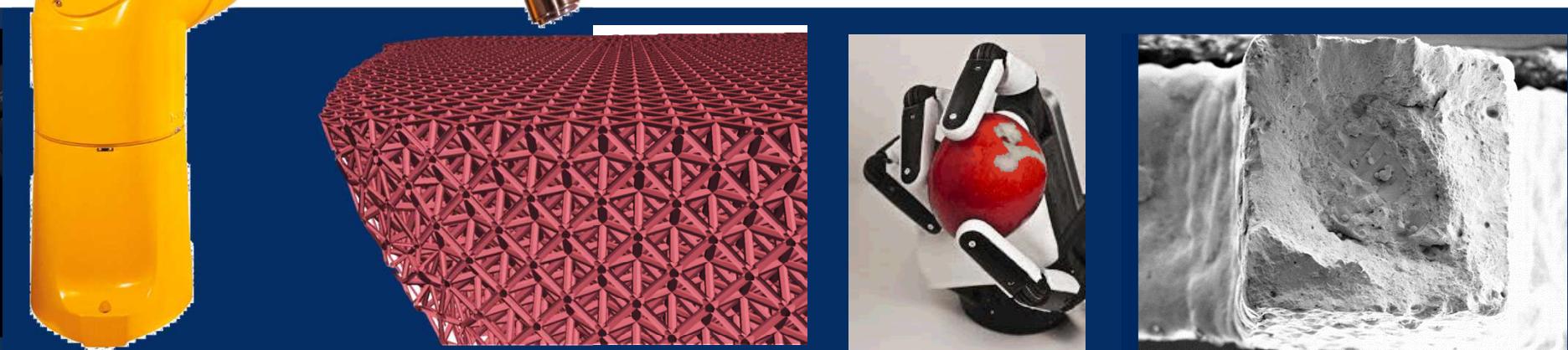


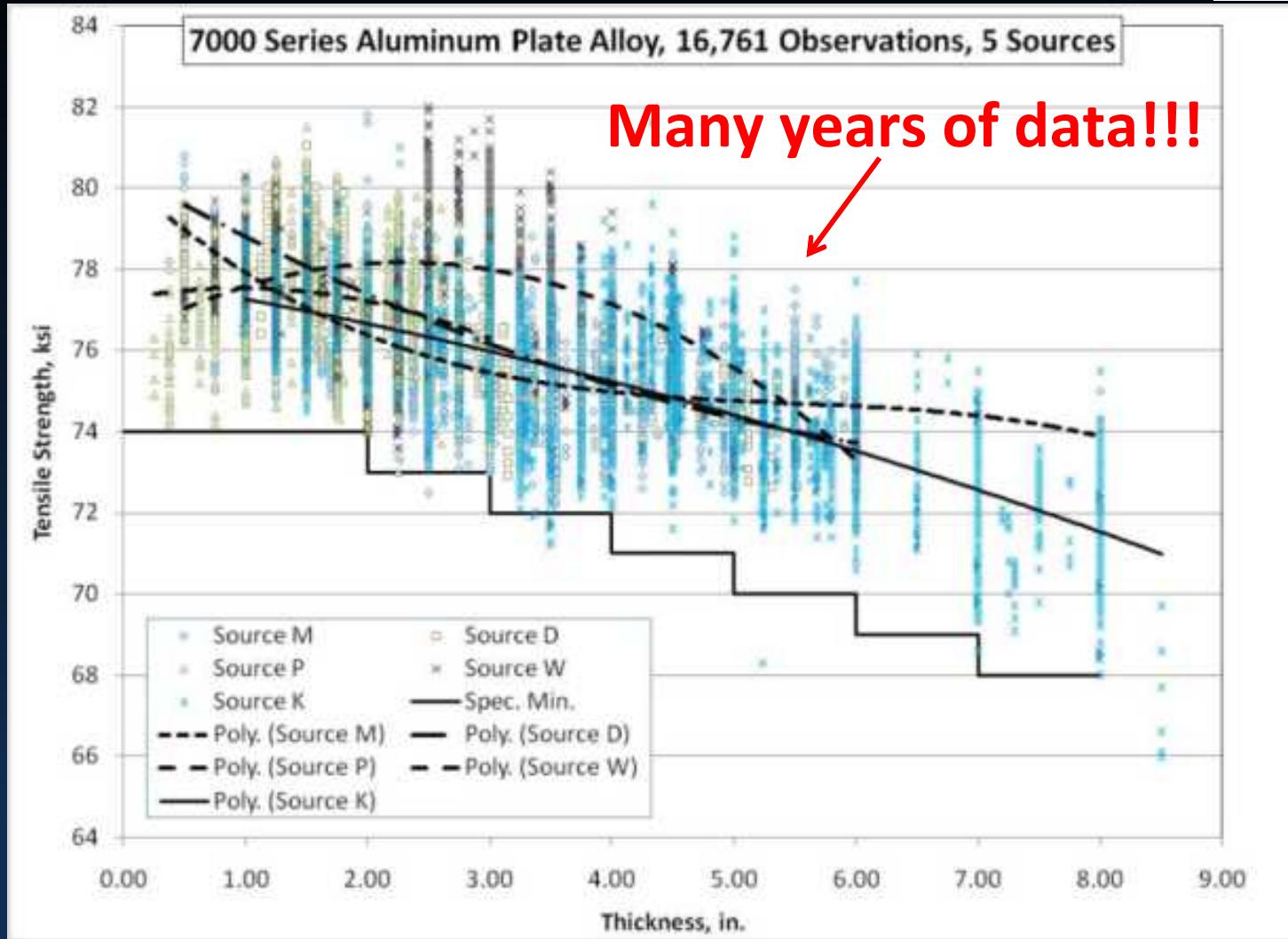
# High-throughput testing reveals rare, catastrophic defects

Brad L. Boyce, J.D. Carroll, B.R. Salzbrenner, B.H. Jared, J.M. Rodelas,  
J.D. Madison

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

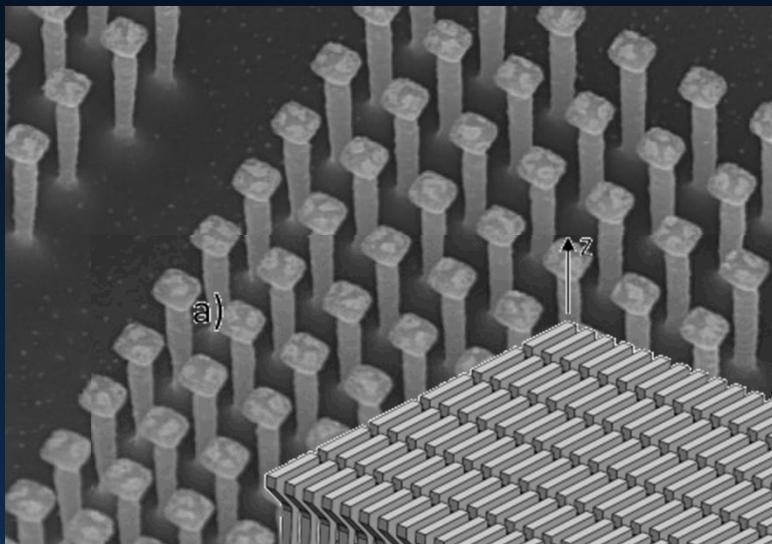


# How conventional materials are qualified...

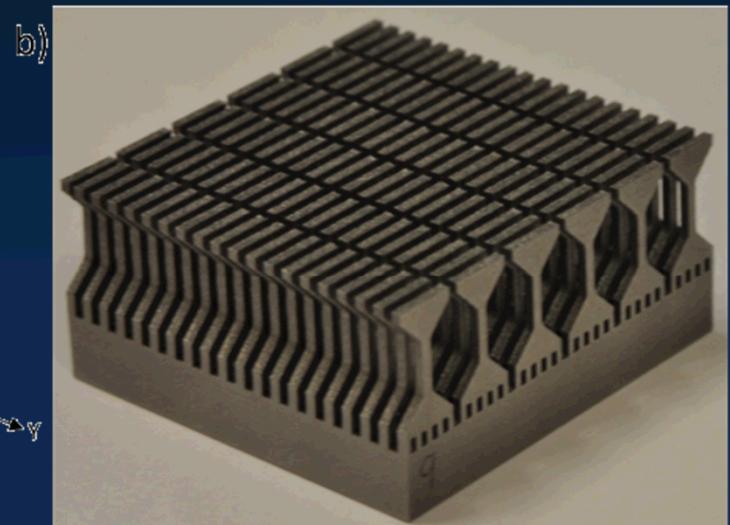
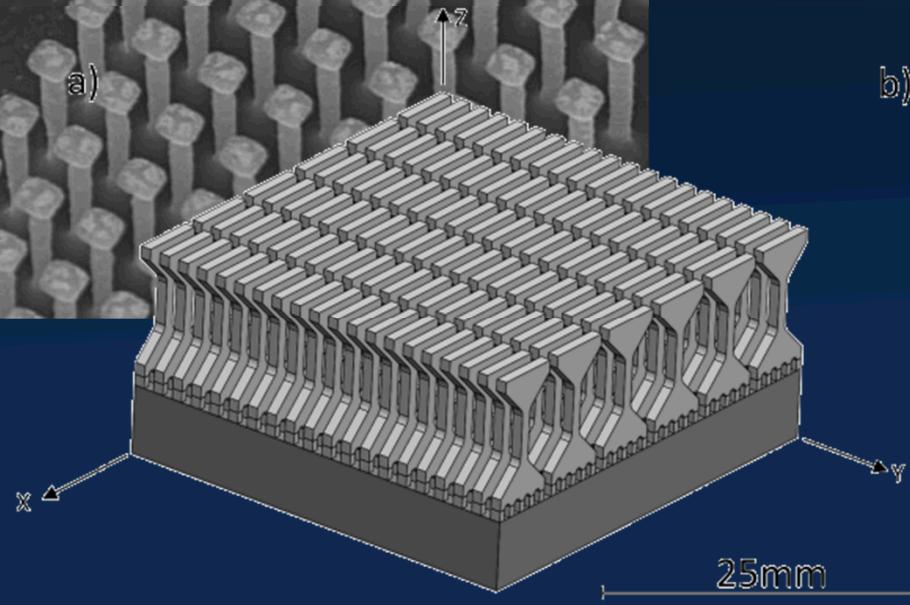


How can we rapidly qualify AM materials?

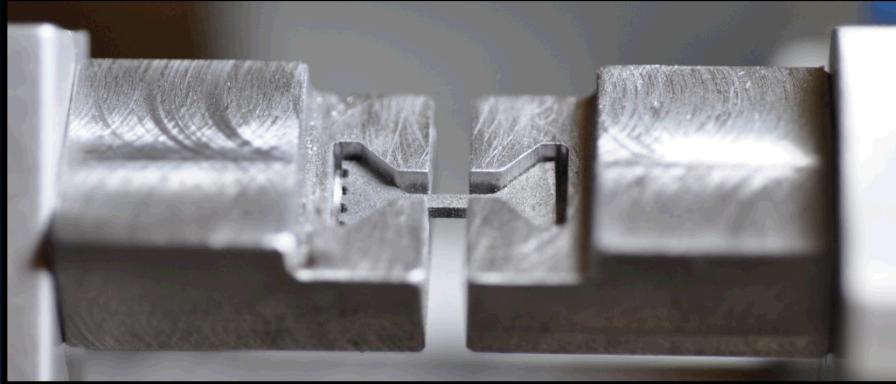
# AM offers an opportunity for rapid statistics



