

Verification, Validation, and Uncertainty Quantification of a Thermal-Mechanical Pressurization and Breach Application

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Outline

- Introduction
- Thermal-Mechanical Breach Validation Experiments
- Thermal-Mechanical Breach Simulations
- Solution Verification Assessment
- UQ Approach
- Validation Assessment
- Insights & Conclusions

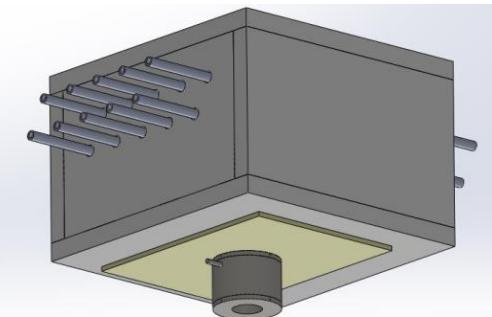
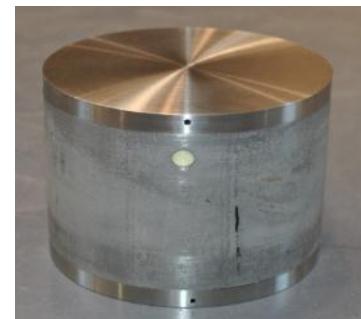
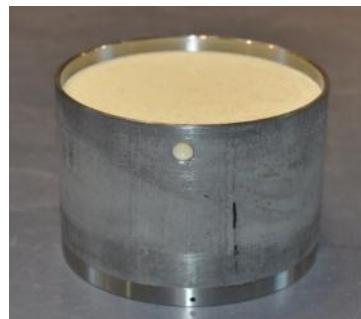
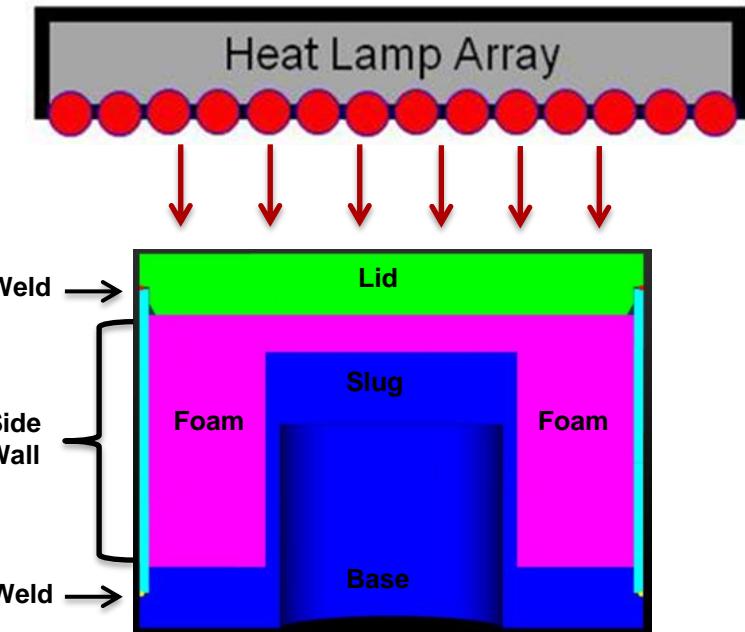
Characterization of T-M Breach

- Qualification of a weapon system requires safety assessments in abnormal environments such as a hydrocarbon fuel fire scenario
- Thermal loads resulting from a fire can cause foams to decompose resulting in the pressurization and breach of sealed regions
- A multi-physics approach was used to numerically model:
 - heat transfer and thermal response
 - foam decomposition and pressurization
 - mechanical deformation and weld failure
- Abnormal breach experiments and material characterization tests were conducted to validate the multi-physics modeling capability



T-M Breach Validation Experiments

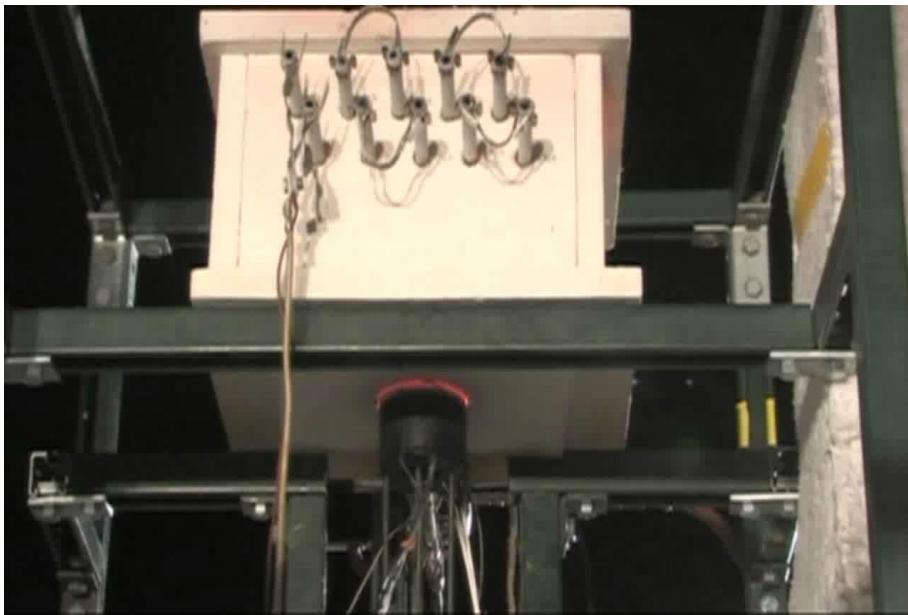
- Test Variables: Can Orientation and Heating Rates
- Response Quantities:
 - Thermocouples (Temperature)
 - Pressure Gauges (Pressure)
 - X-Ray Imaging (Displacements & Foam Decomposition)
 - Time to Breach
- **5 upright tests at 150°C/min to 800°C Lid Temperature**



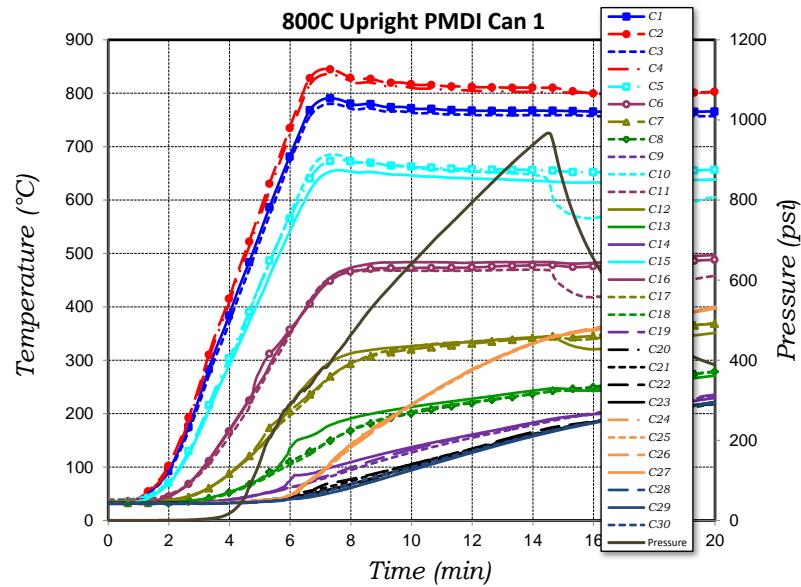
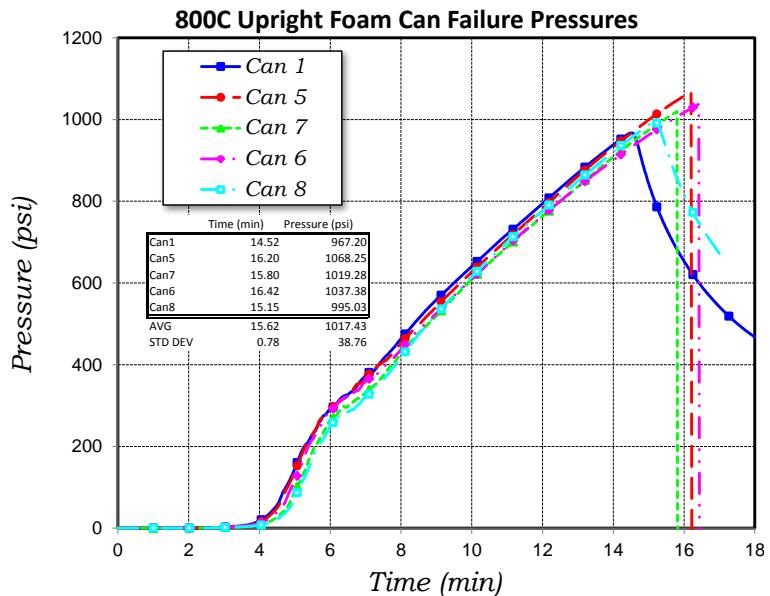
Comparison of Upright 800C PMDI Results

