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Theoretical and Applied Mechanics

In-Process Sensing of Laser Powder Bed Fusion Additive Manufacturing

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**A Workshop on Predictive Theoretical and
Computational Approaches for Additive Manufacturing**

Keck Center, Room K-100
500 Fifth St. NW Washington, DC

EWI[®]

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Acknowledgement: In Process Monitoring Team



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We Manufacture Innovation

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GE Aviation



Outline

- ◆ **Why in-process sensing of Laser Powder Bed Fusion (L-PBF) additive manufacturing is important**
- ◆ **How to develop in-process sensing technology**
- ◆ **Application of in-process sensing to monitor L-PBF**
- ◆ **How in-process sensing improves numerical model prediction**
- ◆ **Sensing development status**

Conventional Manufacturing Techniques



melt



form

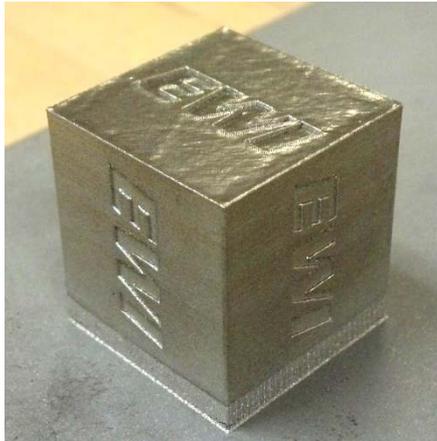


finish

- ◆ **Conventional material production steps are tightly monitored and controlled to ensure quality.**
- ◆ **AM is Materials Creation...directly into a functional part.**

Why is In-Process Monitoring Needed?

1-inch L-PBF Cube



5 miles of weld

- ◆ Each weld is an opportunity for a defect
- ◆ Hours/days/weeks of build time
- ◆ Post process inspection can be difficult and costly
- ◆ **In Process Sensing is necessary to move 3DP to AM**

Approach to Process Sensing

- ◆ **Without sensing:**
 - Rely on process development.
 - Rely on Post-Process Inspection
- ◆ **Incremental approach to material creation allows:**
 - Sensing of defects when they are created
 - Access to difficult to inspect areas.
 - Opportunities to cancel long builds.
- ◆ **Sense first, control second.**
- ◆ **Monitor:**
 - KPP's (Before, During, and After)
 - Local Material/Process Interactions
 - Global Material/Process Interactions

Problem Statement and Objective

- ◆ **Problem Statement:** Laser Powder Bed Fusion (L-PBF) systems do not possess the same level of quality monitoring that conventional manufacturing systems employ
- ◆ **Objectives:** Evaluate and mature in process sensing techniques on a L-PBF Sensor Test Bed to:
 - Enable quality monitoring
 - Process deviations
 - Geometry, distortion, and bed flatness
 - Metallurgical
 - Pores/Lack of fusion/Cracking
 - Create experimental measurements for validating numerical models of L-PBF

Technical Approach

- ◆ **Develop a L-PBF test bed**
 - It is difficult to install sensors in commercial L-PBF machine
 - Therefore, a L-PBF test bed was developed to allow for sensor evaluation without physical or software constraints
- ◆ **Install local sensors**
 - Monitor the area near the point of material fusion
- ◆ **Install global sensor**
 - Defect occurrence over entire bed
- ◆ **Test sensors**
 - Produce thermal images
 - Produce optical images



- A Commercial L-PBF machine:**
- EOS M280 with 400W laser for L-PBF at EWI



Develop a L-PBF Test Bed

-
1. **Design and fabricate test bed**
 2. **Evaluate the test bed**

Design and Fabricate Test Bed

Design



Fabricate



Evaluate

◆ **HARDWARE**

- Checked positional axes to be within 10um resolution
- Determined laser focus position, power calibration
- Completed build platform leveling

◆ **CONTROLS**

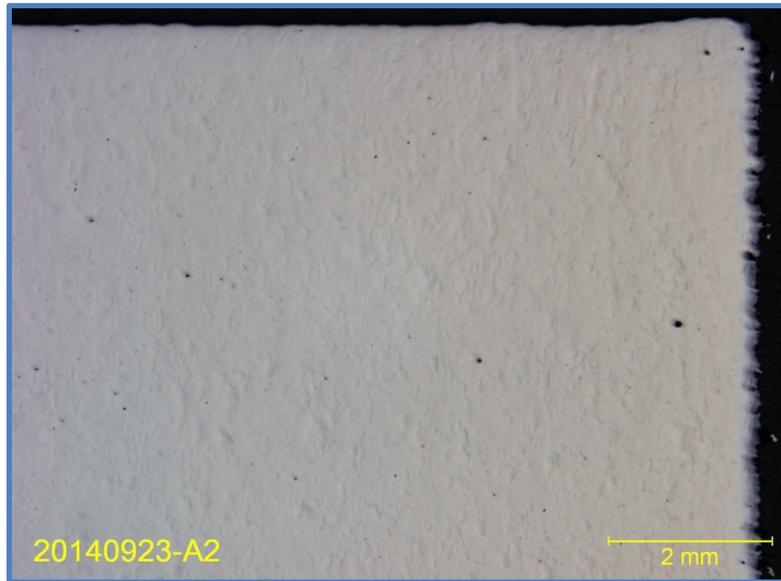
- All motor drives, solenoids, PCs, sensor COM, power, etc., integrated into control cabinet
- 1 PC for sensor test control
- 1 PC for sensor data acquisition and display



