

# Concurrent materials design with artificial intelligence

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Theory of Condensed Matter group

# Neural network algorithm to

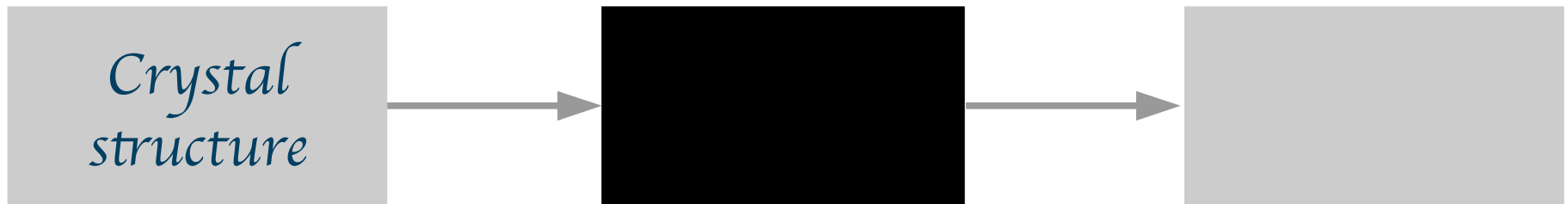
**Merge** simulations, physical laws, and experimental data