(Suo-Anttila, Dodd, Jernigan)

- Failure pressure of 1017 ± 39 psi
- Time to failure of 15.6 ± 0.8 min
- Weld temperature at failure,
 $650^{\circ}\text{C} < T < 750^{\circ}\text{C}$
- Two failure modes observed, venting
or abrupt weld failure

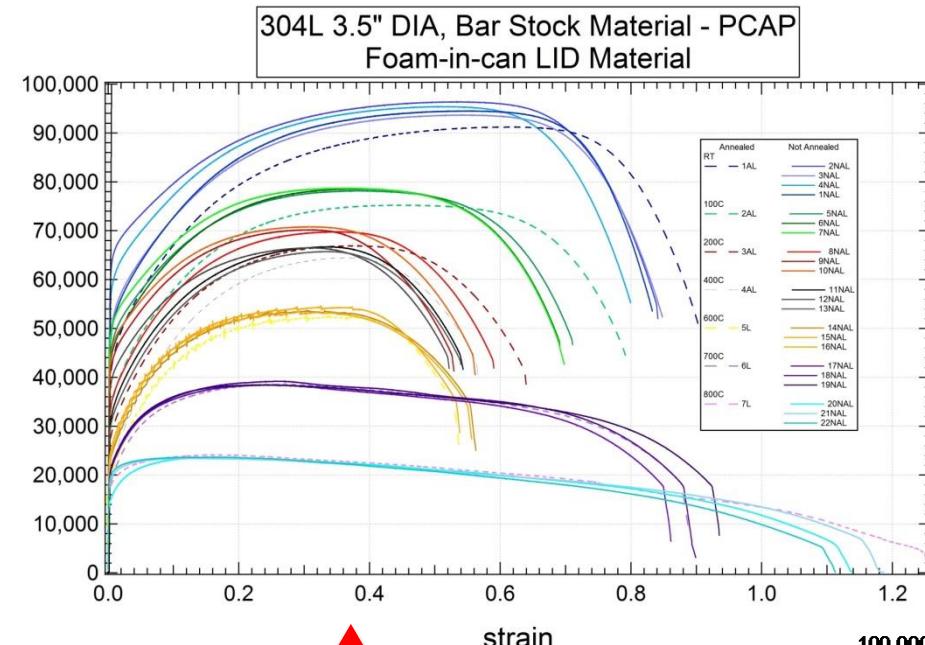


Can 5 Upright 800C Video



Material Characterization of Lid and Wall

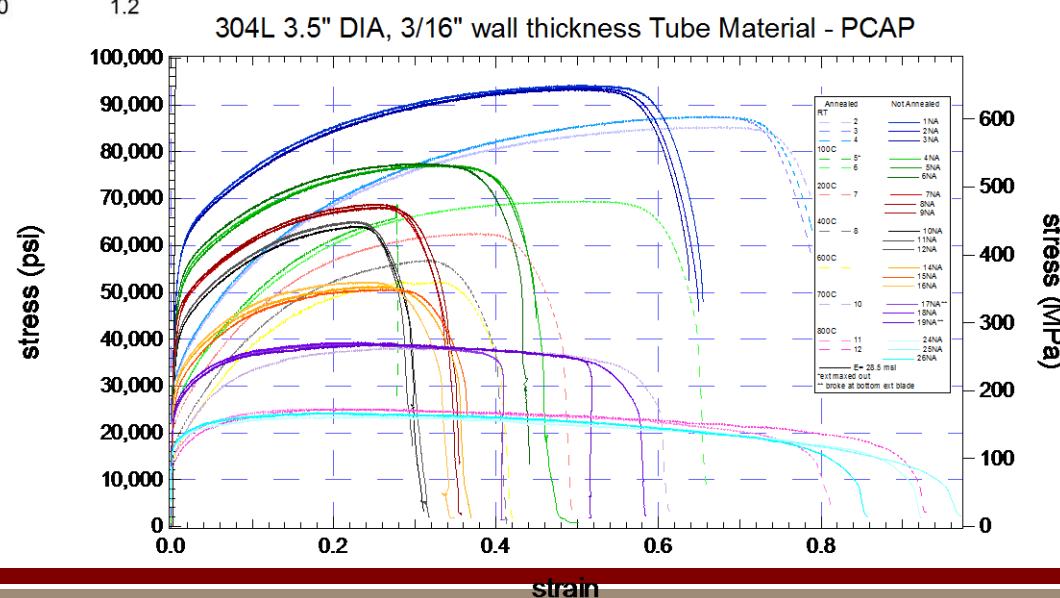
(Antoun & Connelly)



304L Lid Material

304L Wall Material →

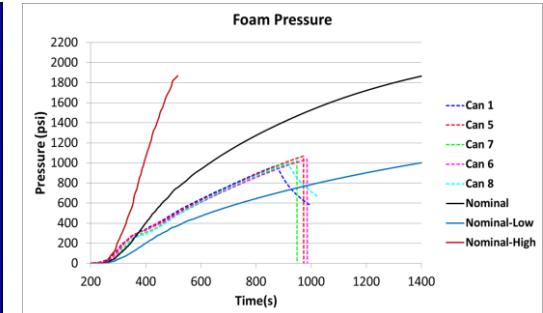
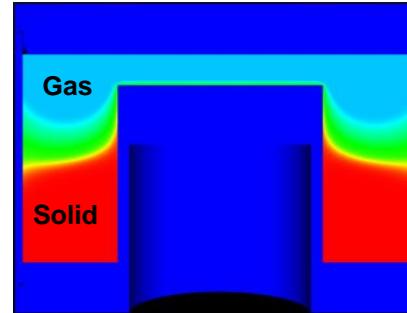
- Temperatures = 20, 100, 200, 400, 600, 700, 800°C
- Material Characterization Tests
 - Lid Tensile Tests = 8 temps x 3 repeats = 24
 - Wall Tensile Tests = 8 temps x 3 repeats = 24



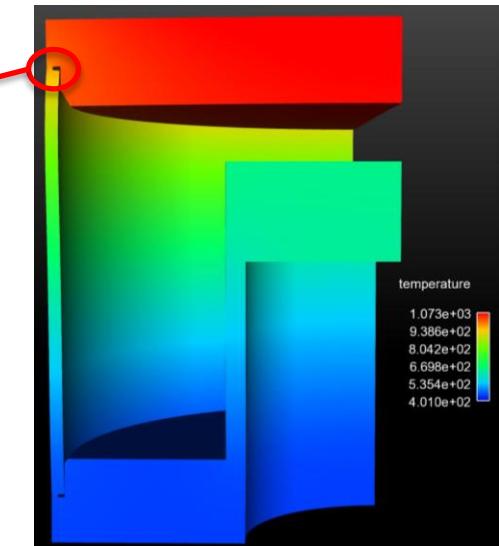
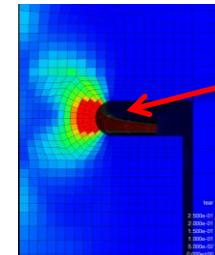
T-M Simulation Problem Description

- Thermal-Mechanical Simulations, 1-1/2 way coupled
- Heat flux boundary condition specified on lid based on experimental lid temperature
- Convection and radiation boundary conditions specified on walls and base
- Effective radiative conductivity model used to represent heat transfer in free volume portion of foam
- Multi-Linear Elastic Plastic (MLEP) material model used to represent canister material behavior
- Weld failure criteria was defined using two approaches:
 - **Tearing Parameter Criteria (TP)**
 - Equivalent Plastic Strain Criteria (EQPS)