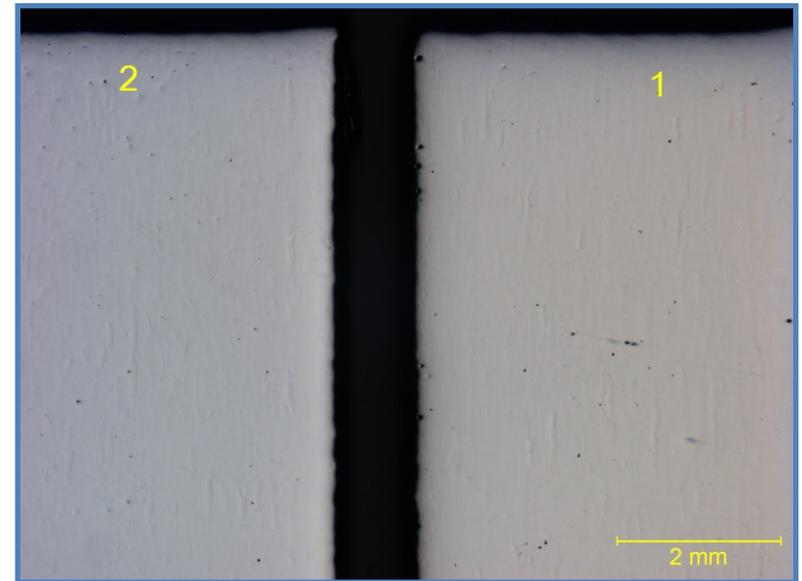
Production of Eight 5x10x10mm Prisms



Equivalent Material Established



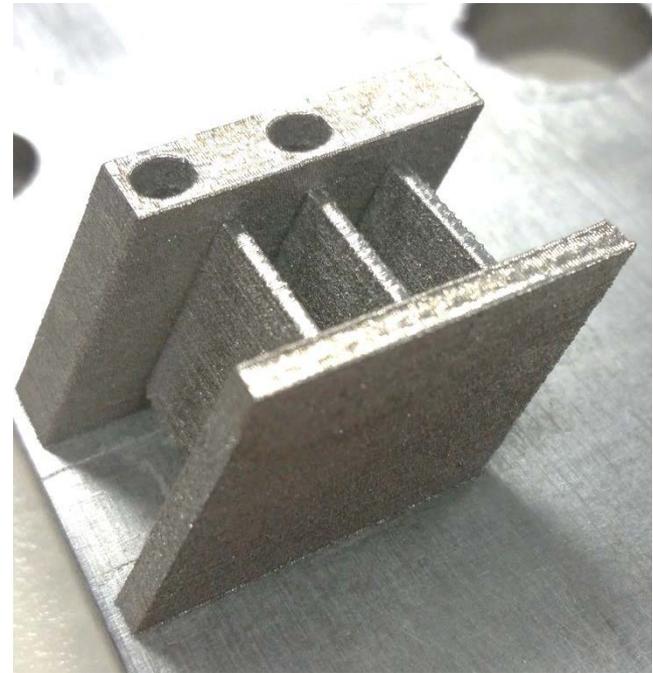
Inconel 625 on EOS Machine



Inconel 625 on Sensor Test Bed

Open Architecture System

- ◆ Complete control over toolpath generation; restricted to simple shapes.
- ◆ Control of laser power, travel speed, position of beam
- ◆ Triggering of sensors and tracking of X,Y position of beam (to track sensor data)
- ◆ Open access to the beam delivery path





Local and Global Sensors

Integrate Sensors Into Sensor Test Bed



Develop Defect-Generating Build Matrix



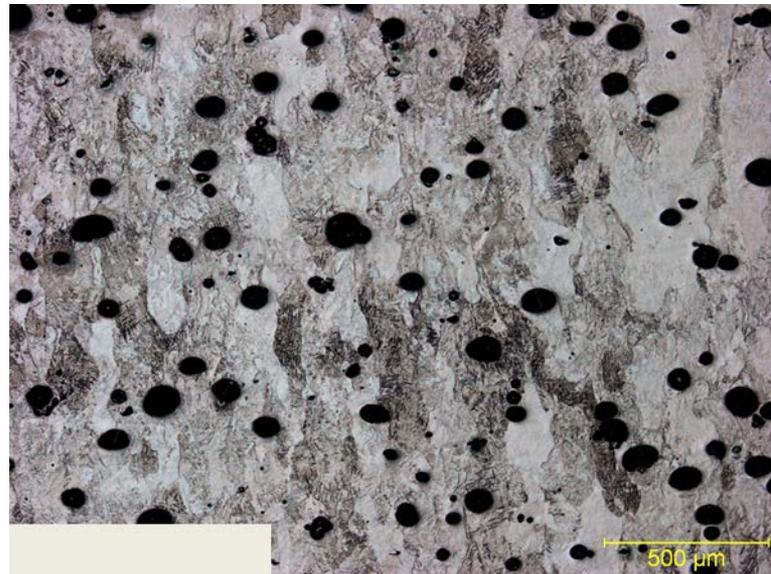
Evaluate Sensors Across Build Matrix



Enhance Sensor Quality Signals

Defect Detection Goals

Metric	Threshold	Objective	Unit of Measure
Geometric Defect Detection	25 μm	10 μm	50% of geometric deviations of XX size
Volumetric Defects	250 μm	100 μm	50% of defects of XX size



Sensors Employed

Local Sensors

- Photodetector
- Spectrometer
- High Speed Video
- Two Color Optical Pyrometer

View process at point of fusion; collect information at and surrounding the melt pool.

Global Sensors

- High Resolution Imaging
- Laser Line Scan
- Global Thermal

FOV is the powder bed. Collect information before, during, and after a layer is scanned.

Sensor Matrix

Process Observation	Sensor	Defect Type					
		Process Deviation	Distortion	Geometry	Bed Flatness	Metallurgical	Volumetric Defects
Local	High Speed Video	Defect Generation Understanding					
	Thermal Imaging					X	X
Global	High Resolution Imaging		X	X	X		
	Laser Line Scanner		X	X	X		
	Thermal Imaging					X	X
	Photogrammetry (UNCC)		X	X			
	Projection Moiré (UNCC)		X	X	X		

Local Techniques: High Speed Video

Objective: Identify defect formation, melt pool characteristics; process understanding

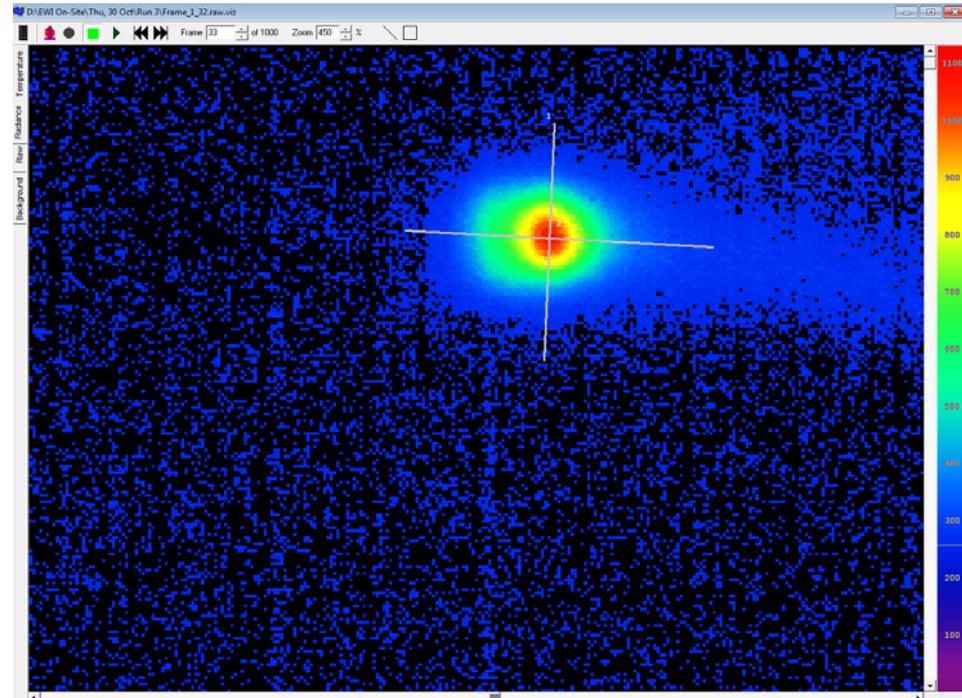
Details:

- **Bead on Plate; 40mm line; 1000FPS; laser 200W; speed: 200mm/s**



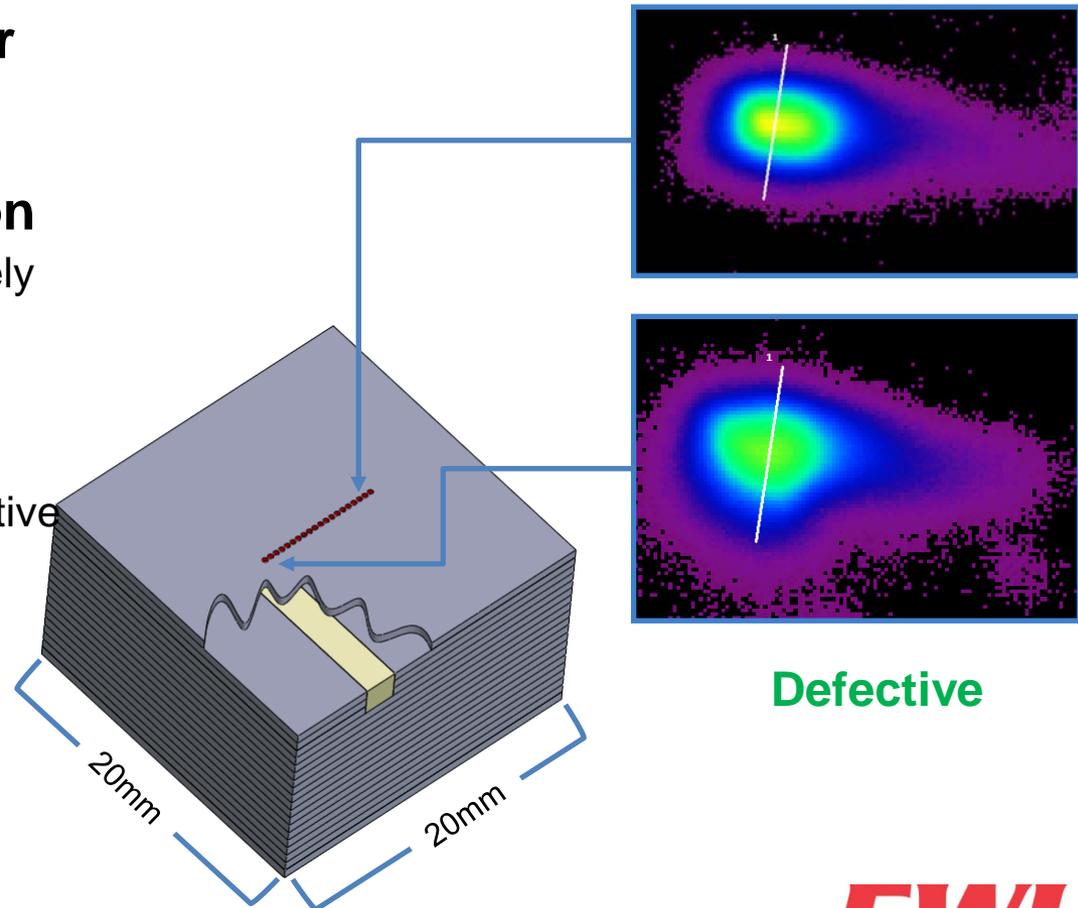
Local Sensor: Thermal Imager

- ◆ **Sensor installed on optical table and aligned with on-axis signal**
- ◆ **Sensor details:**
 - **Model:** Stratronics, IR
 - **Frame rate:** 1000 fps
 - **Exposure:** 100 us
 - **FOV:** 4.6 x 1.9 mm
 - **Resolution:** 6.8 um/pixel
- ◆ **Investigated melt pool behavior over artificial defective regions**
- ◆ **Investigated melt pool shape and size with varying parameters**



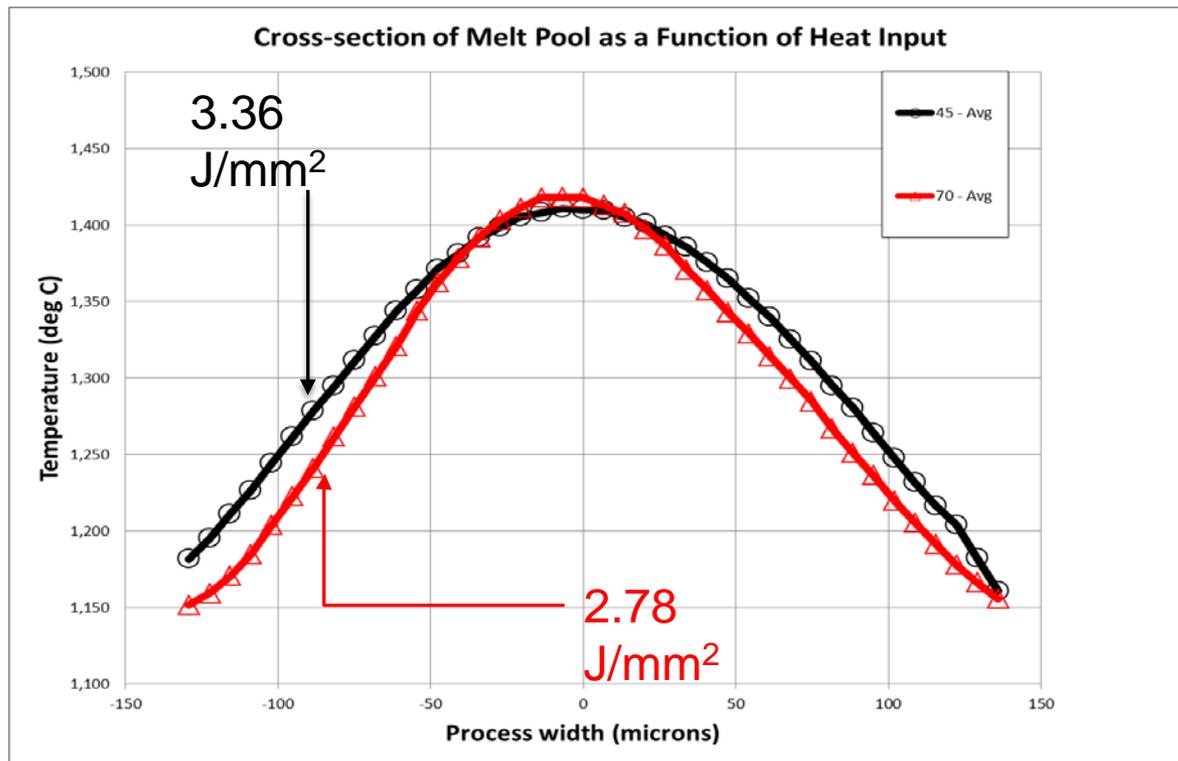
Local Sensor: Thermal Imager

- ◆ Introduced a rectangular volume of unfused powder to the build and observed melt pool variation when processing over this region
 - Melt pool seems to be extremely stable when processing over melted and re-solidified build material
 - Melt pool distorts when processing over artificial defective regions