N. Chekurov et al.,  
*Nanotechnology* 2009

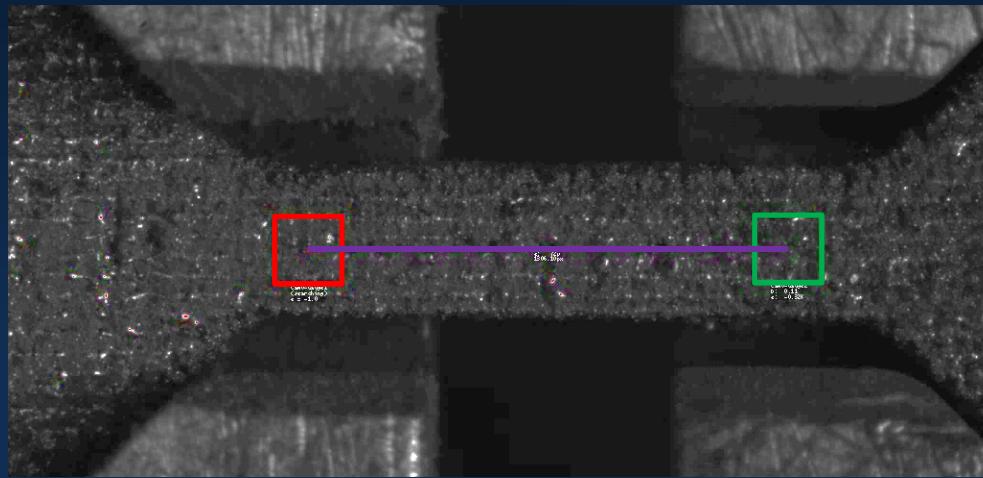


# *Streamline the testing process*



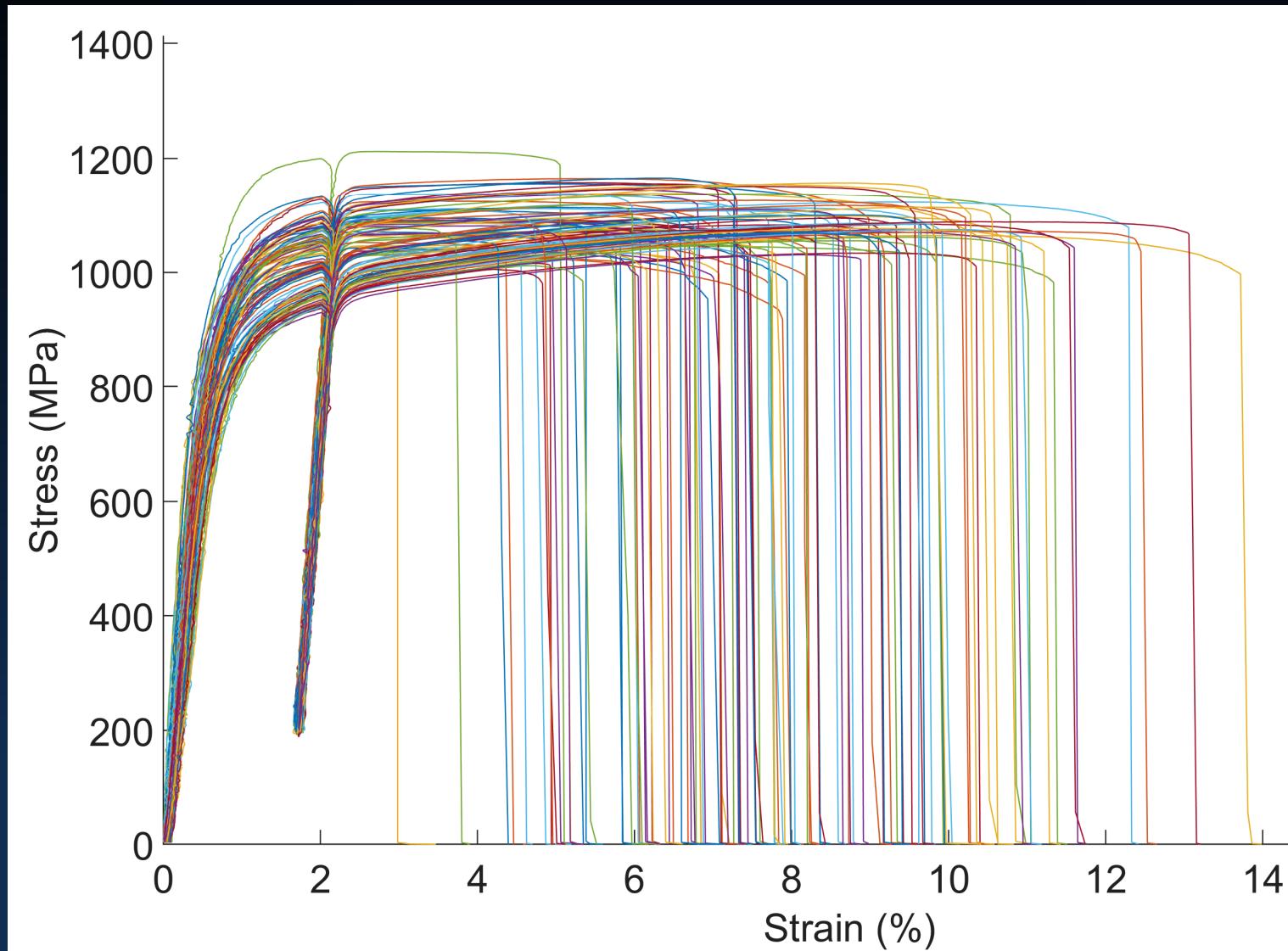
1. Self-aligning 'drop-in' grips

3. Maximize software automation to reduce burden on operator



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

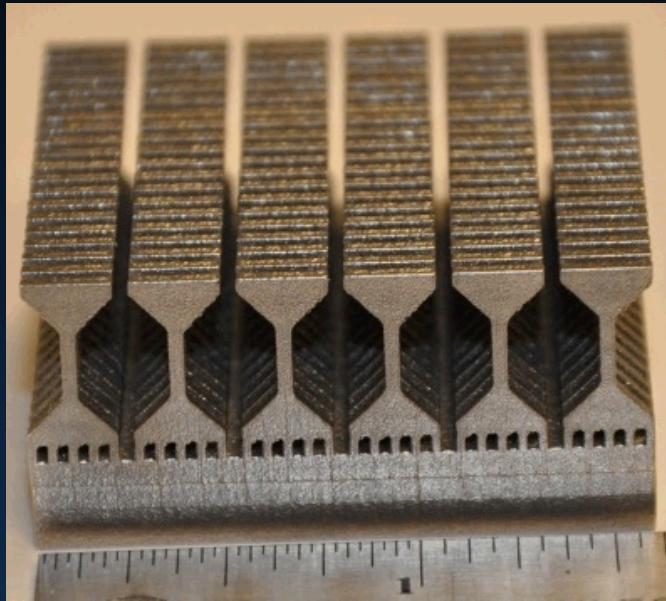
*100 tensile tests in 4 hours...*



# *A comparison of 2 major commercial vendors*

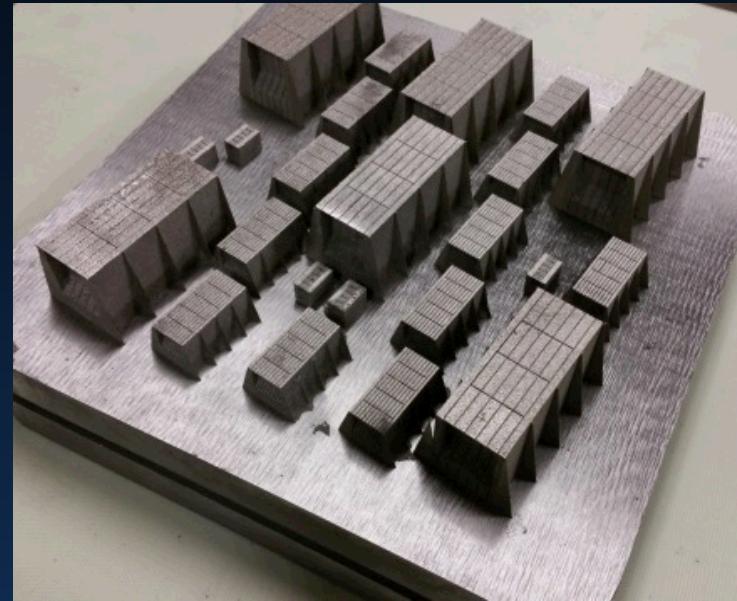


ConceptLaser Mlab



Vendor 1

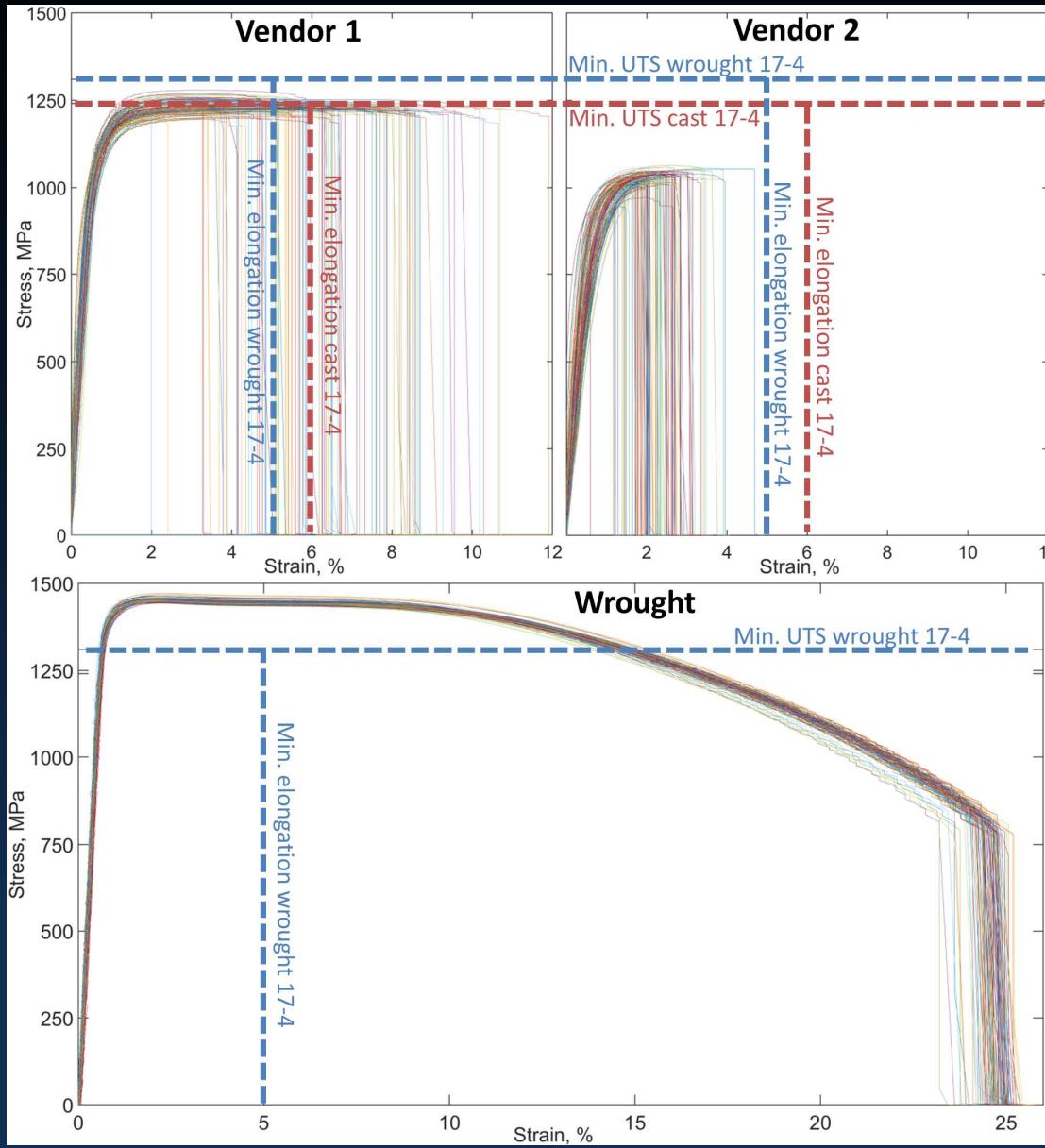
3D Systems ProX300



Vendor 2

Alloy: PH17-4 H900 (precipitation hardenable martensitic stainless steel)