Thermal Heat Transfer Drives Foam Decomposition & Pressurization

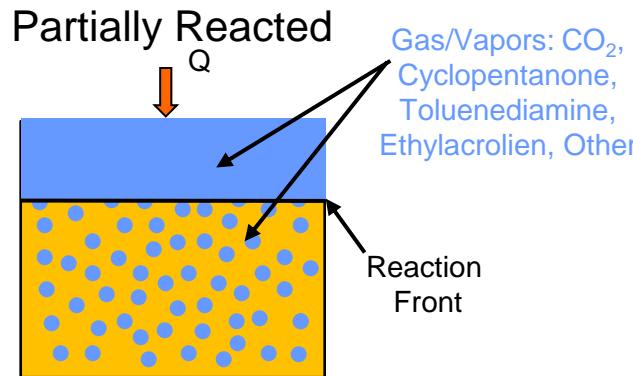
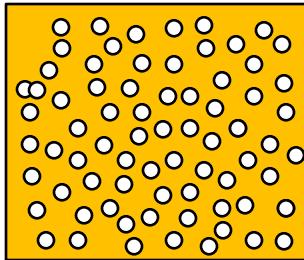


Mechanical Deformation & Weld Failure



Modeling Foam Decomposition

Initial Foam



Energy Equation

Based on diffusive approximation for optically thick material

$$\rho c \frac{\partial T}{\partial t} = \nabla \bullet (k + k_e) \nabla T + \sum_i \rho r_i (-\Delta H_i)$$

$$k_e = \frac{16\sigma}{3(a + \sigma_s)} T^3$$

Effective radiative conductivity k_e depends on absorption coeff. a and scattering coeff. σ_s

Pressure

Decomposition gases and temperatures are summed over the relevant region to calculate the pressure

$$P = \frac{n_g R}{\int_{V_g} \frac{1}{T} dV_g} = \frac{n_g R}{\left(\int_{V_{fv}} \frac{1}{T} dV_{fv} + \int_{V_B^0} \frac{\Phi}{T} dV_B^0 \right)}$$

Moles of gas

Free volume/temperature

Gas Volume: reacted area and pore space

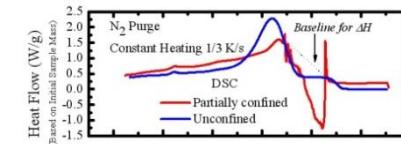
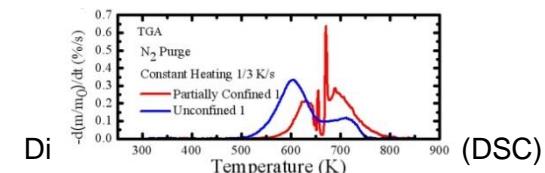
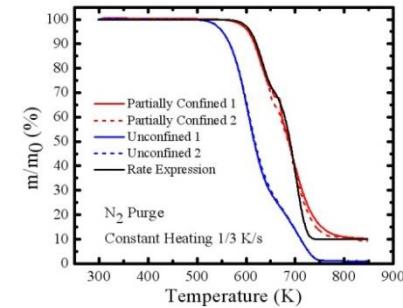
Decomposition Model

Foam decomposition is predicted by Arrhenius-type model for reaction rate:

$$\frac{d[M]}{dt} = A e^{-E_a/RT} [M]^n$$

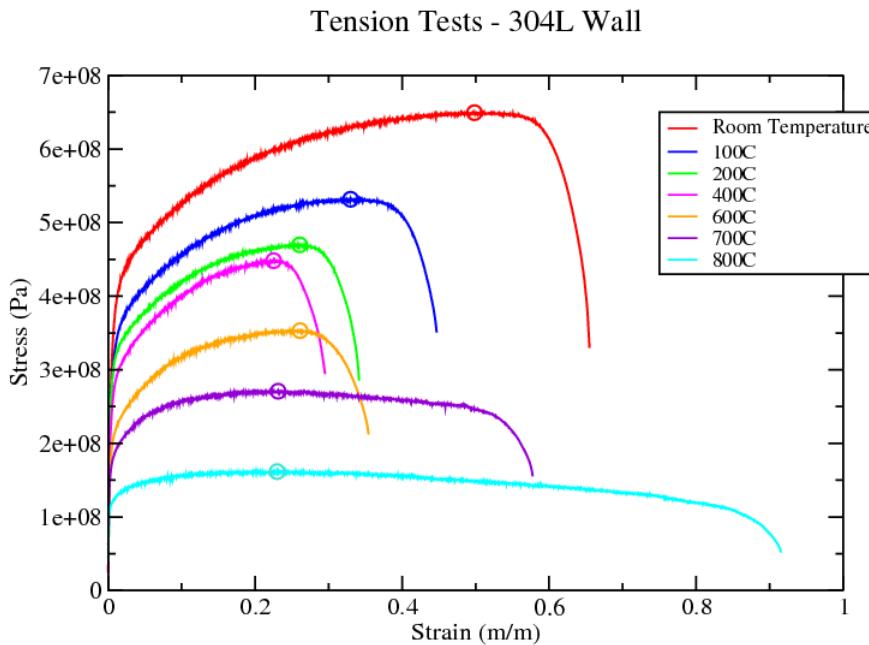
- Activation energy and heat of reaction are calculated from ThermoGravimetric experiments

ThermoGravimetric Analysis (TGA)



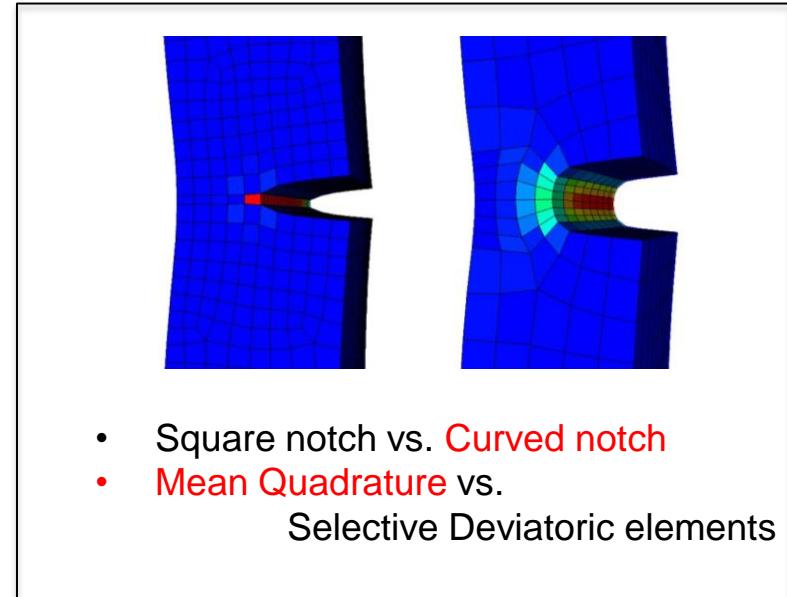
Weld Failure Prediction Method

- Determined critical values of tearing parameter and EQPS at maximum load from tensile tests at each temperature
- Considered 2 weld representations, 2 element types, and several levels of mesh size