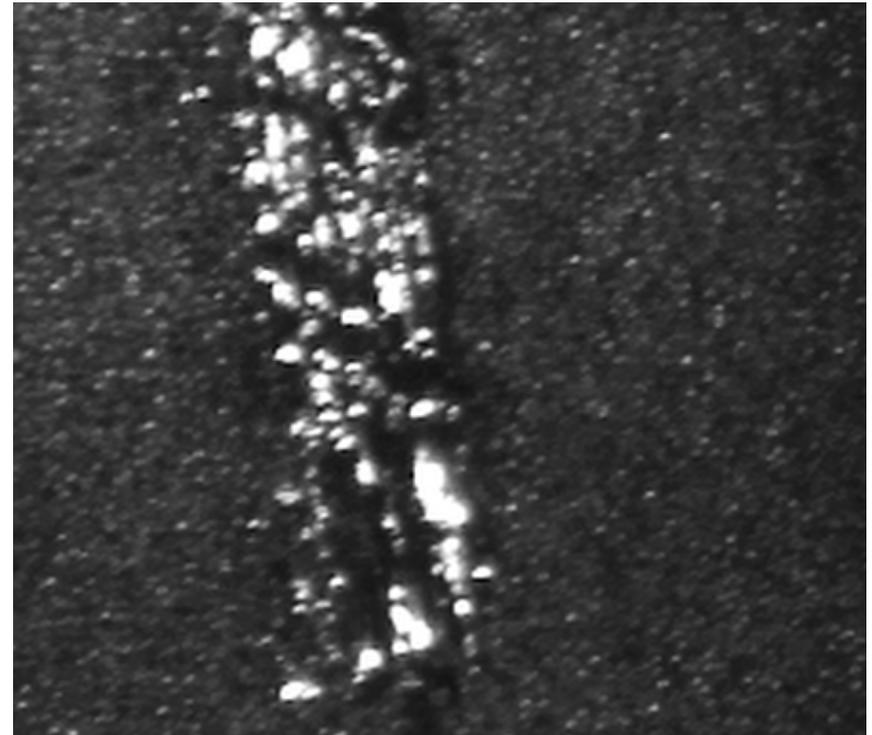
Local Sensor: Thermal Imager

- ◆ Melt pool width increases with energy density increases are measurable



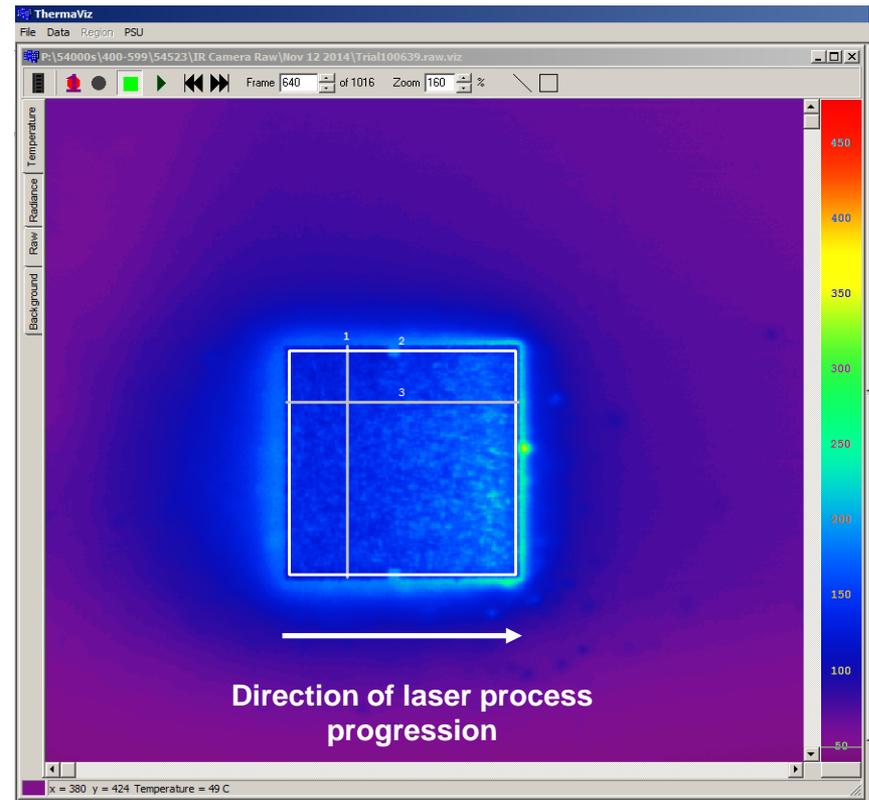
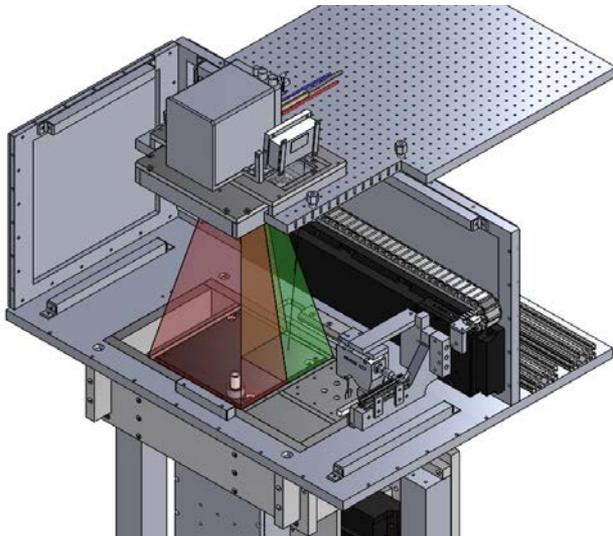
Local Sensor: Optical Imager

- ◆ **Sensor is installed on optical table and aligned with on-axis signal**
- ◆ **Sensor details:**
 - **Model:** IDT Vision, NX7-S2
 - **Frame rate:** 1000 fps
 - **Exposure:** 20 us
 - **FOV:** 11.4 x 6.4 mm
 - **Resolution:** 5.9 um/pixel
- ◆ **Early images showed promise but required higher illumination levels**
- ◆ **High luminosity LED spot lights have been configured and tested**
- ◆ **Currently focal plane issues are plaguing the results**
- ◆ **Analysis software complete to measure melt pool size and shape**

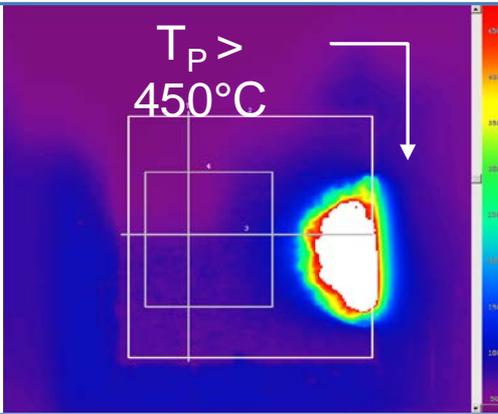
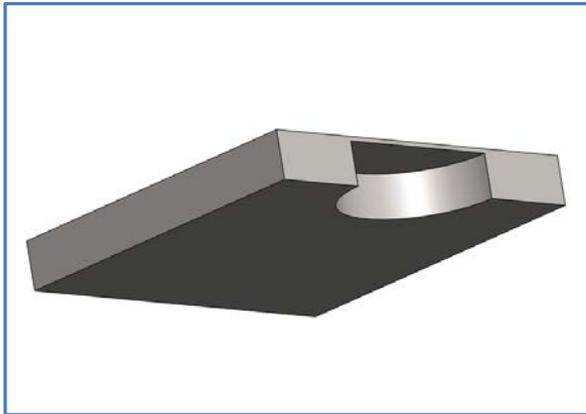


Global Sensor: Thermal Imager

- ◆ **Camera is installed over the top side viewing port**
- ◆ **Sensor details:**
 - **Model:** Stratonics, ThermaViz
 - **Frame rate:** 10 fps
 - **Exposure:** 10 ms
 - **FOV:** 83.2 x 83.2 mm
 - **Resolution:** 130 um/pixel

