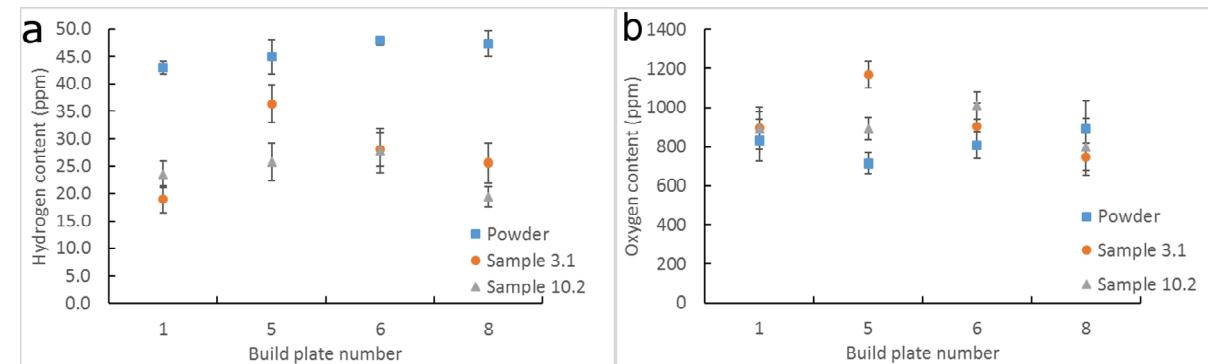
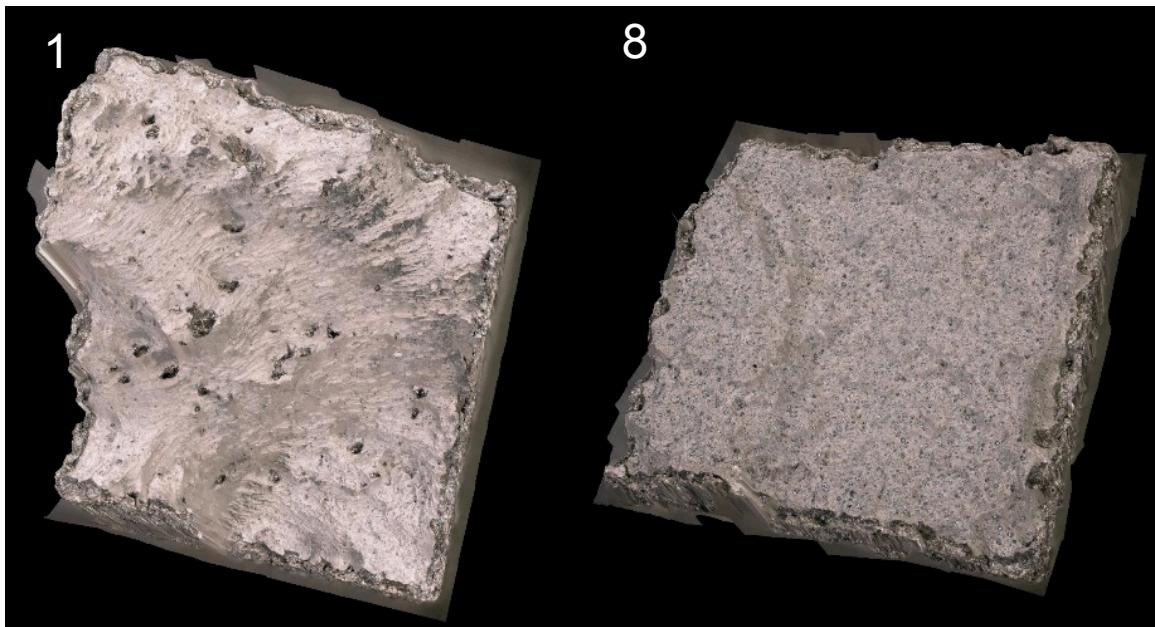
