



# AI SUMMIT

COLUMBUS, OH • OCTOBER 25–27, 2022

## HOW AI CAN BE USED IN 3DP AND SMART MANUFACTURING:

FROM THE PERSPECTIVE OF INDUSTRY,  
HEALTH SYSTEMS, AND ACADEMIA



HEALTHCARE  
PRODUCTS  
COLLABORATIVE





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Lacey Harbour  
Regulatory Manager,  
Thermo Fisher



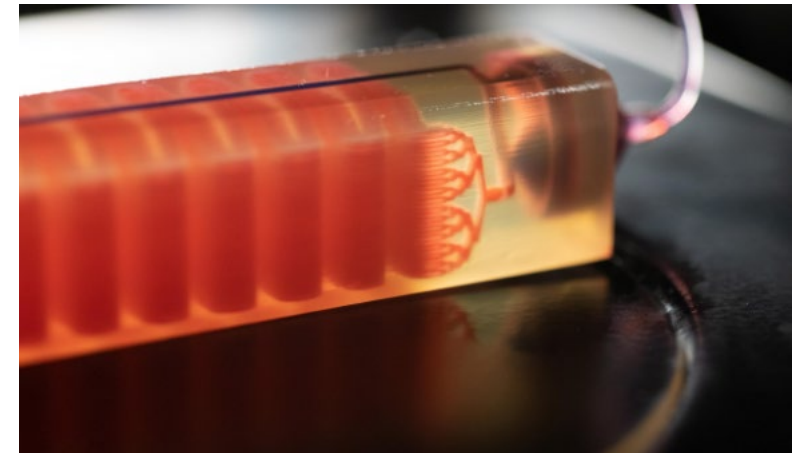
Todd Goldstein  
PhD - Director, 3D  
Design and  
Innovation  
Northwell Health



Federico Anzil  
Advanced Technology &  
Digital Manufacturing  
Manger  
LimaCorporate

# The Future of Medicine is Precise, Personal, and POC

- With 3DP Applications in:
  - Bioprinting/ tissue engineering and implants
  - Oncological microfluidics (microprinting)
    - Diagnosis, modeling, and drug delivery
  - Pharmaceuticals
  - Orthopedic implants, surgical guides, and surgical models
  - Dental applications



## Technical Considerations for Additive Manufactured Medical Devices

### Guidance for Industry and Food and Drug Administration Staff

Document issued on December 5, 2017.

The draft of this document was issued on May 10, 2016.

For questions about this document regarding CDRH-regulated devices, contact the Division of Applied Mechanics at (301) 796-2501, the Division of Orthopedic Devices at (301) 796-5650, or Matthew Di Prima, Ph.D. at (301) 796-2507 or by email [matthew.diprima@fda.hhs.gov](mailto:matthew.diprima@fda.hhs.gov). For questions about this document regarding CBER-regulated devices, contact the Office of Communication, Outreach, and Development (OCOD) at 1-800-835-4709 or 240-402-8010.

## Discussion Paper: 3D Printing Medical Devices at the Point of Care



[fda.gov](https://www.fda.gov)

# Four Challenges with Dimensions of Risk

- **Assuring devices 3D printed at the PoC are safe and effective**
- **Assuring appropriate control of devices 3D printed at the PoC**
- **Clarifying the responsible entity**
- **PoC training and capabilities**

# Definitions

- **Point of Care (PoC) 3D printing facility** – the physical location near or at the site of a patient (e.g., hospitals, ambulatory surgical facilities, outpatient treatment facilities, physicians' offices, or certain dental laboratories) that 3D prints medical devices.
- **3D printing medical device production system (MDPS)** – a collection of the raw materials, software and digital files, main production equipment and post-processing (if applicable) equipment intended to be used by a healthcare provider or healthcare facility, to produce a specific type of medical device at the point of care, for treating or diagnosing their patients, or preventing or mitigating disease, or to affect a structure or function of the body. An MDPS includes the medical device it is intended to produce.