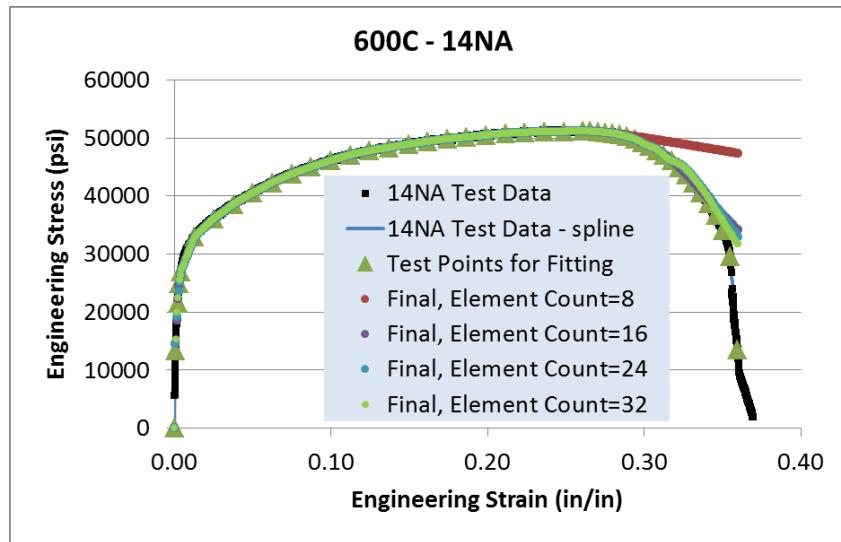
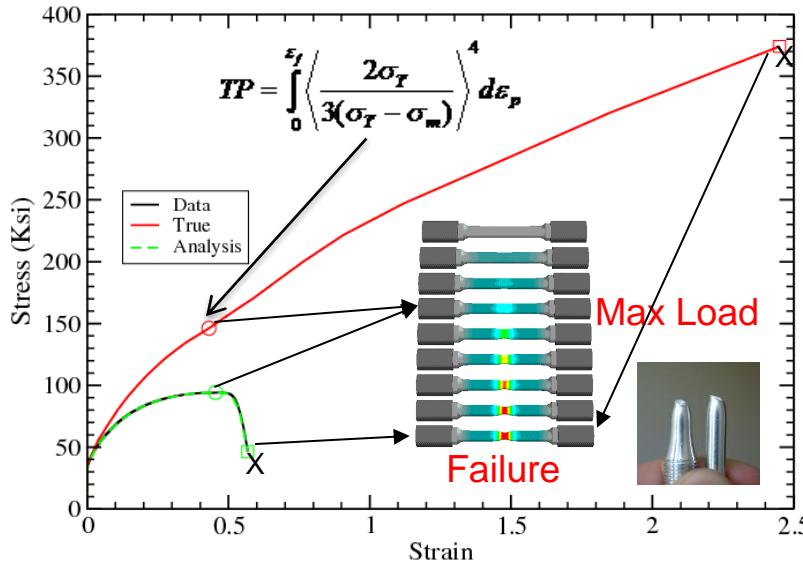


Tearing Parameter (TP) relates the stress state to the plastic strain at failure by the evolution integral (developed at Sandia):

$$TP = \int_0^{\epsilon_f} \left(\frac{2\sigma_{max}}{3(\sigma_{max} - \sigma_m)} \right)^4 d\epsilon_p$$



MLEP Model Calibration Based on Mesh Converged Models

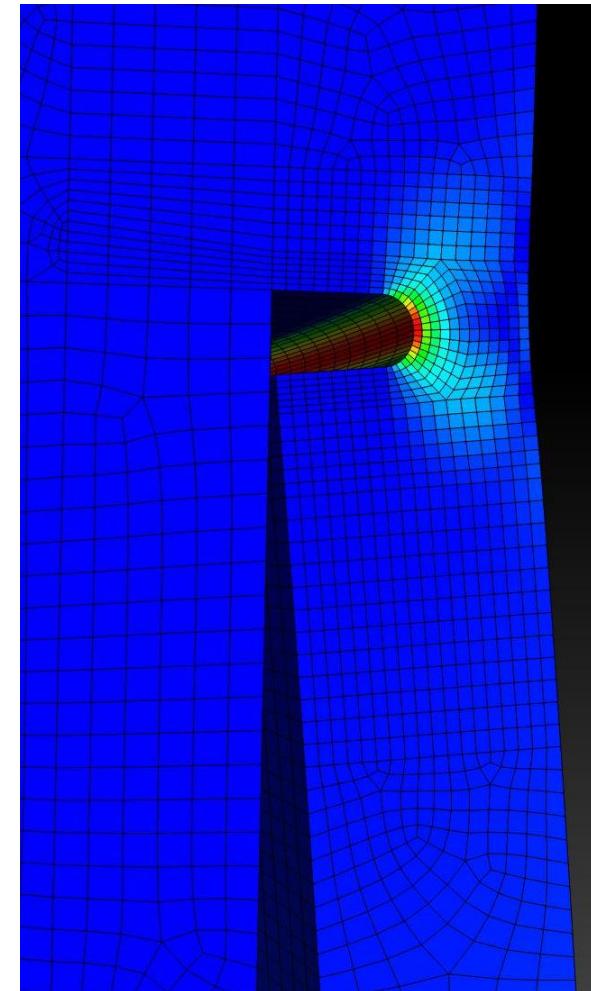


- Inverse calculations used to derive Cauchy stress-logarithmic strain curves
- Mesh independent up to max load (uniform stress/strain field)
- Very mesh sensitive past max load where necking occurs (strain-rates increase by orders of magnitude)
- Unable to get a converged solution for the last part of the data curve
- Tensile shape and material model form are incorrect past max load, likely due to strain-rate effects

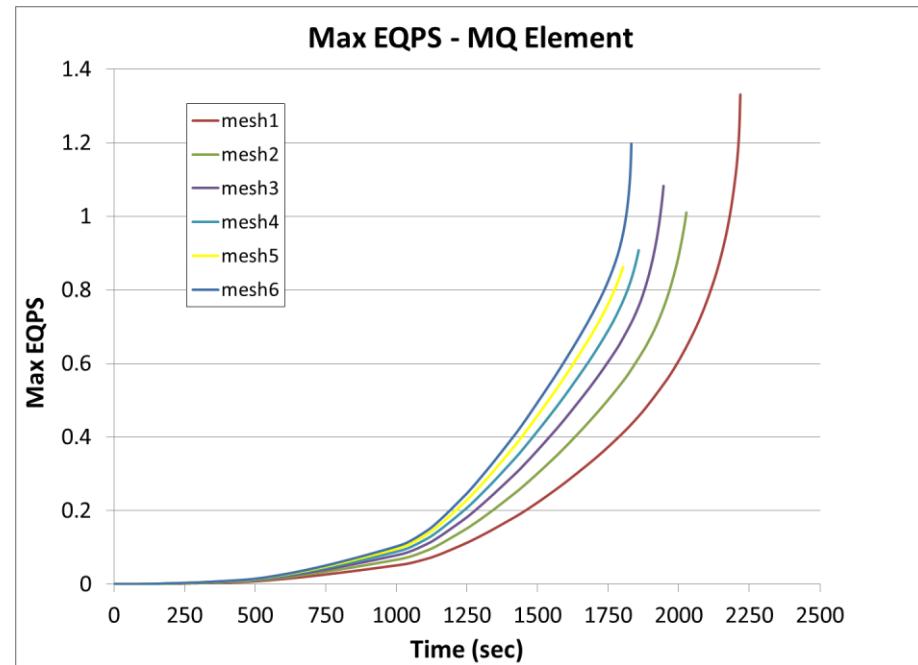
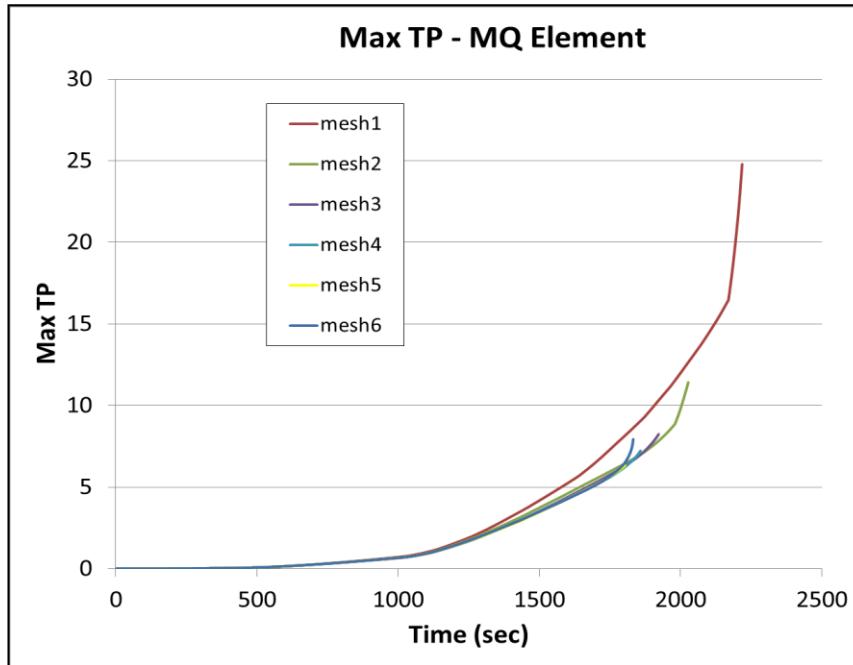
Solution Verification Study

