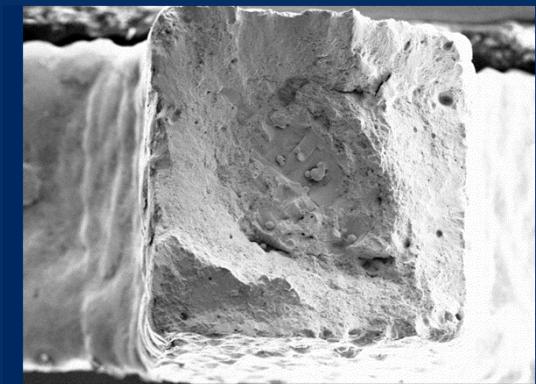


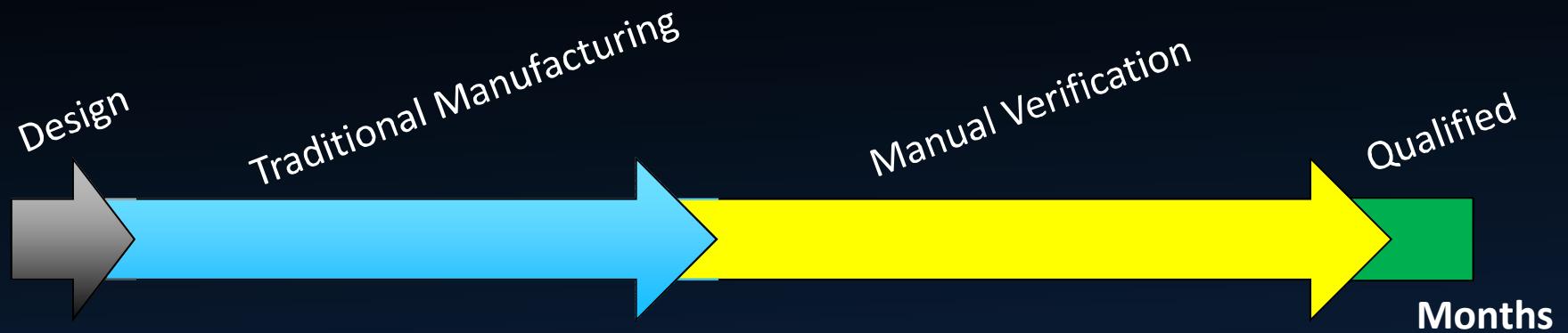
# *High-throughput testing reveals rare, catastrophic defects*

**Brad L. Boyce, Brad C. Salzbrenner, Bradley H. Jared,  
Jeffrey M. Rodelas, Jonathan D. Madison, Jay Carroll**

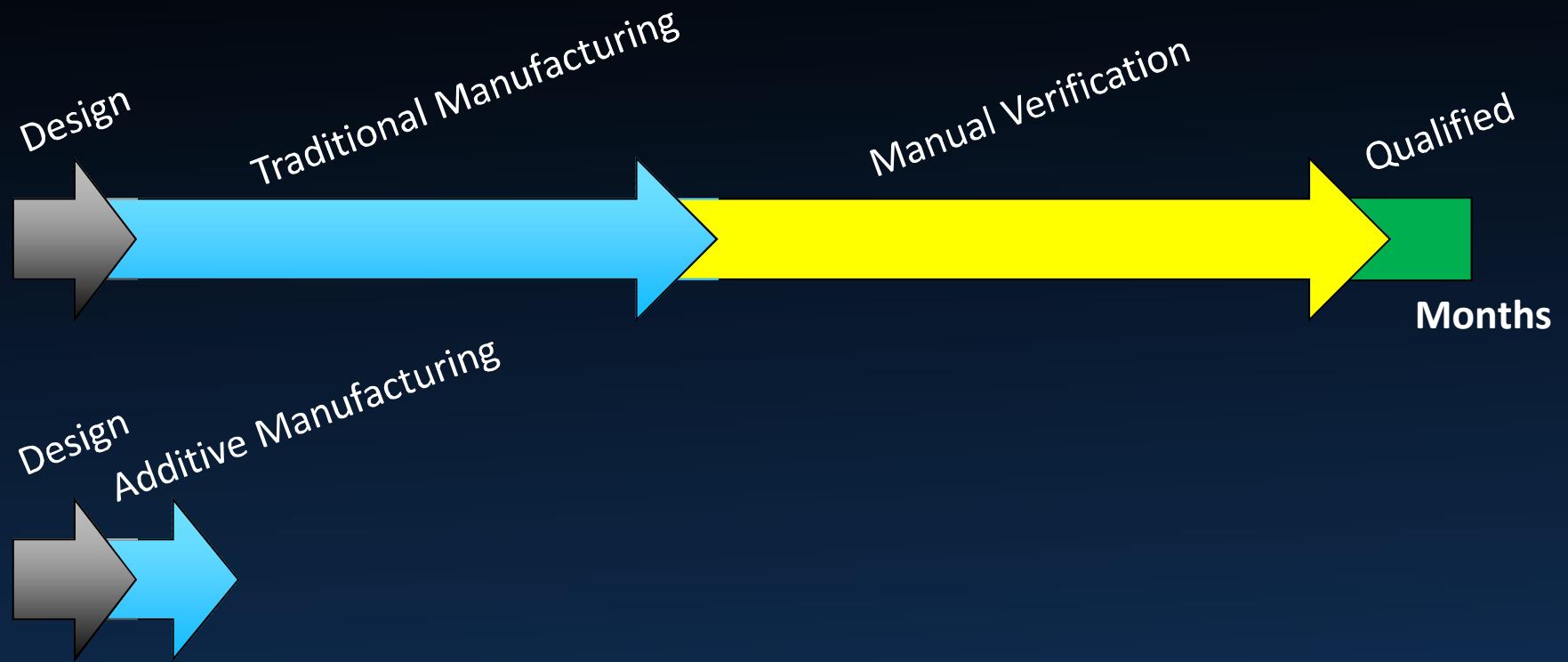
Materials Science and Engineering Center  
Sandia National Laboratories, Albuquerque, NM, USA



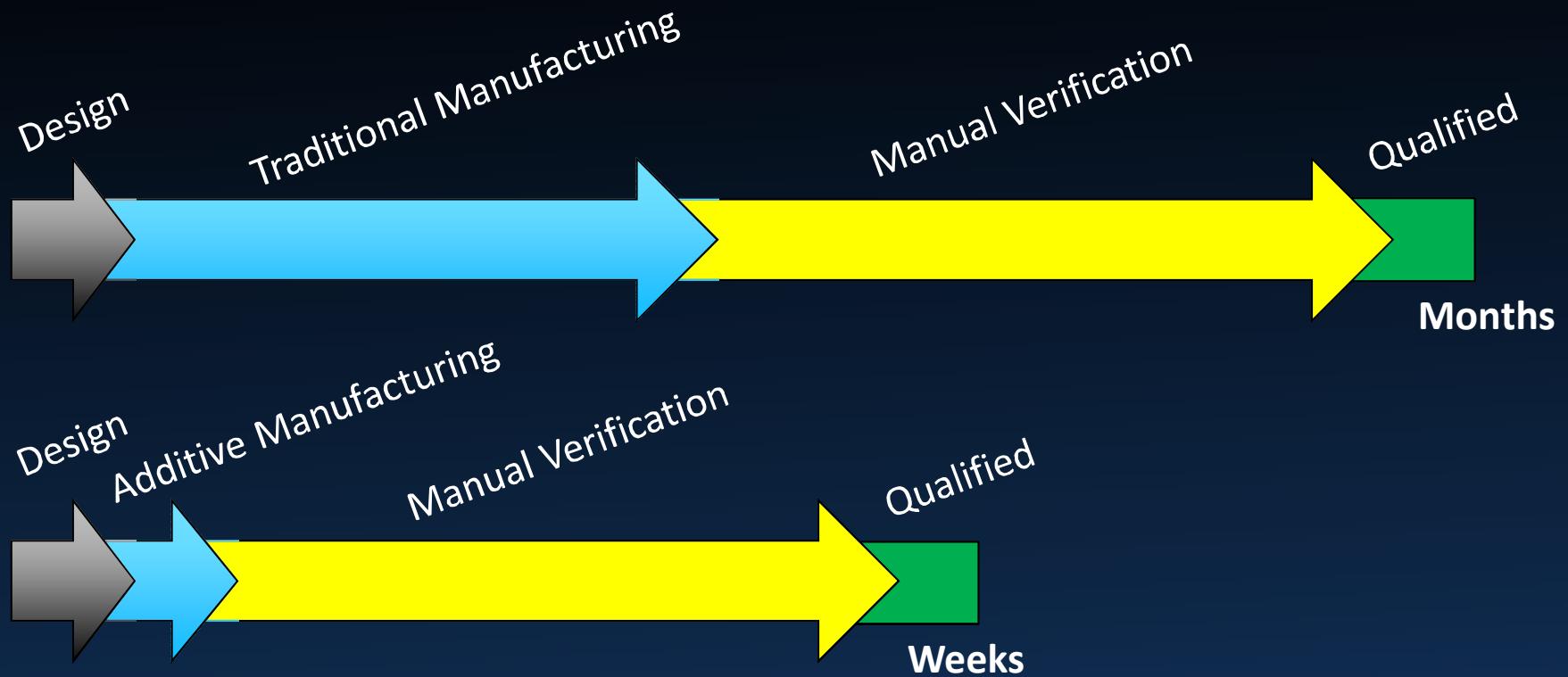
# *Changing timelines...*



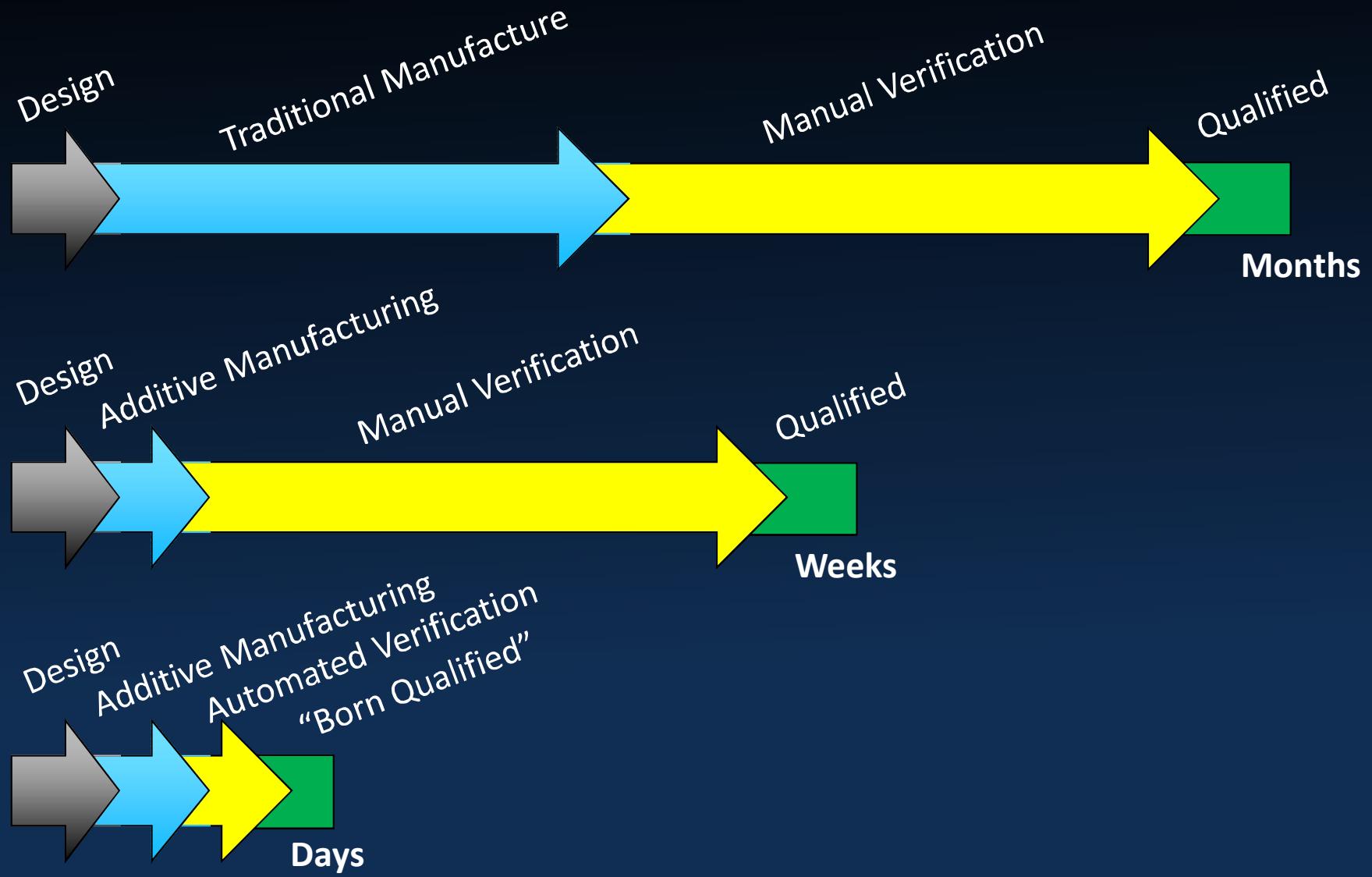
# Changing timelines...