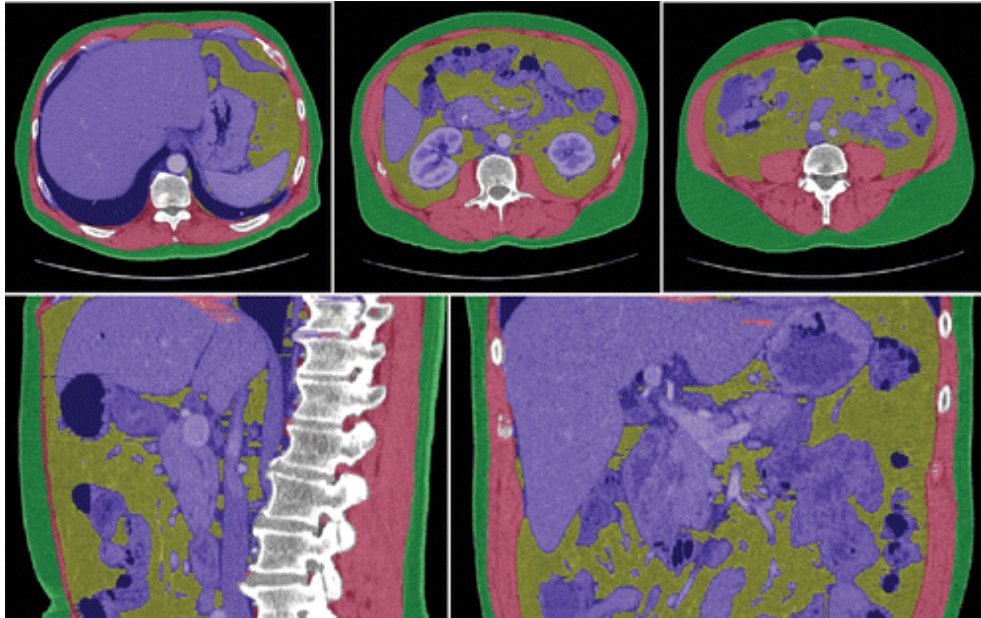


# For MDPS to be truly POC, AI is necessary.

*Examples from academia and industry*

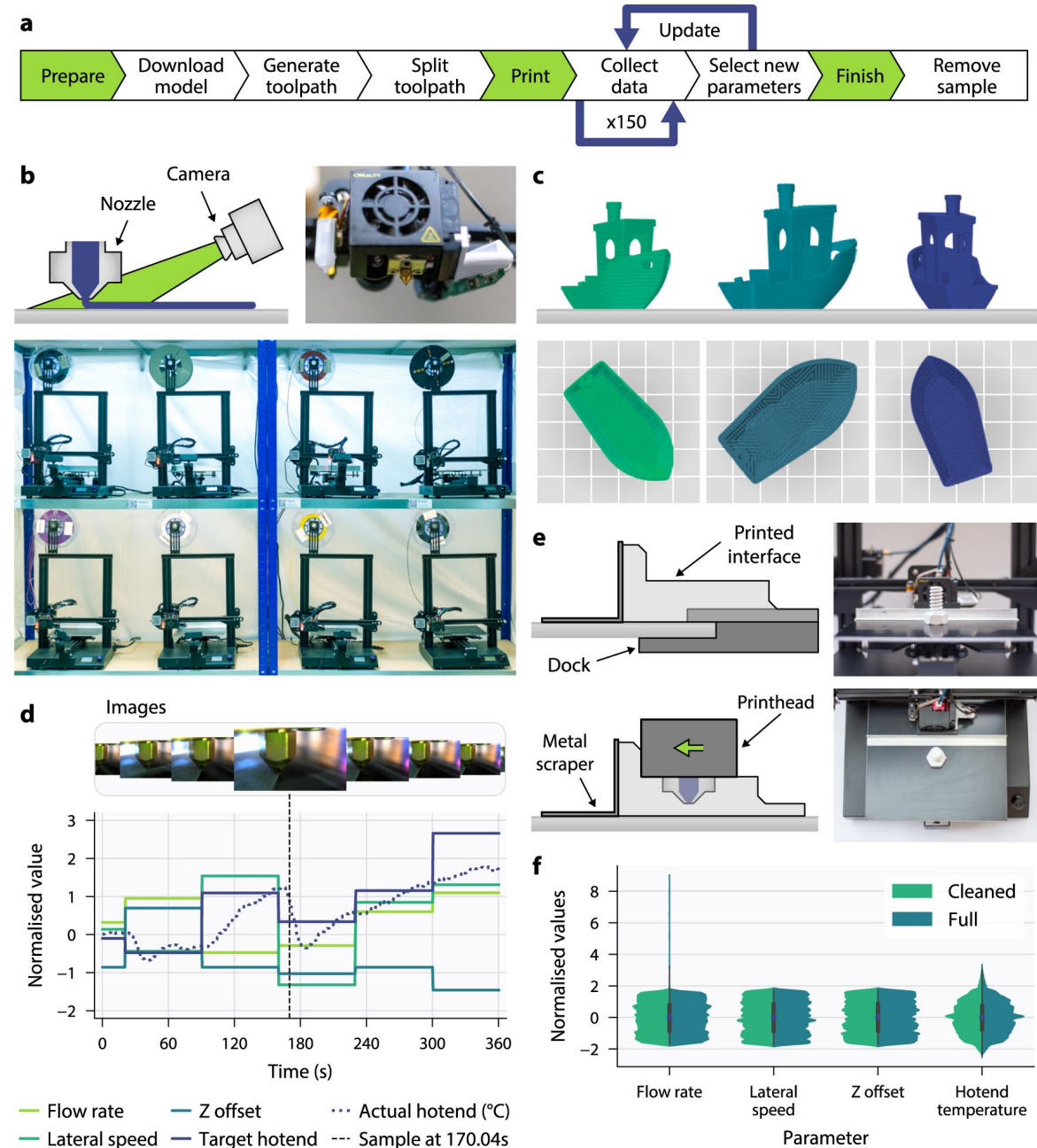
## Segmentation with DL

*Automated Abdominal Segmentation of CT Scans for Body Composition Analysis Using Deep Learning, Erickson et. al., 2019*



## Continuous Process Monitoring and Error Prevention

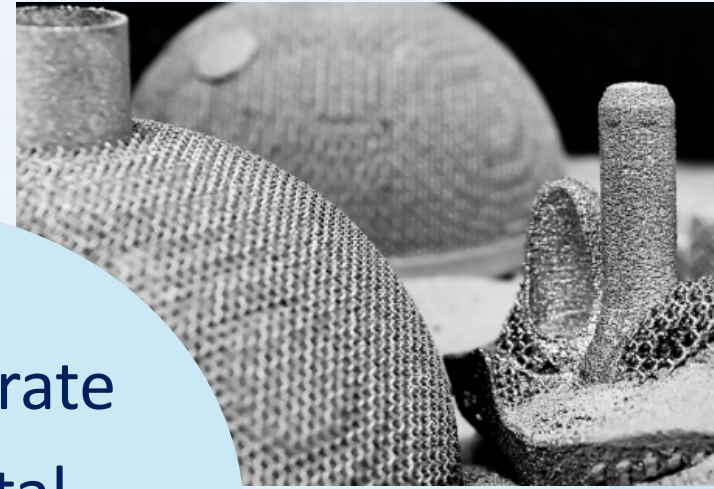
*Generalisable 3D printing error detection and correction via multi-head neural networks Pattinson, S.W., Brion, D.A.J., 2022*



# Two Use Cases



Northwell  
Health  
(In-Hospital  
Engineering/  
Academia)



LimaCorporate  
(In-Hospital  
Medical Device  
Manufacturer)





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## In-House Design and 3D Printing

Todd Goldstein PhD

Director 3D Design and Innovation

AVP Joint Venture Operations



HEALTHCARE  
PRODUCTS  
COLLABORATIVE






- We're a network of collaborators, research pioneers, entrepreneurs and educators that is 80,000 strong. As the largest health system in New York, we are privileged to treat more New Yorkers—over two million each year—than anyone else.\* Caring for so many of our own is how we're helping to create a brighter tomorrow

# A mission to serve

At Northwell, we strive to improve the health of the communities we serve and are committed to providing the highest quality clinical care; educating the current and future generations of healthcare professionals; searching for new advances in medicine through the conduct of biomedical research; promoting health education; and caring for the entire community regardless of the ability to pay.