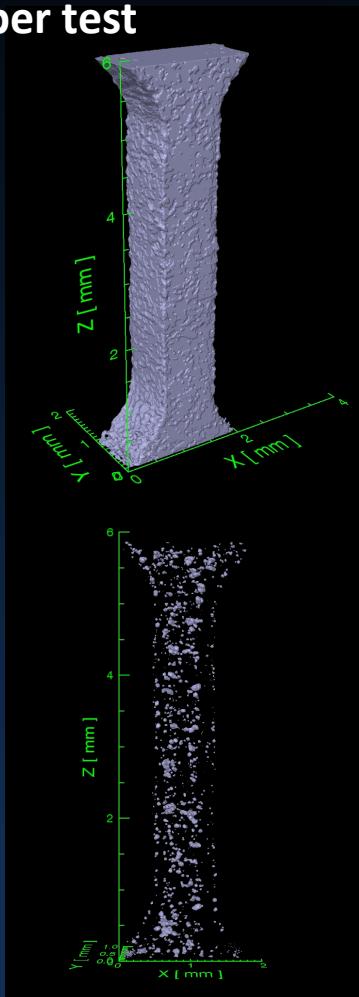
# Comparing 100 tests from 3 sources



# *Opportunities for data mining...*

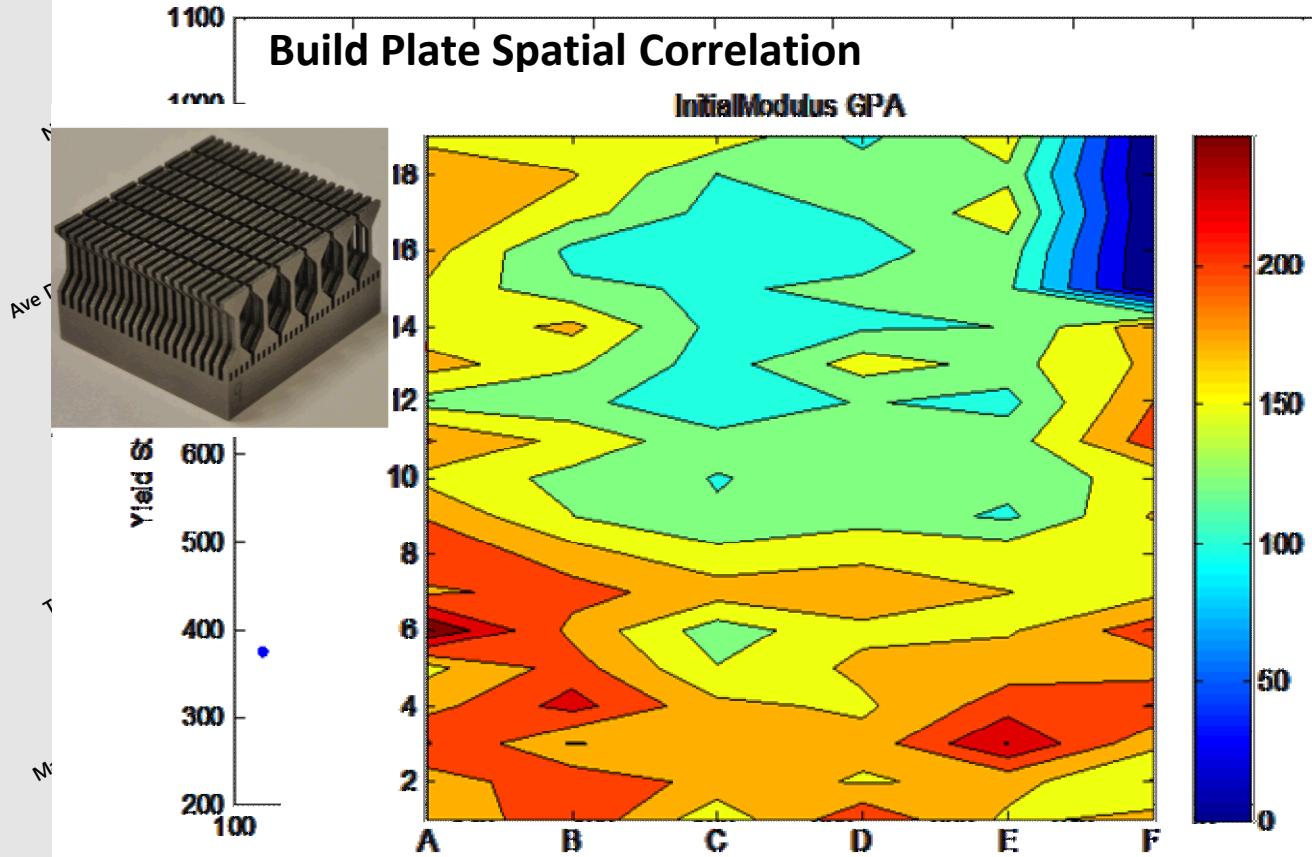


**3 GB of CT data  
per test**

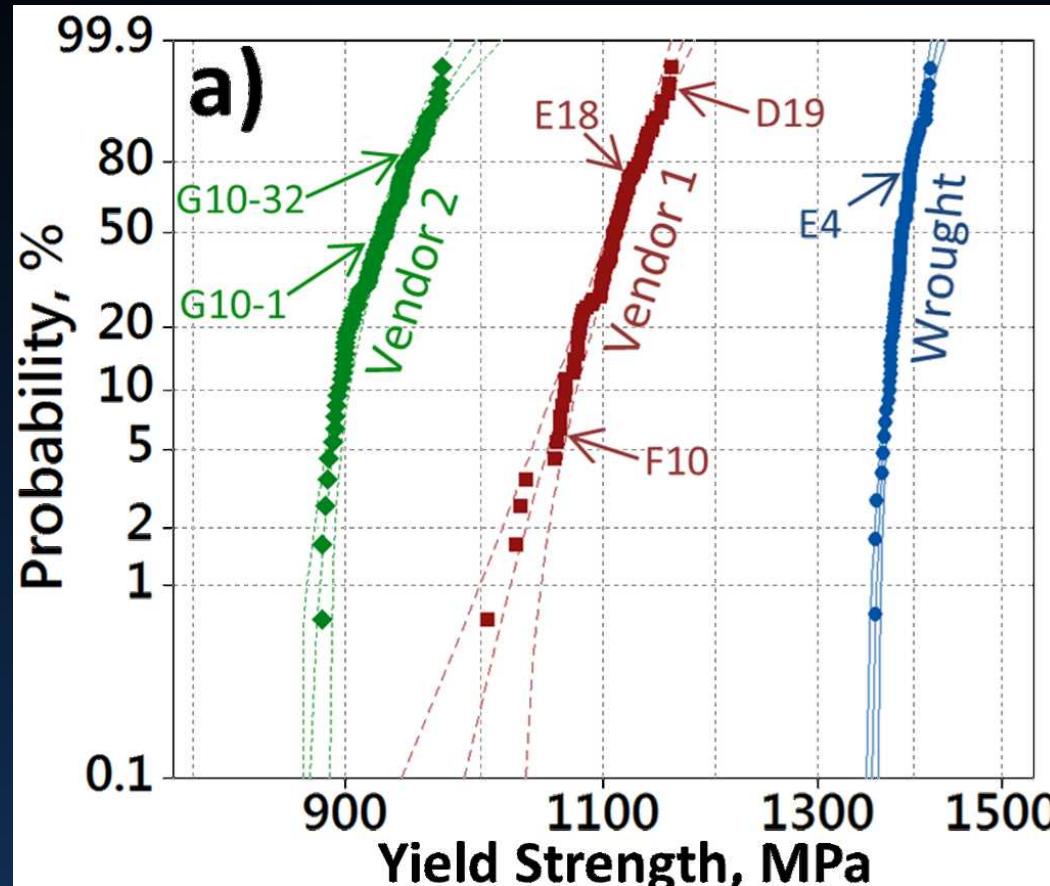


## Pairwise Correlation Analysis

# Cluster Analysis

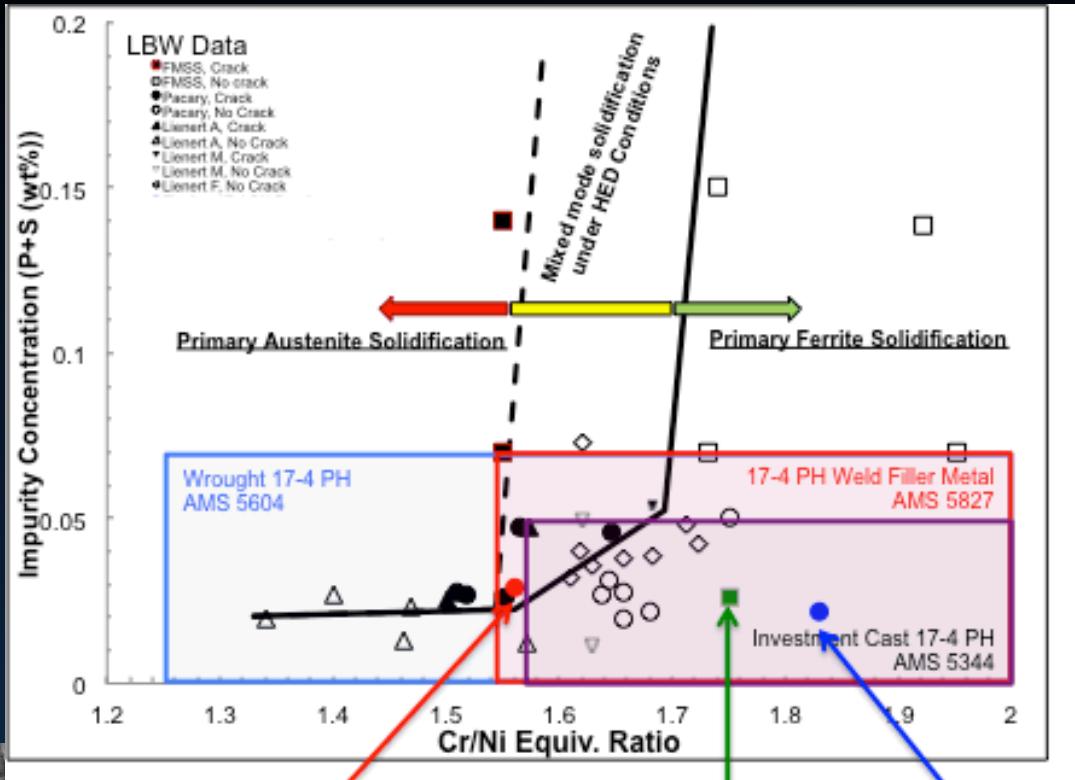


# 3-Parameter Weibull Fits to Distributions



*What is the origin of different properties???*

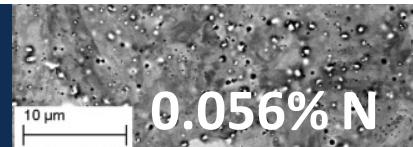
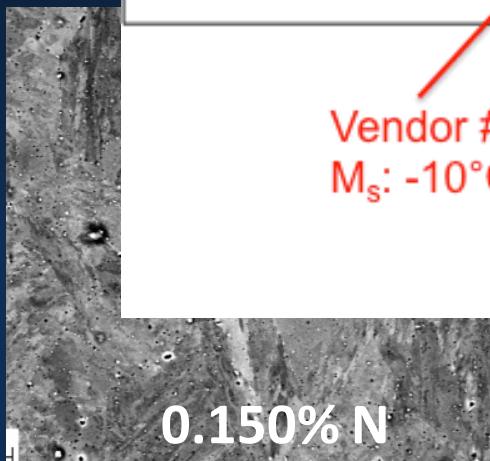
# 3-Parameter Weibull Fits to Distributions



Vendor #2  
 $M_s: -10^\circ\text{C}$

17-4 PH sheet  
 $M_s: 109^\circ\text{C}$

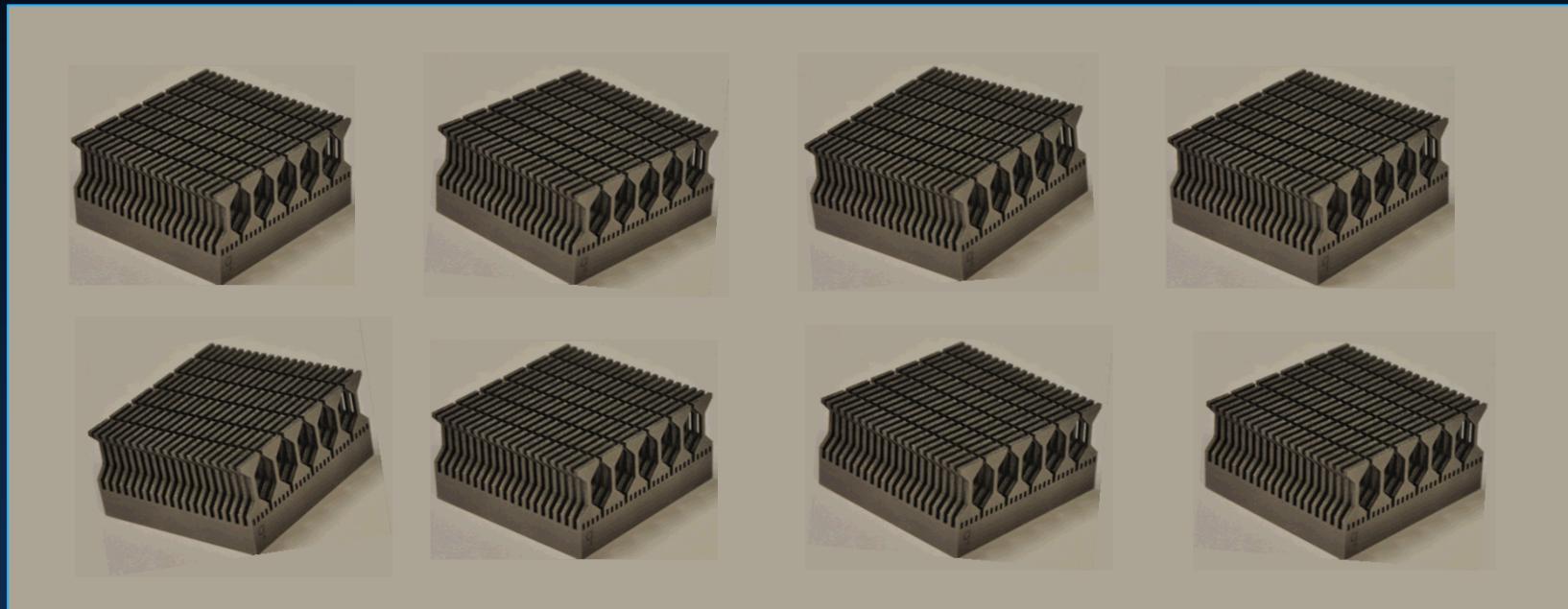
Vendor #1  
 $M_s: 100^\circ\text{C}$



Roughness complications strength determination:

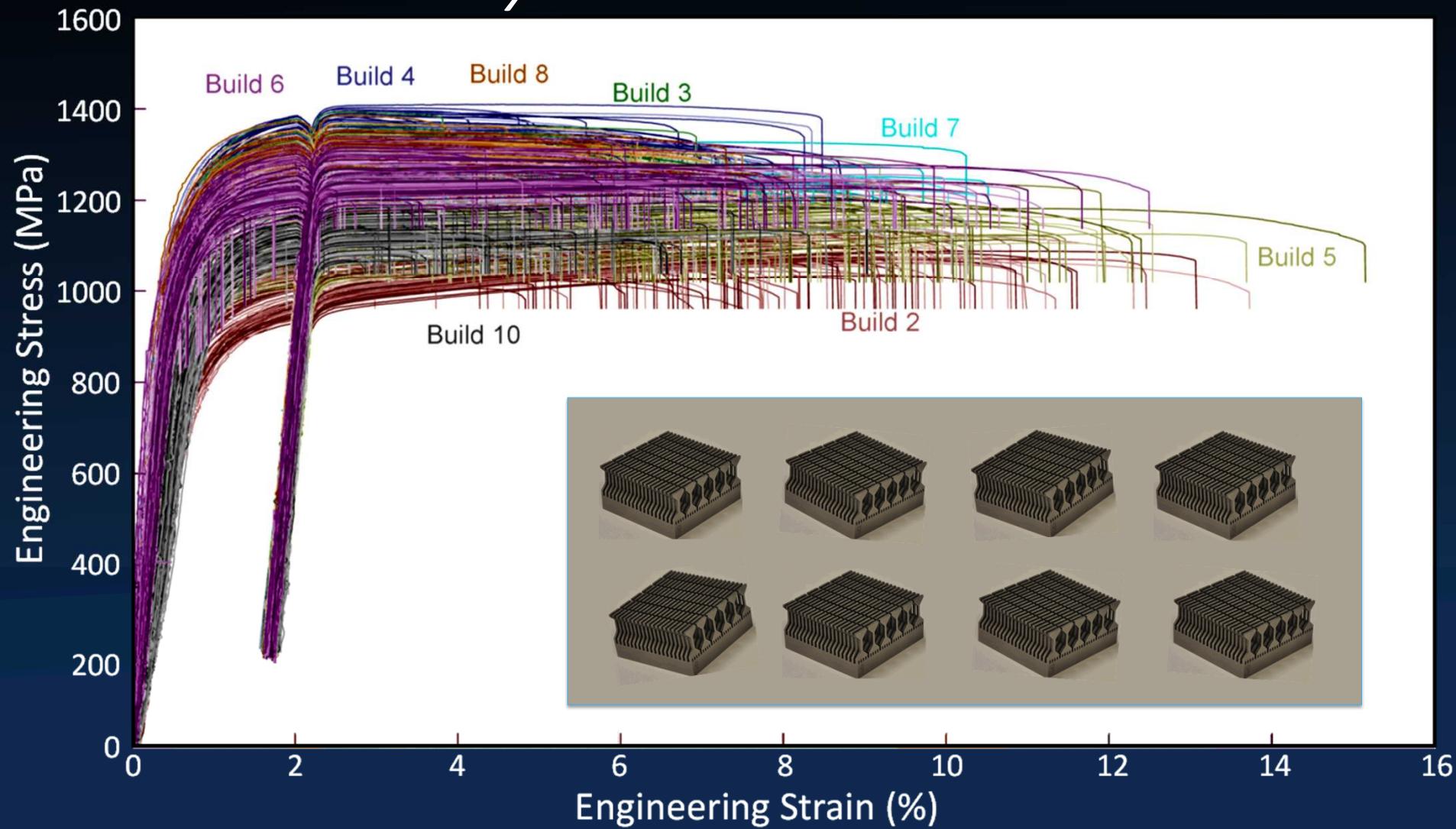
1. Caliper measurements overestimate true load-bearing area
2. Notch-like stress concentrations cause early yielding

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

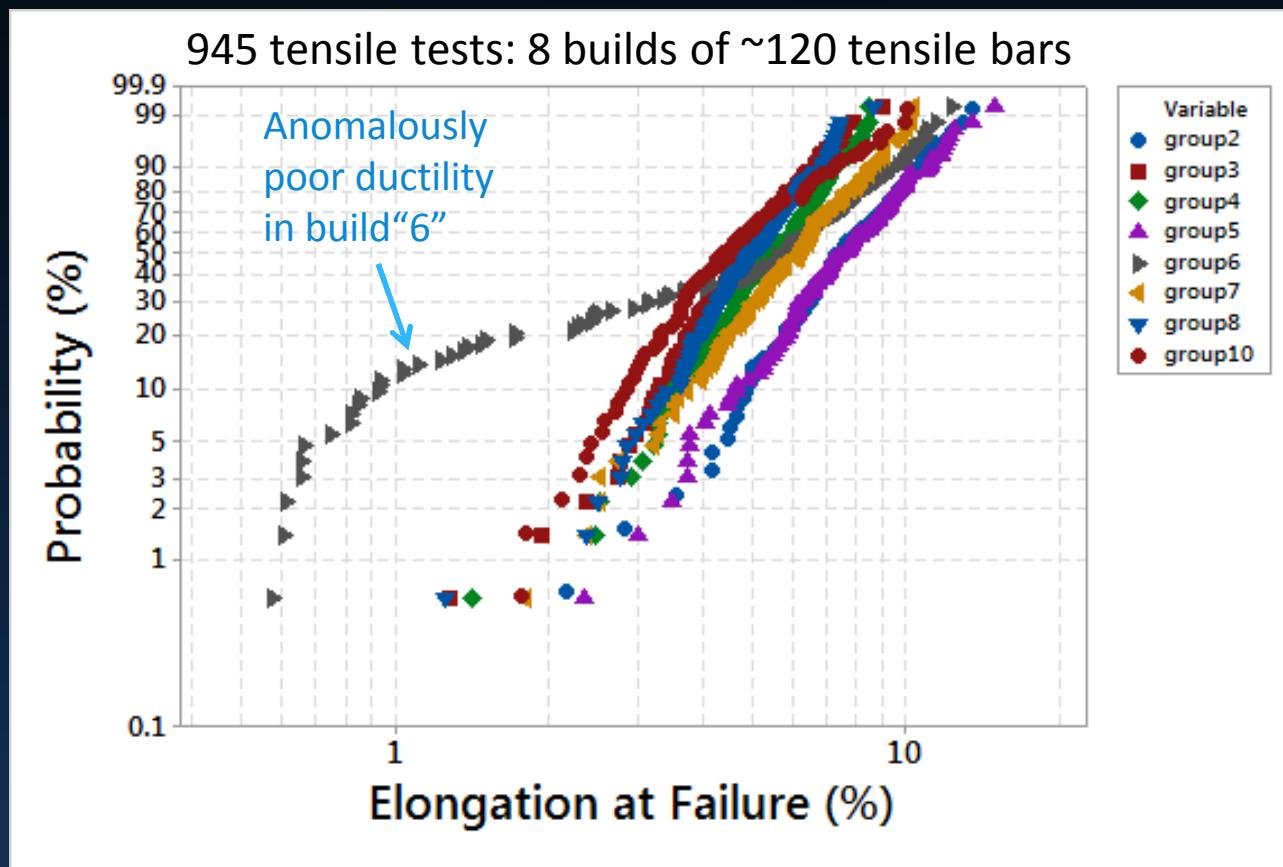


*(960 tensile bars!)*

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

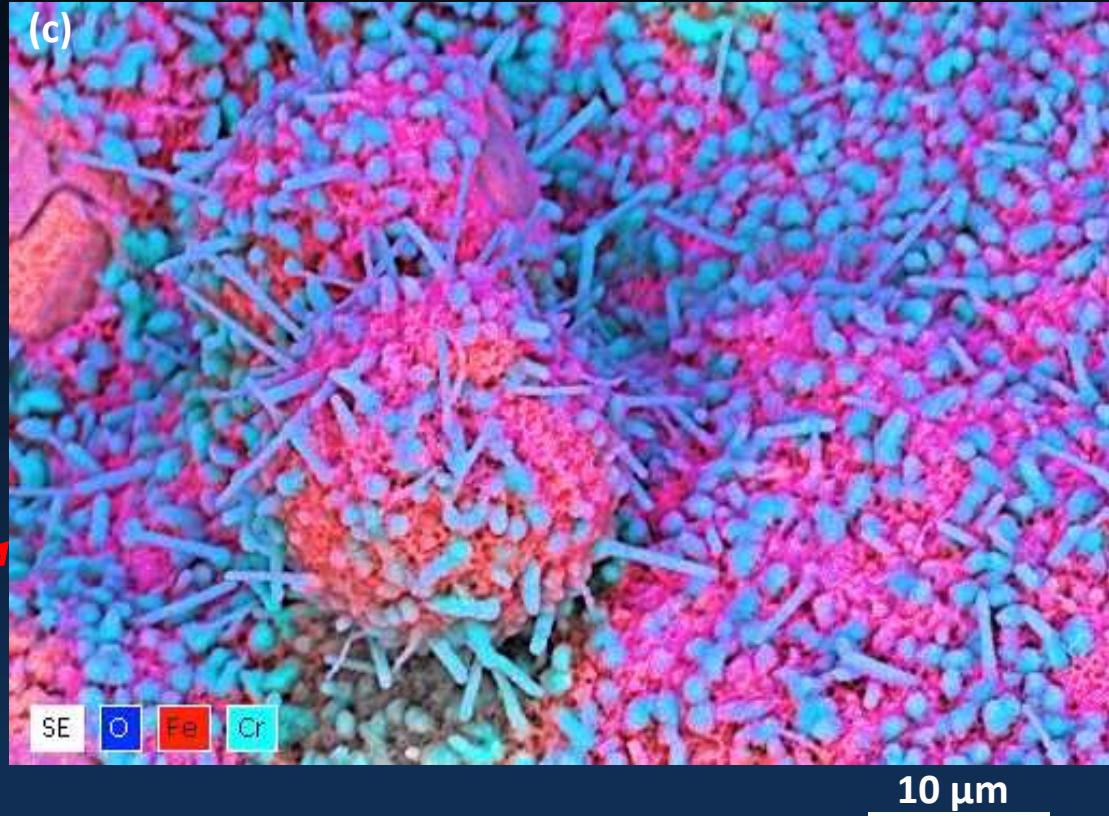
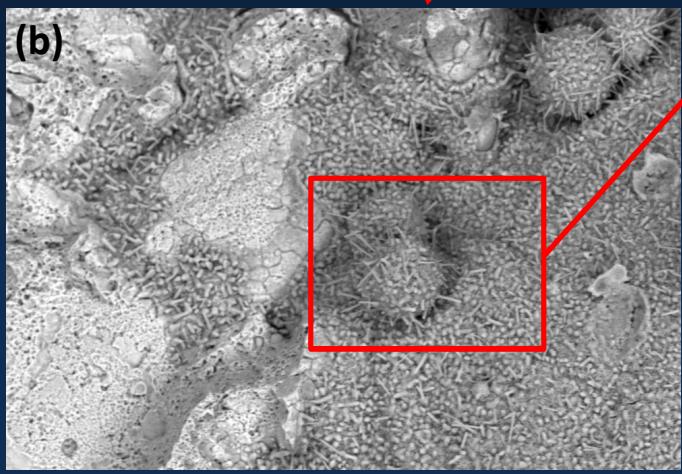
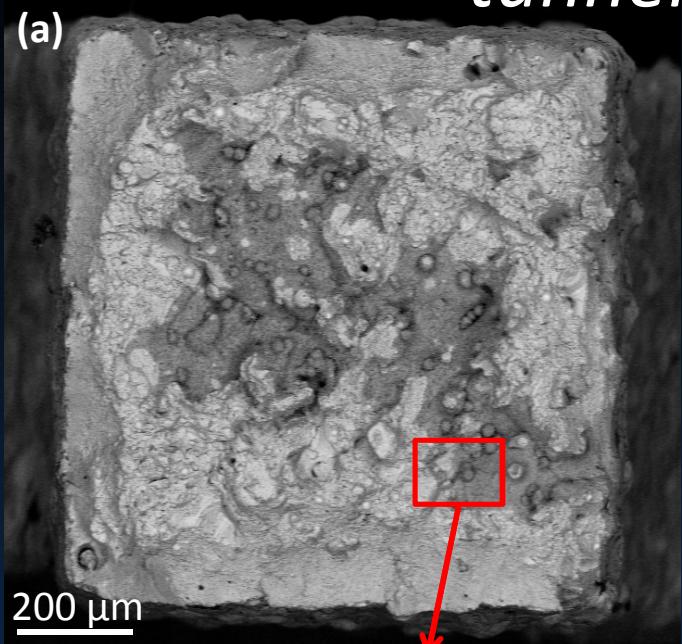