Mechanical Deformation and Breach

- Solver and residual tolerances were set to small values to reduce numerical noise
- Load Step (10.0, 1.0, 0.1)
 - Solver tolerances were set to small values, 1.0e-06
- Element Size: 6 meshes – $\frac{1}{4}$ symmetry geometry
 - Mesh 1 = 370,440; Weld block = 6,048 (6x6)
 - **Mesh 2 = 694,936; Weld block = 10,752 (8x8)**
 - Mesh 3 = 1,190,721; Weld block = 16,800 (10x10)
 - **Mesh 4 = 1,850,944; Weld block = 24,192 (12x12)**
 - Mesh 5 = 2,639,996; Weld block = 32,928 (14x14)
 - **Mesh 6 = 3,684,285; Weld block = 43,008 (16x16)**
- Element Type
 - Mean-Quadrature (MQ) Element - Uniform Gradient with Total Hourglass Formulation
 - Selective Deviatoric (SD) Element - Fully Integrated Gradient, Hourglass control isn't required

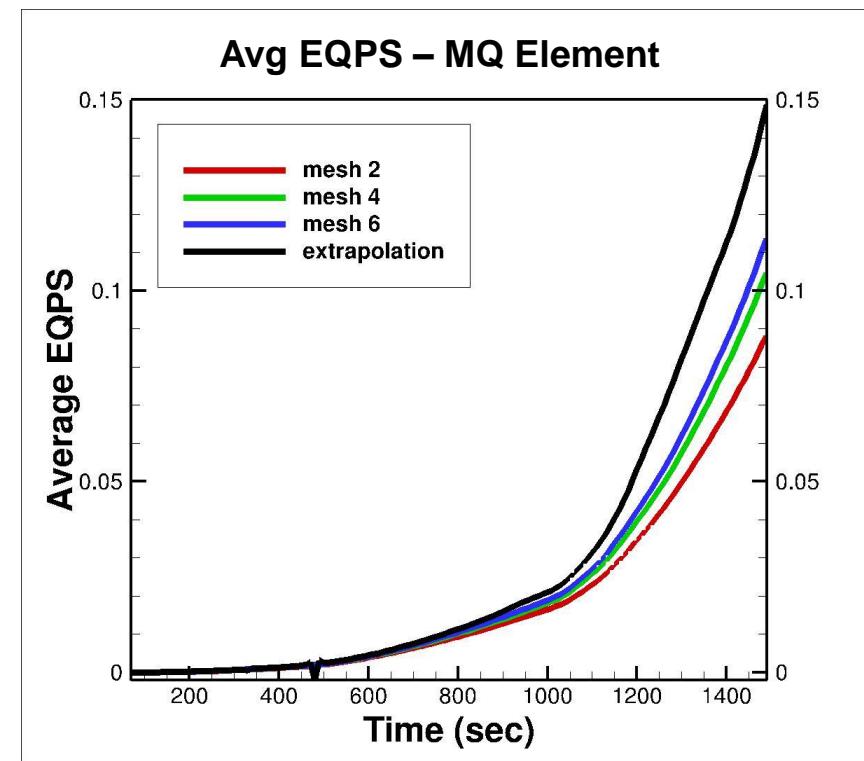
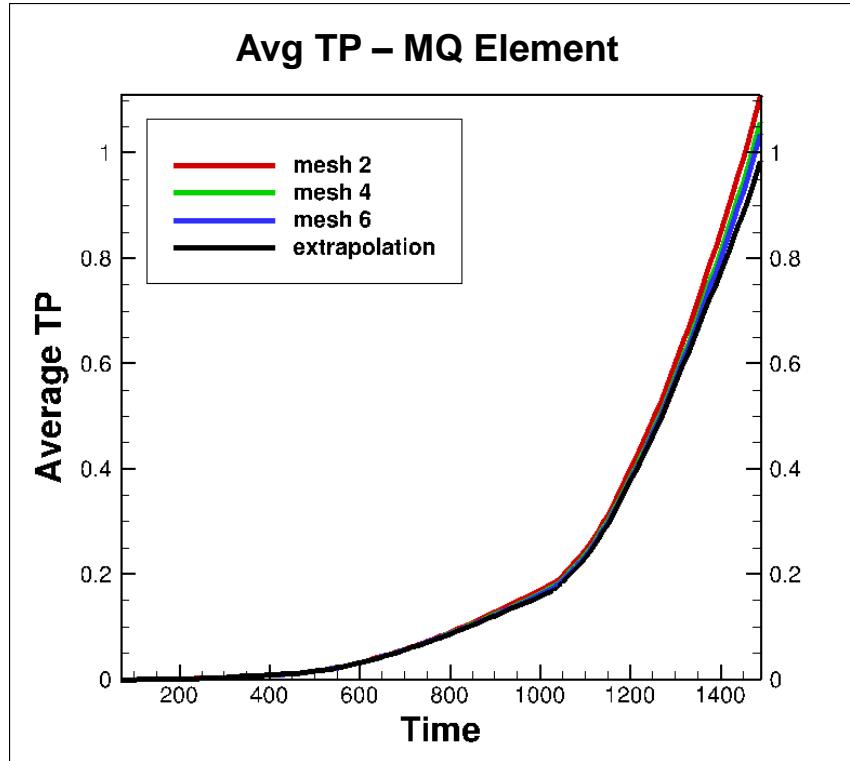


Mesh Sensitivity – Max TP & Max EQPS



- Max TP results didn't show monotonic convergence but were very similar
- Max EQPS results showed better convergence with mesh refinement
- Maximum quantities convergence can be problematic because the physical location may change

Mesh Sensitivity – Avg TP & Avg EQPS



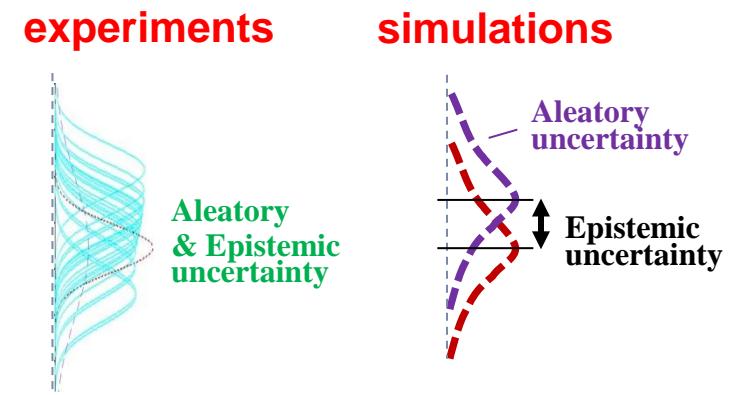
- Average values calculated in weld block only
- Average TP and Average EQPS show monotonic convergence with mesh refinement and extrapolated solutions are possible
- EQPS shows more sensitivity to mesh size than Tearing Parameter

- Categorize Uncertainties
 - Aleatory, Epistemic, Traveling, Non-Traveling
- Characterize Uncertainties
 - Highly dependent on expert judgment
 - Accommodate different representations
 - Interval Tolerances
 - Discrete
 - Distributional
 - Quantify discretization and sparse data uncertainties
- Propagate Uncertainties
 - Staged mixed-order polynomial surrogate model
 - Linear UQ Propagation – all uncertainties
 - Linear Sensitivity Analysis – identify dominant factors
 - Higher-Order UQ Propagation – dominant factors
- Compare Experimental Results to Simulation Result

Real Space Comparison of Experiments and Simulation Results used in the Validation Study

Approximate Pbox representations segregate aleatory and epistemic uncertainties

- **Aleatory** – random uncertainty, stochastic variability, describes a set or population of multiple values
- **Epistemic** – systematic uncertainty, unknown single result within uncertainty range



Extrapolation from validation assessment to application assessment requires additional separation of traveling and non-traveling uncertainties

- **Traveling** – model quantities and uncertainties that “travel” from the validation study to applications of interest
- **Non-Traveling** – quantities and uncertainties that are specific to the validation experiment and study

➤ For additional UQ details, refer to Vicente Romero’s presentation this afternoon @ 3:10p.