**80,000+**  
Employees

 [Work at Northwell](#)




**850+**  
Hospitals and care  
centers

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**4,200**  
Physicians

 [Find a doctor](#)

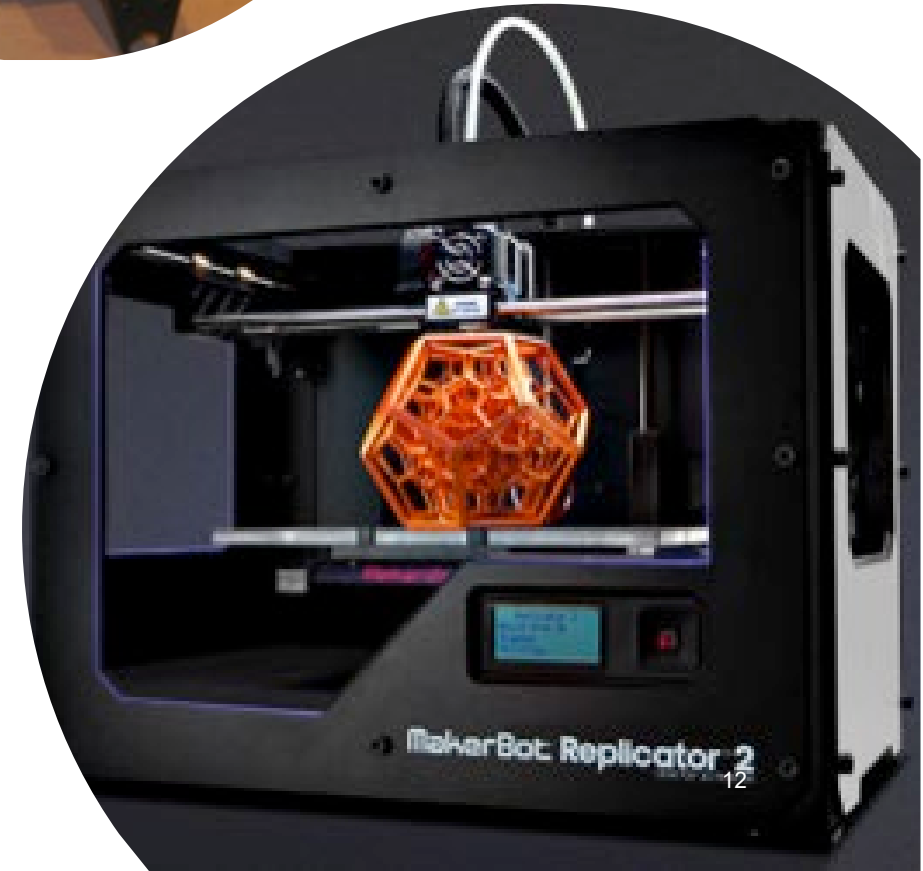


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Contributed

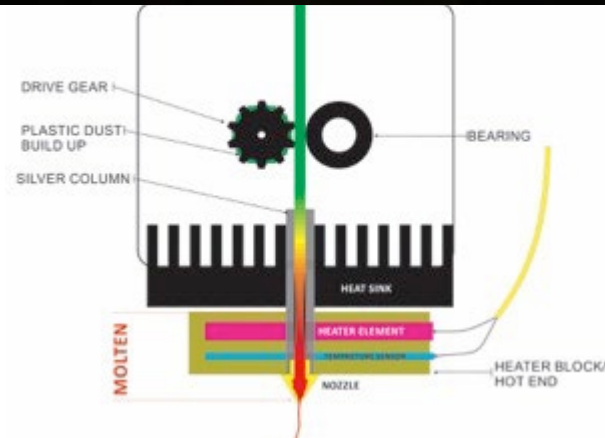
 [Community initiatives](#)

# 3D Printing

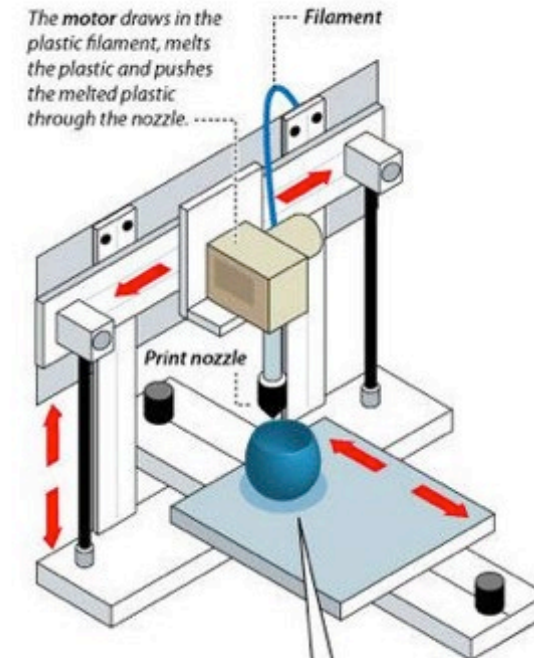
- Process for making a physical object from a three-dimensional digital model, typically by laying down many successive thin layers of a material, however many other printing processes exist.