# *Distributions from 8 nominally identical cooling fins (Vendor 1)*



*Why such poor ductility in one build???*

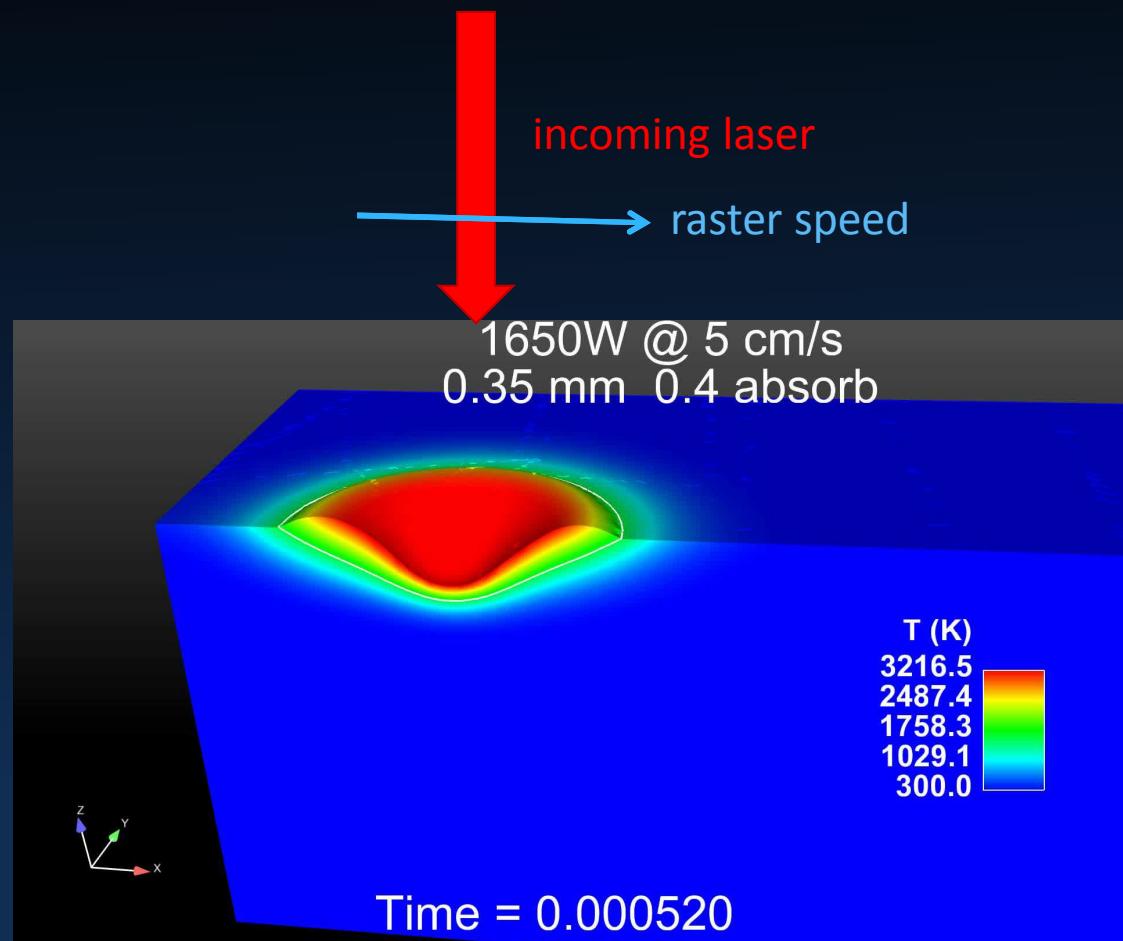
# *Anomalous 'low ductility' caused by "tunneling porosity"*



# Is modeling the path to process optimization?



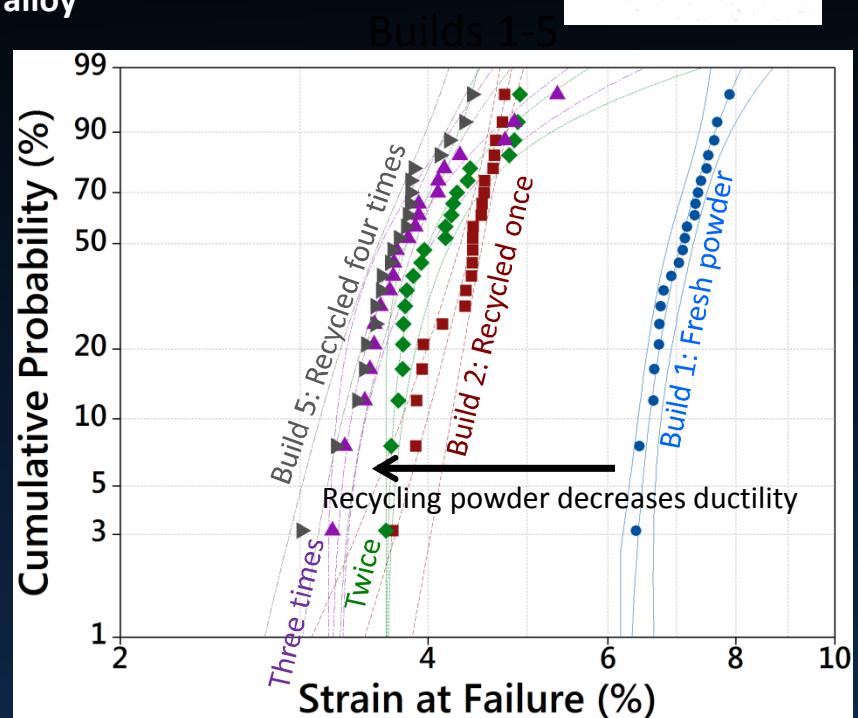
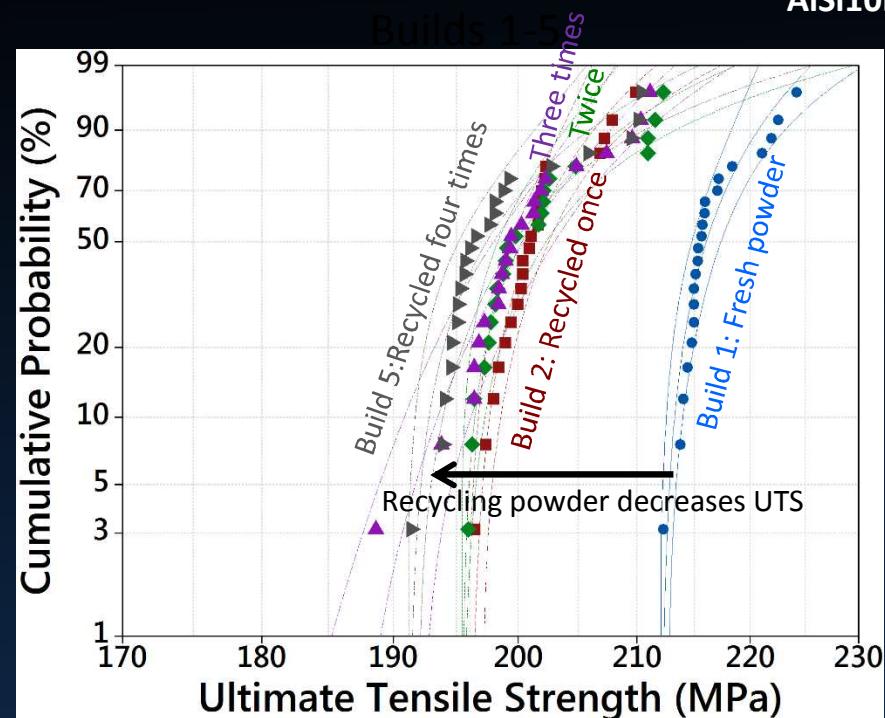
→ Understand and control the sources of flaw formation



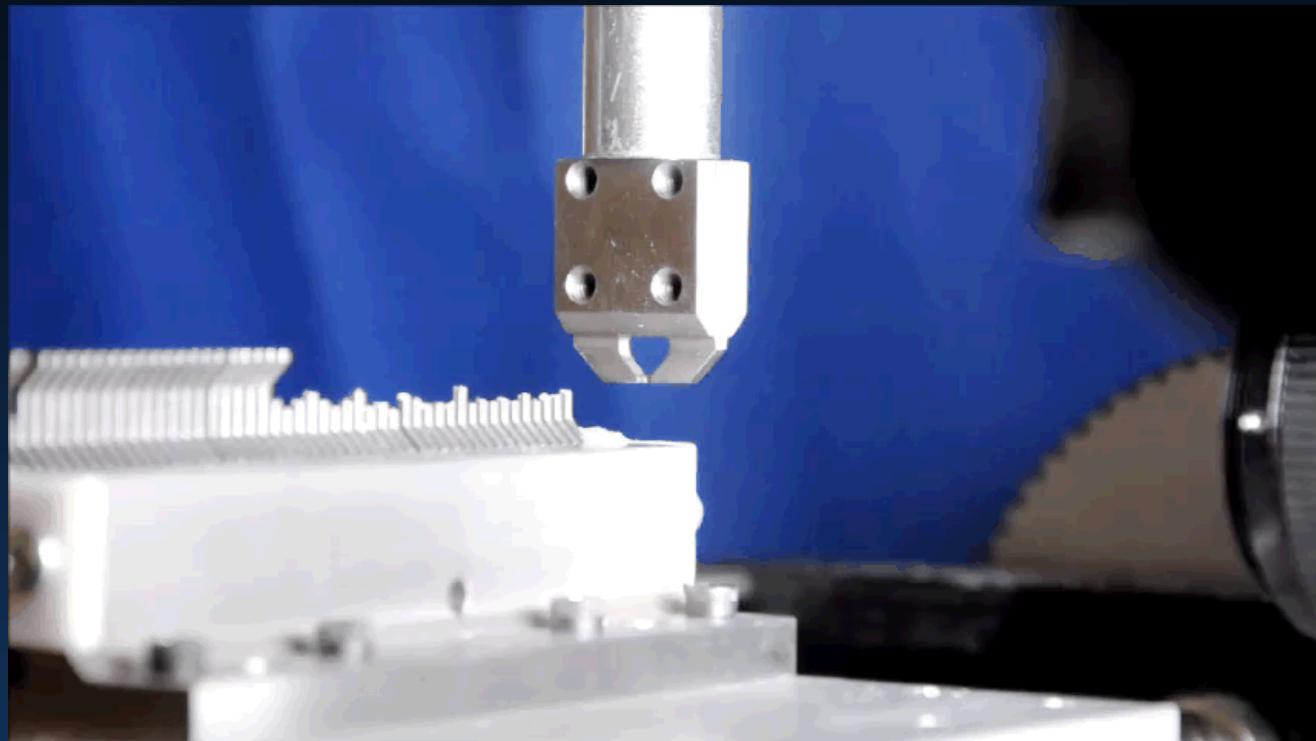
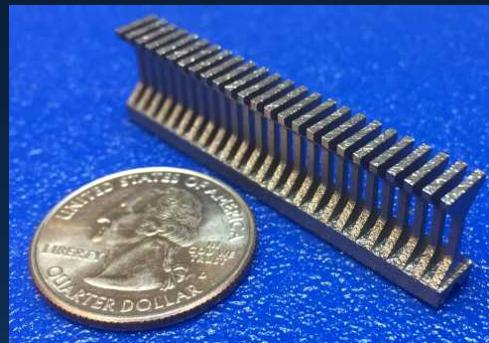
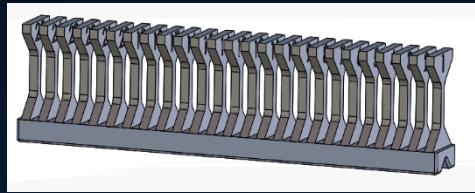
Laser/plume interactions, raytracing  
Plasma fluid mechanics  
Radiation heat transfer  
Laser energy adsorption  
Thermal expansion  
Non-equilibrium vapor pressure  
Evaporation with latent heat  
Pressure-temperature relations  
T-dependent heat capacity  
Incompressible fluid dynamics  
Convective/conductive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