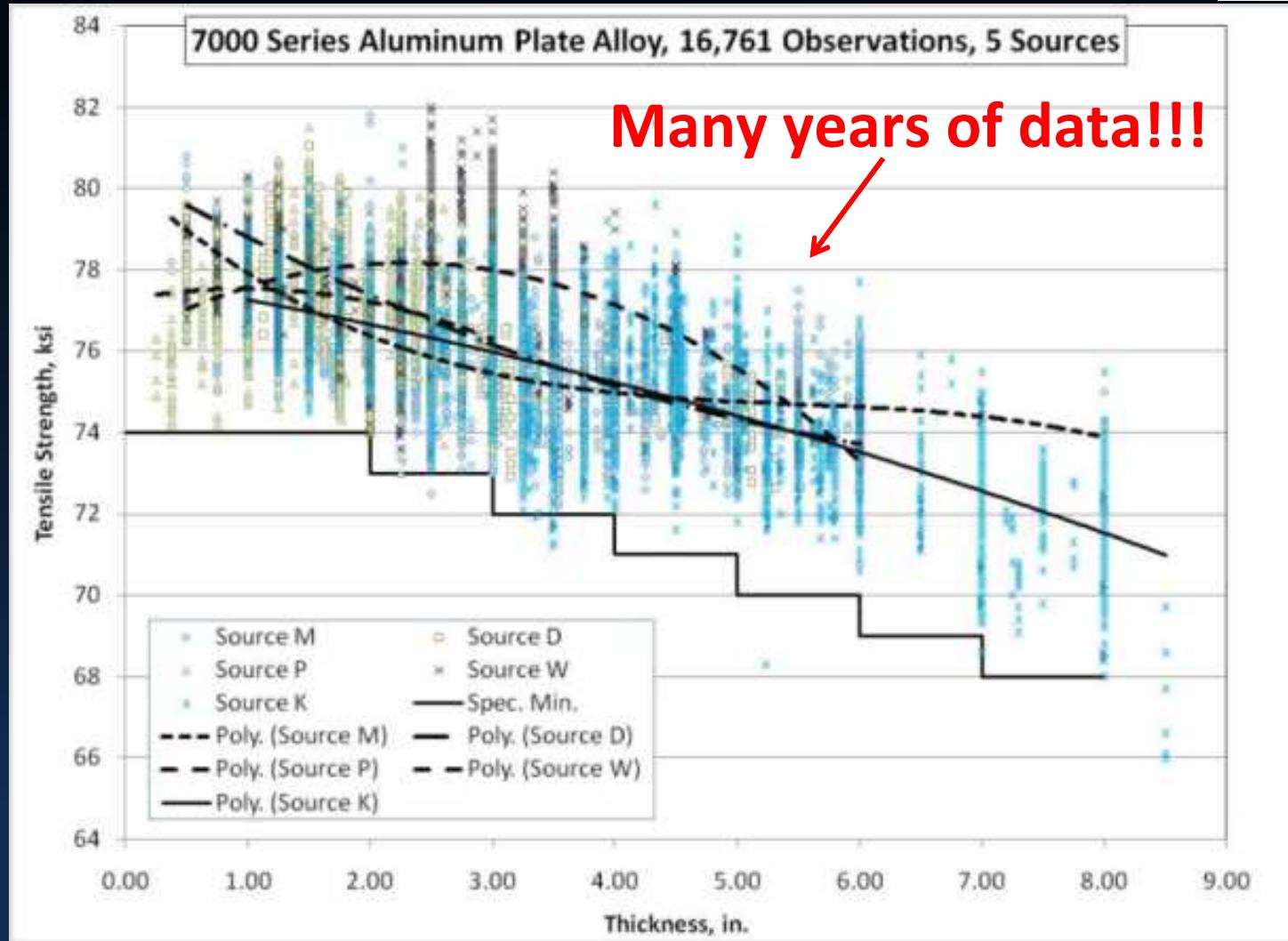
# Changing timelines...



# Changing timelines...

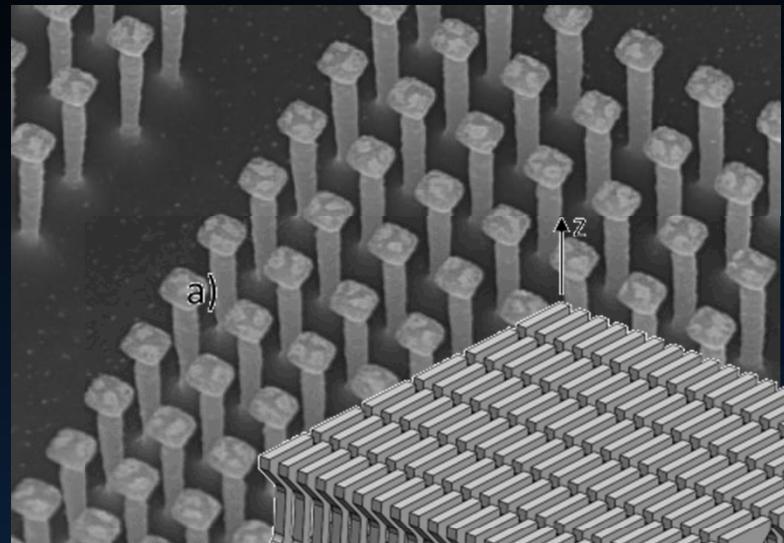


# How conventional materials are qualified...

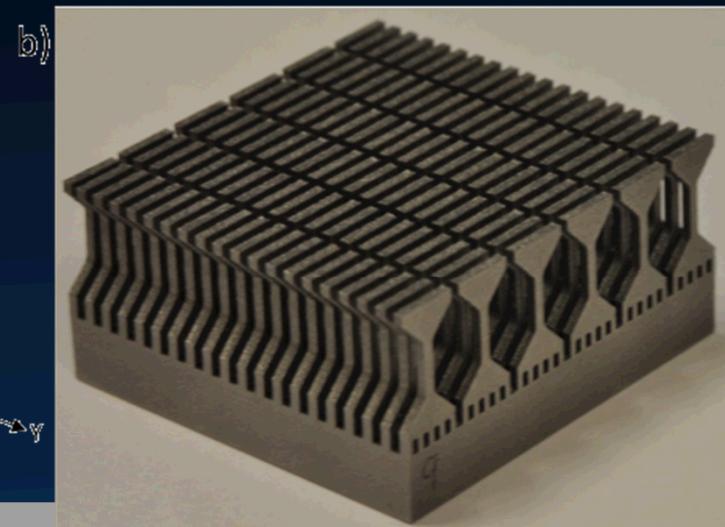
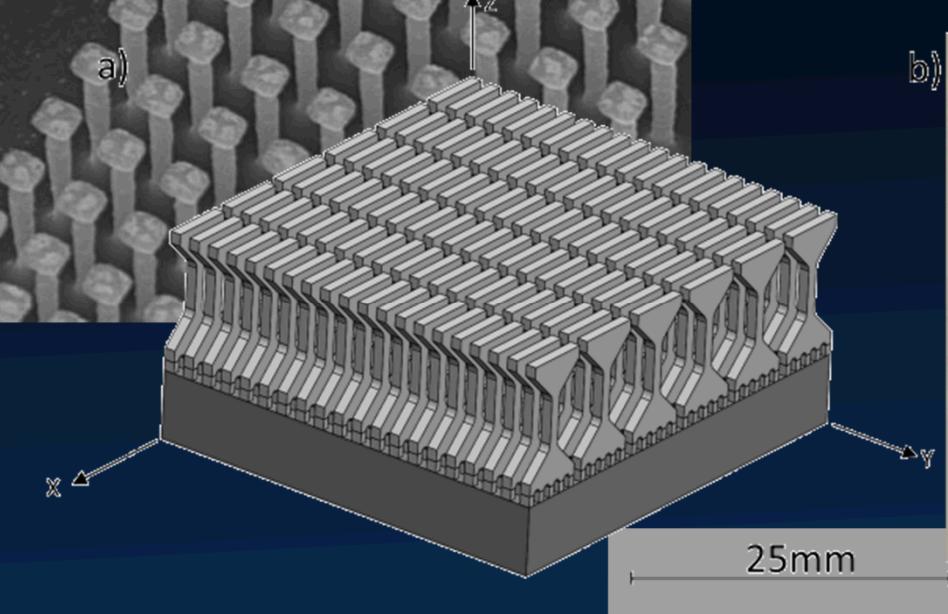


## How can we rapidly qualify AM materials?

# AM offers an opportunity for rapid statistics

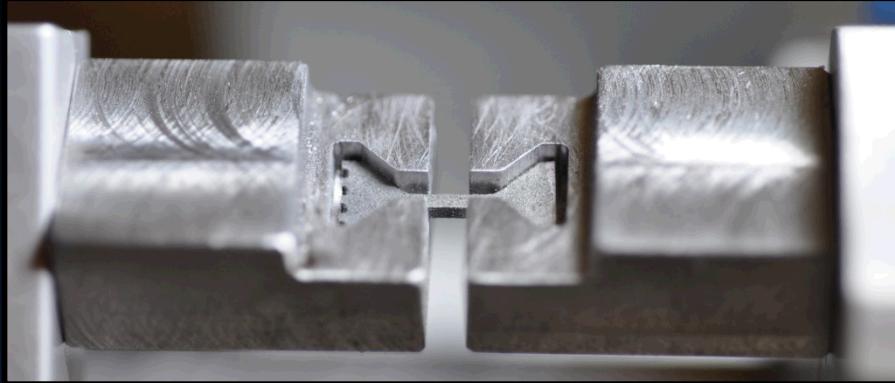


N. Chekurov et al.,  
*Nanotechnology* 2009

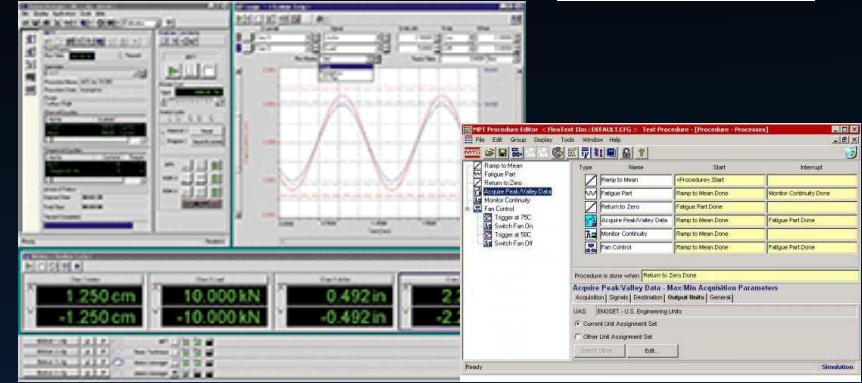


*Not quite a material property test...  
A standardized structural performance test*