Traveling and Non-Traveling Uncertainties in Thermal-Mechanical Validation Problem

Non-Traveling Uncertainties

Experimental Aleatory

- lid TC measurement/redundancy test-test variations: I[$\pm 2\%$]
- ss304 emissivity can-can variations: I[± 0.03]
- ambient temperature test-test variations I[$\pm 10\text{C}$]
- pressure measurement/redundancy test-test variations: I[$\pm 2\%$]

Experimental Epistemic

- ss304 emissivity effective value over time, space: $0.69 + I[\pm 20\%]$
- effective temperature for radiative, convective losses: $29\text{C} + I[\pm 15\text{C}]$
- convection coeff. effective value over time, space: $10\text{W/m}^2\text{-K} + I[\pm 40\%]$

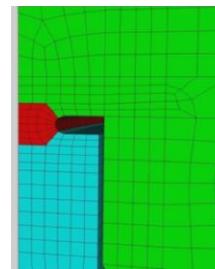
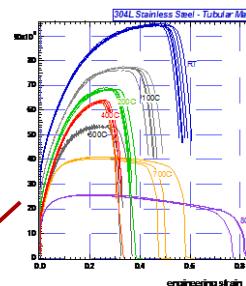
Model Epistemic

- mesh size error
- solver error

Traveling Uncertainties

Model Aleatory

- material stress-strain curves for lid, weld, & wall
- lid thermal contact: I[20%, 90%] of distance between modeled extremes of no heat transfer and perfect-contact heat transfer
- wall thickness: I[0.062,0.0645]in.
- weld depth: I[0.023, 0.031]in.



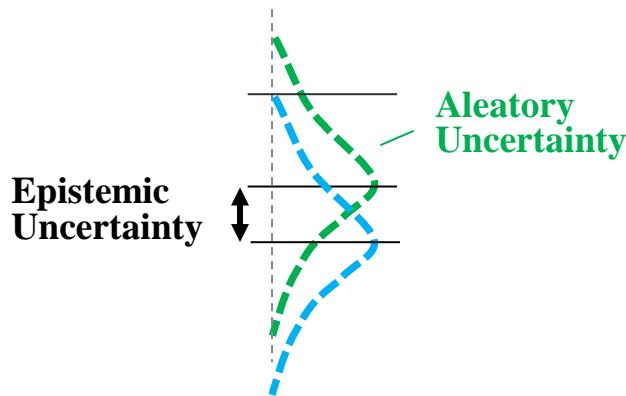
Model Epistemic

- foam conductivity: $f(\text{temp.}) + I[\pm 20\%]$
- foam specific heat: $f(\text{temp.}) + I[\pm 20\%]$
- foam activation energy: value + I[$\pm 4\%$]
- foam pressure multiplier: I[0.5, 2.64]
- ss304 conductivity: $f(\text{temp.}) + I[\pm 20\%]$
- ss304 specific heat: $f(\text{temp.}) + I[\pm 20\%]$

SA/UQ Analysis for T-M Assessment

(75 thermal-mechanical runs for response surfaces + ~150 mechanical-only for σ - ϵ curve strength rankings)

Experimental UQ processing



- 4 sims. to normalize results for known input differences in the 5 experiments
 - measured changes in foam dens. & lid TC temperatures from test to test

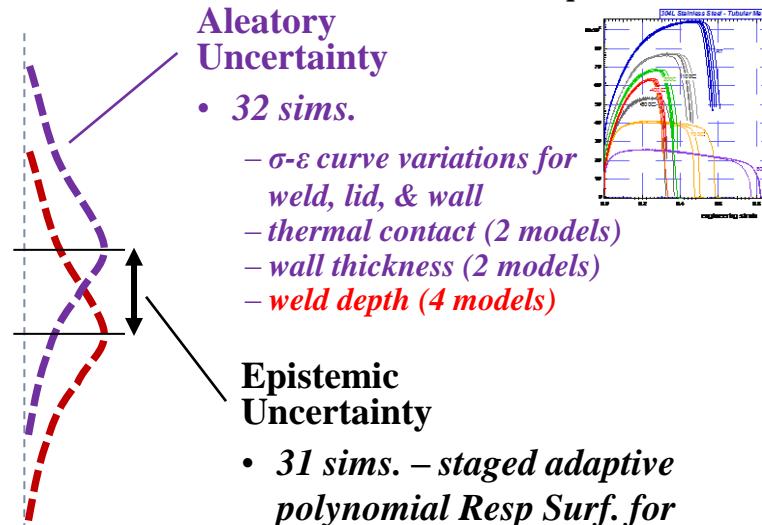
8 sims. to process data for random and systematic uncertainties in experiments

4 sources:

- lid temperature
- convection coefficient
- emissivity
- ambient temperature



Simulation UQ processing



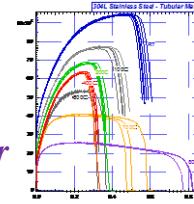
Aleatory Uncertainty

- 32 sims.
 - σ - ϵ curve variations for weld, lid, & wall
 - thermal contact (2 models)
 - wall thickness (2 models)
 - weld depth (4 models)