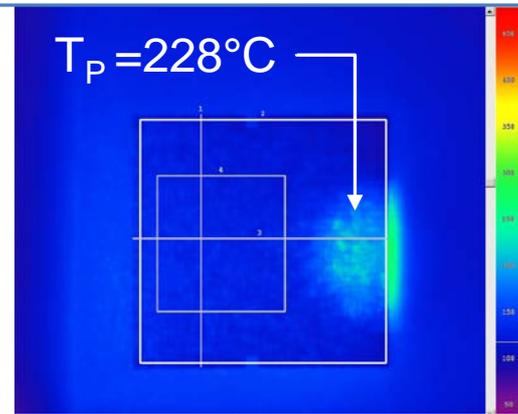
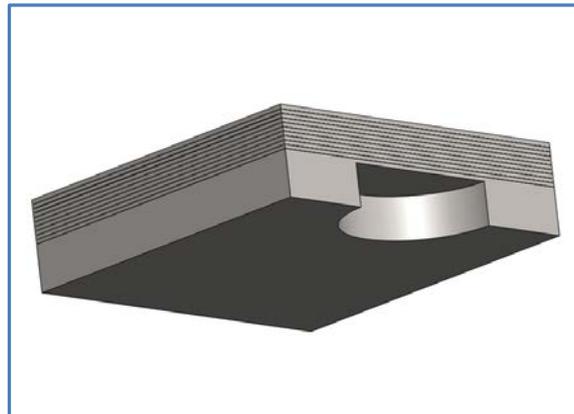


Global Sensor: Thermal Imager



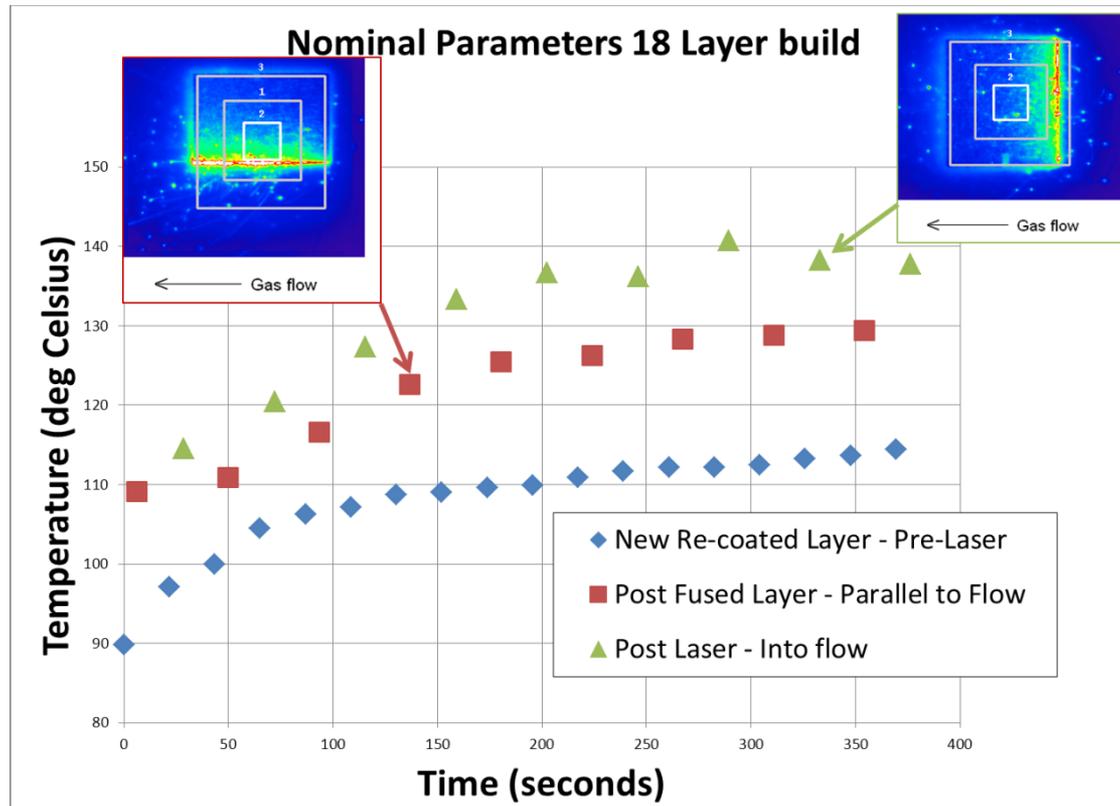
Layer 1

Layer 10



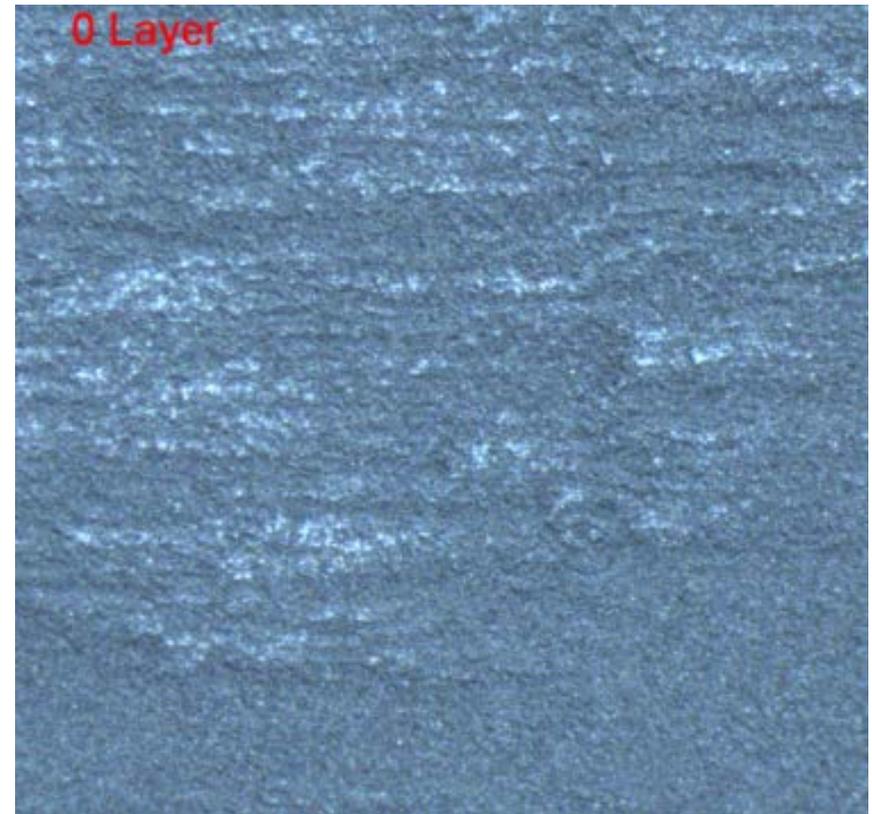
Global Sensor: Thermal Imager

- ◆ Observed a difference in cooling when traversing the laser progression parallel to gas flow versus normal to gas flow