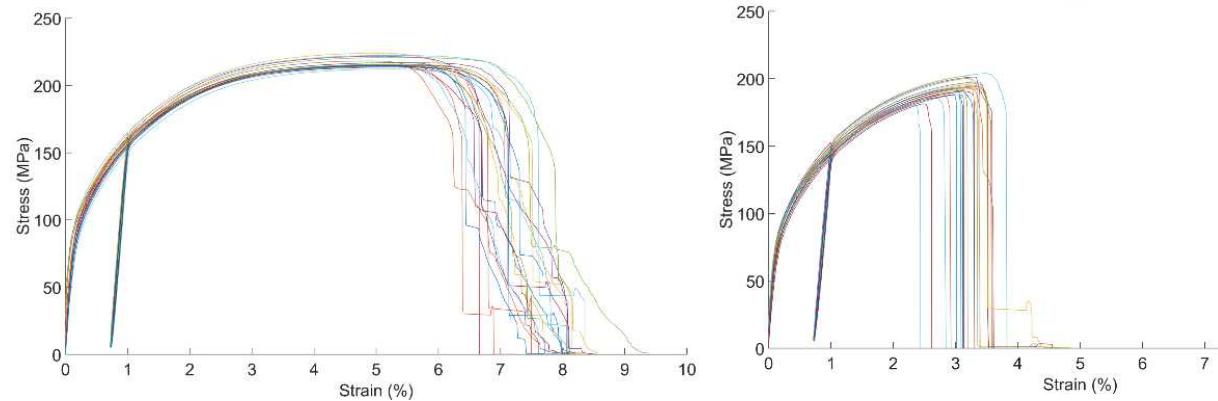
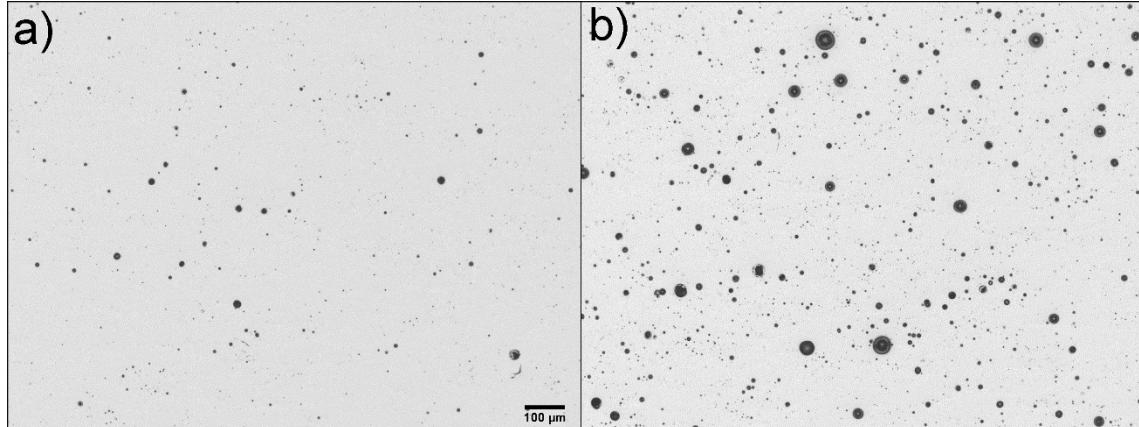