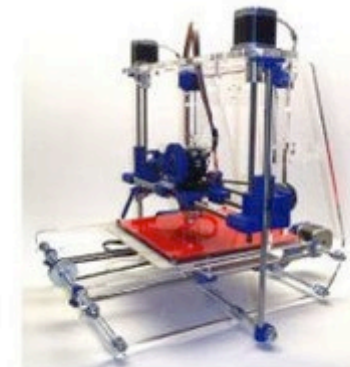
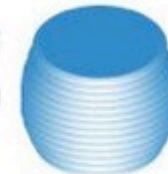




- 1 A 3D image is created using a computer-aided design software.
- 2 The CAD file is sent to the printer.



- 3 The printer lays down successive layers of liquid, powder, paper or metal material and builds the model from a series of cross sections.

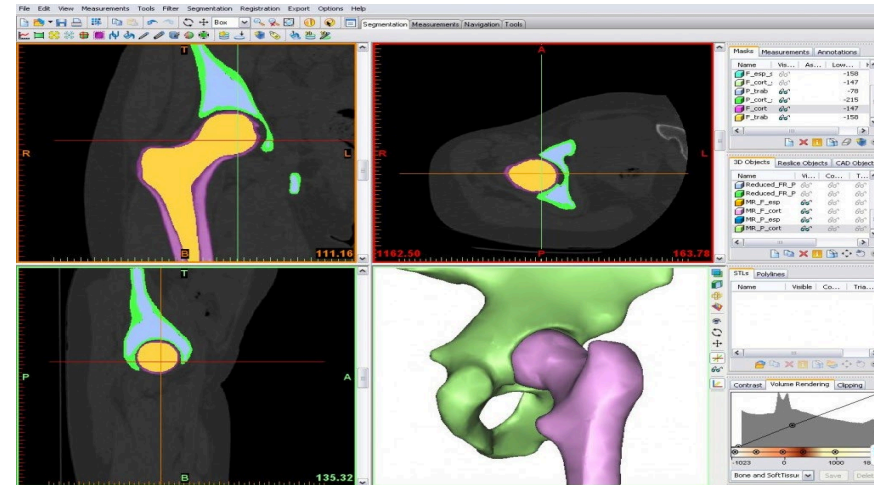
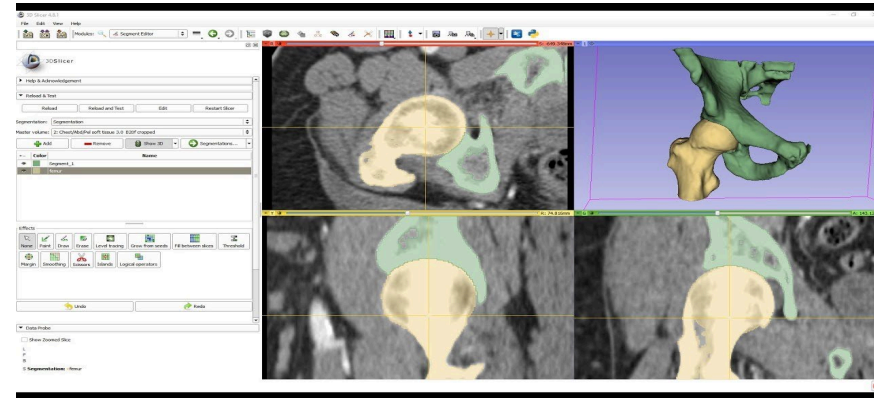
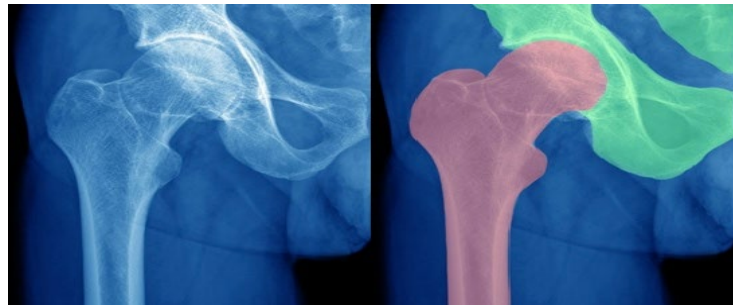


Credit: airwolf3d.com



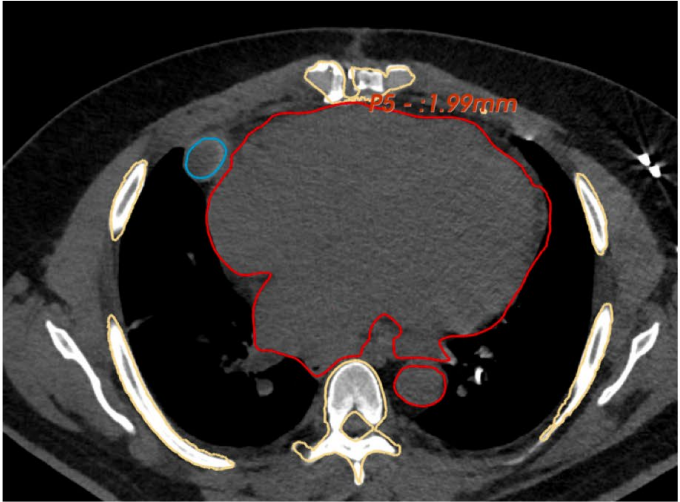
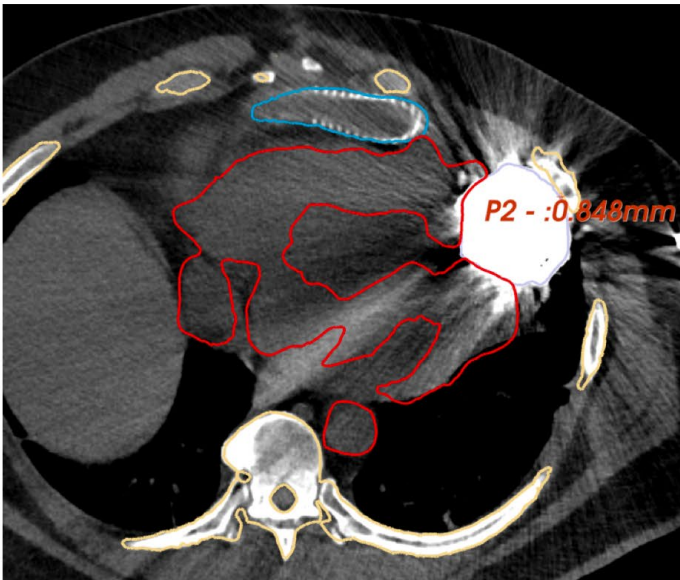
- Take your pick of brand / model