Global Sensor: Optical Imager

- ◆ **Camera is installed over the top side viewing port**
- ◆ **Sensor details:**
 - **Model:** PointGrey, Flea3
 - **Resolution:** 17.7 um/pixel
 - **FOV:** 70x40 mm
- ◆ **Images are taken after each layer is processed**
- ◆ **Software algorithms have been written to take key measurements on the build layer**
- ◆ **Limited analysis has been performed to date**



Global Sensor: Laser Profiler

- ◆ **Sensor is installed on the recoater arm**
- ◆ **Sensor details:**
 - **Model:** Keyence LJ-V7060 laser line scanner
 - **Line width:** 15 mm
 - **Resolution (width):** 20 μm
 - **Resolution (height):** 16 μm

Laser Scanned Data

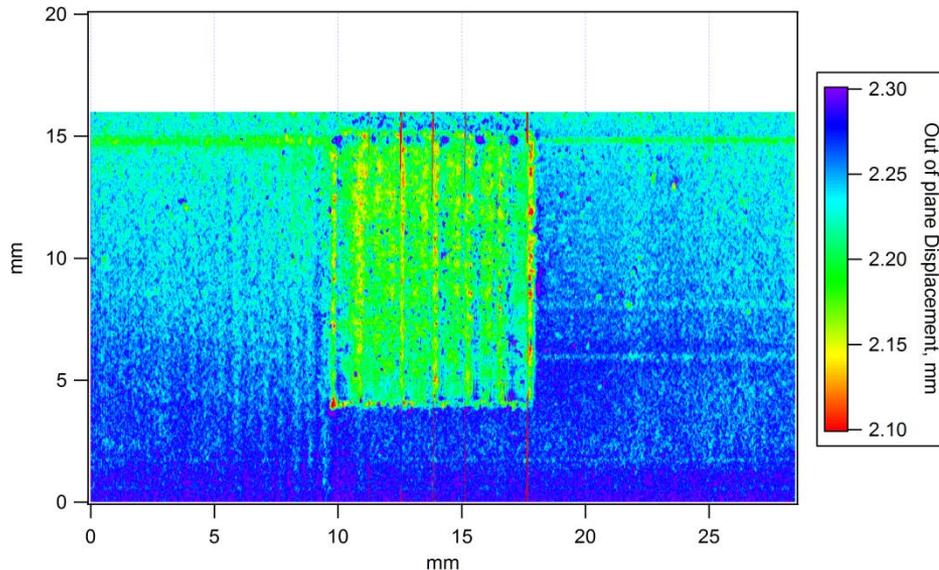
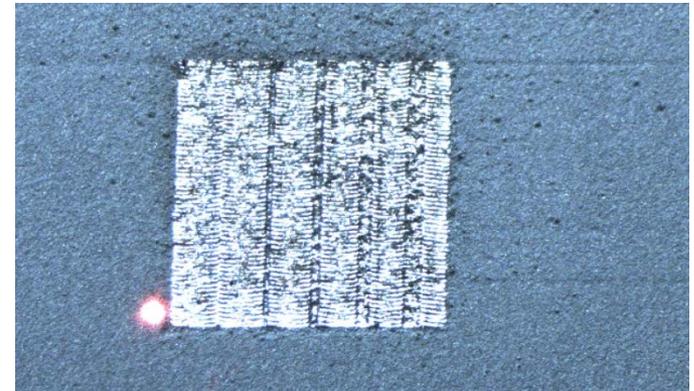


Image Scan



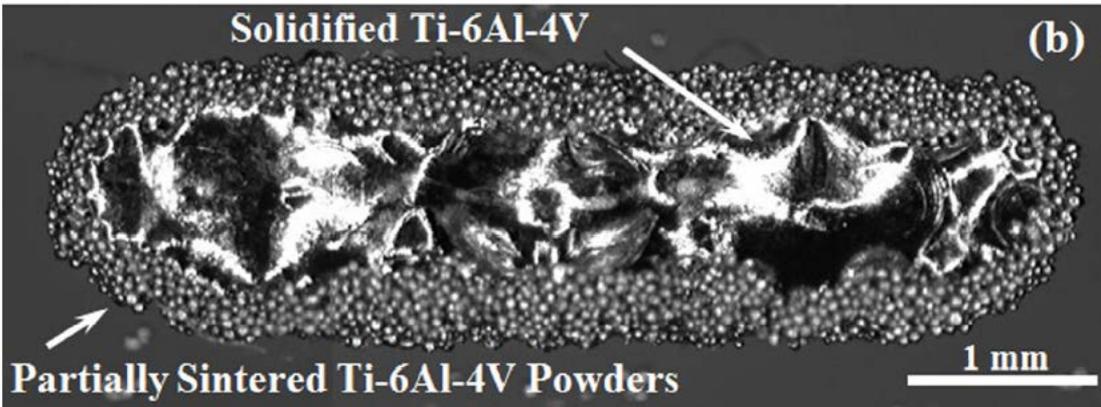
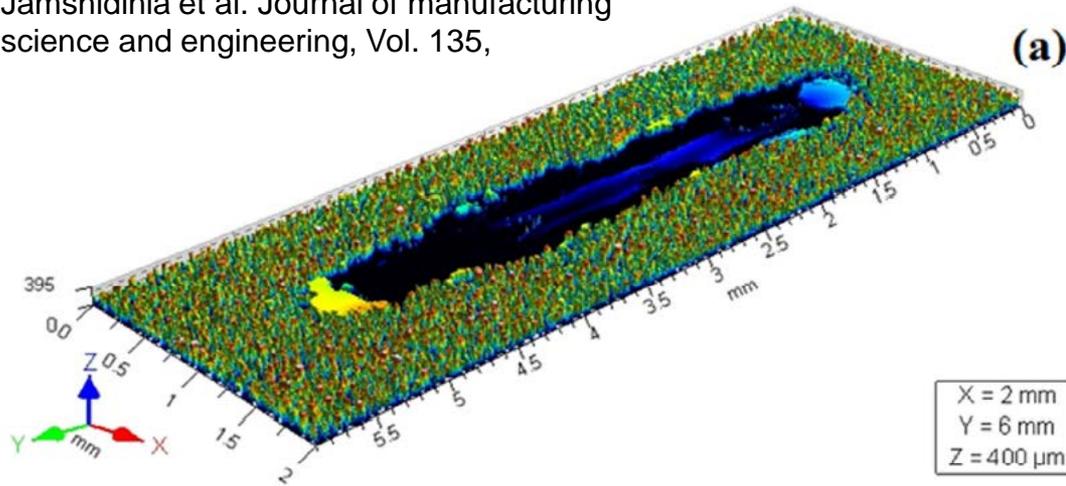


Sensing Helps Numerical Modeling

1. **Validate CFD model**
2. **Validate thermal model**
3. **Validate mechanical model**