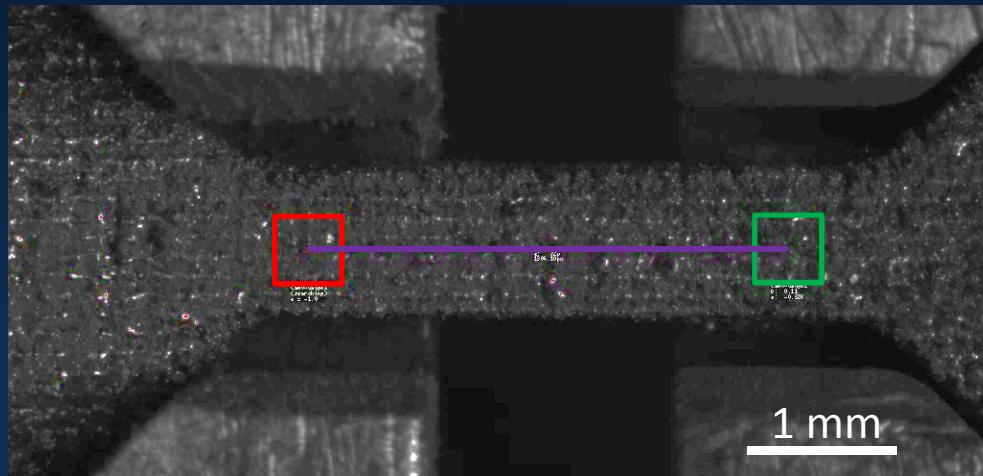
# Streamline the testing process



1. Self-aligning 'drop-in' grips

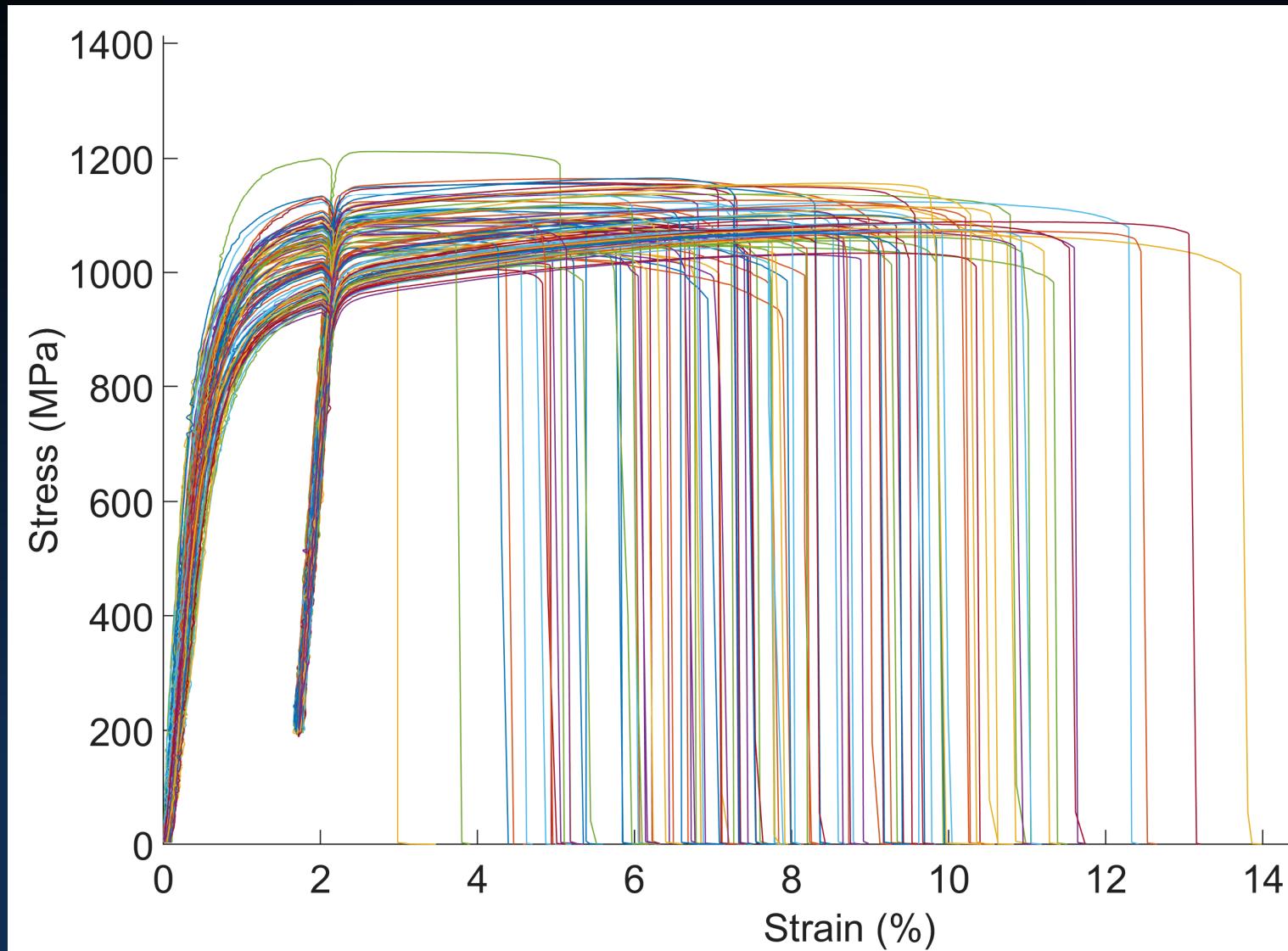


3. Maximize software automation to reduce burden on operator

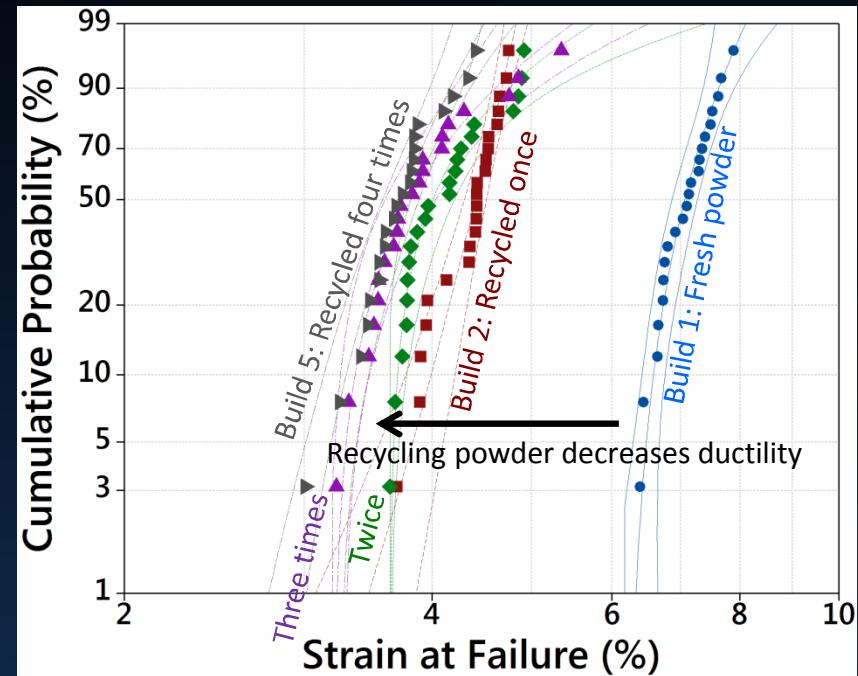
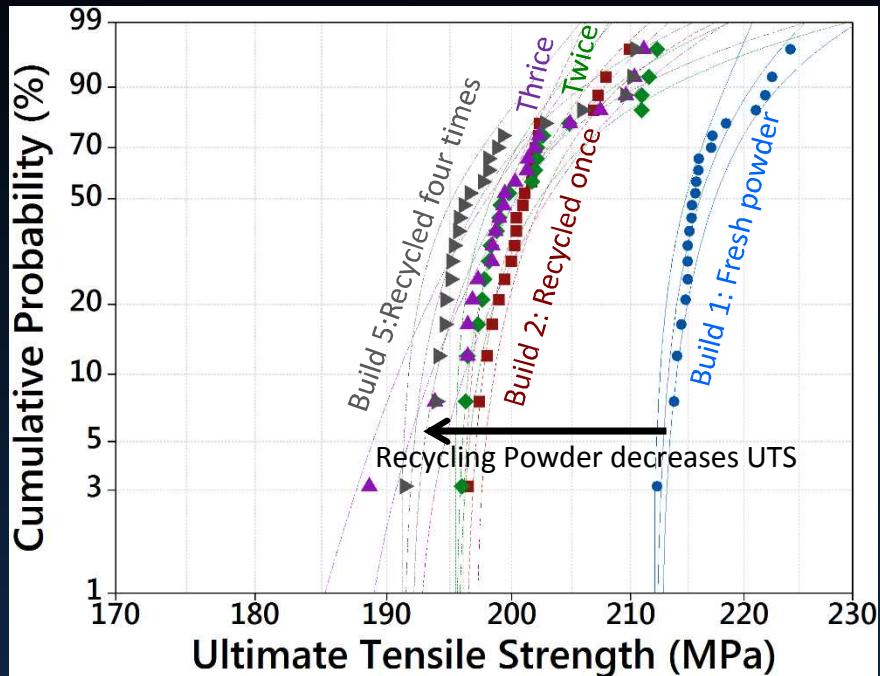


2. Non-contact virtual extensometer with "live" digital image correlation

*100 tensile tests in 4 hours...*



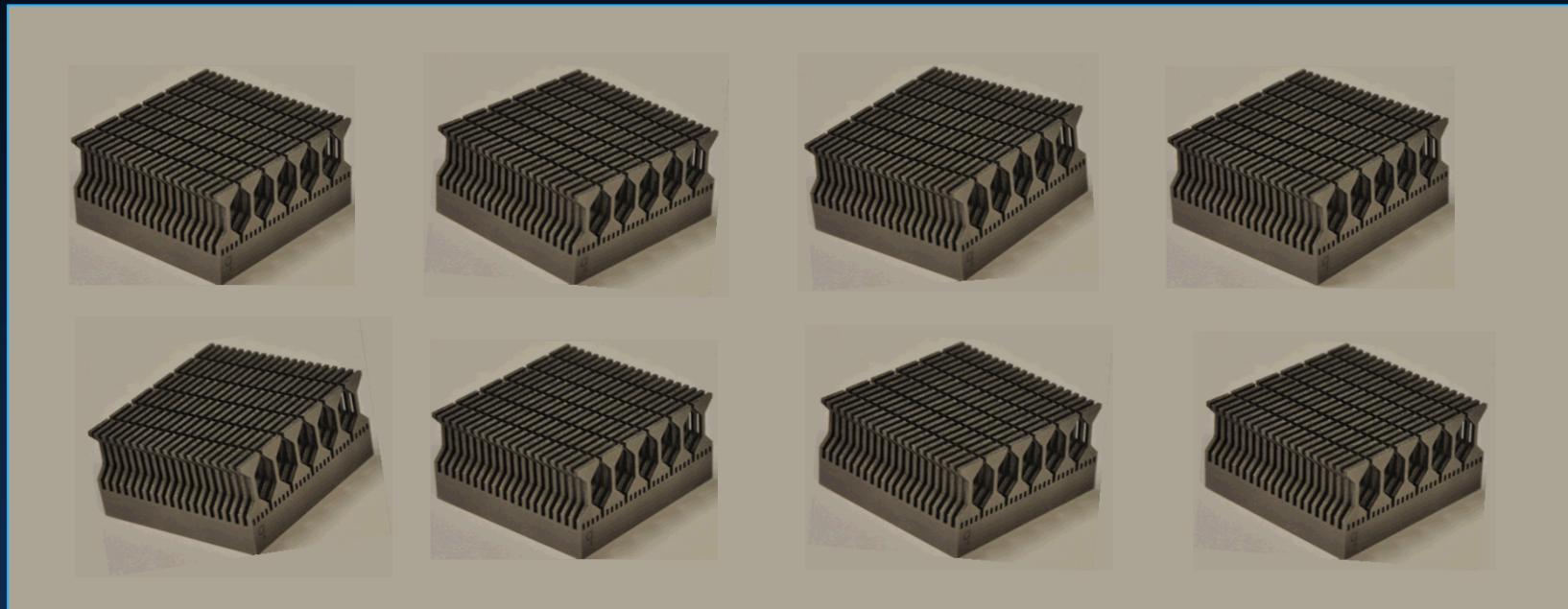
# Rapid evaluation of powder reuse effects



Al-Si-Mg Alloy, Renishaw

$$P_f = 1 - \exp \left[ - \left( \frac{\sigma - \sigma_0}{\sigma_\theta - \sigma_0} \right)^m \right]$$