# Segmentation







P5	1.991 mm	Distance from mediastinal structures to the posterior sternum	
P2	0.848 mm	Distance from Pump to Rib	

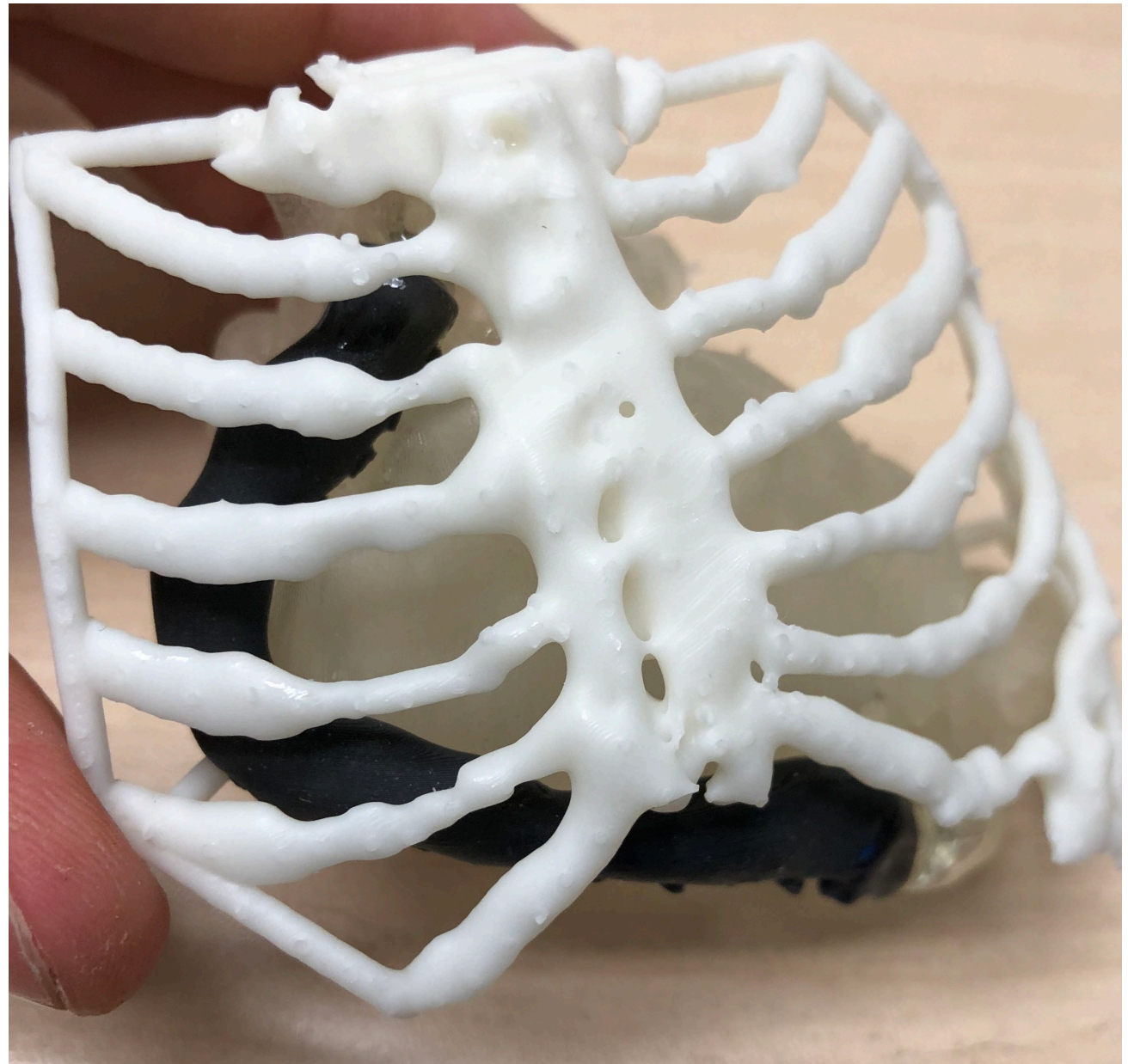