# Powder recycling is clearly a concern

AlSi10Mg alloy



*Around the corner...*  
*Inspired by Bob Odette et al. @ UCSB:*



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

# *Opportunities for collaboration...*



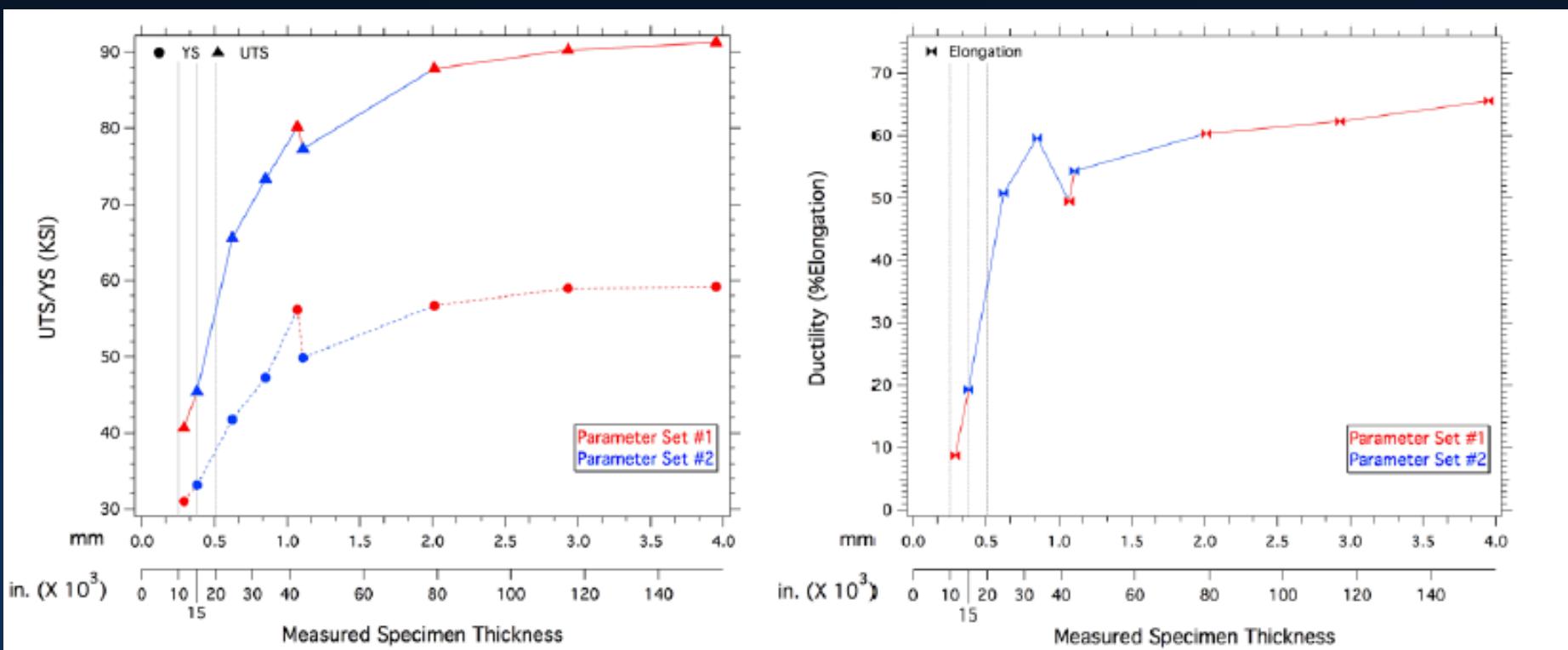
- Combinatorial process variation followed by high-throughput testing for rapid process optimization.
- In-process monitoring followed by high-throughput testing to develop correlations for process anomaly detection.
- Combining rapid property measurements with high-throughput microstructural characterization



Stay tuned...



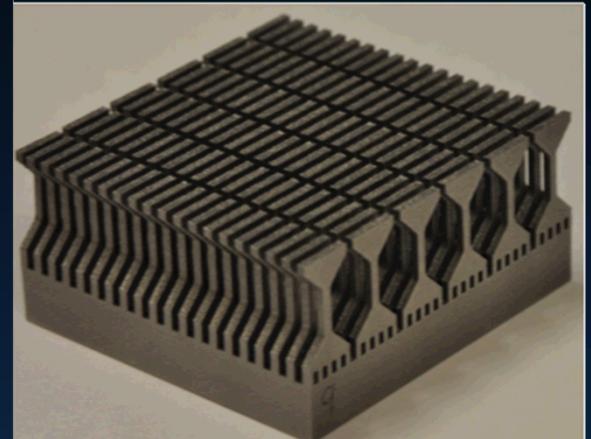
# *Size scale effects: separating intrinsic material properties from extrinsic structural dimensions*



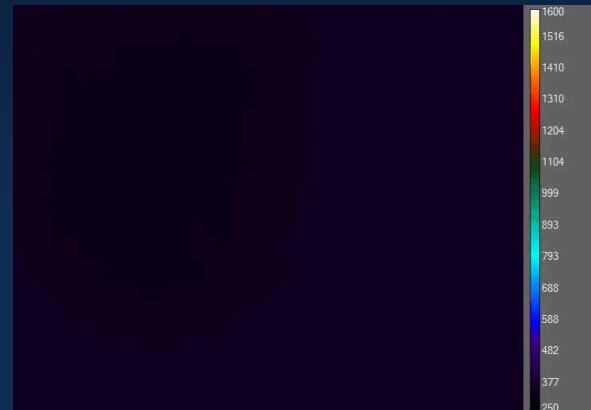
# Summary...



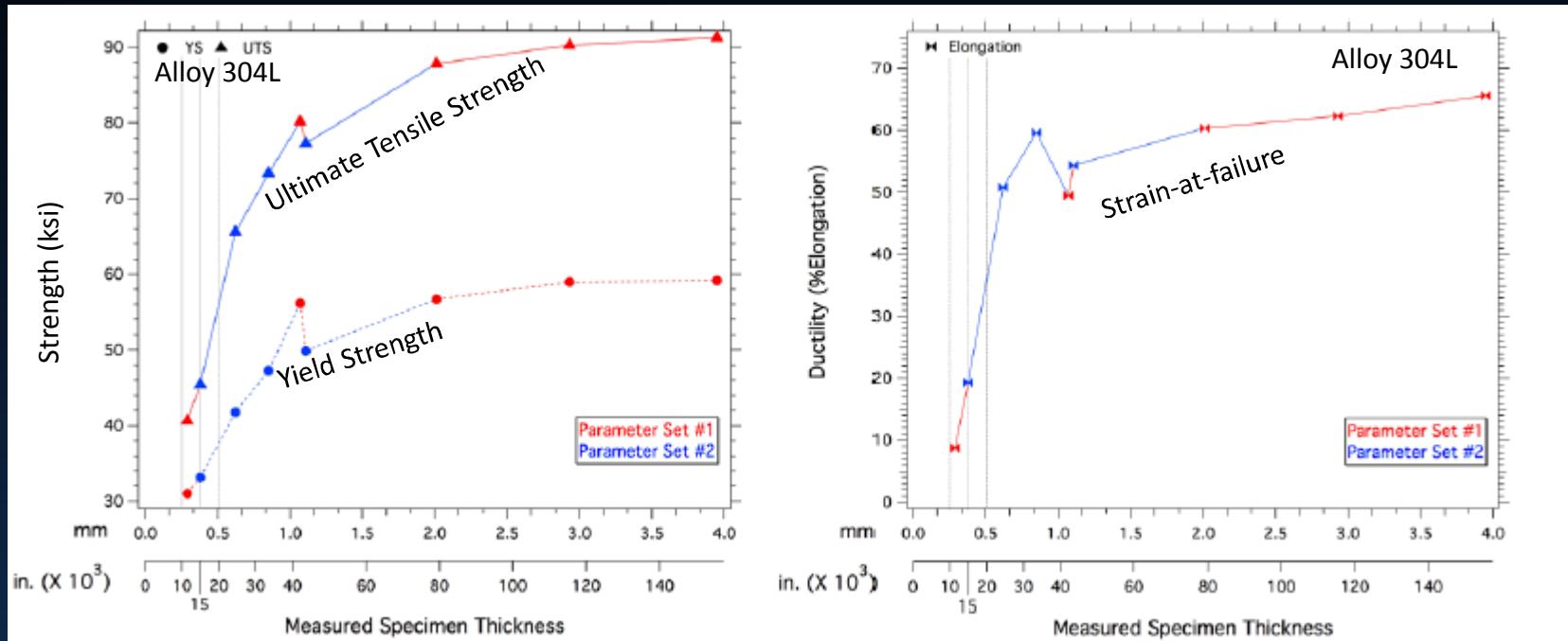
High-throughput measurements of additively manufactured materials provides a rapid method for screening performance anomalies and diagnosing sources of poor reliability.



Eventually, we would like to screen using in-process monitoring/control. Rapid materials characterization will enable the development of needed process-structure-property correlations.