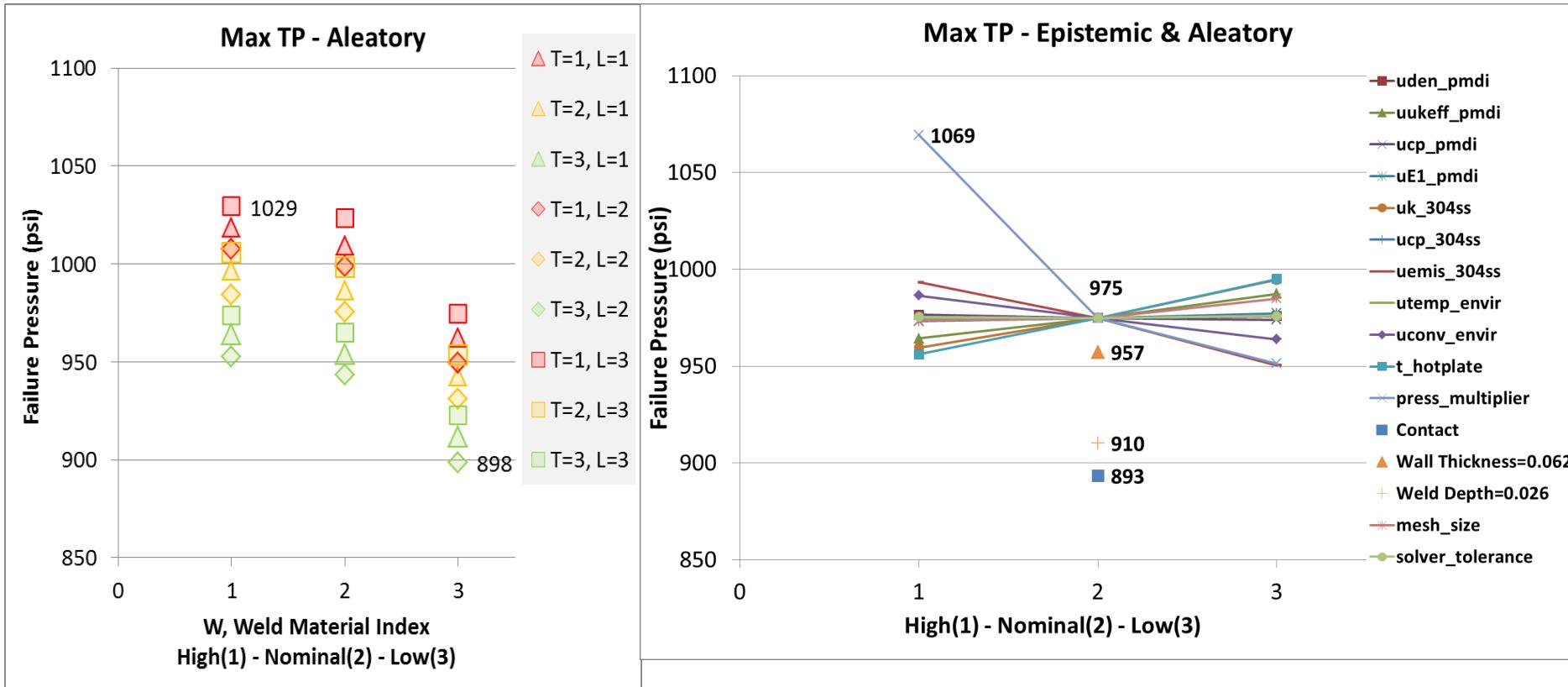
Epistemic Uncertainty

- 31 sims. – staged adaptive polynomial Resp Surf. for 7 parametric sources
 - foam conductivity
 - foam specific heat
 - foam activation energy
 - pressure multiplier
 - ss304 conductivity
 - ss304 specific heat
- 6 sims. for mesh & solver effects (3 meshes)

~150 mechanical sims. for σ - ϵ curve strength rankings at each temperature

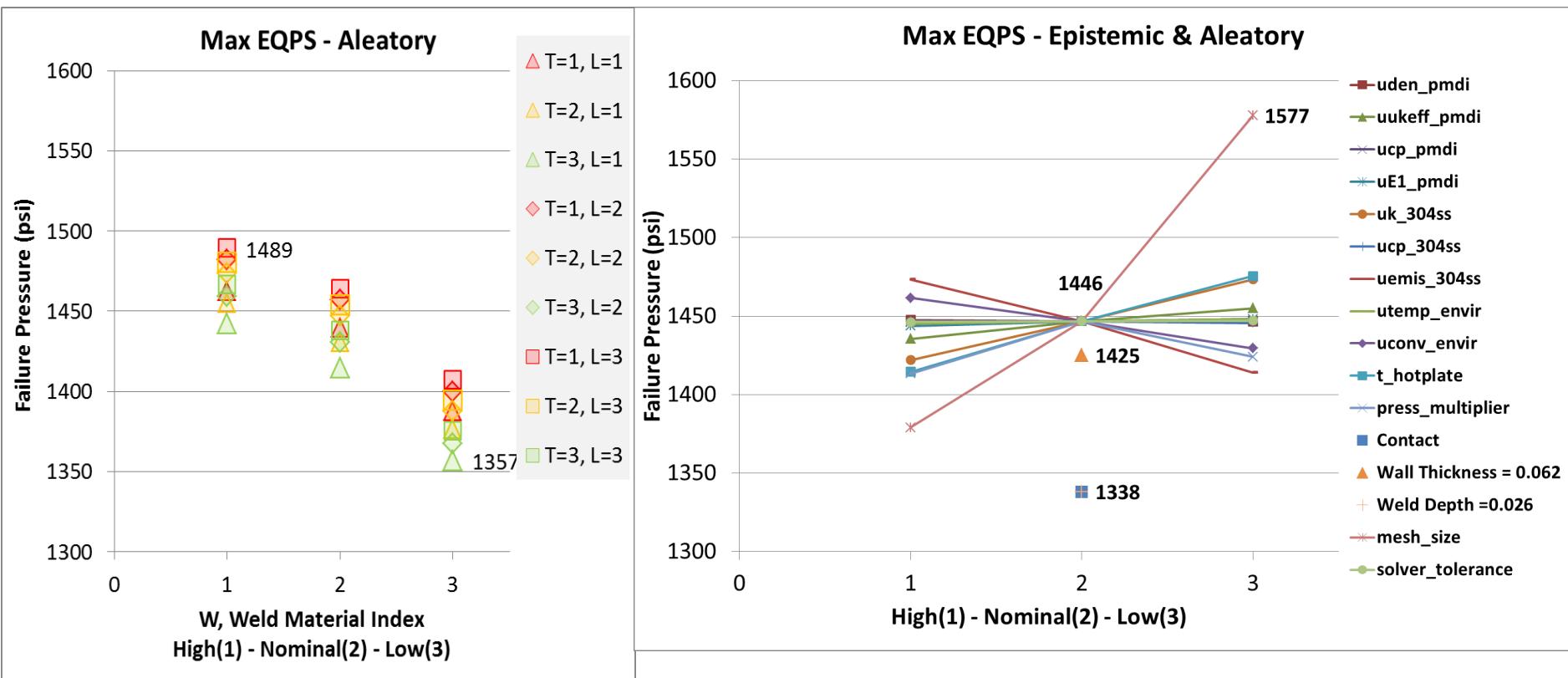


Parameter Sensitivity – TP Failure



- Uncertainties due to repeat material curves and foam pressure multipliers are dominant factors

