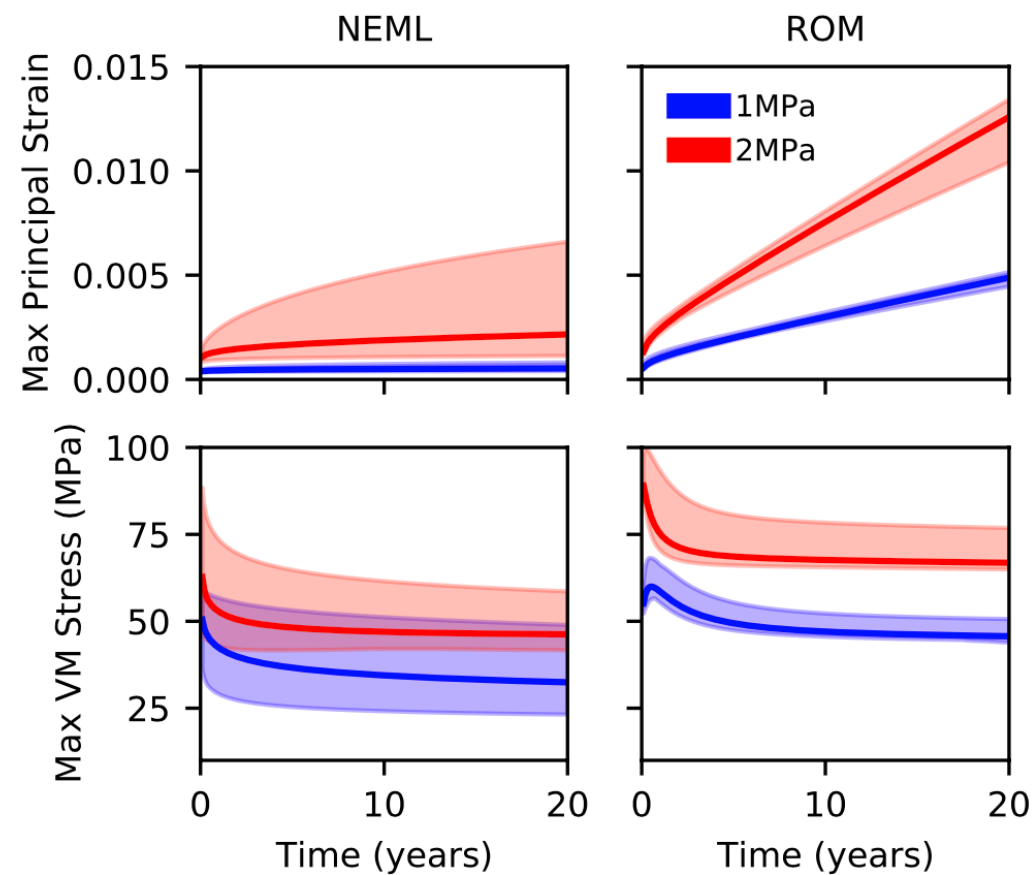
Pipe Lateral Simulations: $T=550^{\circ}\text{C}$, $P=2\text{MPa}$