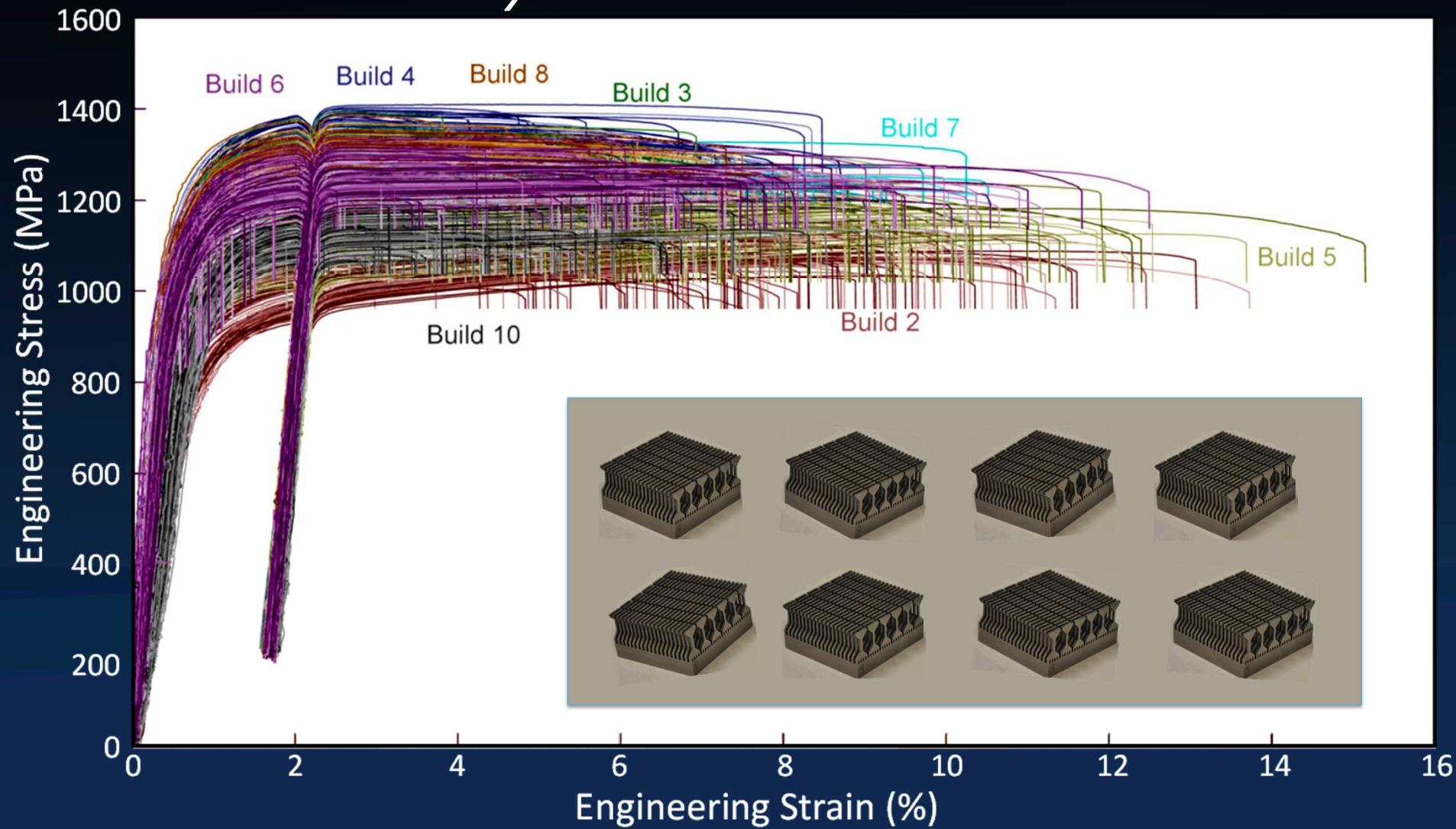
*How consistent are 8 separate builds of the same 'cooling fin' from the same vendor?*



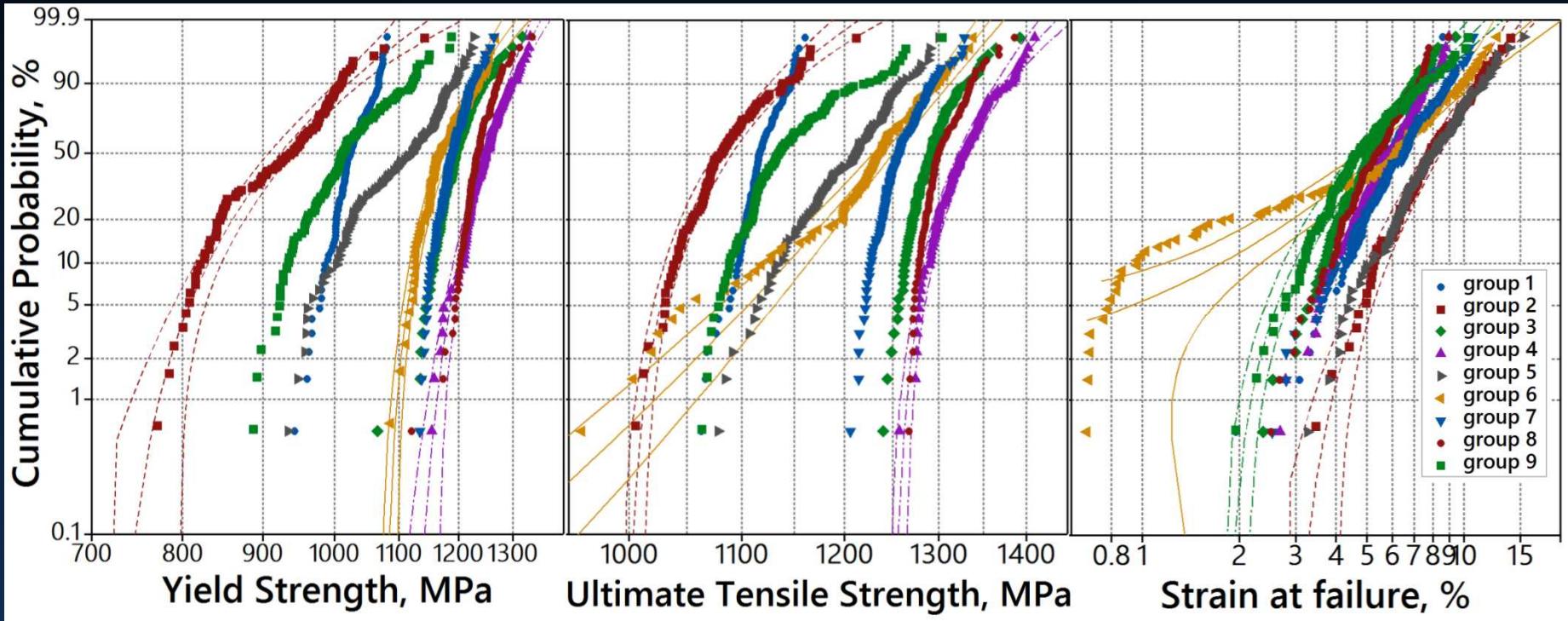
*960 tensile bars, produced in 2 weeks for ~\$10 each*

Alloy: 17-4PH

# *“Big data”? 945 tensile tests from 8 nominally identical builds*

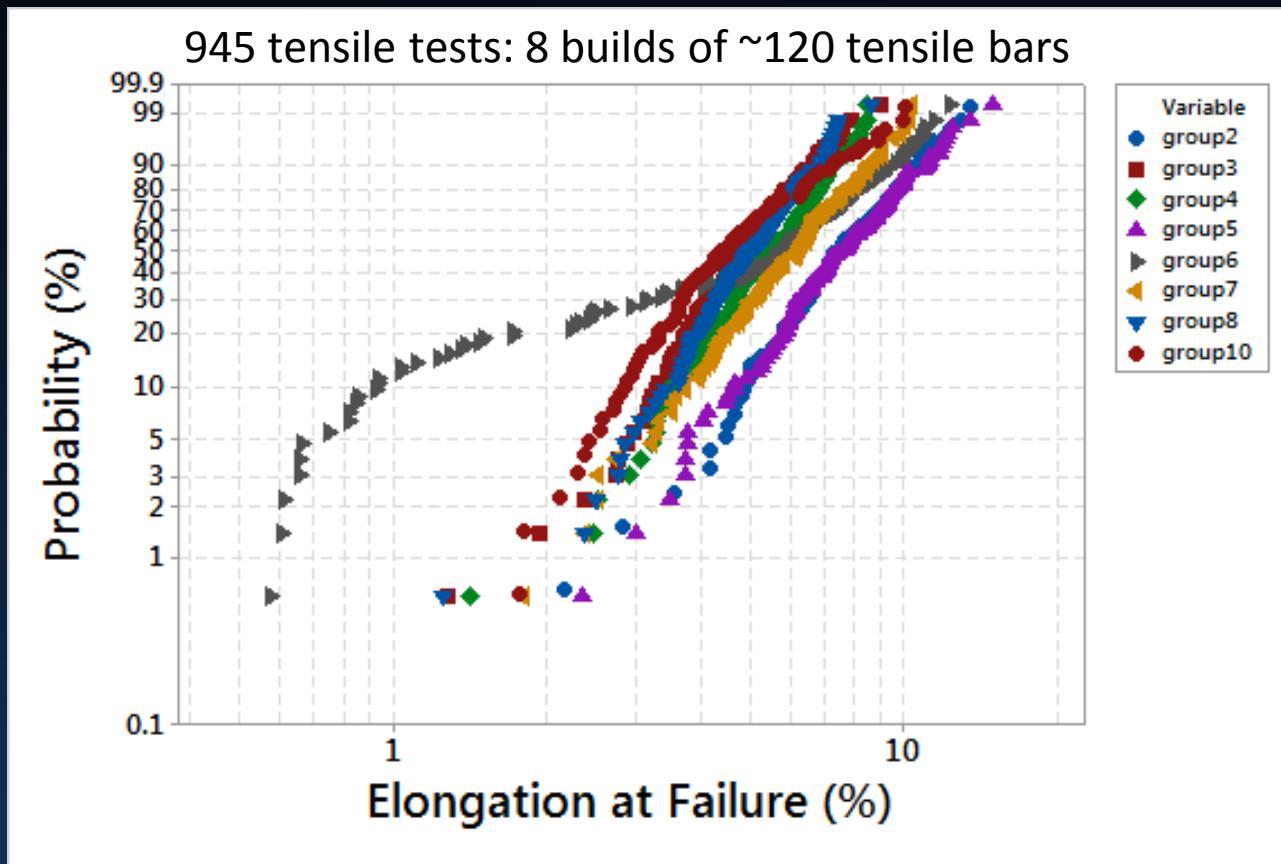


# Weibull CDFs illuminate “within-build” and “between-build” variability

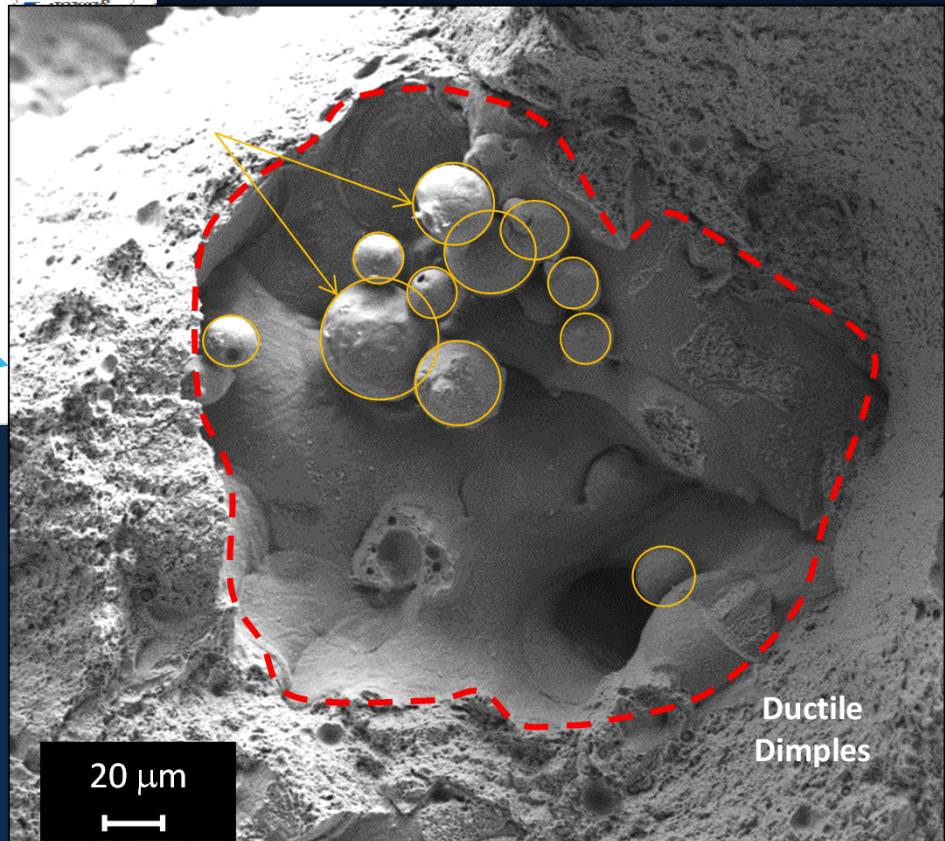
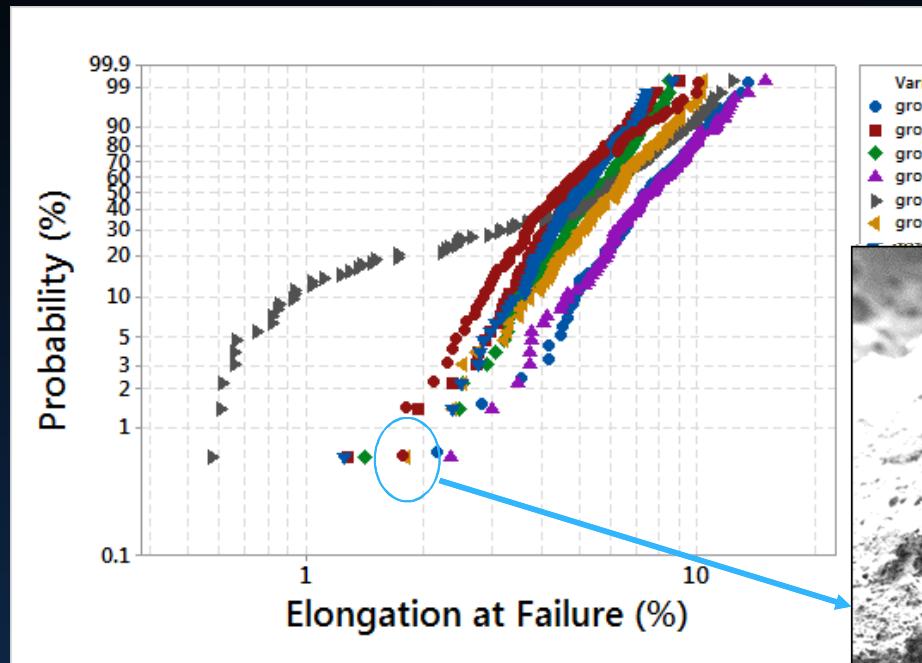