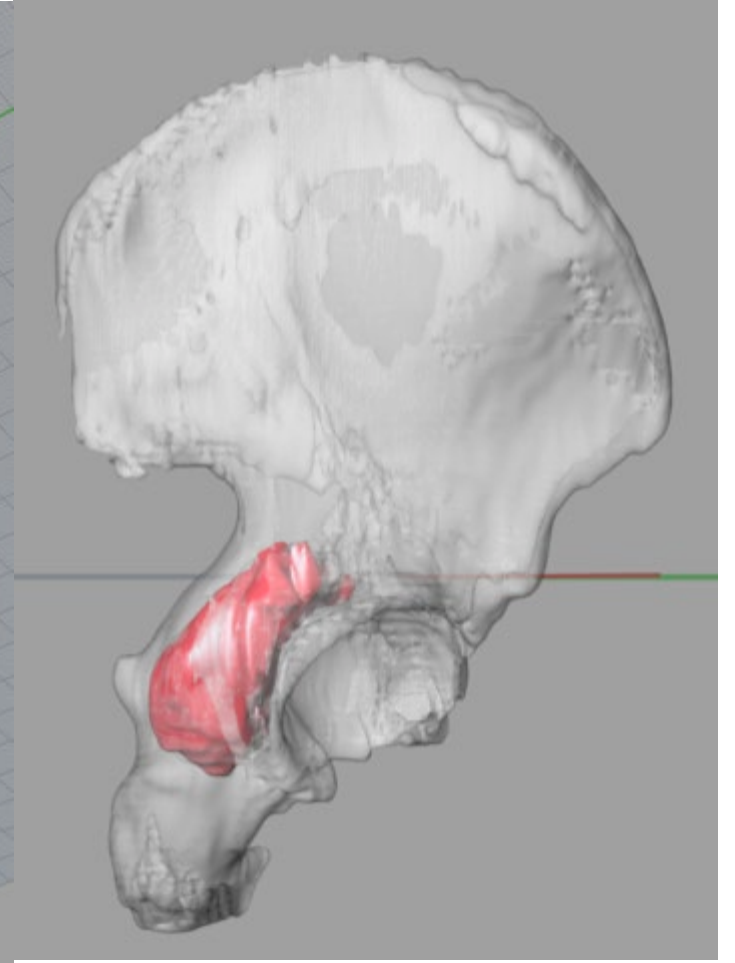
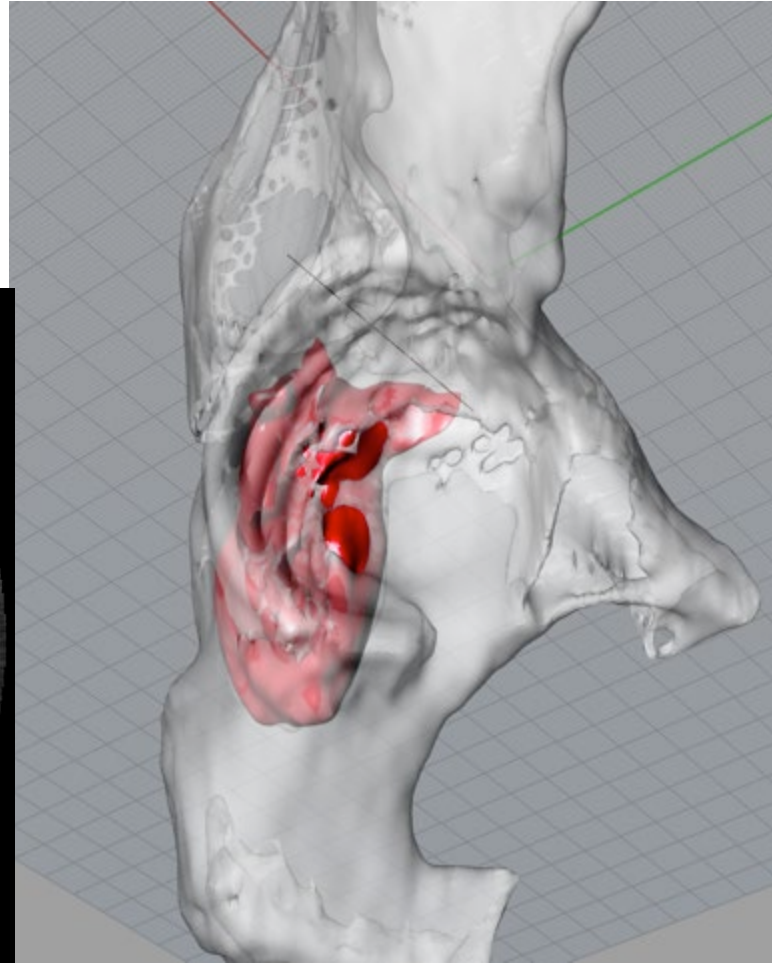
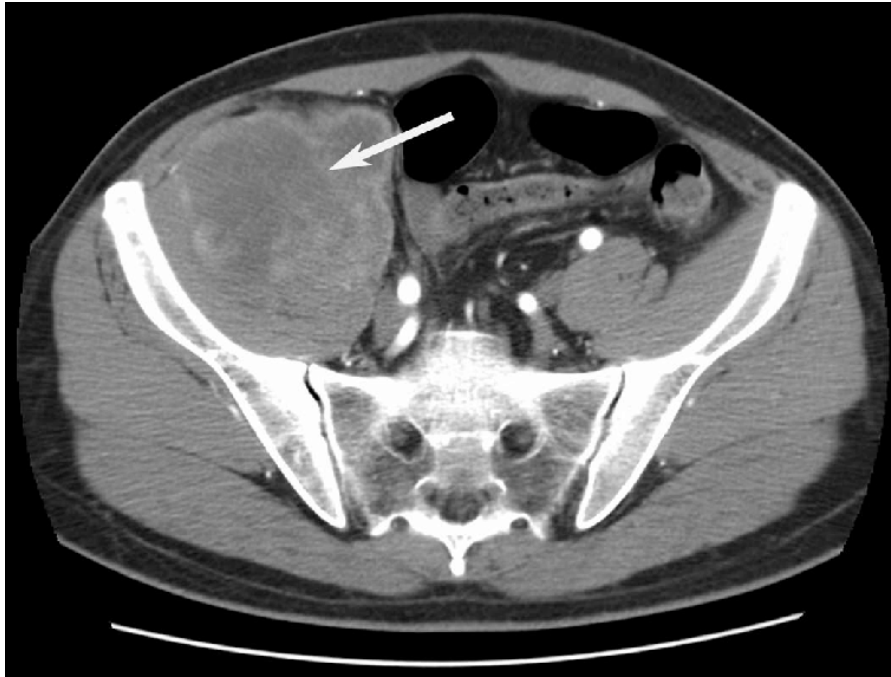
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# LVAD Surgical Planning Model