**Reduce** the need for expensive experimental development

**Accelerate** materials discovery

**Generic** with **proven** applications in materials discovery

# A black box



# Train with complete data

*Materials  
design*

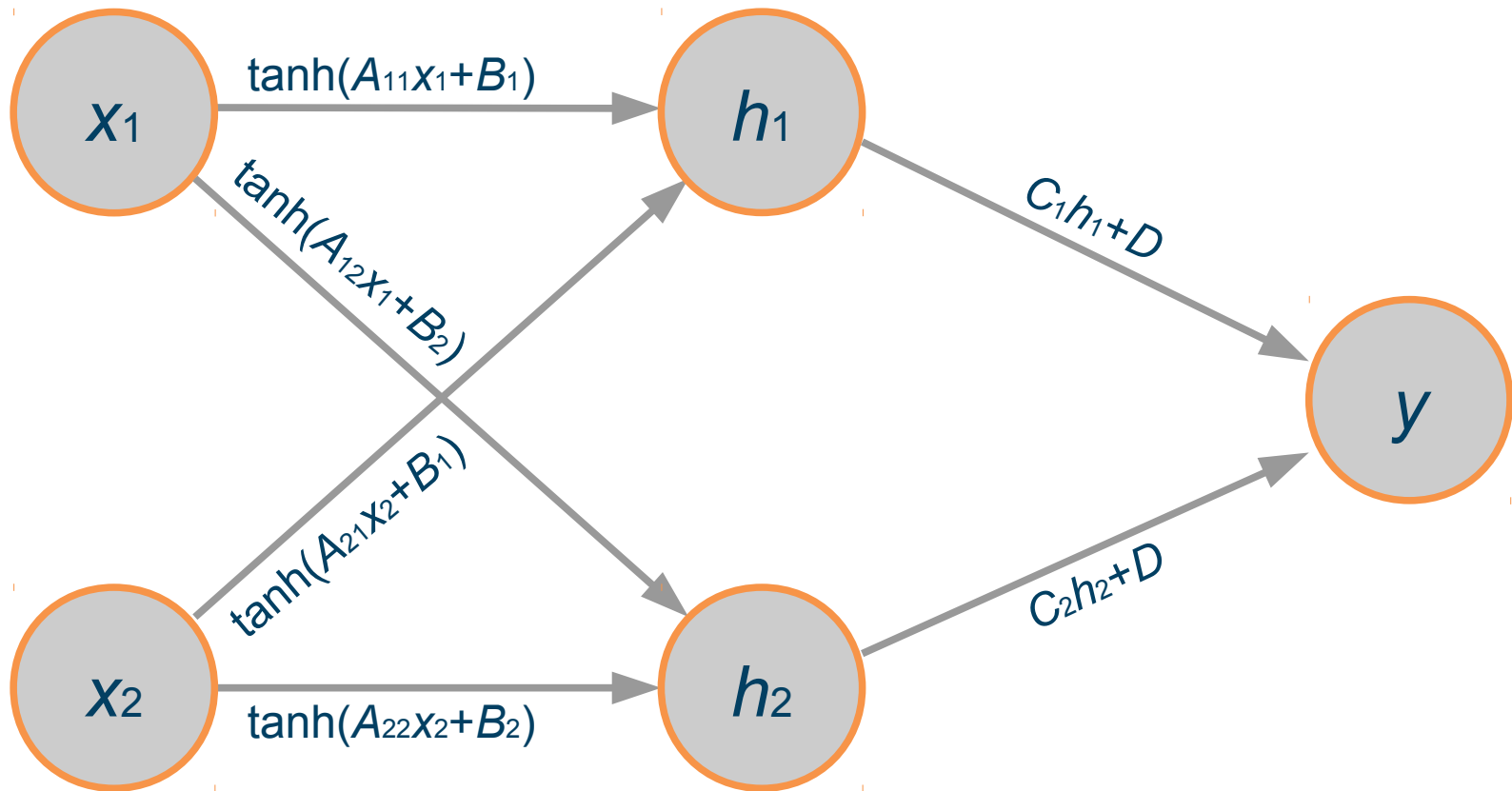


Materials  
design

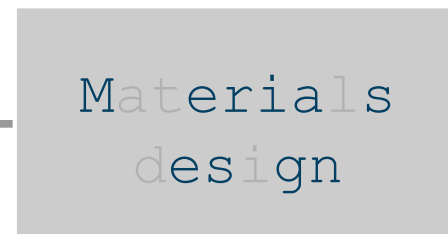
# Predict with complete data



# Architecture



# Train with fragmented data



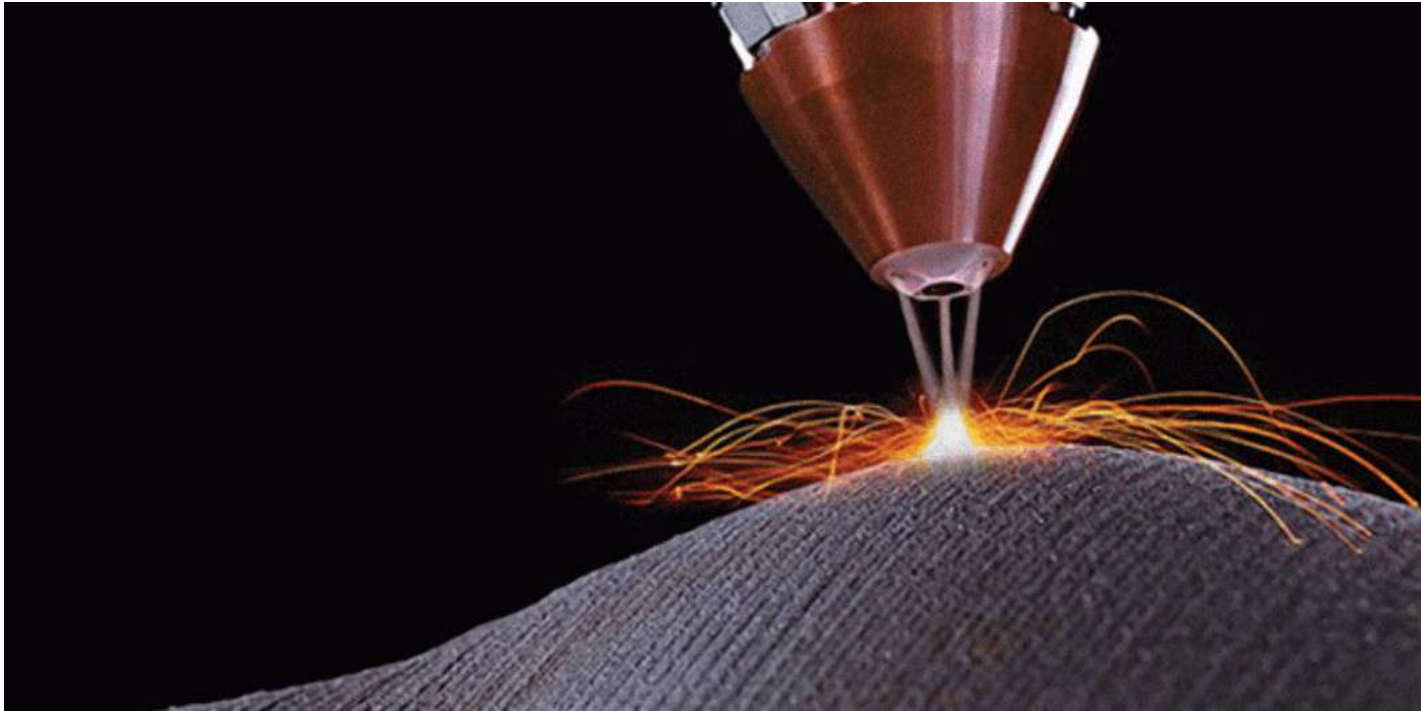
# Predict with fragmented data



Crystal structure

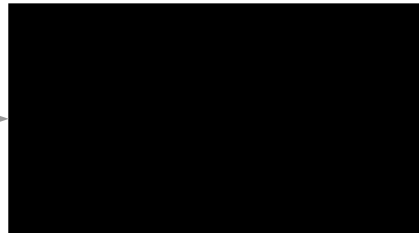
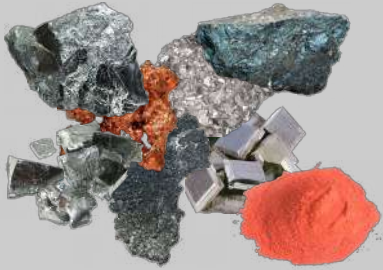


# Direct laser deposition requires new alloys



# Neural networks for materials design

## Composition



## Properties

Process



Fatigue

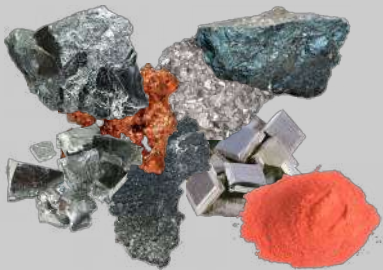


Welding



# Neural networks for materials design

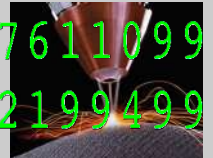
## Composition



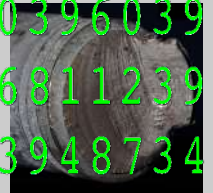
## Properties

293928764790904  
021364010360203  
636584970508183  
703818406465007  
501066378902903  
715269094674449  
011404497494803  
488685276110993  
203932721994999  
976579342243418  
394046703960393  
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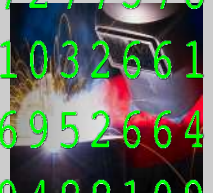
## Process