$$P_f = 1 - \exp \left[ - \left( \frac{\sigma - \sigma_0}{\sigma_\theta - \sigma_0} \right)^m \right]$$

# *Unpacking the variation in ductility...*

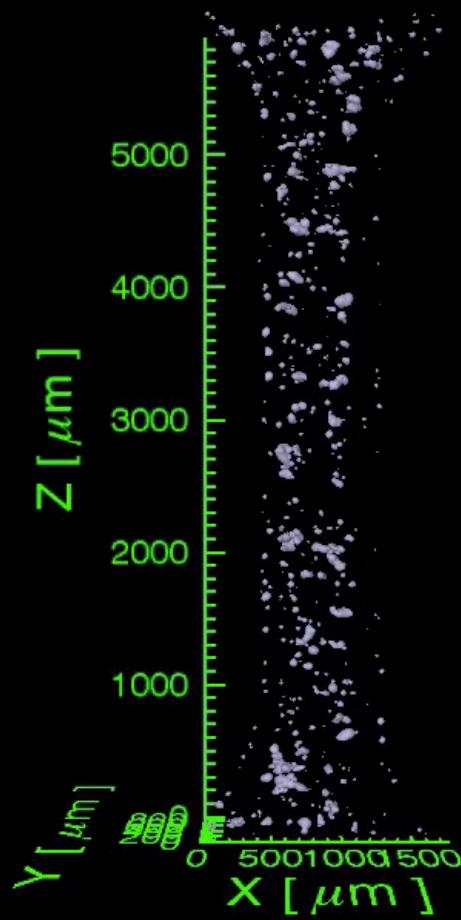
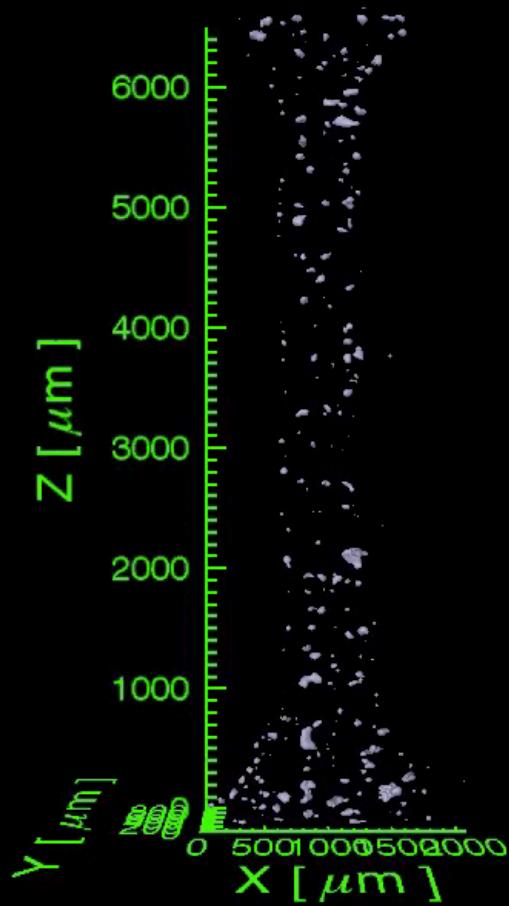


# *“Typical” Ductility-Limiting Flaws*



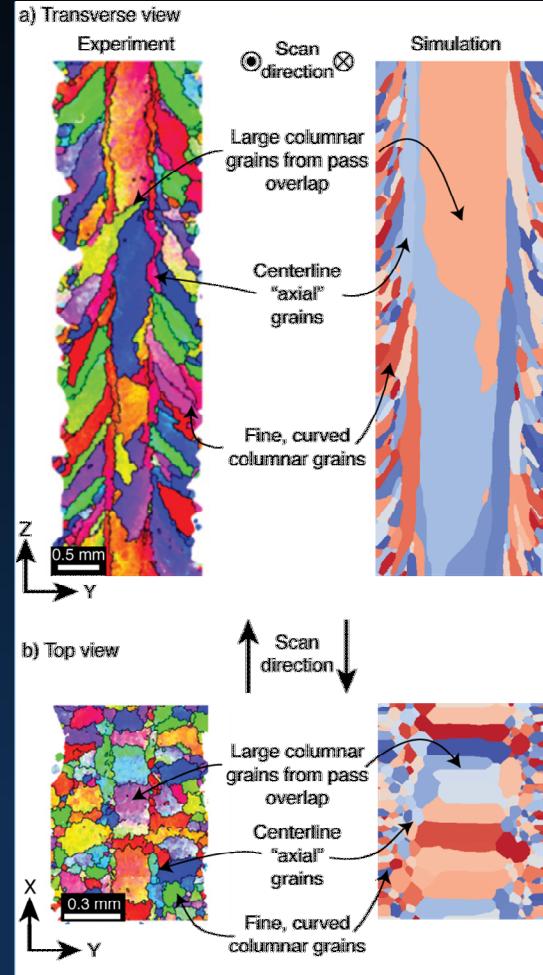
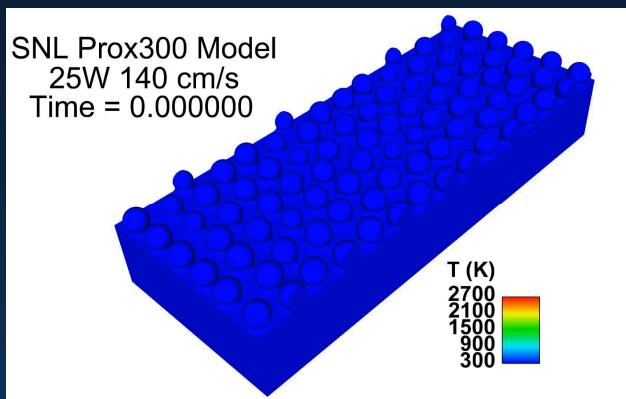
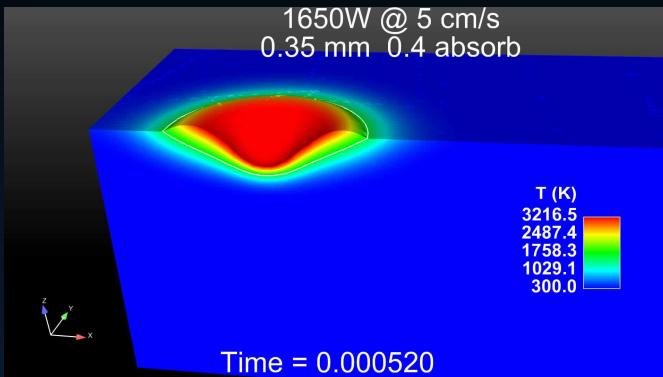
Fractography is not high-throughput!

# *X-ray CT Scans are not high-throughput!*



- 100 CT Scans  $\sim \$30,000$  and 3 months...
- Need high-throughput CT, in-process detection, or other inferential detection method

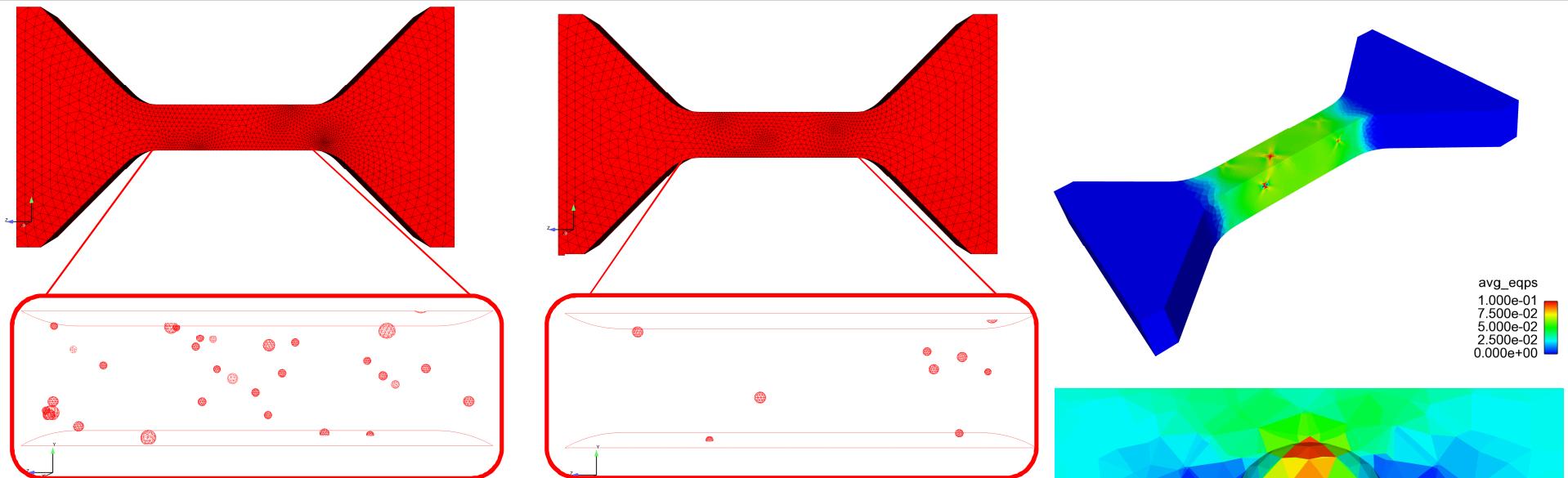
# Modeling the AM solidification process



## This is a herculean challenge

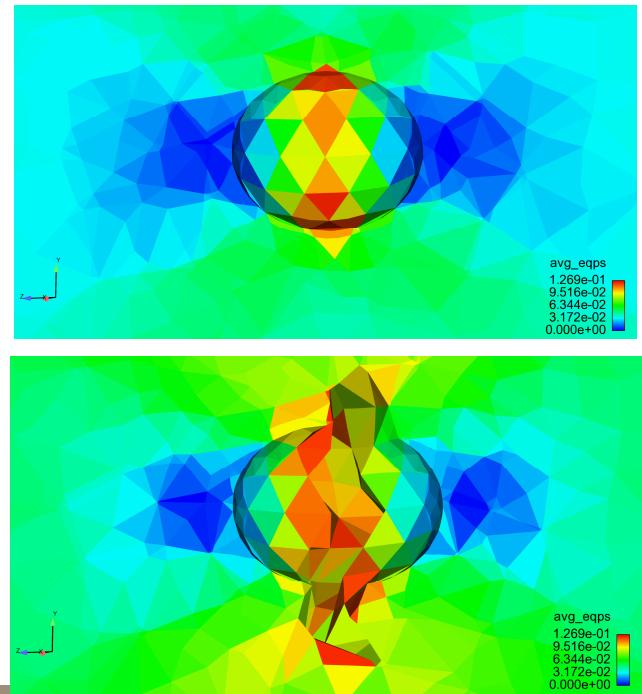
Powder packing  
Laser/plume interactions  
Plasma fluid mechanics  
Radiation heat transfer  
Laser energy adsorption, radiation  
Thermal expansion  
Non-equilibrium vapor pressure  
Evaporation with latent heat  
Pressure-temperature relations  
T-dependent heat capacity  
Incompressible fluid dynamics  
Convective/conductive heat transfer  
Capillary forces  
Marangoni forces  
Hydrodynamic mixing  
Multicomponent liquid-solid diffusion  
Solidification macrosegregation  
Solidification shrinkage  
CTE thermal contraction  
Thermomechanical deformation  
Residual Stress  
Solid-state diffusion  
Anisotropic crystallization  
Solid-state phase transformation