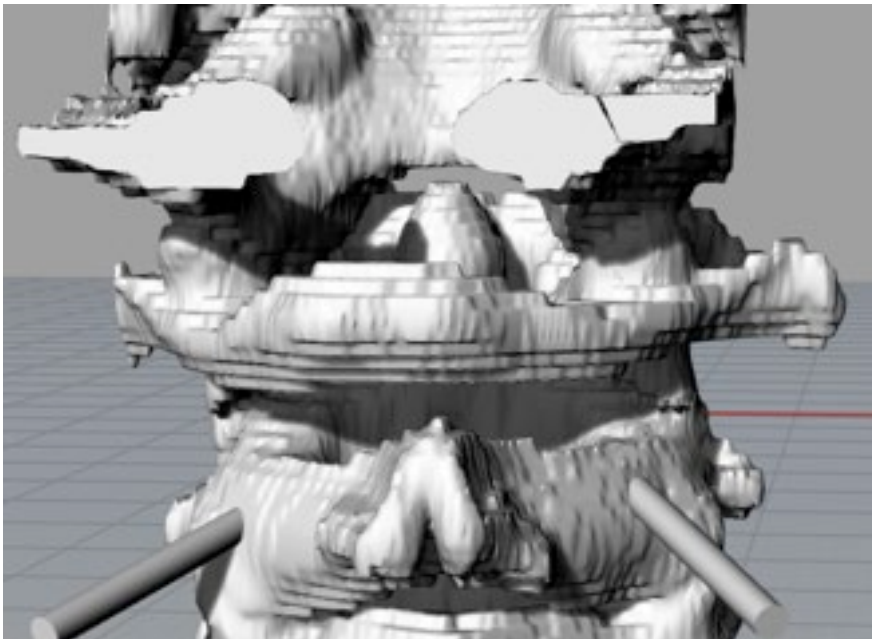
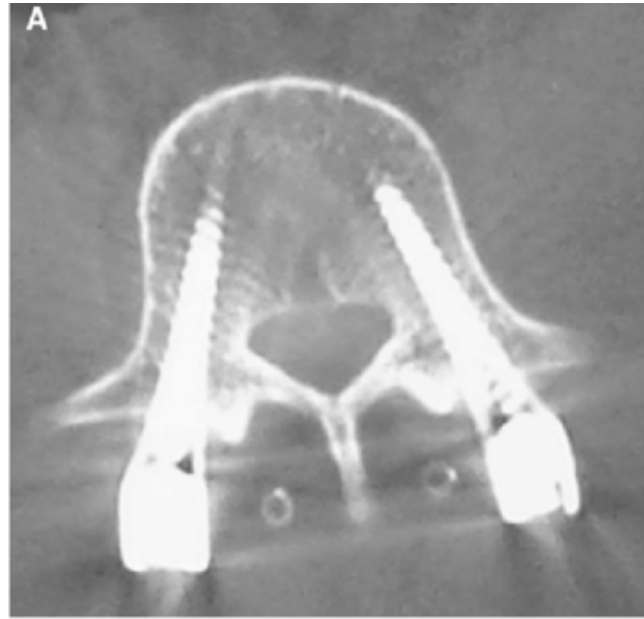
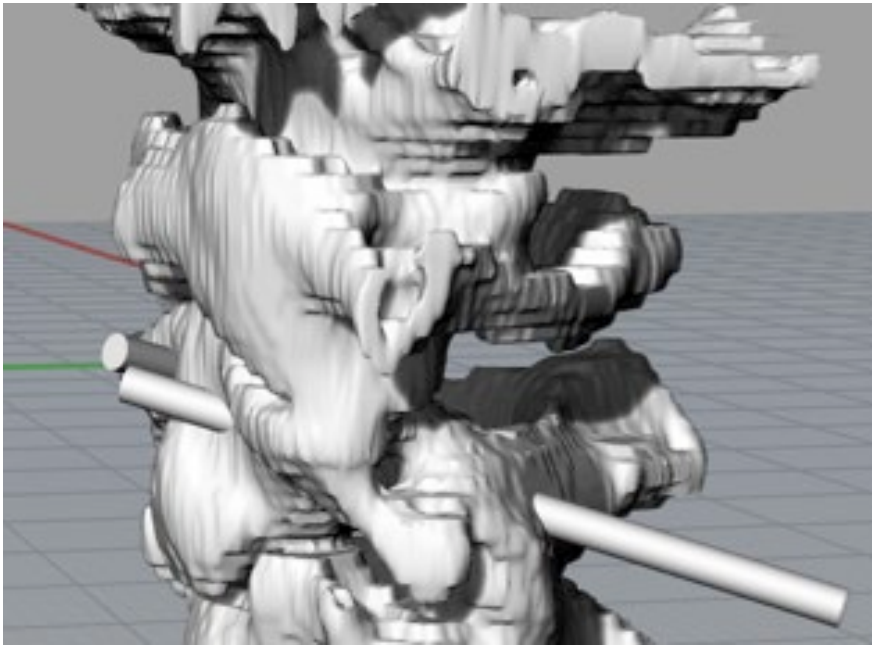
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# Tumor Resection