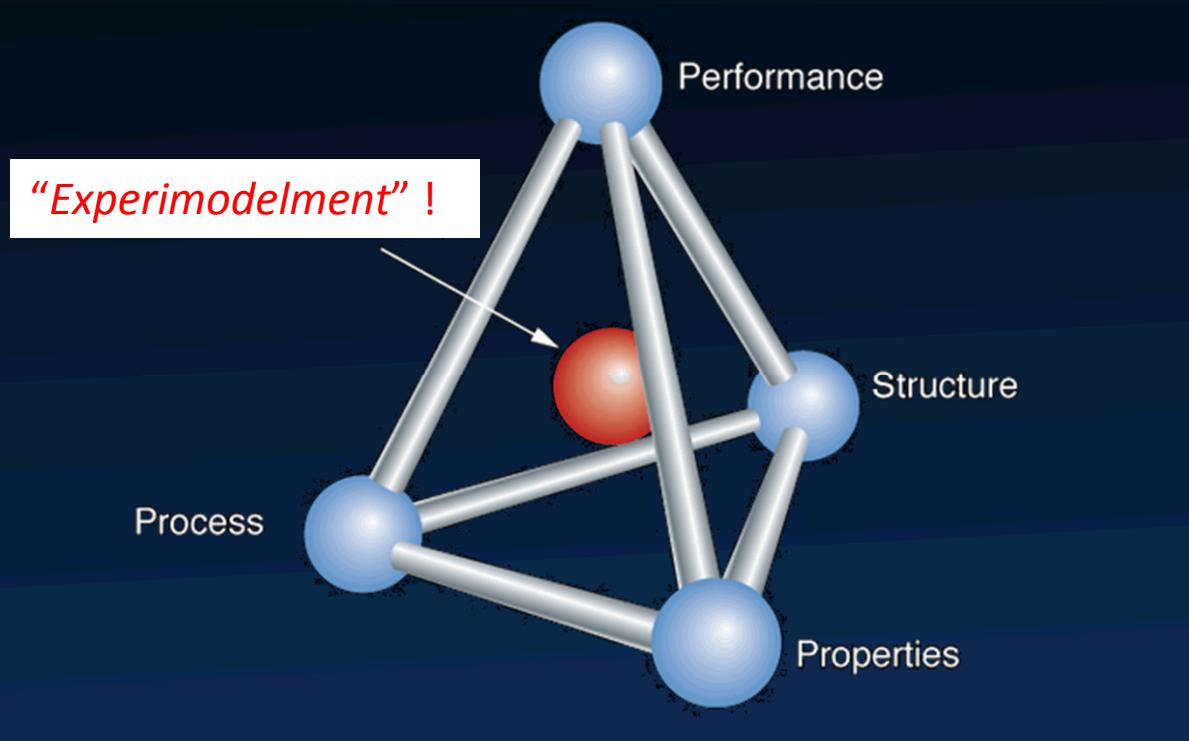


# Future work...

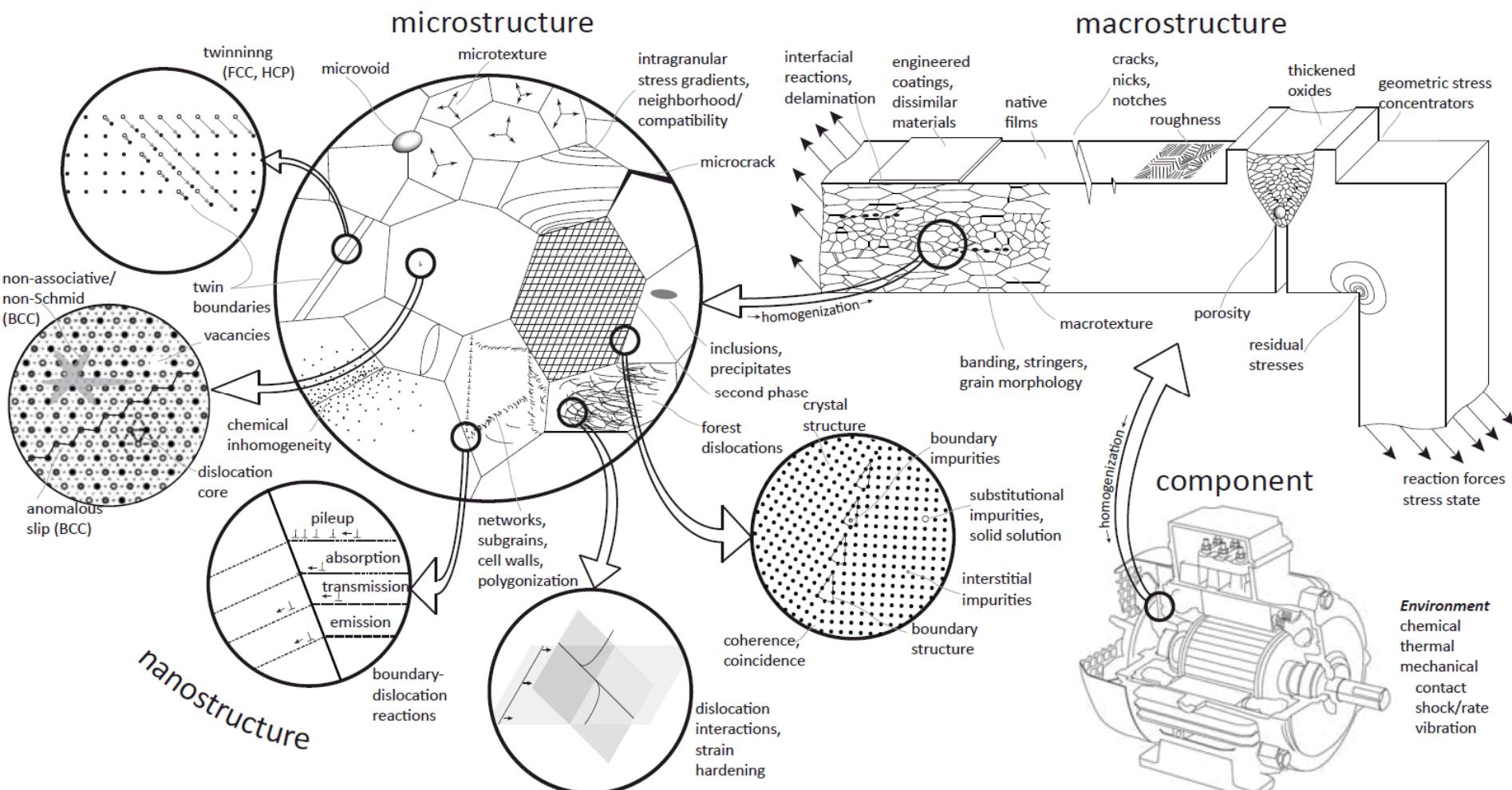


How does sample thickness affect defect populations and resulting property distributions?

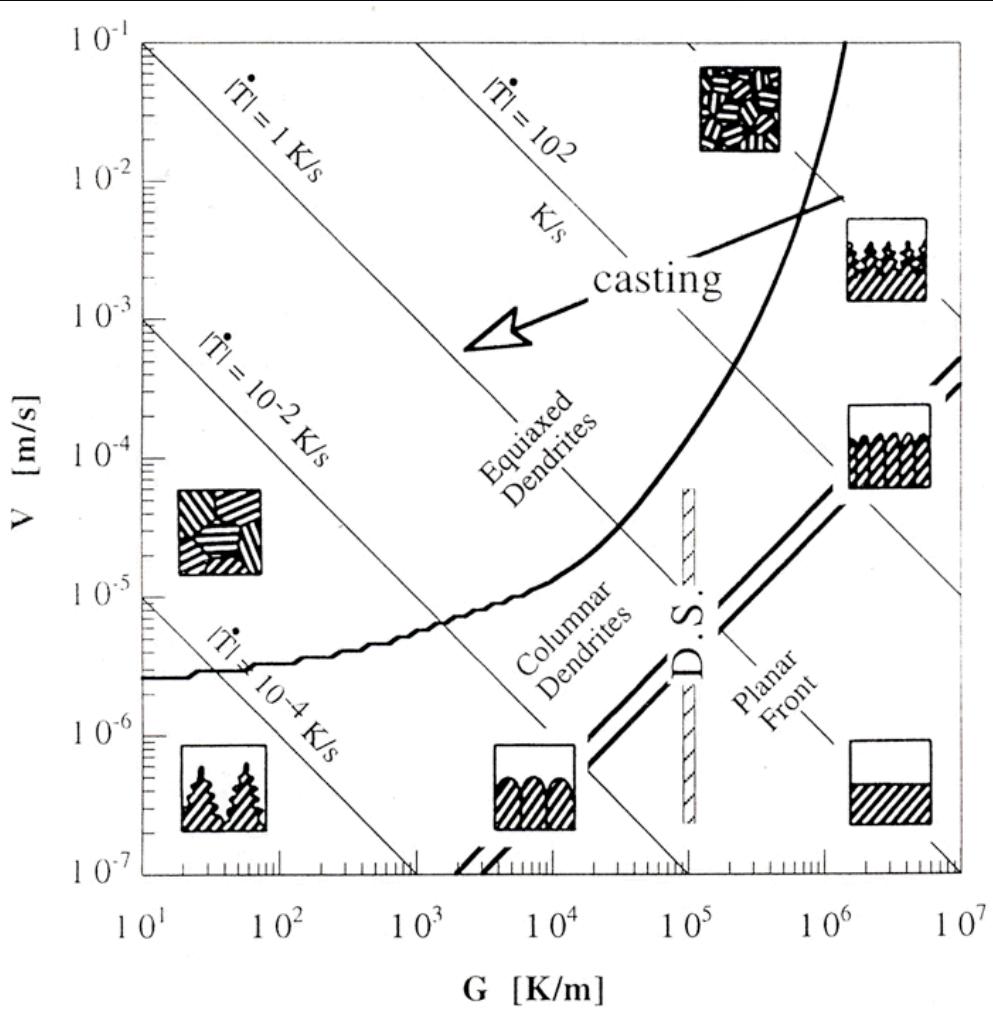
# *What is the origin of different properties?*



# What is the origin of different properties?



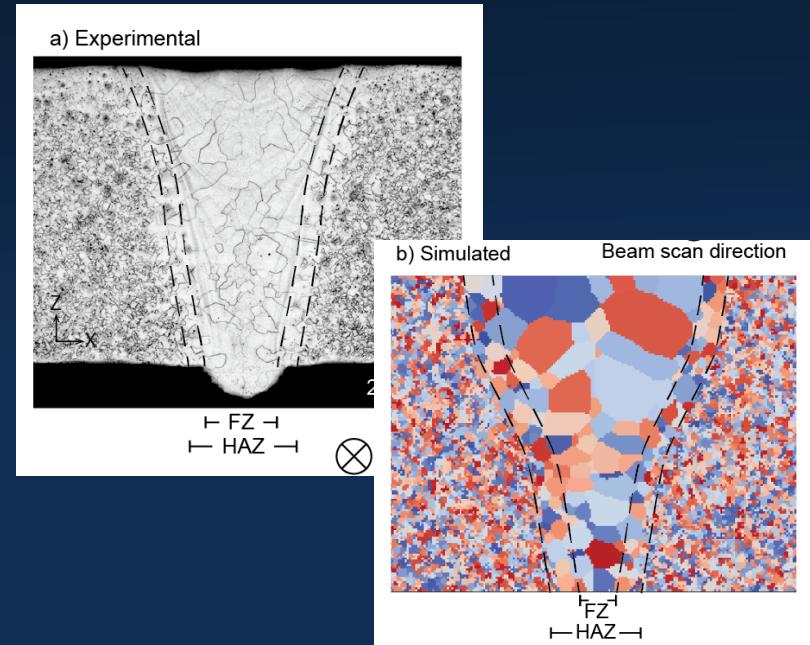
# Ultimate goal: Predict solidification microstructure