# Finite Element Analysis of Porosity Effects

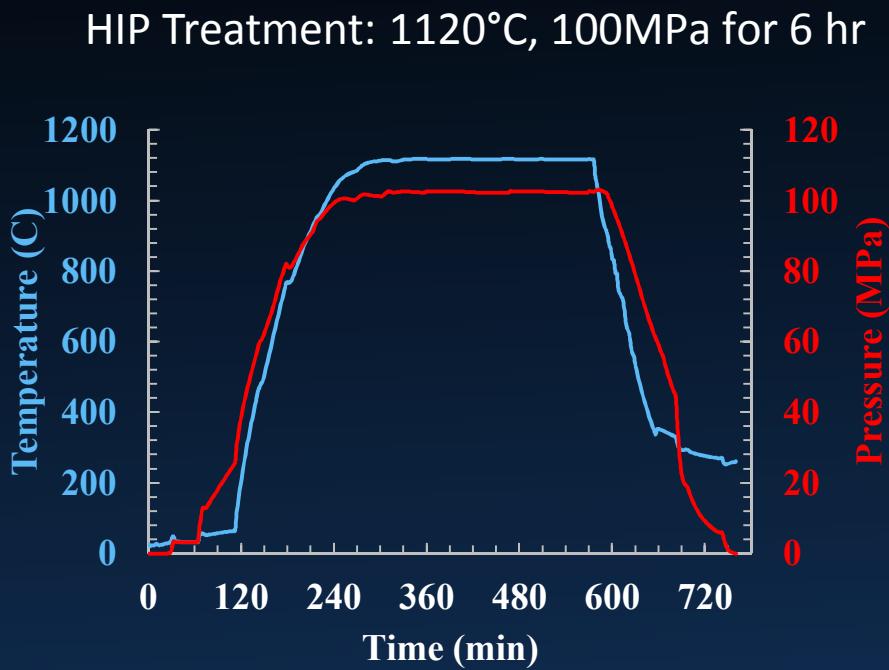


$$\dot{\phi} = \sqrt{\frac{3}{2}} \dot{\epsilon}_p \frac{1 - (1 - \phi)^{m+1}}{(1 - \phi)^m} \sinh \left[ \frac{2(2m - 1)}{2m + 1} \frac{\langle \frac{I_1}{3} \rangle}{\sqrt{3J_2}} \right]$$

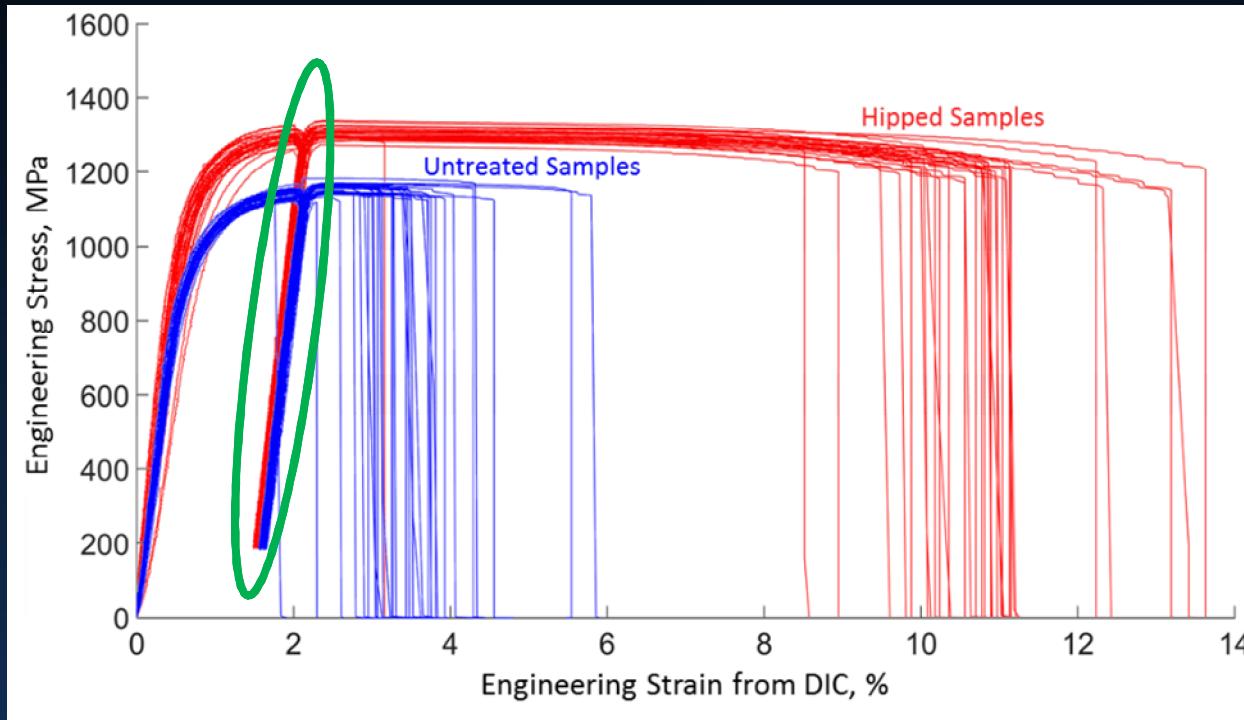
**Hypothesis:** process-induced defects will intensify and localize deformation, but that microscale void mechanisms will still ultimately lead to failure (decoupled scales).



# Hot Isostatic Press (HIP) Remediation



# Hot Isostatic Press (HIP) Remediation



# Effect of Porosity on Modulus



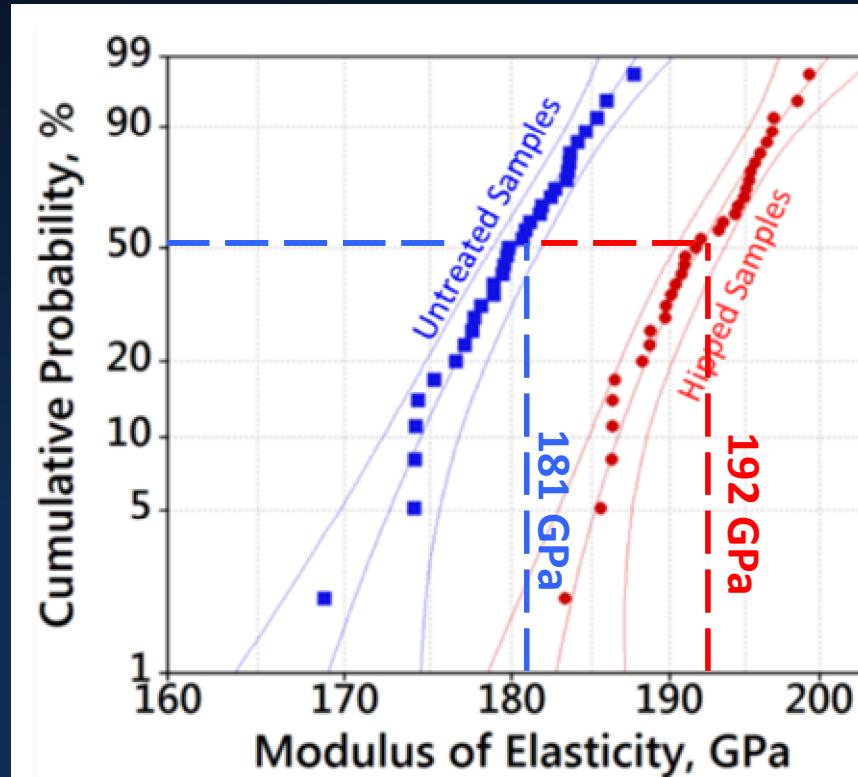
$$E_p = E_0 * (1 - a * P)$$

$a = 1.9$  [Choren et al, J. Mater Sci, 2013]