Sensing Helps Validate Fluid Flow Predictions

Jamshidinia et al. Journal of manufacturing science and engineering, Vol. 135,

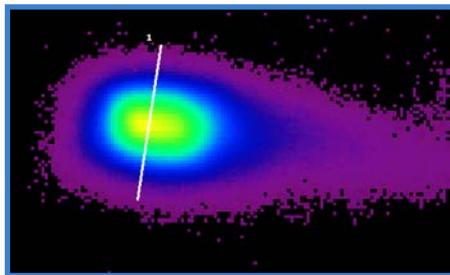
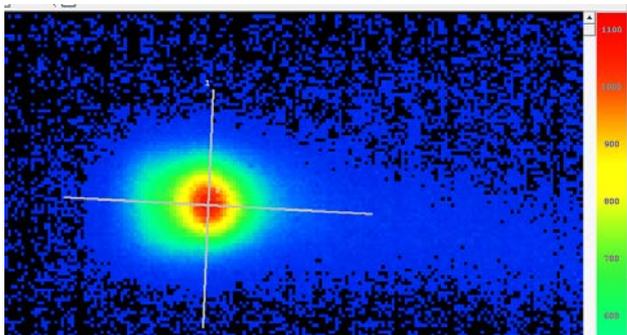


- **Computational fluid dynamics (CFD) can be used to predict the fluid flow in the molten pool.**
- **Optical images can be used to validate the CFD predictions to improve the fundamental understanding of additive manufacturing process.**

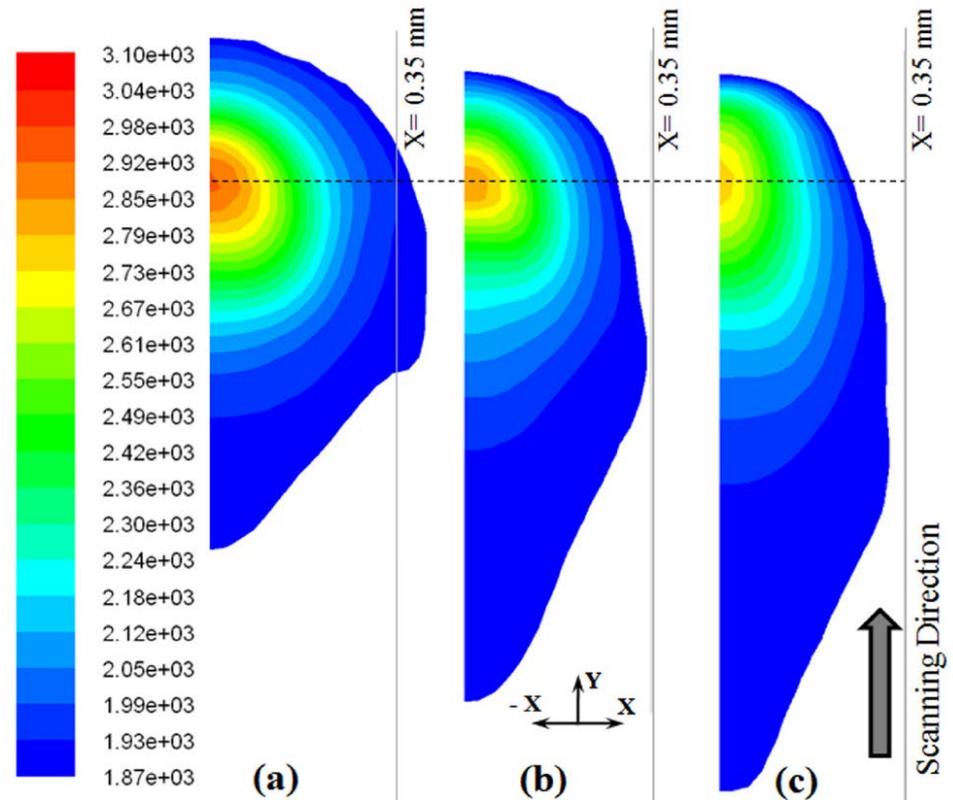
Sensing Helps Validate Temperature Prediction

Thermal images can be used to validate numerical thermal model predictions of temperature.

Thermal images



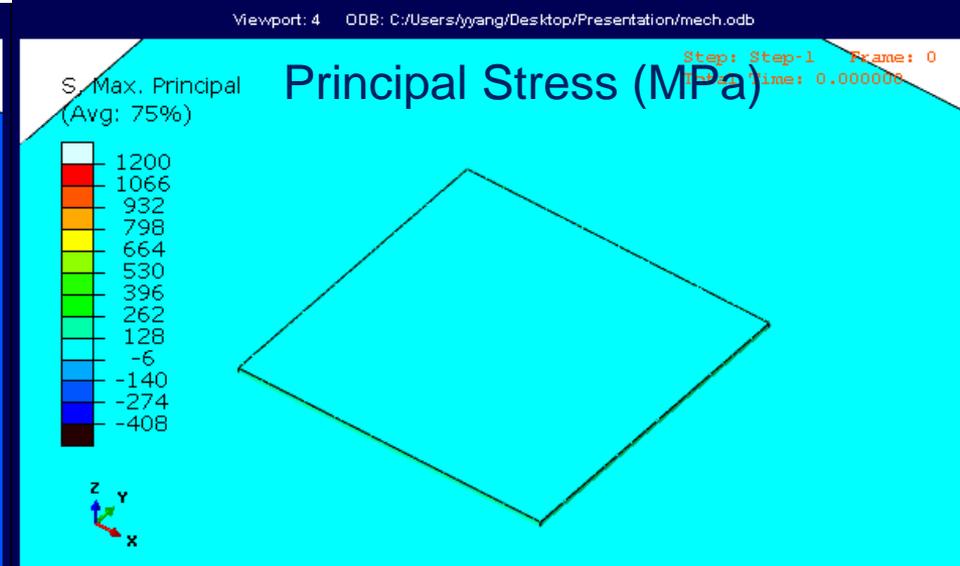
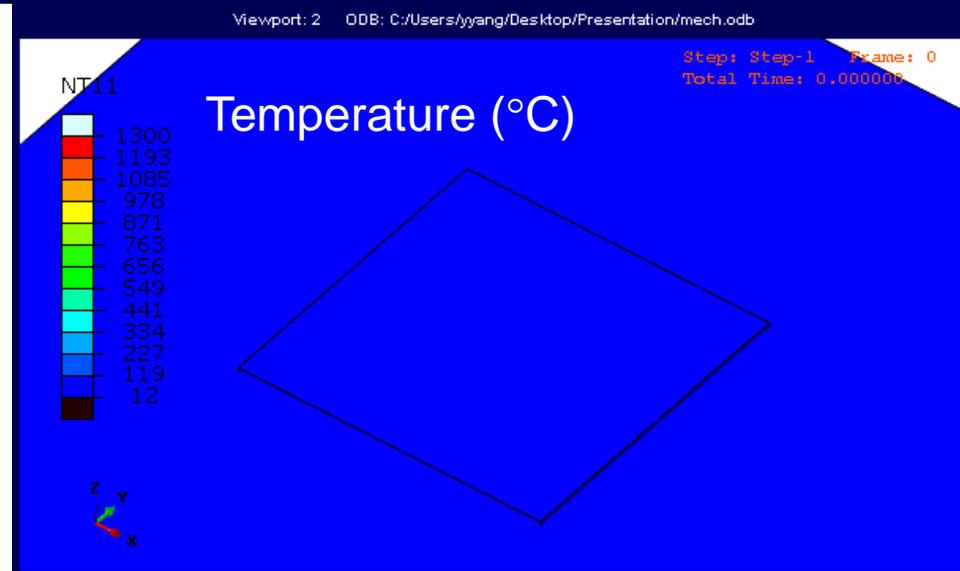
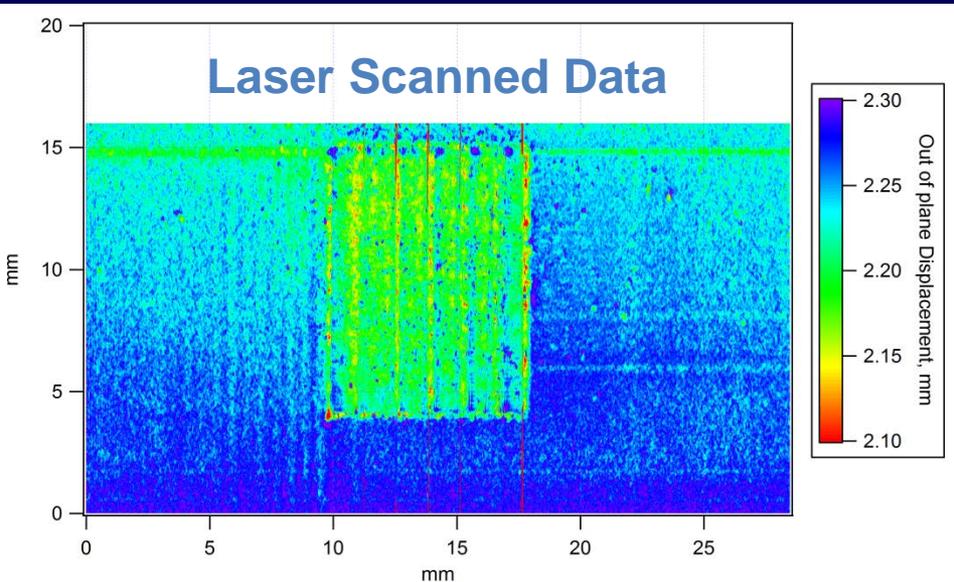
Numerical model predicted temperature distributions