Pipe Lateral Simulations



(a) Temperature = 550°C



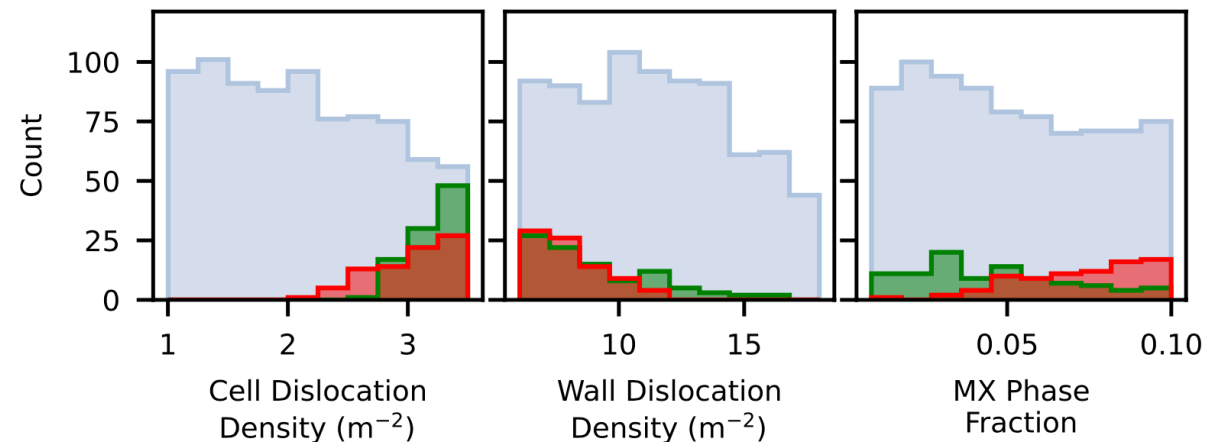
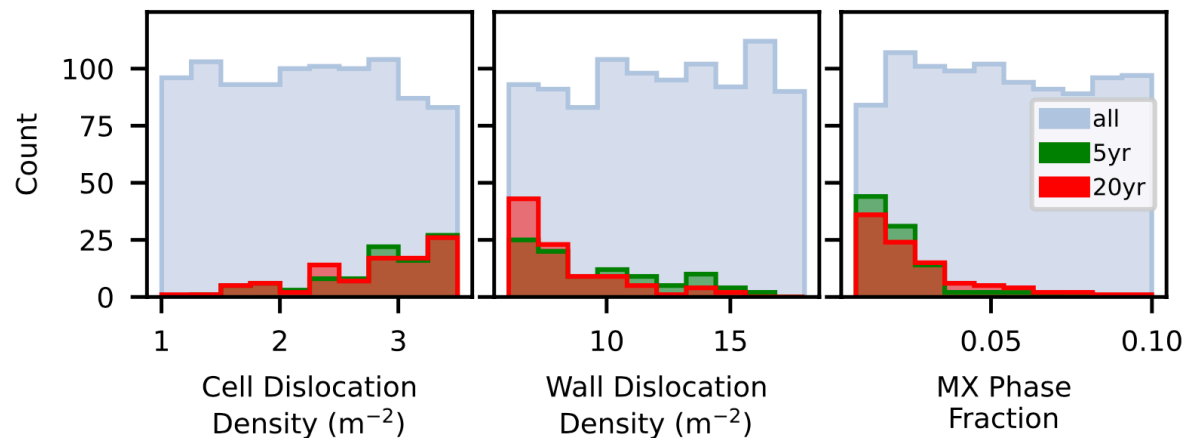
(b) Temperature = 600°C

NEML, laromance stress strain.