Statistical analysis of correlation between part and test sample properties

Lisa Deibler, Jay Carroll, Daniel Campbell, Heather Boldt, Clint Holtey

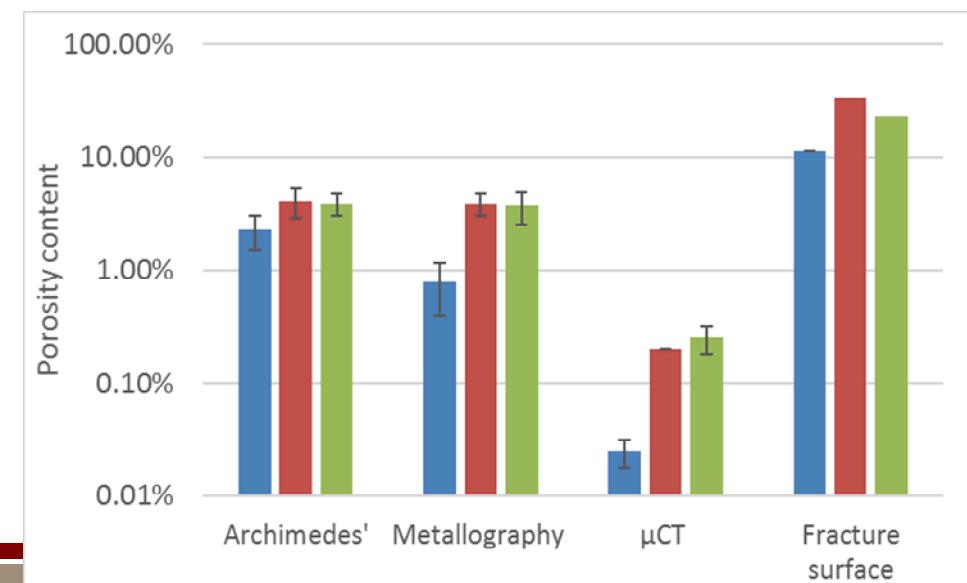
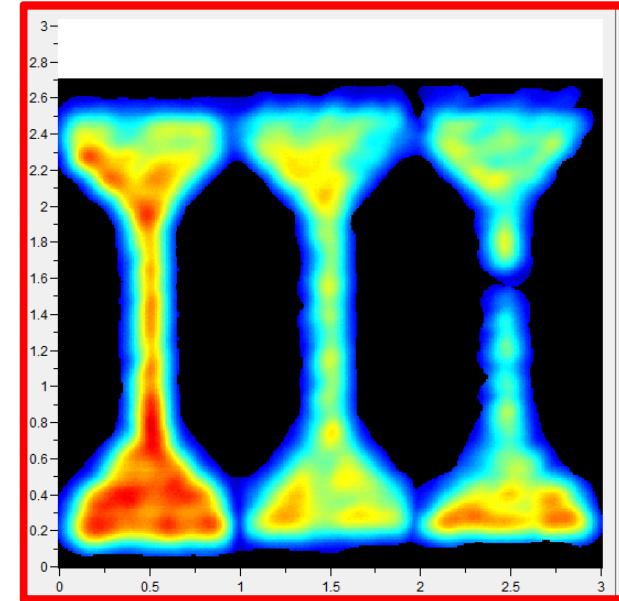
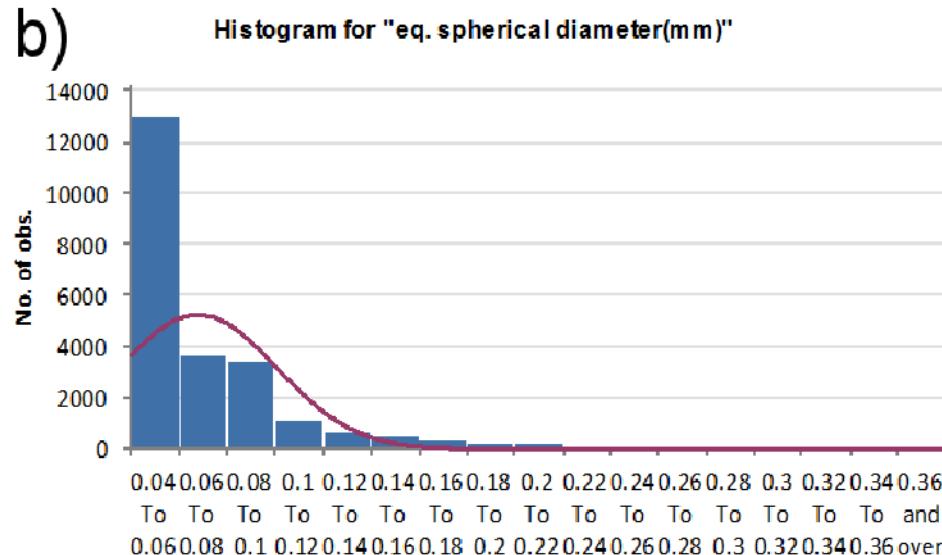
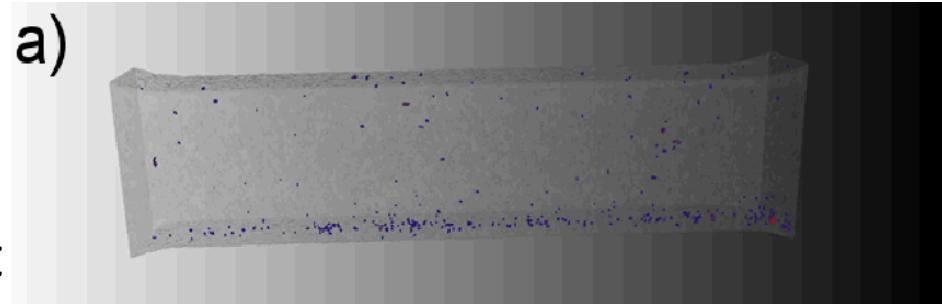
AM for high consequence parts

- How to ensure that AM parts are good? Characterization!