## Fatigue

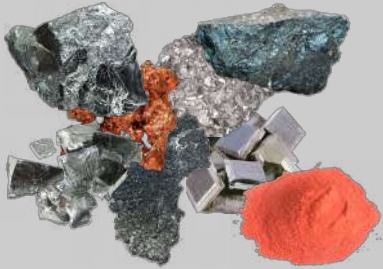


## Welding



# Neural networks for materials design

## Composition



## Properties

Process



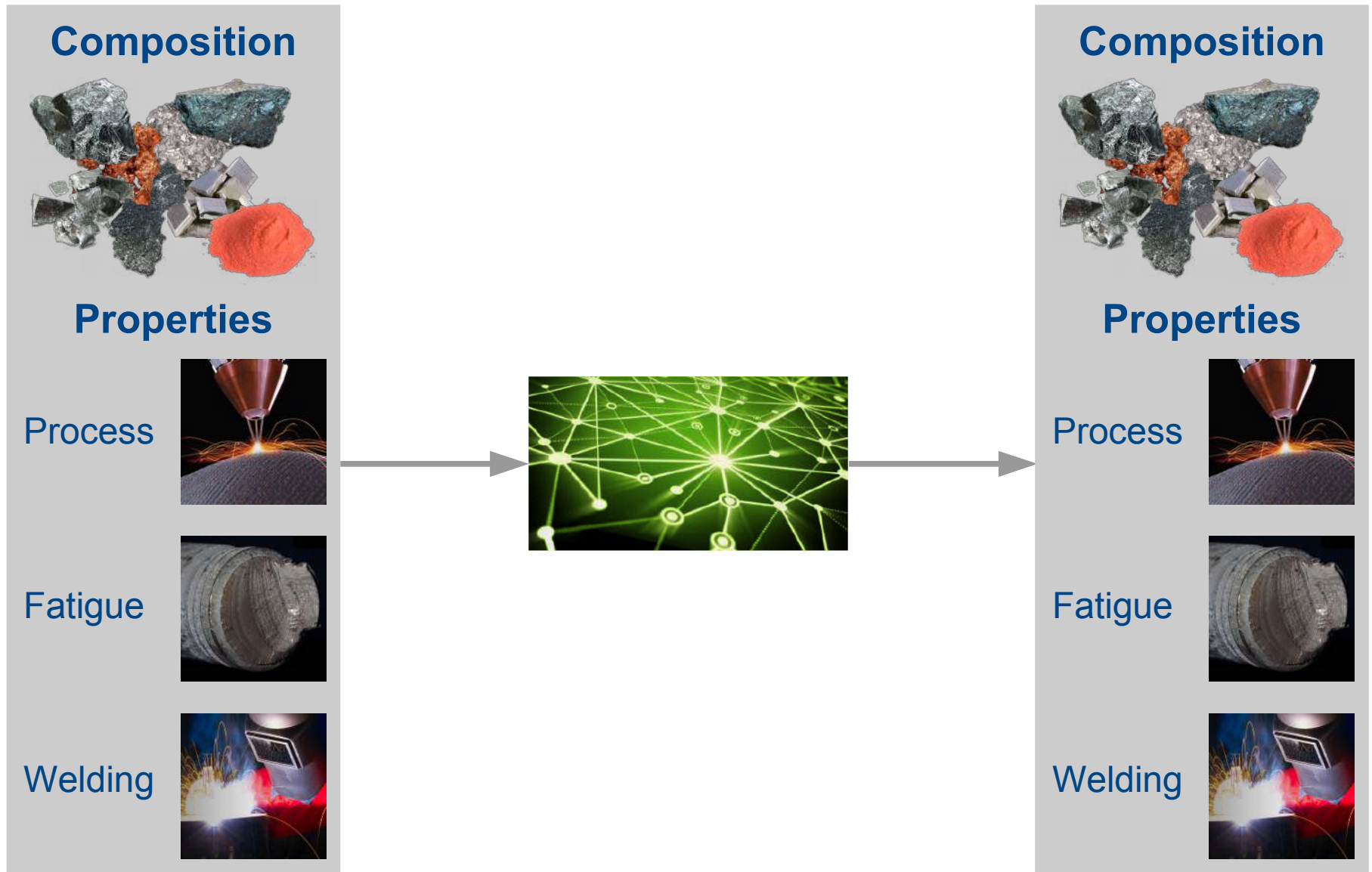
Fatigue



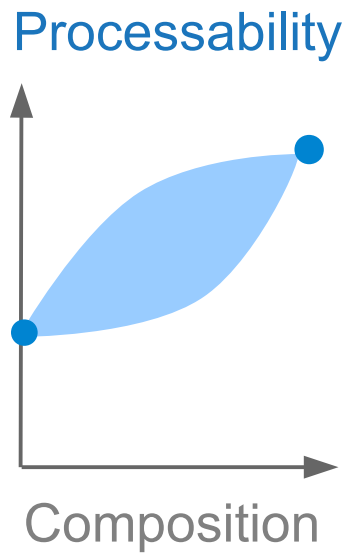
Welding