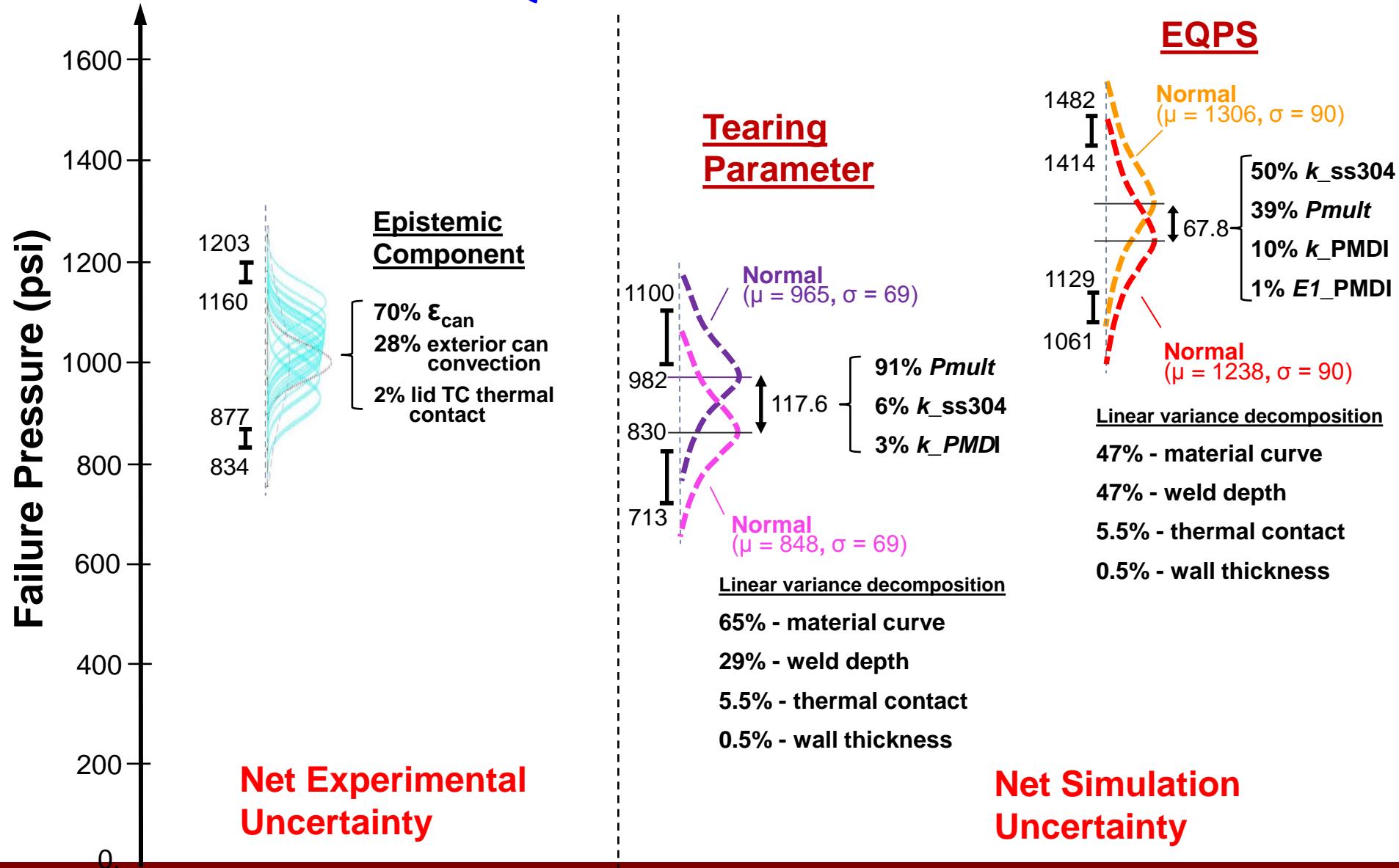
Parameter Sensitivity – EQPS Failure



- Uncertainties due to repeat material curves and mesh size are dominant factors

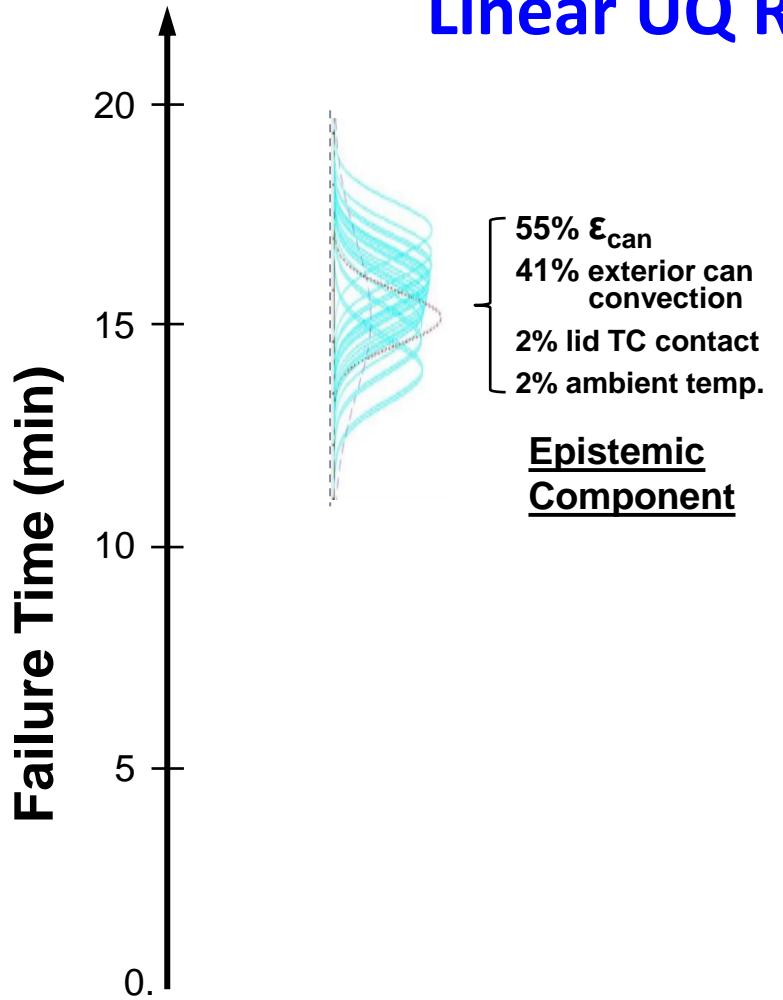
T-M Validation Comparisons – Failure Pressure

Linear UQ Results – Mesh 4



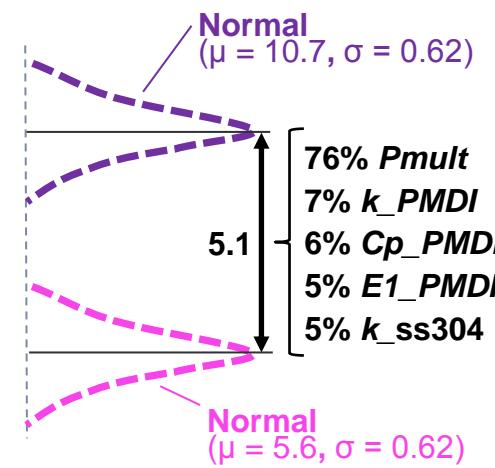
T-M Validation Comparisons of Failure Time

Linear UQ Results – Mesh 4



Net Experimental
Uncertainty

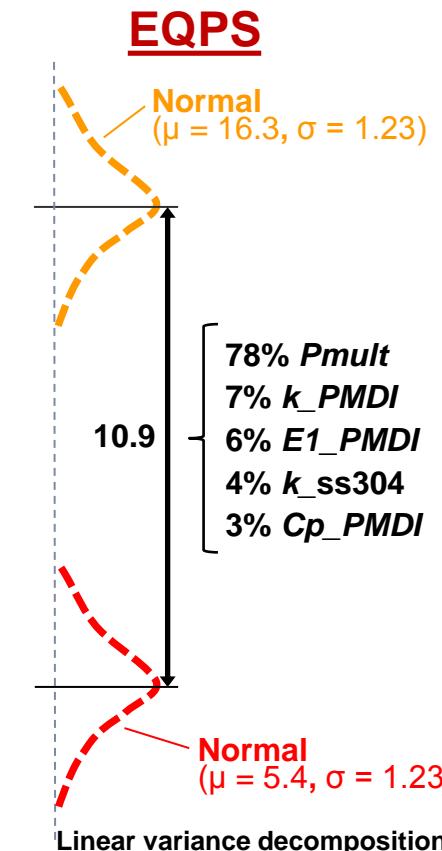
Tearing Parameter



Linear variance decomposition

61.5% - material curve
27% - weld depth
11% - thermal contact
0.5% - wall thickness

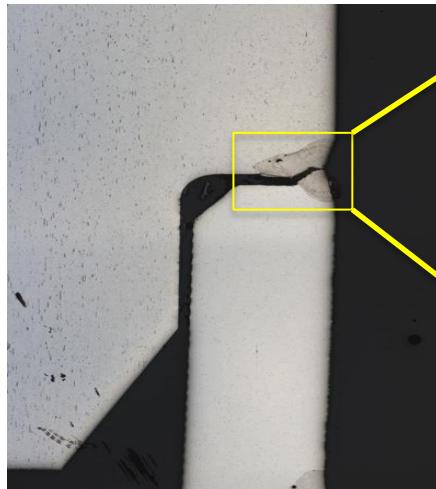
Net Simulation
Uncertainty



Linear variance decomposition
44.5% - material curve
42% - weld depth
13% - thermal contact
0.5% - wall thickness

Thermal-Mechanical Breach Insights

- Different deformation mechanisms occur for higher temperature scenarios:
 - Low Temperature mechanism = void growth
 - High Temperature mechanism = grain slippage
- Cracking occurs in weld region and leads to breach
 - High temperature effect
 - Partial penetration weld with voids
 - Pressure loading from decomposing organic materials
 - Complicated stress state, including residual stresses in weld
 - Strain-aging at temperature, can cause material hardening and reduced ductility



(Charlie Robino, 1831)



Conclusions

- Abnormal thermal environments in combination with strain-rate effects introduced new material deformation mechanisms and failure modes
- Tearing Parameter criteria was conservative relative to experimental data but may not necessarily be predictive; mesh effects and strain-rate effects were reduced by setting critical values at max load conditions
- Material model provides the basis for all mechanical analysis and as such, including the correct form and data is critical to any assessment; e.g., strain rate effects are necessary to capture correct tensile shape past max load
- Weld modeling approach is a critical choice in any assessment and will determine the degree of accuracy and uncertainty
- Solution verification was necessary to quantify the numerical error and as such, provided a basis to evaluate the physics models and the modeling approach
- Uncertainty quantification approach prototyped the separation of aleatory and epistemic uncertainties, traveling and non-traveling uncertainties for extrapolation, and a higher order assessment for computationally-intensive simulations
- Fully-integrated process from experimental design through predictive assessment provided an opportunity to better characterize boundary conditions, reduce uncertainties, and generate repeat data sets for validation assessment