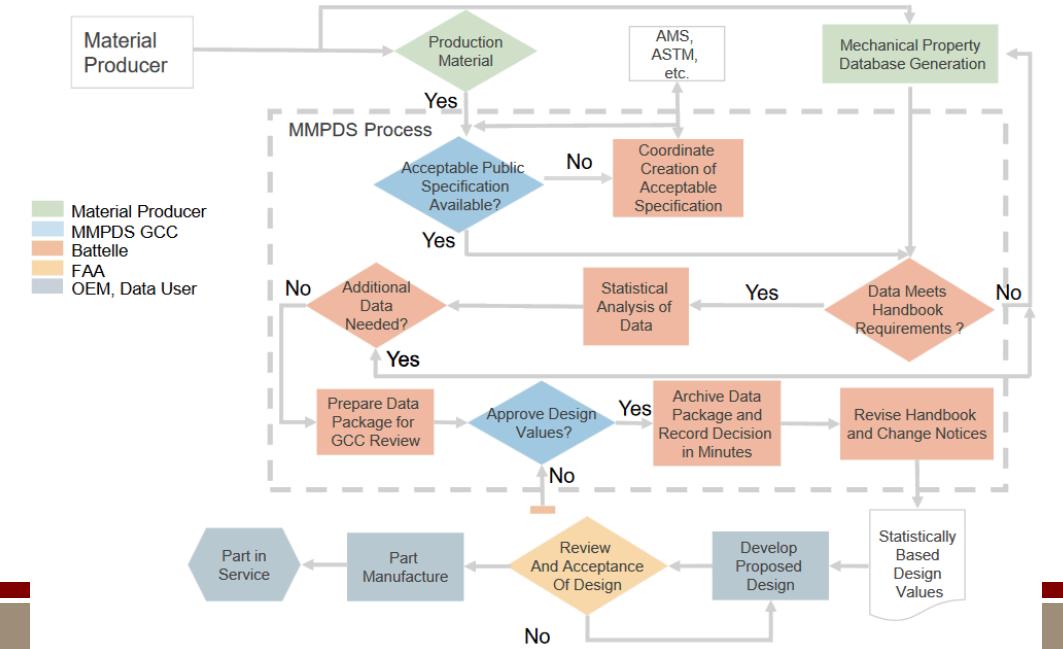
Non-destructive technology

- μ CT
- Ultrasound
- Eddy Current
- Density



“Traditional” statistics based analysis

- Military Handbook 5/ Metallic Material Properties Development and Standardization Handbook (MMPDS)
- S-Basis – specification minimum
 - 3 heats, 30 tests
- B-Basis – 90% of population equals or exceeds with a confidence of 95%
 - 10 heats/10 lots, 100 tests minimum
- A-Basis – 99% of the population equals or exceeds with a confidence of 95%
 - 3 heats/10 lots, 100 tests minimum

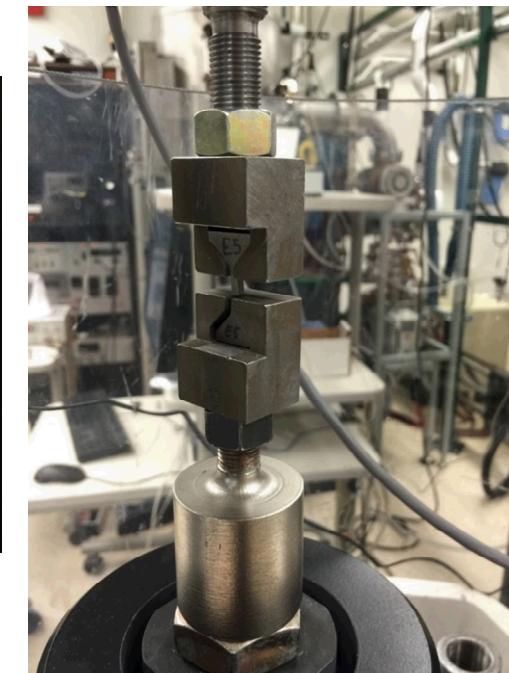
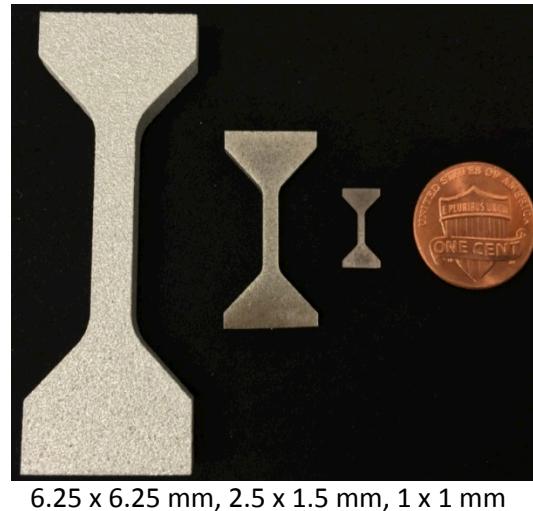