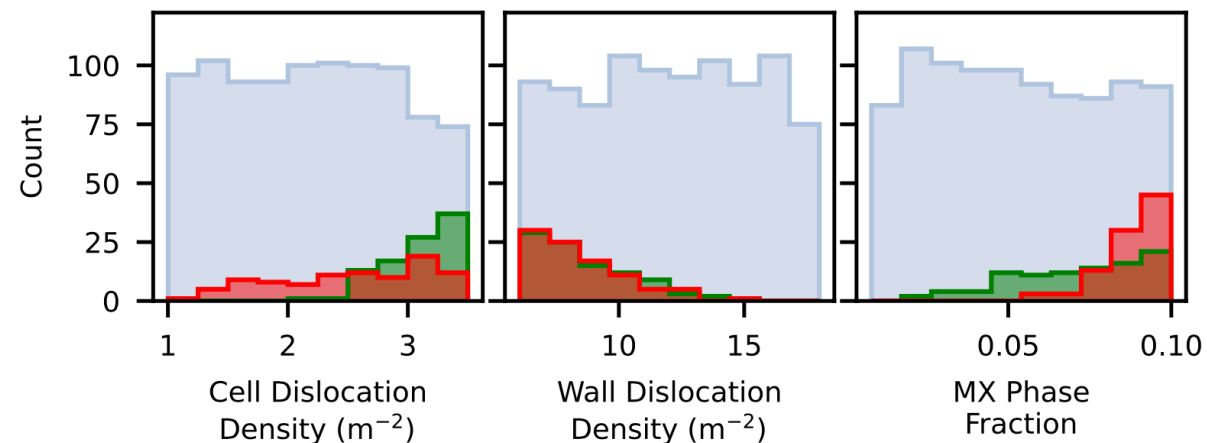
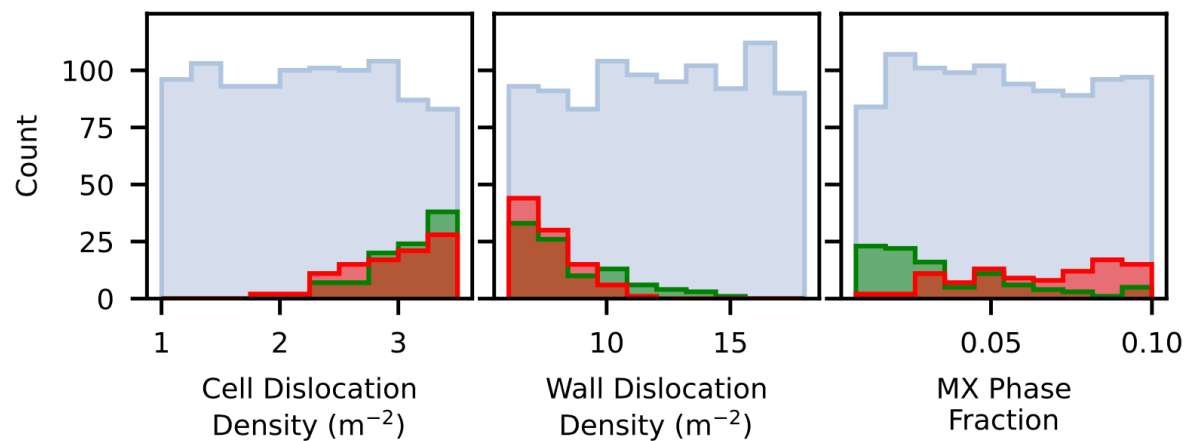
P=1MPa (55MPa)

P=2MPa (110MPa)

T=550C

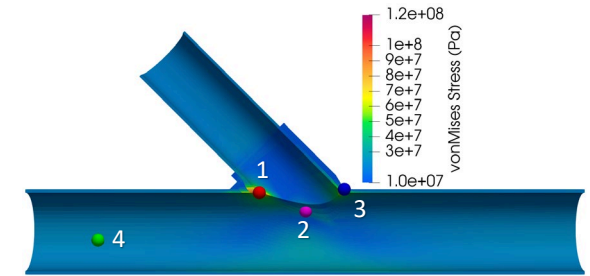


T=600C



Future Work

- Get better sampling of LAROMANCE model for pipe lateral.
- Run Simulations at a single pressure, collect results at different locations.
- Check LAROMANCE parameter ranges for MX phase fraction - 10% seems high



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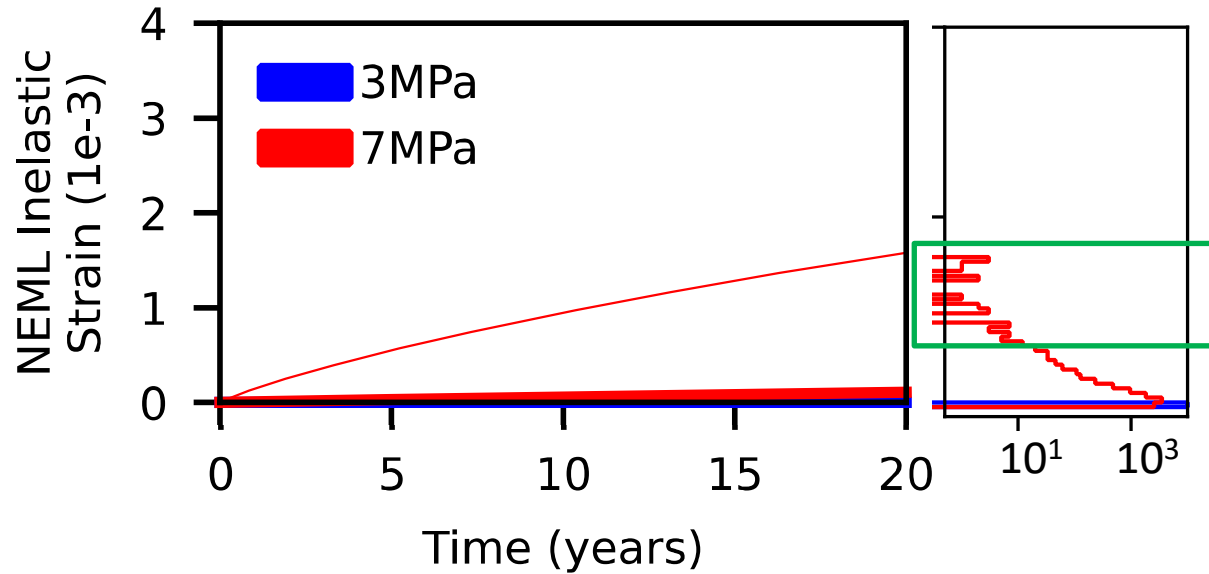
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Extra Slides