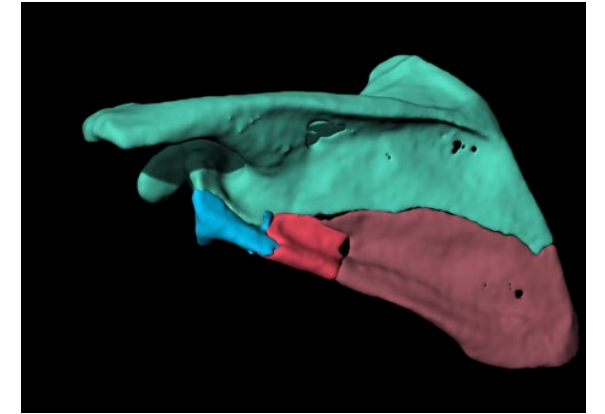
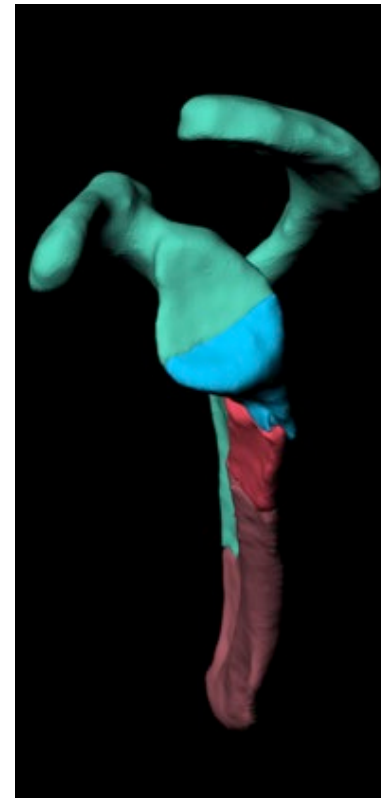
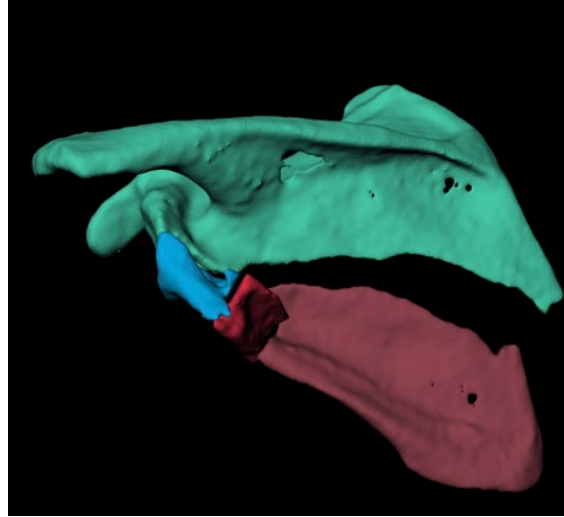
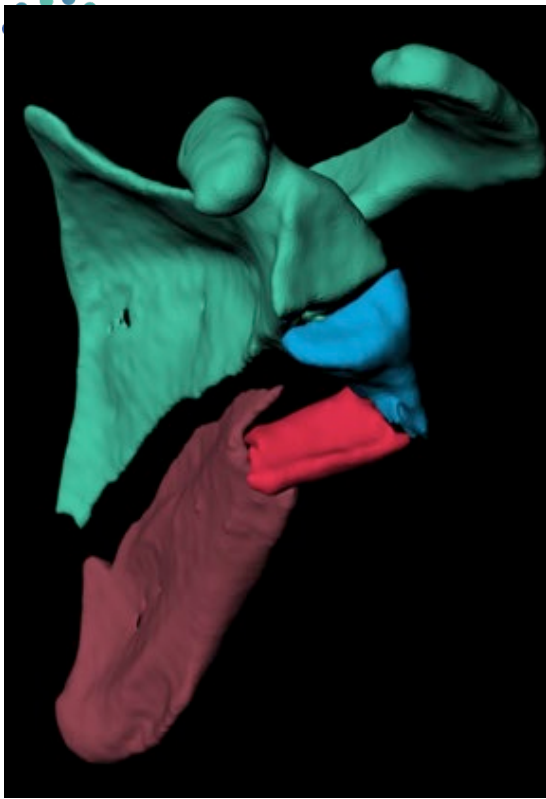






# Trajectory Guides

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# Shoulder Fracture & Reduction

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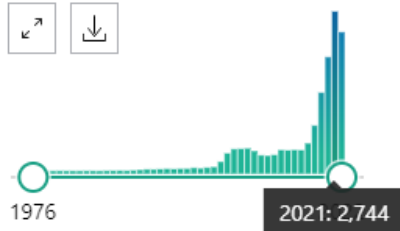
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☐ **Artificial Intelligence** and Cellular **Segmentation** in Tissue Microscopy Images.

1 Durkee MS, Abraham R, Clark MR, Giger ML.

Cite Am J Pathol. 2021 Oct;191(10):1693-1701. doi: 10.1016/j.ajpath.2021.05.022. Epub 2021 Jun 12.

PMID: 34129842 [Free PMC article.](#) [Review.](#)

Share With applications in object detection, image feature extraction, image classification, and image **segmentation**, **artificial intelligence** is facilitating high-throughput analysis of image data in a variety of biomedical imaging disciplines, ranging from radiolog ...

☐ **Toward High-Throughput Artificial Intelligence-Based Segmentation in Oncological PET Imaging.**

2 Yousefirizi F, Jha AK, Brosch-Lenz J, Saboury B, Rahmim A.

PET Clin. 2021 Oct;16(4):577-596. doi: 10.1016/j.cpet.2021.06.001.

PMID: 34537131 [Review.](#)

Share **Artificial intelligence** (AI) techniques for image-based **segmentation** have garnered much attention in recent years. ...This work reviews existing AI techniques for **segmentation** tasks and the evaluation criteria for translational AI-based **segmentation** ...

☐ **Artificial intelligence** in ultrasound.

3 Shen YT, Chen L, Yue WW, Xu HX.

Cite Eur J Radiol. 2021 Jun;139:109717. doi: 10.1016/j.ejrad.2021.109717. Epub 2021 Apr 12.

# The Future?



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# AI in 3DP

**The Lima Corporate Use Case**

**Please request slides**