Test data types

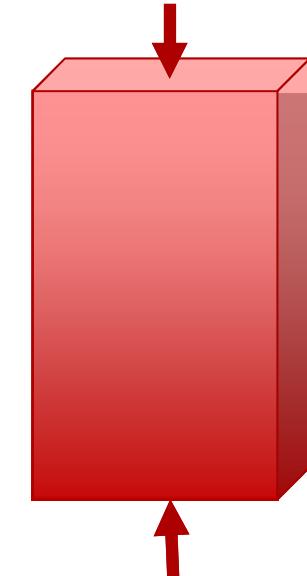
Charpy impact



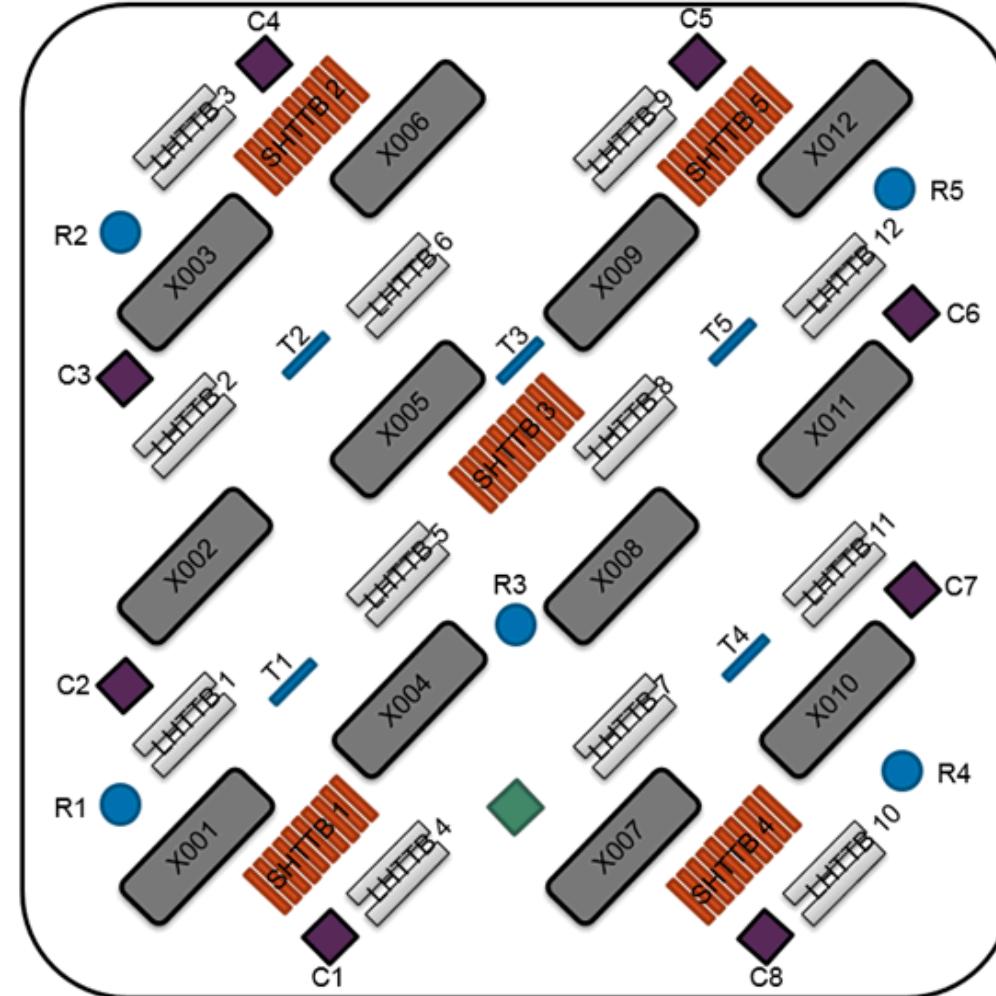
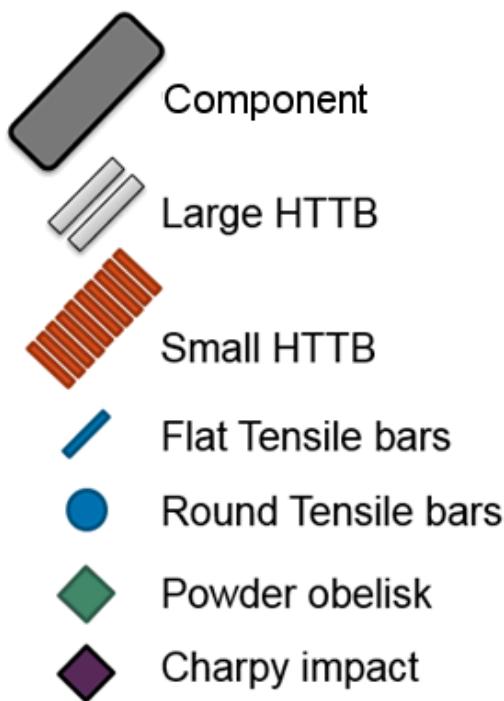
High throughput tensile – large and medium bars