Scanning speed: (a) 100mm/s; (b) 300mm/s; (c) 500mm/s

Jamshidinia et al. Journal of manufacturing science and engineering, Vol. 135,

Sensing Helps Validate Mechanical Model: Temperature, Stress, and Deformation





Sensing Development Status

1. **Local sensors**
2. **Global sensors**
3. **Technical gaps**

Local Sensor Progress to Date

- ◆ **Currently collecting data at ~10% of desire rate (once every 10 melt pools)**
- ◆ **Thermal: High resolution imaging of the melt pool; Currently operating in single-color mode due to software issues.**
- ◆ **Visual: High speed video taken; balancing illumination and focus issues.**
- ◆ **Spectrometer: Slow response time of COT sensors; overall intensity dependencies; limited analysis of line sensitivity**
- ◆ **Photodetector: Could prove useful if spectral lines can be related to defects.**

Global Sensor Progress to Date

- ◆ **Collecting data every layer.**
- ◆ **Thermal: Promising results. Large embedded defects can clearly be seen; may be masked when overhangs are present.**
- ◆ **Visual: Machine vision promising; requires algorithm development**
- ◆ **Laser Line scanner: Similar to machine vision**

Technical gaps

- ◆ **Producing Known Defects and Evaluate All sensors against these defects**

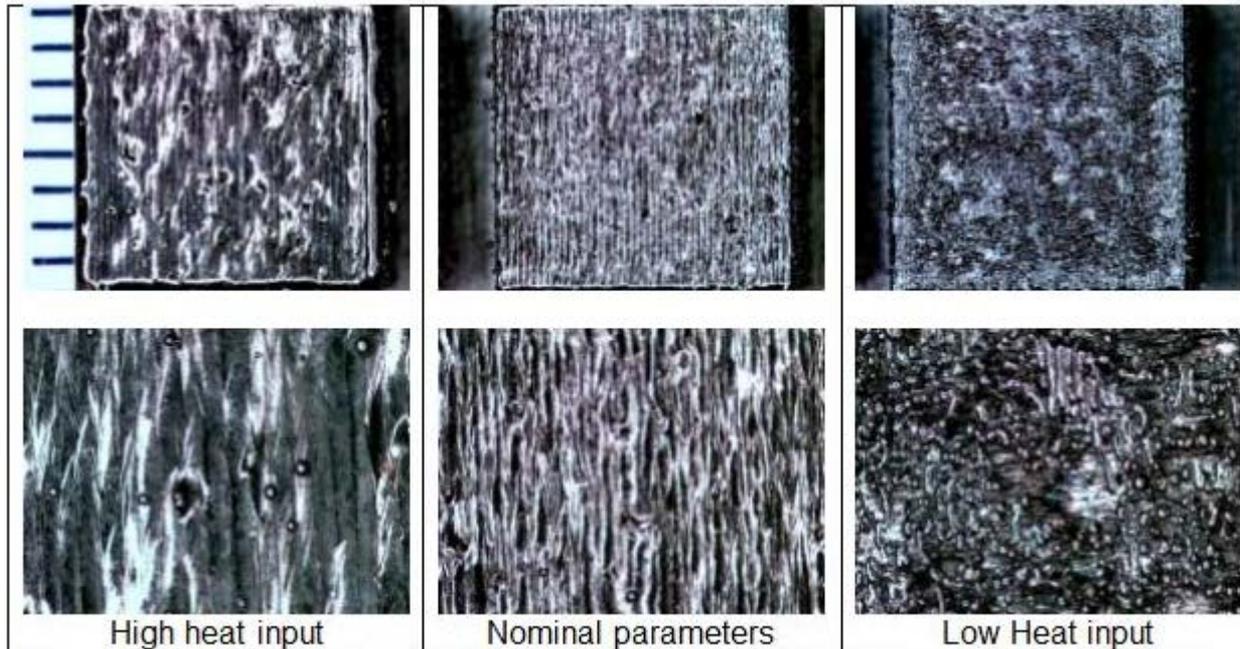


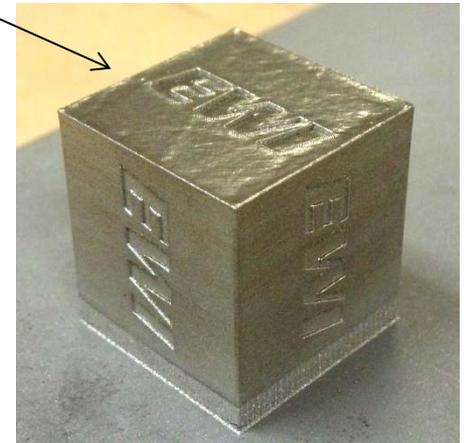
Figure 1: Stereoscope images from high (370W, 384mm/s), nominal (289W, 960 mm/s) and low heat (116W, 1536 mm/s) input coupons.

Technical Gaps

BIG Challenge = BIG Data

◆ **throughput, processing/distillation, go/no-go, storage**

- Global Imaging with 10MP camera: 9.6 GB
- Local sensing: measurement every beam width >80M data points



Summary

- ◆ **There is more to 3D Printing than the process...**
- ◆ **Treat AM like any other manufacturing process.**
- ◆ **Quality Control and in process sensing will be necessary to move 3DP to AM.**
- ◆ **Developing a flexible sensor test bed for L-PBF and evaluating candidate sensor techniques for in-process monitoring.**
- ◆ **Unique opportunity to inspect layer by layer**

Questions

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