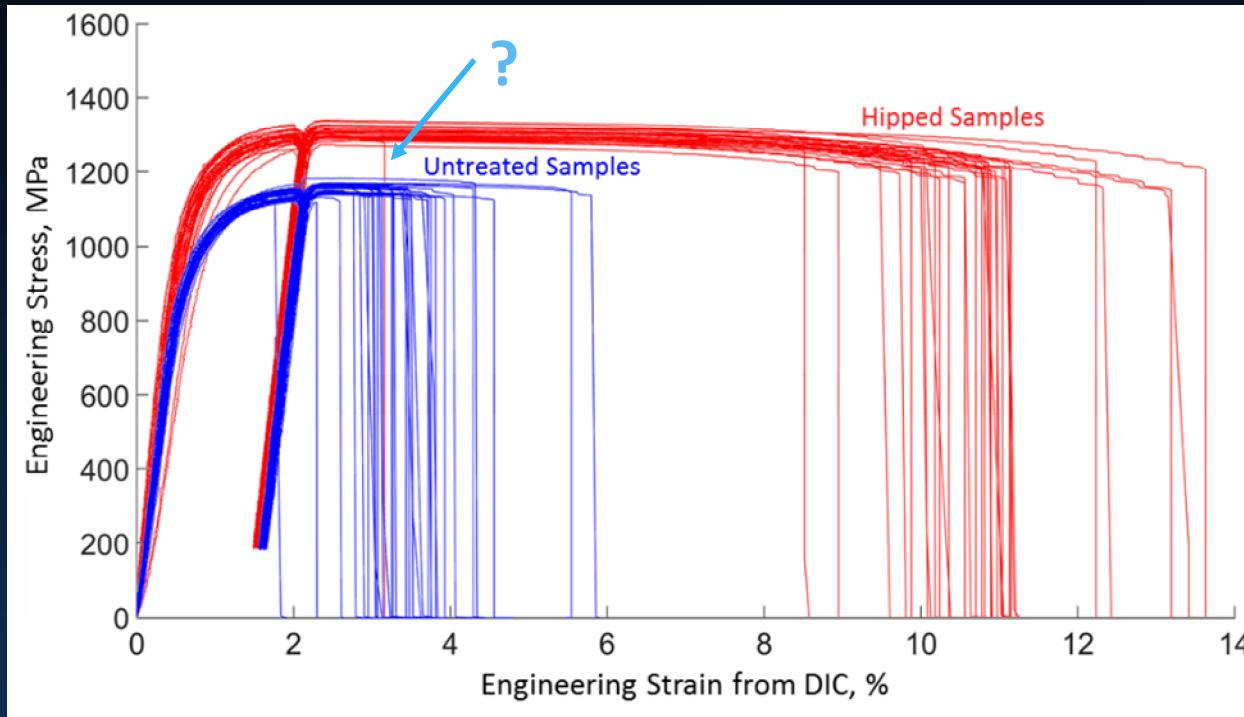
$$E_0 = 195 \text{ GPa}$$

$$\Rightarrow E_{0.06\%} = 195 \text{ GPa}$$

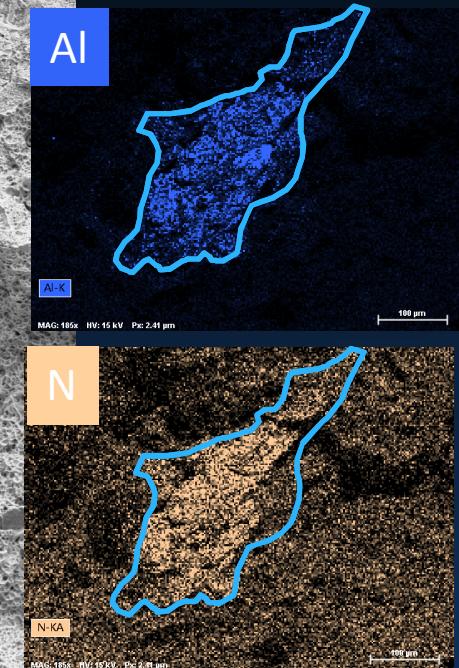
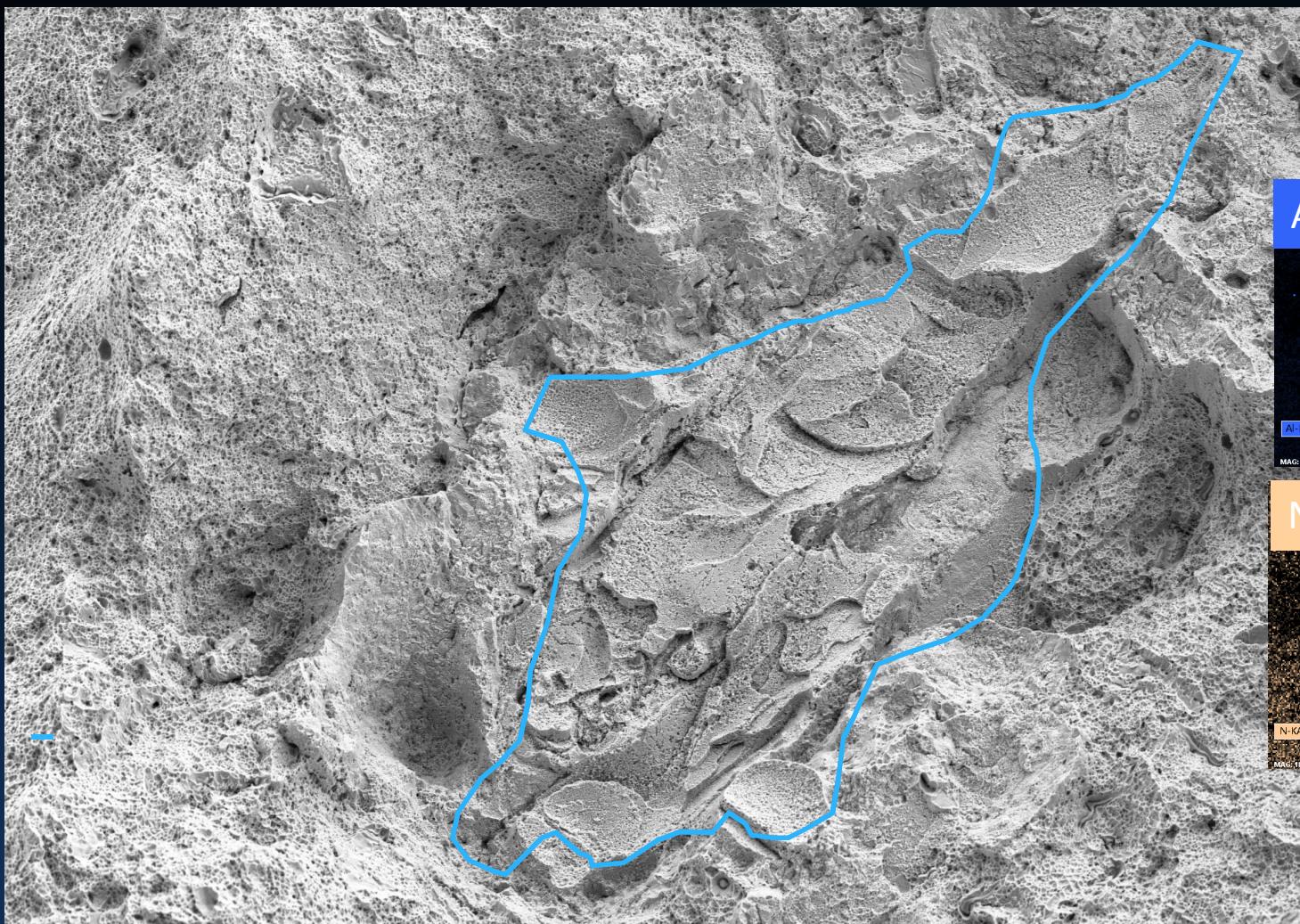
$$E_{3.3\%} = 183 \text{ GPa}$$



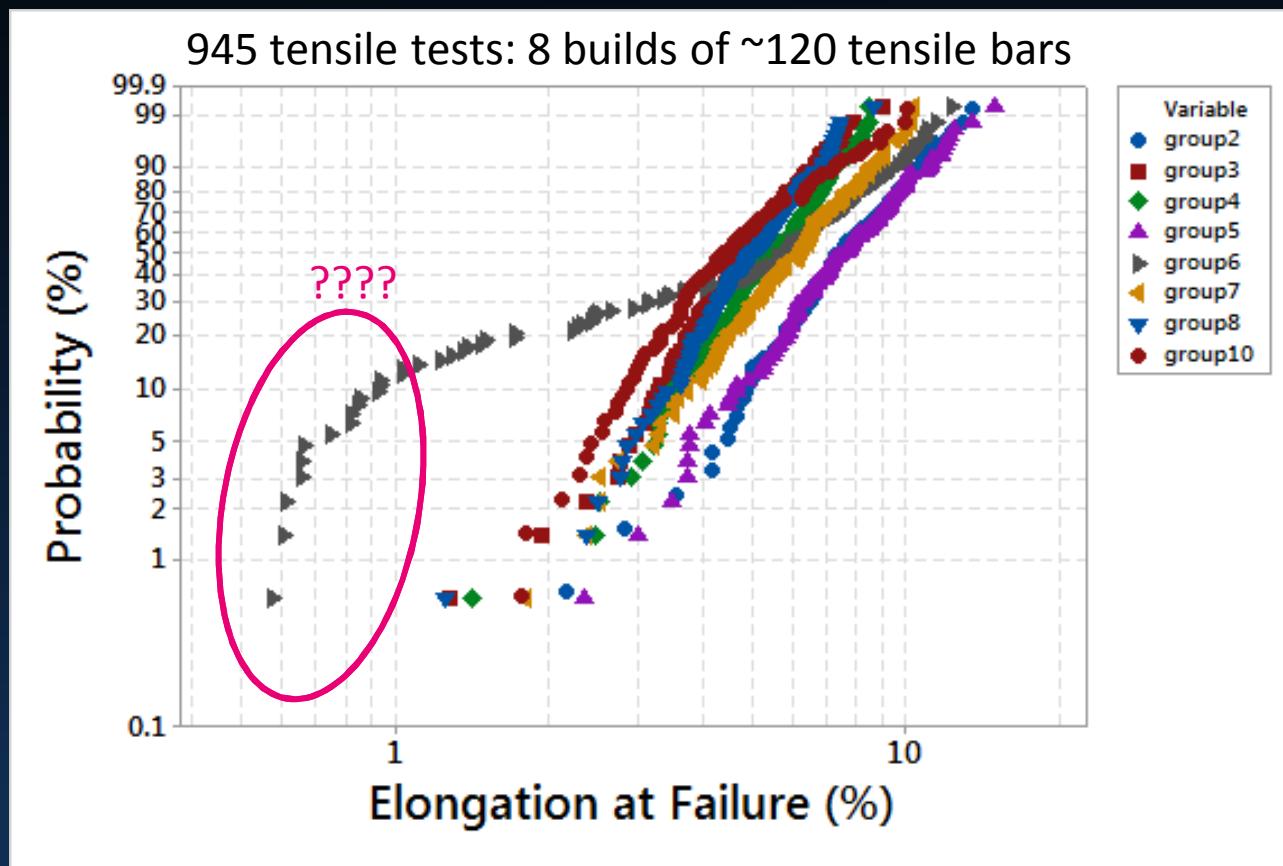
# Hot Isostatic Press (HIP) Remediation



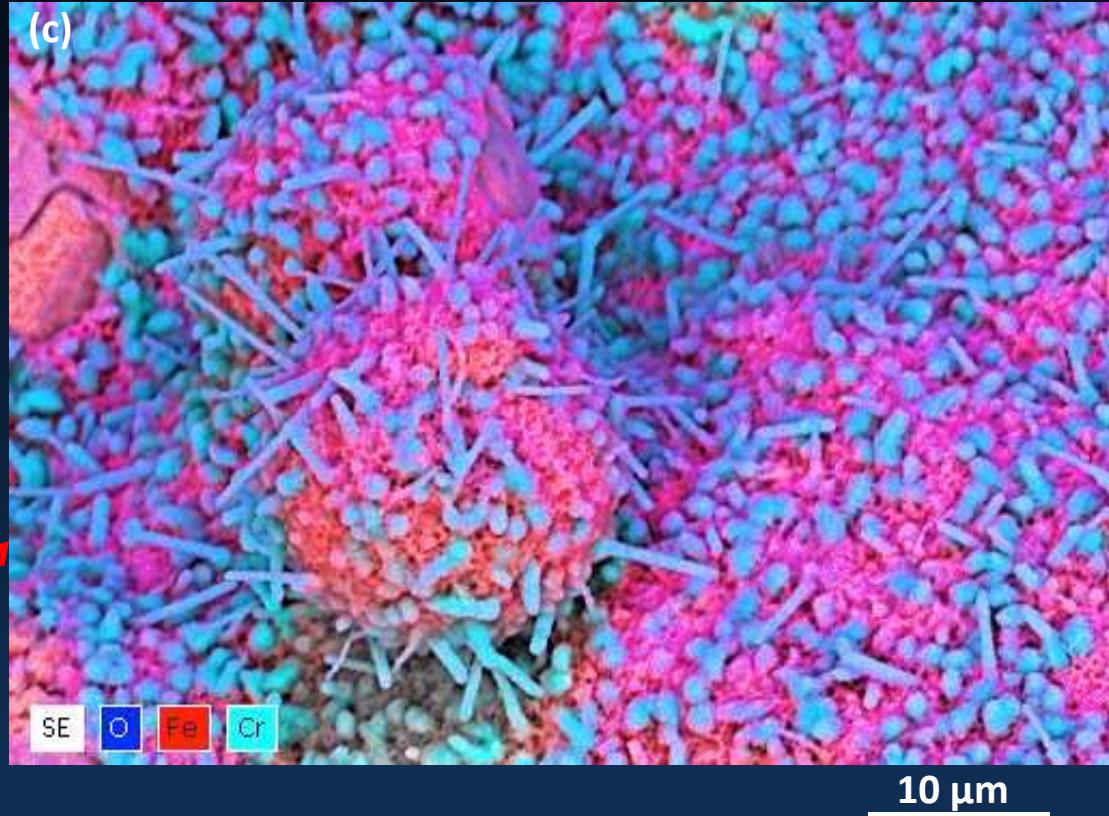
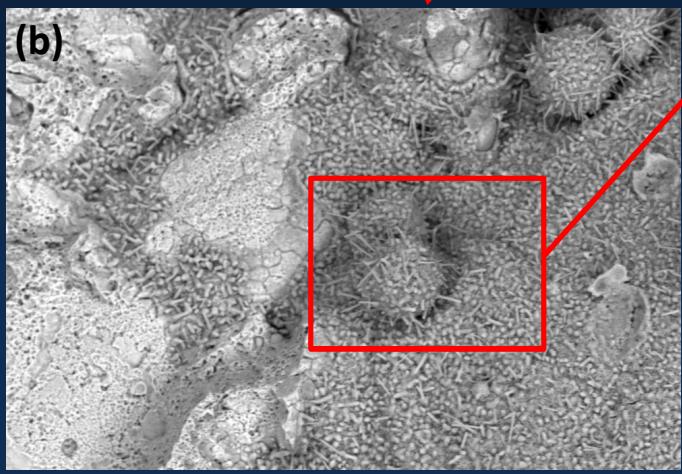
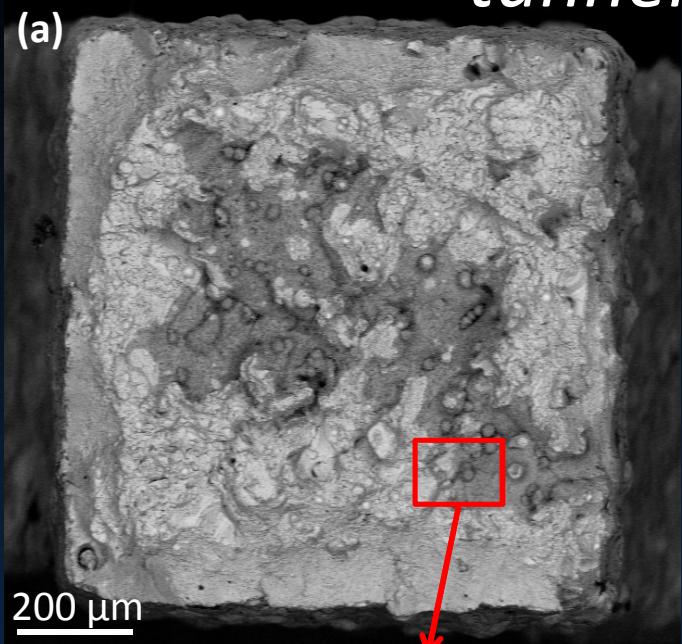
# Low Outlier: Aluminum-rich region!?