Component tests



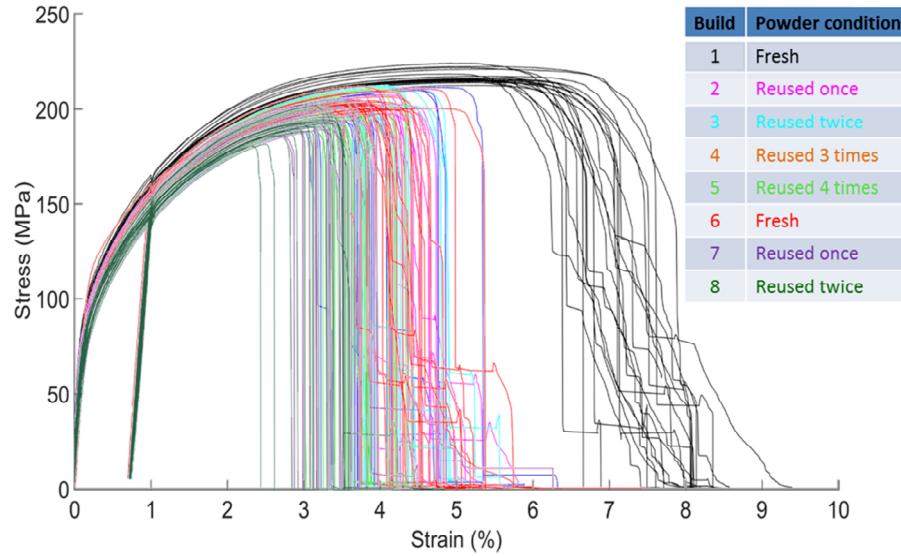
Build layout



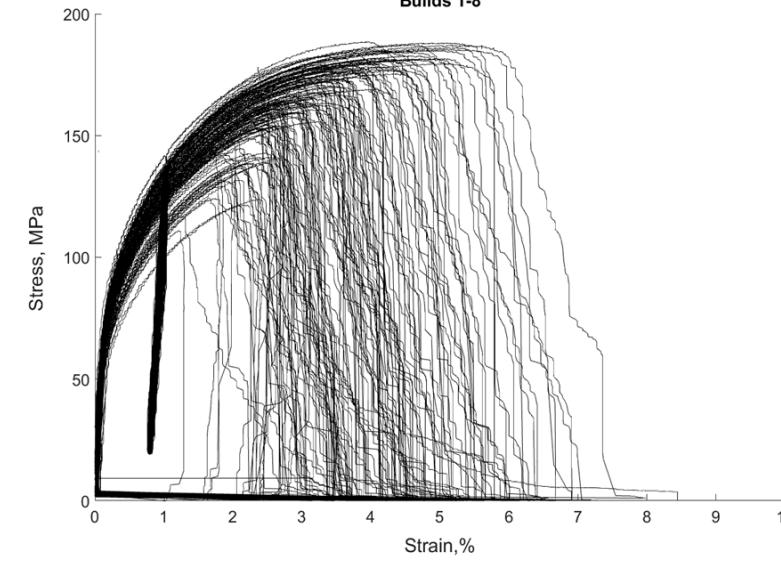
BUILD	POWDER CONDITION
1	Fresh
2	Reused once
3	Reused twice
4	Reused 3 times
5	Reused 4 times
6	Fresh
7	Reused once
8	Reused twice

Raw test data

Large tensile bars



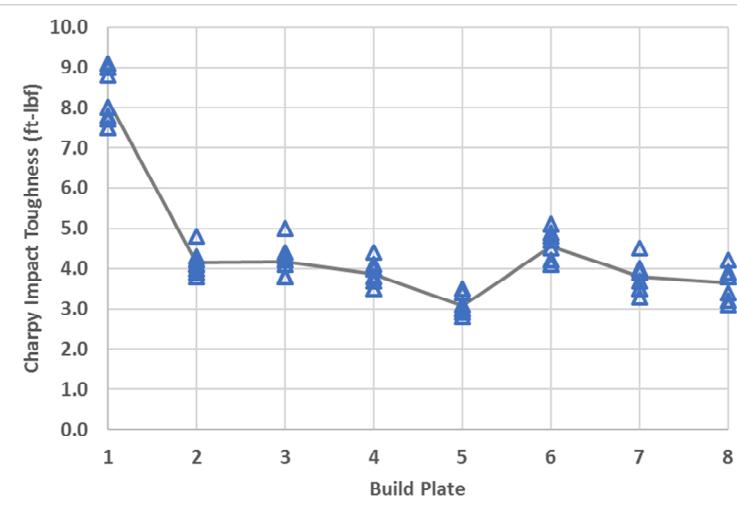
Small tensile bars



Data from tensile tests

- Position
- Yield strength
- Unloading modulus
- UTS
- UTS % strain
- Ductility
- Area