Potts Kinetic Monte Carlo

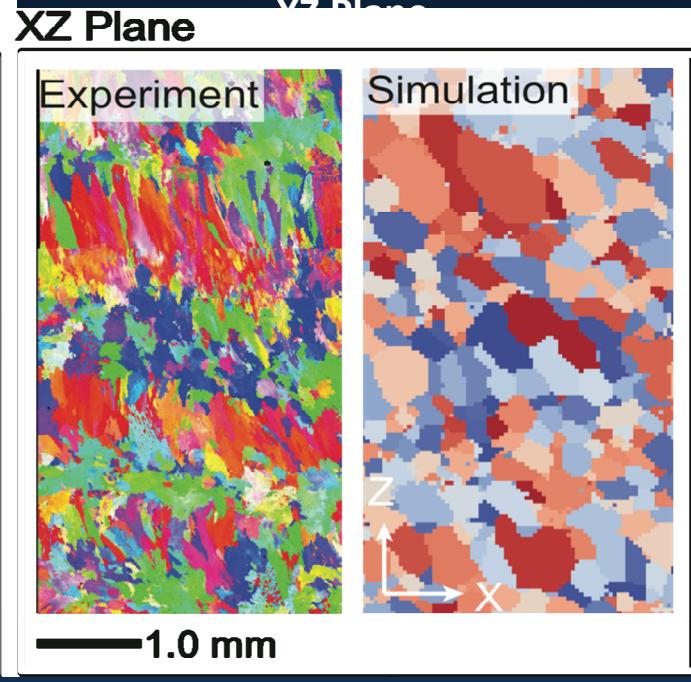
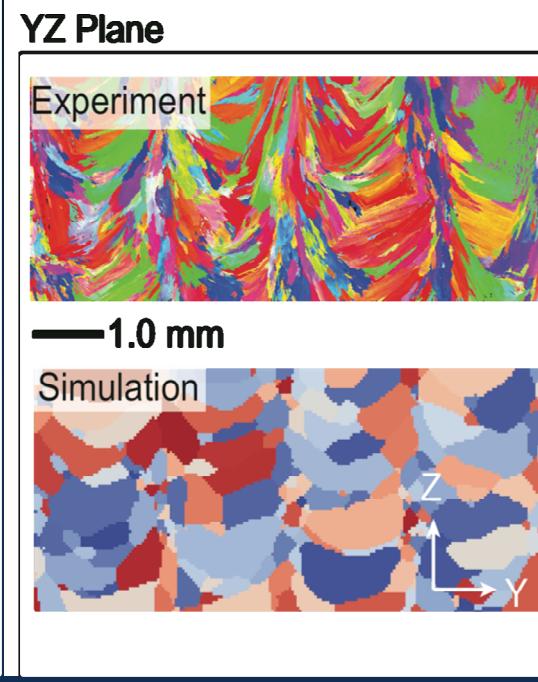
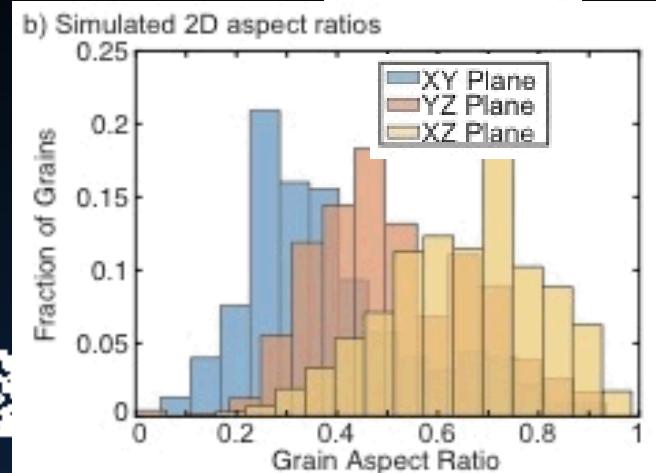
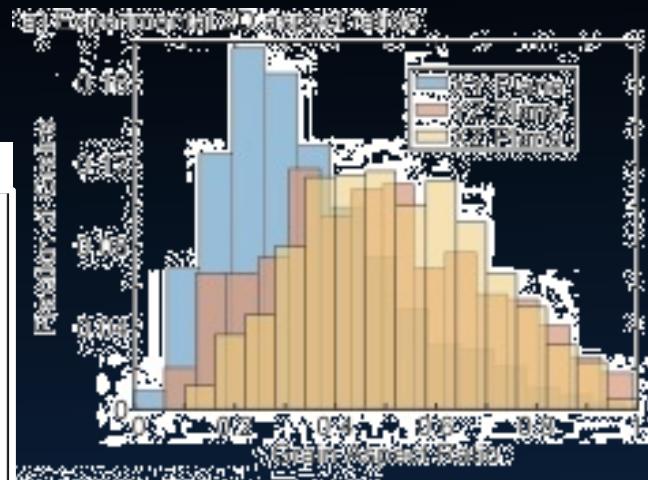
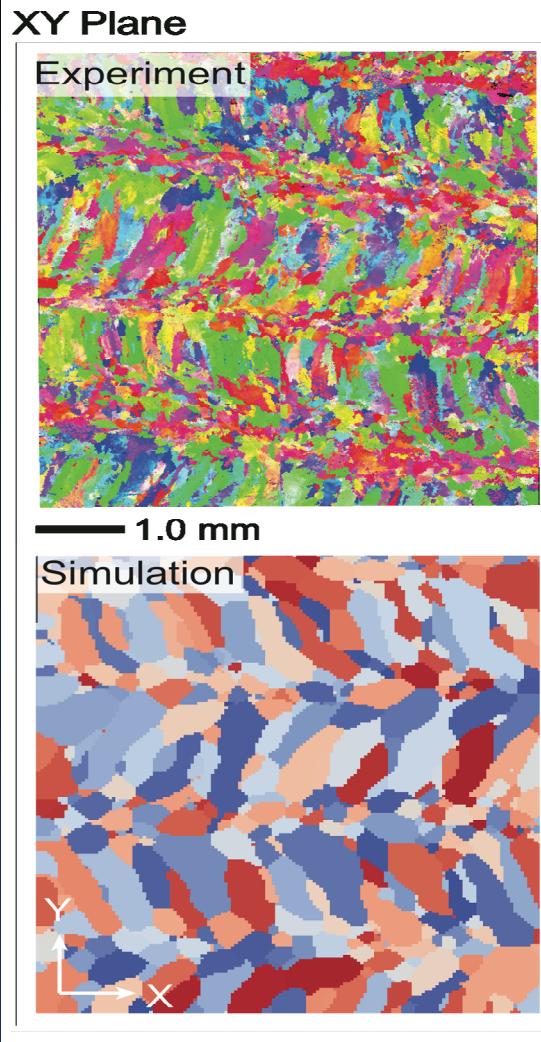
$$P = \begin{cases} \exp\left(\frac{-\Delta E}{k_B T_S}\right) & \text{if } \Delta E > 0 \\ 1 & \text{if } \Delta E \leq 0 \end{cases}$$

$$E = \frac{1}{2} \sum_{i=1}^N \sum_{j=1}^{26} (1 - \delta(q_i, q_j))$$



# Capturing complex solidification microstructure

3.8 kW EBSD results



# Properties 'Alinstante'

## An Aspirational Goal:

Can we reduce materials science evaluation  
from months to hours?

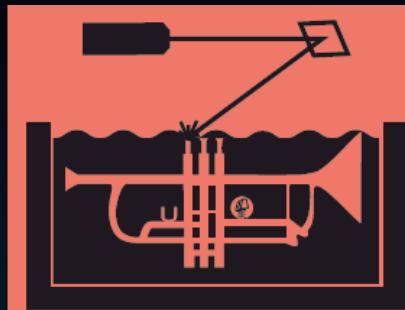
(design-build-test loop in a day?)



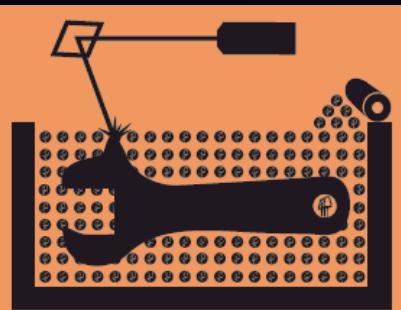
- Geometric metrology probe
- Surface roughness probe
- Mechanical properties probe
- Compositional probe
- Phase probe
- Thermal probe
- Electrical probe
- Tribology probe
- Resonance probe
- ...



# 8 Families of AM Processes (ASTM F2794)



**VAT PHOTOPOLYMERIZATION**



**POWDER BED FUSION (PBF)**



**BINDER JETTING**



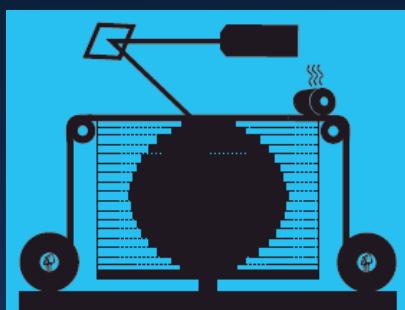
**MATERIAL JETTING**

**Alternative Names:**  
SLA™ - Stereolithography Apparatus  
DLP™ - Digital Light Processing  
3SP™ - Scan, Spin, and Selectively Photocure  
CLIP™ - Continuous Liquid Interface Production

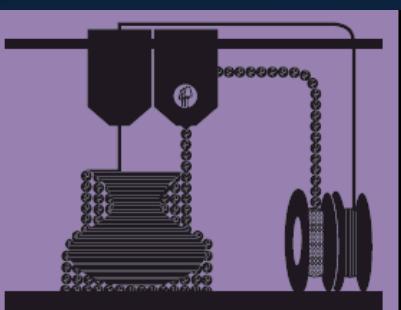
**Alternative Names:**  
SLS™ - Selective Laser Sintering; DMLS™ - Direct Metal Laser Sintering; SLM™ - Selective Laser Melting; EBM™ - Electron Beam Melting; SHS™ - Selective Heat Sintering;

**Alternative Names:**  
3DP™ - 3D Printing  
ExOne  
Voxeljet

**Alternative Names:**  
Polyjet™  
SCP™ - Smooth Curvatures Printing  
MJM - Multi-Jet Modeling  
Projet™



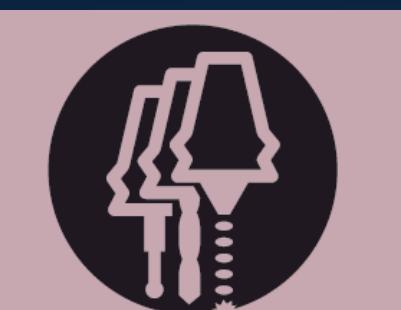
**SHEET LAMINATION**



**MATERIAL EXTRUSION**



**DIRECTED ENERGY DEPOSITION (DED)**



**HYBRID**

**Alternative Names:**  
LOM - Laminated Object Manufacture  
SDL - Selective Deposition Lamination  
UAM - Ultrasonic Additive Manufacturing

**Alternative Names:**  
FFF - Fused Filament Fabrication  
FDM™ - Fused Deposition Modeling

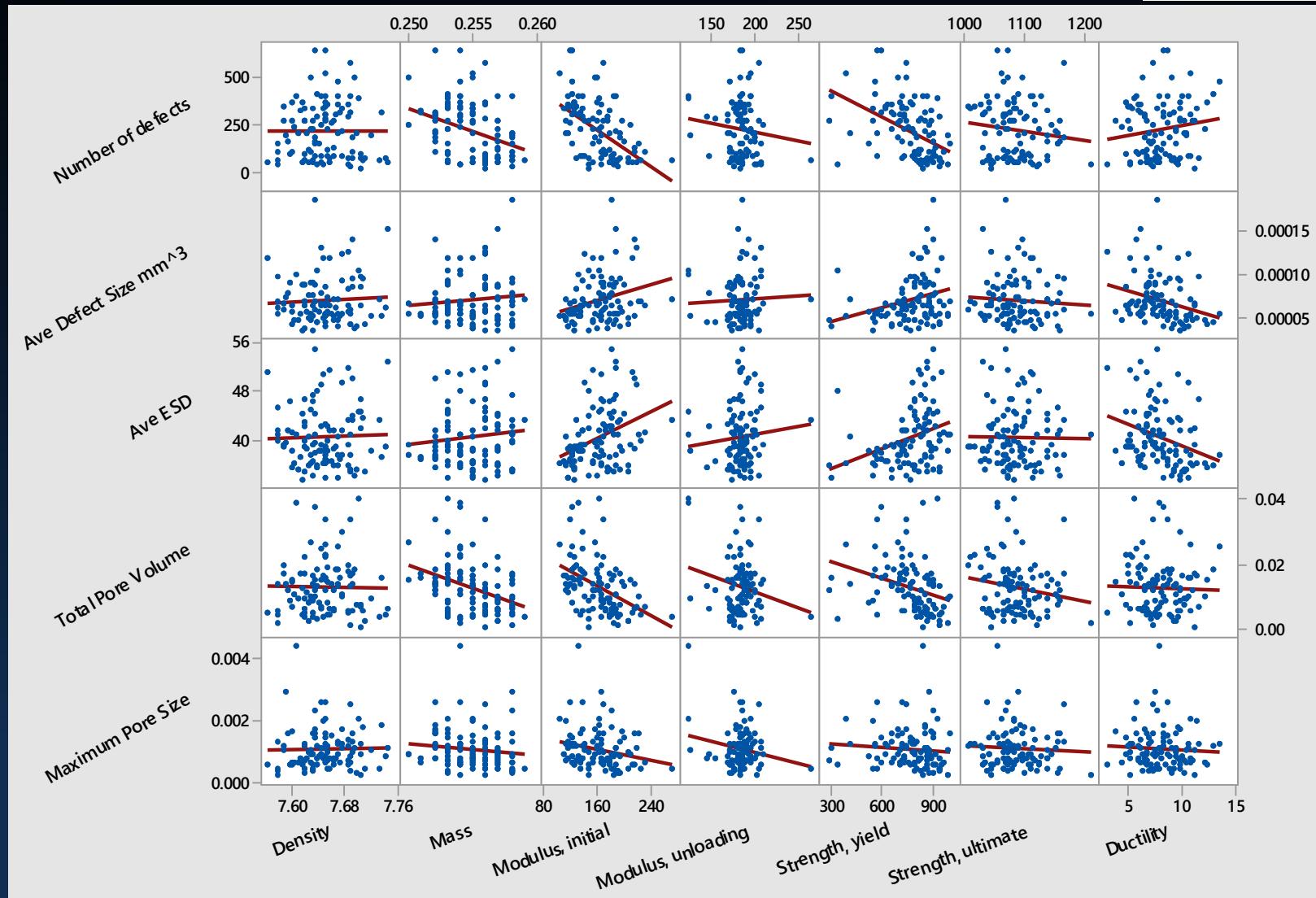
**Alternative Names:**  
LMD - Laser Metal Deposition  
LENS™ - Laser Engineered Net Shaping  
DMD™ - Direct Metal Deposition

**Alternative Names:**  
AMBIT™ - Created by Hybrid Manufacturing Technologies

# Pairwise Correlations are Unconvincing



## Porosity Metrics



## Properties

*Cluster analysis seems promising*