NEML Parameter Sensitivity T=550C, P=7MPa

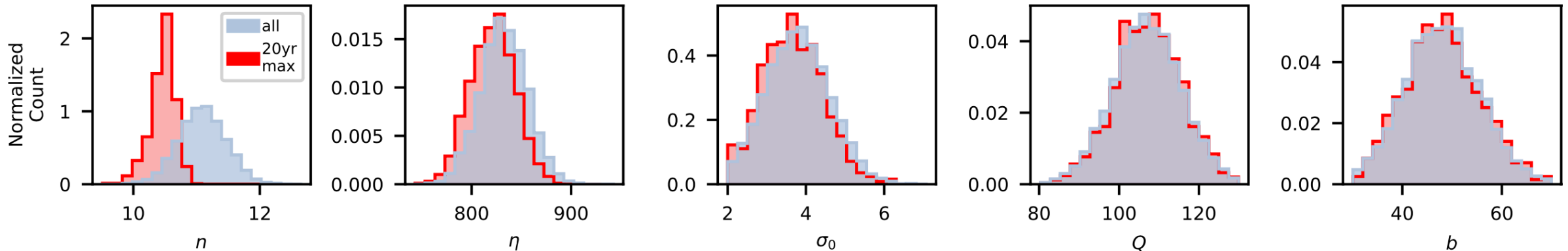
T=550C



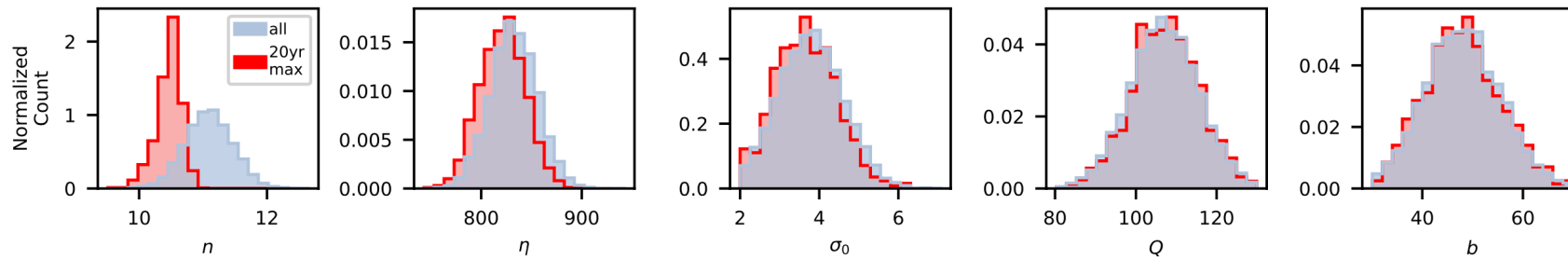
Parameters leading to top 10% of maximum inelastic strain after 20 years for T=550C, P=7MPa