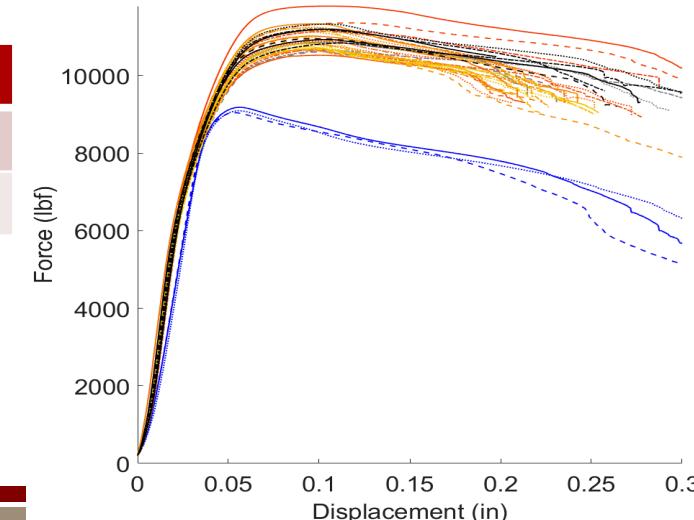
Charpy impact



Data from Charpy

- Position
- Charpy toughness

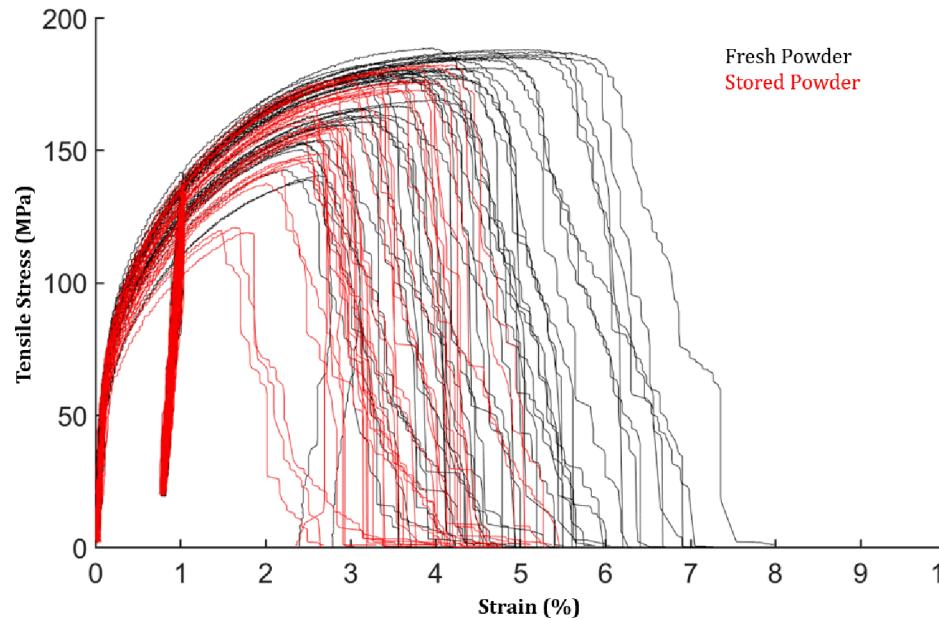
Component quasistatic crush tests



Data from component crush

- Position
- Displacement at peak load
- Peak load
- First crack displacement
- First crack load
- Through crack displacement
- Through crack load