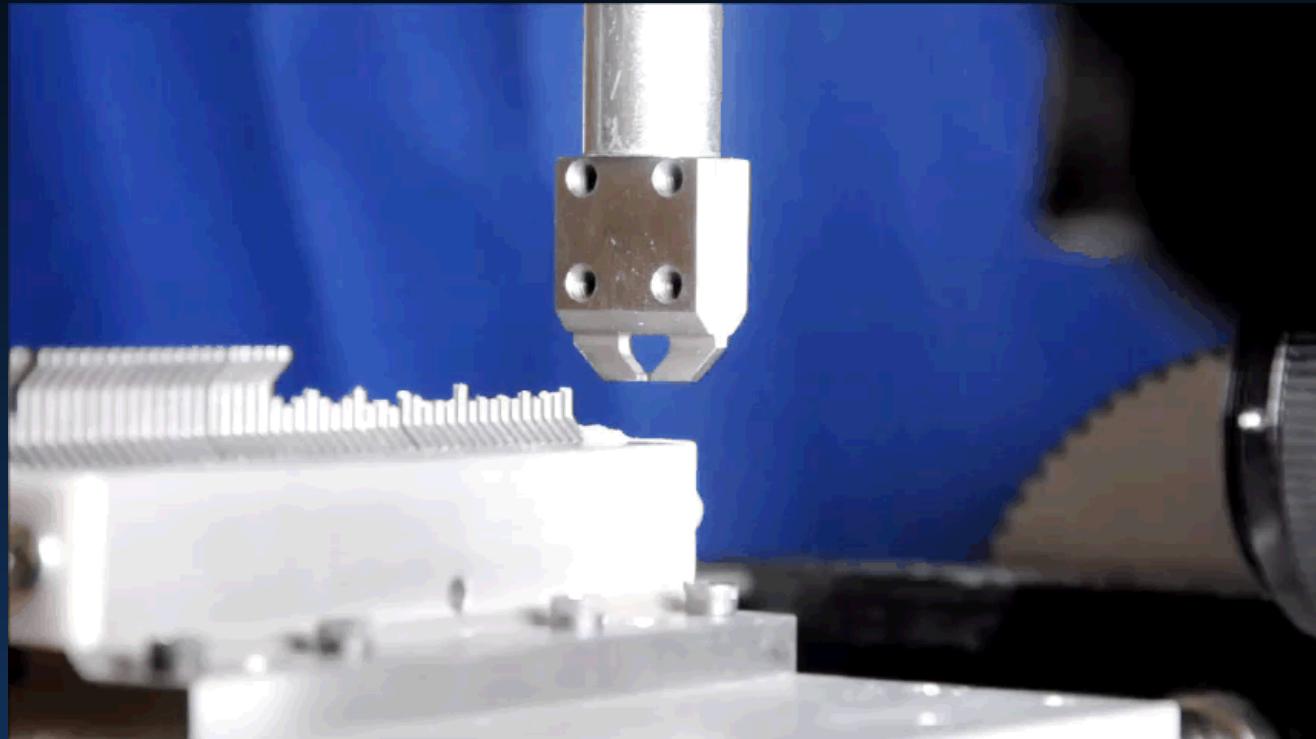
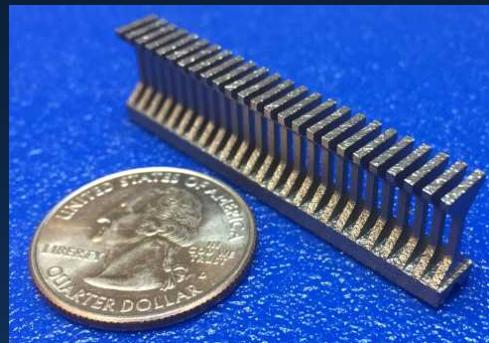
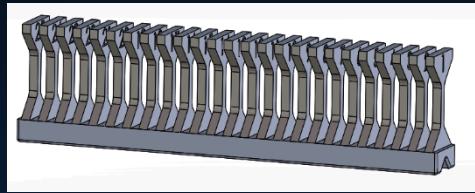
# *Distributions from 8 nominally identical cooling fins (Vendor 1)*



# *Anomalous 'low ductility' caused by "tunneling porosity"*



# *Next level of Automation...*

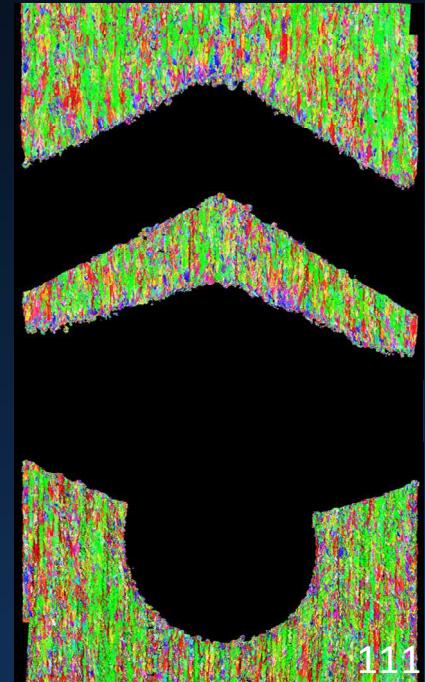
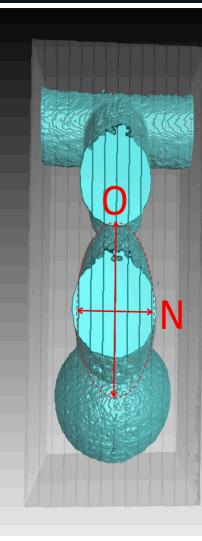
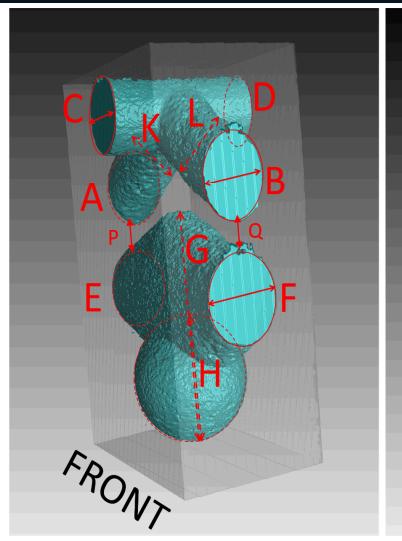
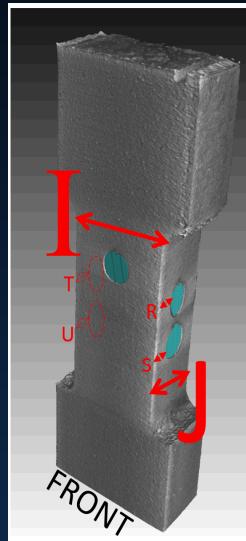
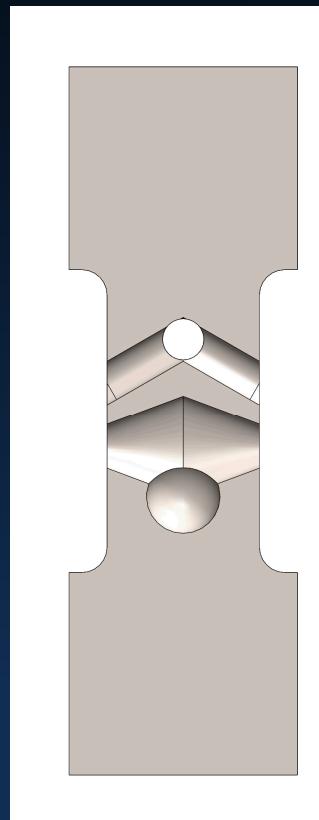


**>100 tensile tests/hr with minimal operator burden**

# Announcing the 3<sup>rd</sup> Sandia Fracture Challenge



Provided with tensile data, CT data, roughness, microstructure, etc,  
***predict*** the conditions (force, displacement) for fracture...



Alloy: 316L

Production method: Laser Powder Bed Fusion



Know someone who might be interested? E-mail [blboyce@sandia.gov](mailto:blboyce@sandia.gov)

# *Summary...*



- High-throughput methods permit rapid insight into both “typical” variation of material properties and statistically anomalous rare events.
- The anomalous defects are missed in small-populations of tests
- Modeling can help us understand the role of these defects and process paths to eliminate the defects.
- More development is needed on both high-throughput post-process and in-process characterization

# *Automation beyond the tensile test...*



<u>Properties</u>	<u>Structure</u>	<u>In-Process</u>
Tensile strength	Geometry	<b>In-process monitoring</b>
Ductility	Roughness	<b>Adaptive Feedback Control</b>
Toughness	Porosity	
Hardness	Chemistry	<b>Post-Processes</b>
Wear & friction	Phase content	Surface remediation
Permeability	Grain Size	Heat treatment
Thermal expansion	Crystal Texture	Subtractive machining
Reactivity/corrosion	Residual stress	Coating
Electrical conductivity	Dislocation content	Joining
Resonance	etc.	Integration
etc.		etc.

\* Some measurements, like resonance testing, can be used to infer multiple aspects (geometry, density, modulus, residual stress, etc)

# *A diagnostic artifact provides an inspection surrogate and a process monitor...*



## Material & Structural Properties

### Mechanical Properties

Arrays of tensile bars used to investigate stochastic tensile properties. Arrays of two different-sized tensile bars allow exploration of size-dependent mechanical properties

### Structural Dynamics

Several cantilever beams of two heights can be used to test the resonance frequency of the material.

### Notched Features

Arrays of notched features intended to explore stress-concentration effects on reliability and develop break-away coupons

### Material Chemistry

Coupons to readily verify the composition and monitor contaminant levels.

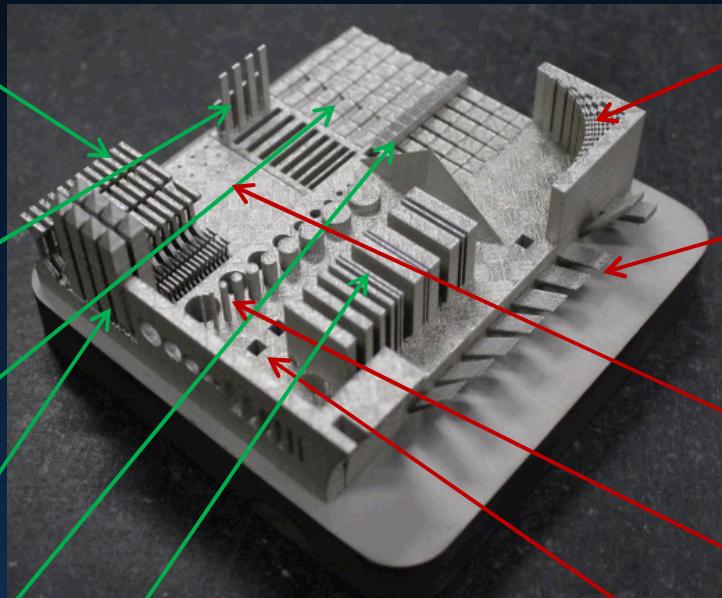
### Surface Roughness

Several features explore the interplay between geometry and the resulting surface roughness

### Residual Stresses

Several features may be used to quantify the stress-induced warpage. Also, regions of the part exacerbate internal residual stresses to be measured by x-ray/ neutron diffraction or hole drilling.

Sandia Artifact printed in stainless steel alloy 17-4PH using a commercial vendor (Fineline) with a ConceptLaser Mlab Printer



## Printability Limits & Metrology

### Minimum Feature Dimensions

Evaluate printability and dimensional accuracy for a wide range of feature types including theoretical sharp corners

### Overhangs & Bridges

Incrementally sized features intended to determine the maximum dimension that will maintain structural integrity of the part. Features push printer to failure point.

### Internal voids

Intentional internal void arrays of varying dimension allow inspectability assessment

### Aspect Ratios

A wide range of aspect ratios explores the printability limits of positive and negative features

### Consistency features

Arrays of nominally identical features allow evaluation of repeatability

Most existing artifacts (e.g. NIST AM artifact) emphasize dimensional metrology and ignore material/structural properties. This compact array employs many dual-purpose features and many arrays of features for statistical repeatability analysis.