Flow Rule

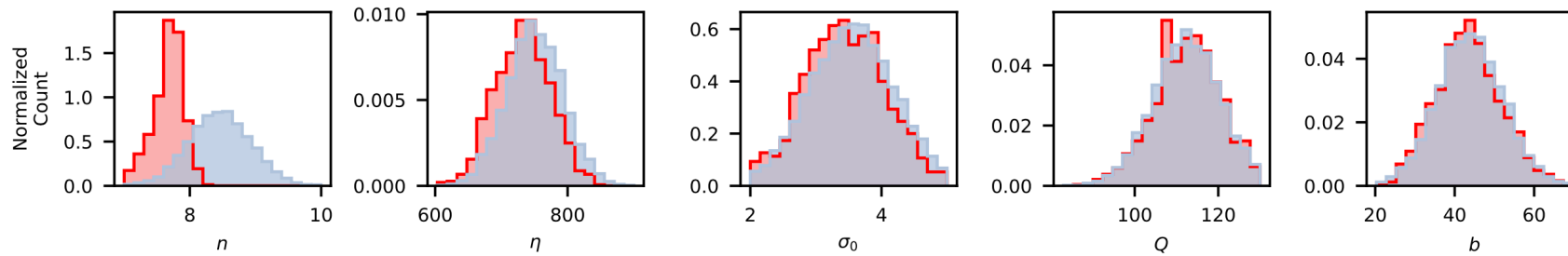
$$\dot{\epsilon}_{vp} = \left\langle \frac{\frac{\sigma}{1-\omega} - \sigma_0 - R}{\eta} \right\rangle^n$$



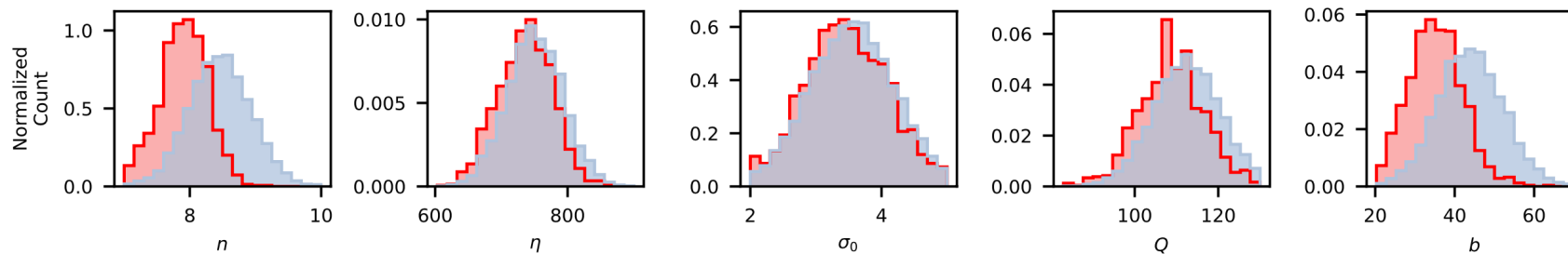
Pipe Results: Parameter Sensitivity NEML