Statistical analysis – effects influencing peak tensile load



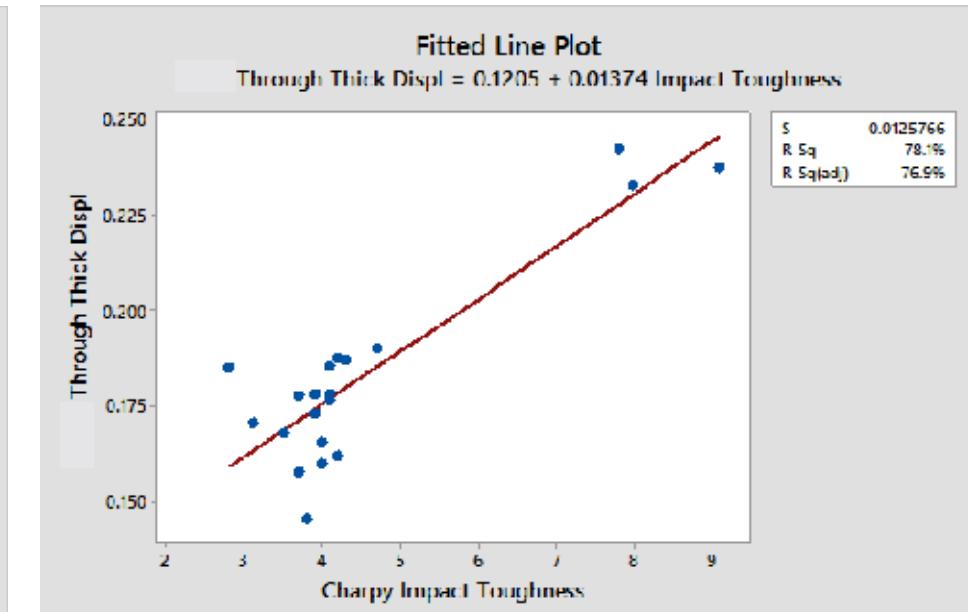
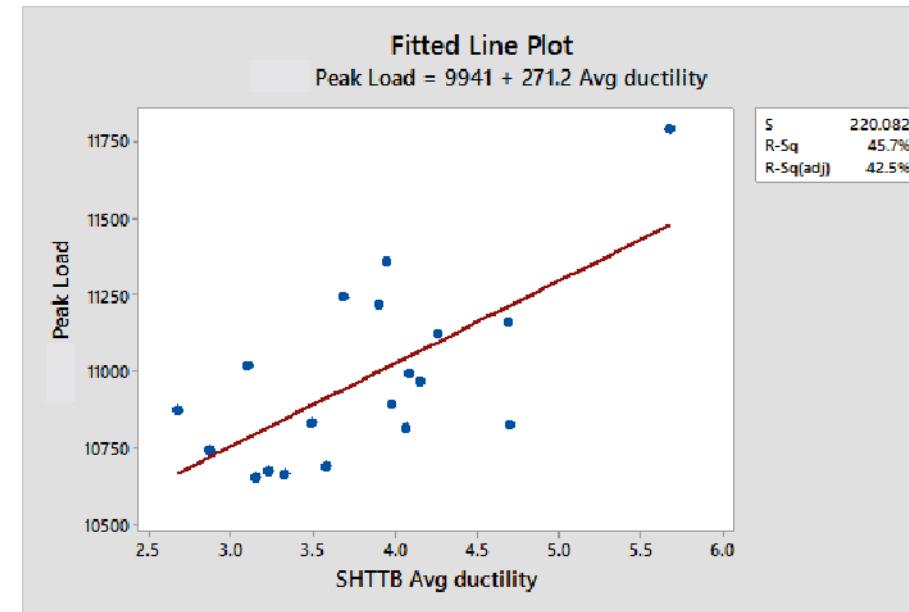
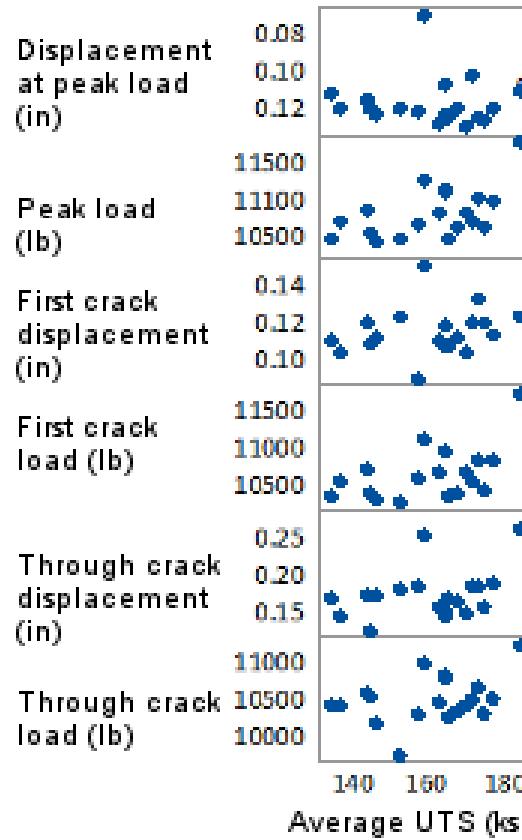
ANOVA analysis of peak tensile load

Source	Degrees of freedom	Sum of squares	Mean sum of squares	F-value	P-Value
Including build plate 1					
Wiper direction position	1	464804	464804	14.35	0.002
Argon flow position	1	14658	14658	0.45	0.512
Build plate	7	1053722	150532	4.65	0.007
Error	17	453352	32382		
Total	23	2045610			
Excluding build plate 1					
Wiper direction position	1	359065	359065	12.49	0.004
Argon flow position	1	37933	37933	1.32	0.273
Build plate	6	321629	53605	1.86	0.169
Error	12	345018	28751		
Total	23	1043867			

- Position with respect to Argon flow is not significant.
- Position with respect to wiper IS significant
- Build plate is significant if build plate 1 is included, but is NOT if build plate 1 is excluded.

Statistical analysis – Correlation of test articles with component performance

- There are not any obvious correlations between the data from the small tensile samples near the components and the components.
- Charpy impact toughness is slightly better correlated with the displacement at through thickness crack.



Conclusions

- Traditional methods of ensuring parts are good are not as useful for AM parts. The process is too variable.
- It is important to test a statistically significant number of samples.
- Wiper direction is strongly correlated with peak load in this data.
- Looking at nearest neighbor test samples may not be correlated to part properties.

Acknowledgements

- Andrea Exil
- Chris Finfrock
- Chad Taylor
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