(a) Temperature = 550°C, Pressure = 7 MPa



(b) Temperature = 600°C, Pressure = 3 MPa



(c) Temperature = 600°C, Pressure = 7 MPa

Rate sensitivity exponent, n
Hardening parameter, b

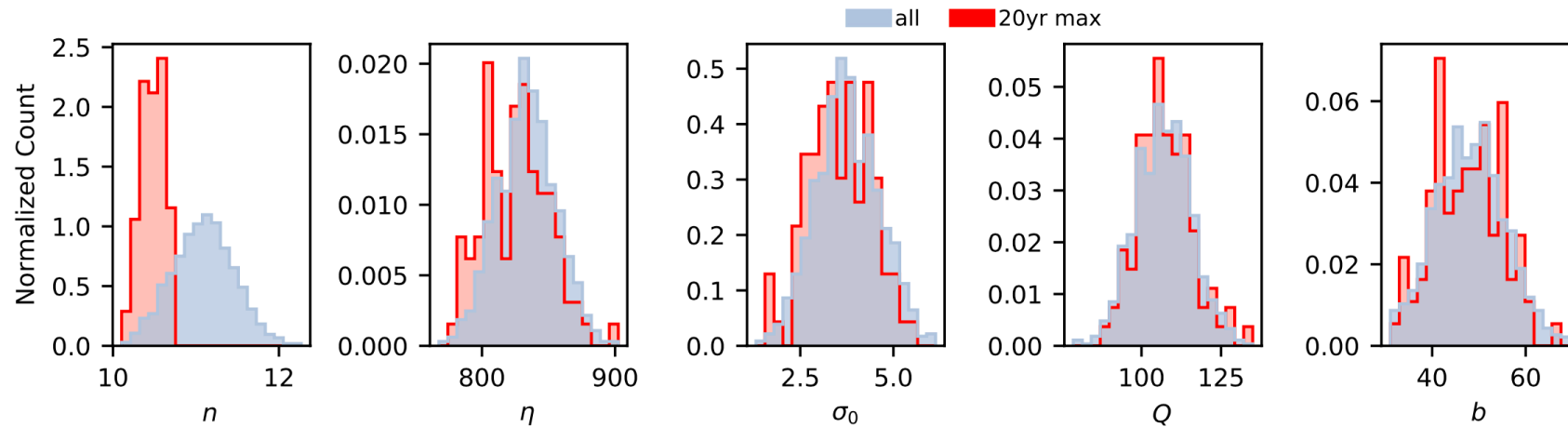
Flow Rule

$$\dot{\epsilon}_{vp} = \left\langle \frac{\frac{\sigma}{1-\omega} - \sigma_0 - R}{\eta} \right\rangle^n$$

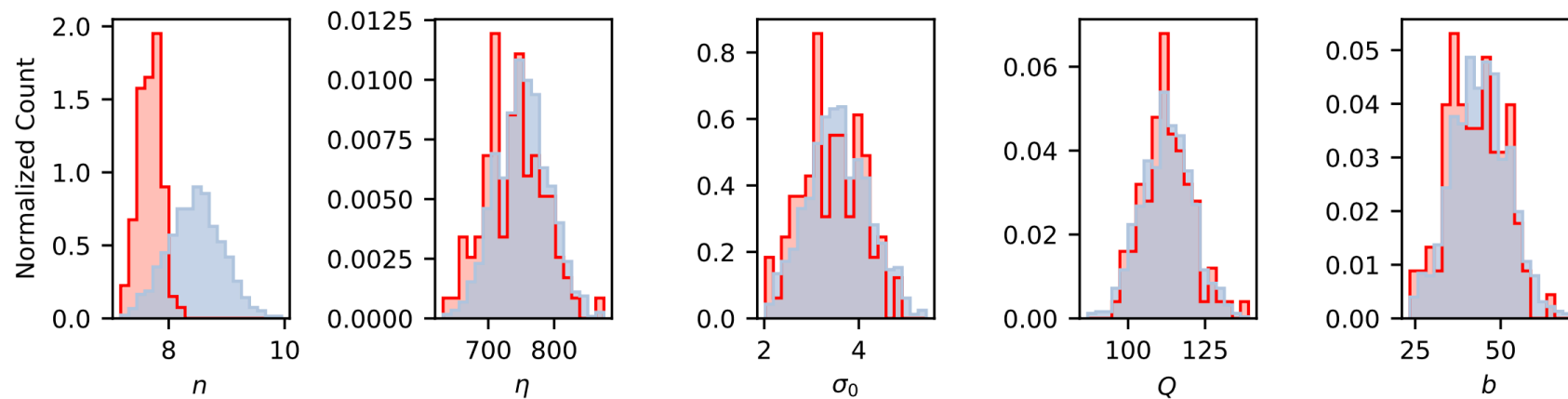
Hardening Parameter

$$R = Q \left[1 - \exp(-b|\epsilon_{vp}(t)|) \right]$$

Pipe lateral: Parameter Sensitivity NEML



(a) Temperature = 550°C, Pressure = 1 MPa



(b) Temperature = 600°C, Pressure = 2 MPa

Rate sensitivity exponent, n
Hardening parameter, b

Flow Rule

$$\dot{\epsilon}_{vp} = \left\langle \frac{\frac{\sigma}{1-\omega} - \sigma_0 - R}{\eta} \right\rangle^n$$

Hardening Parameter

$$R = Q \left[1 - \exp(-b|\epsilon_{vp}(t)|) \right]$$