# Neural networks for materials design

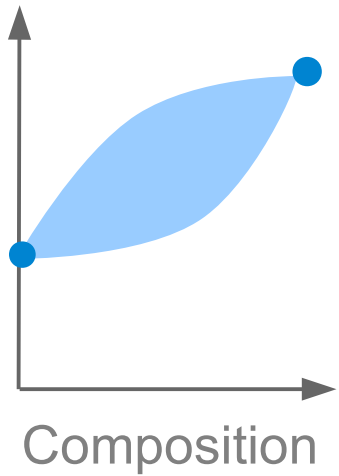


# Insufficient processability results

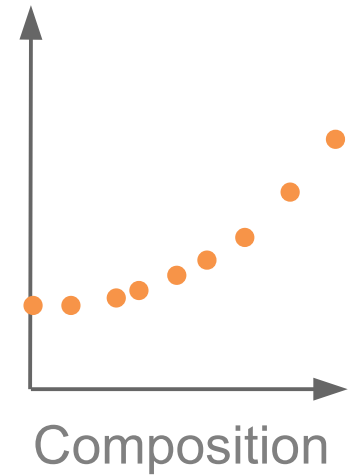


# Welding is analogous to direct laser deposition

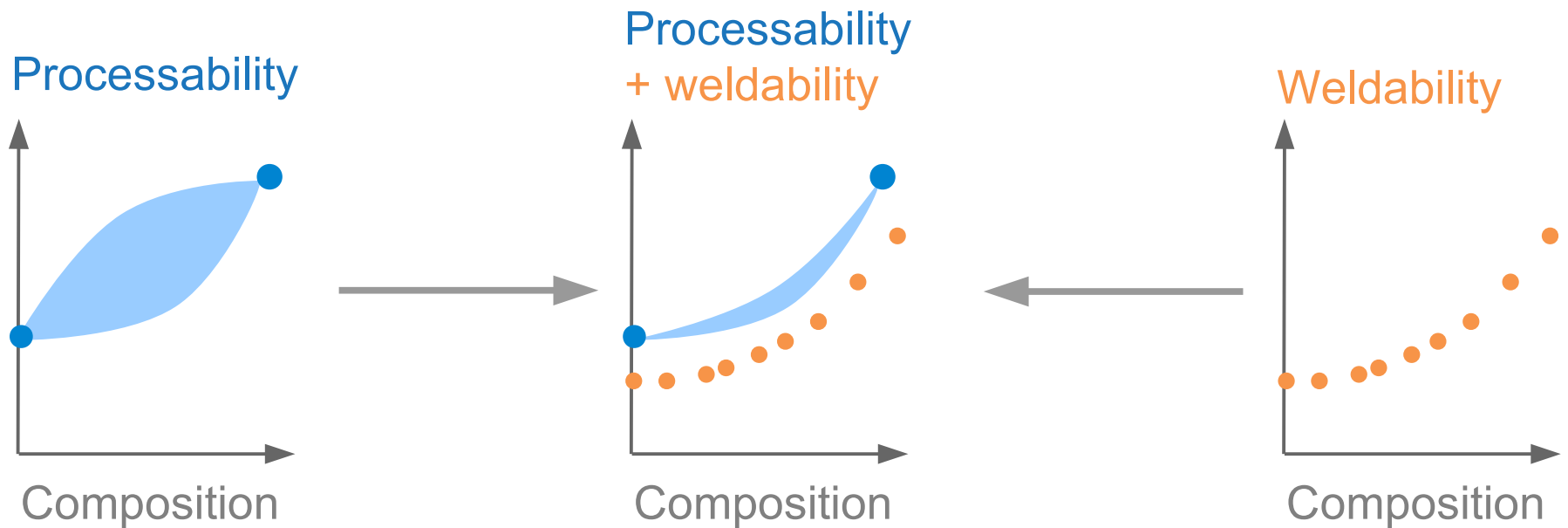
Processability



Weldability

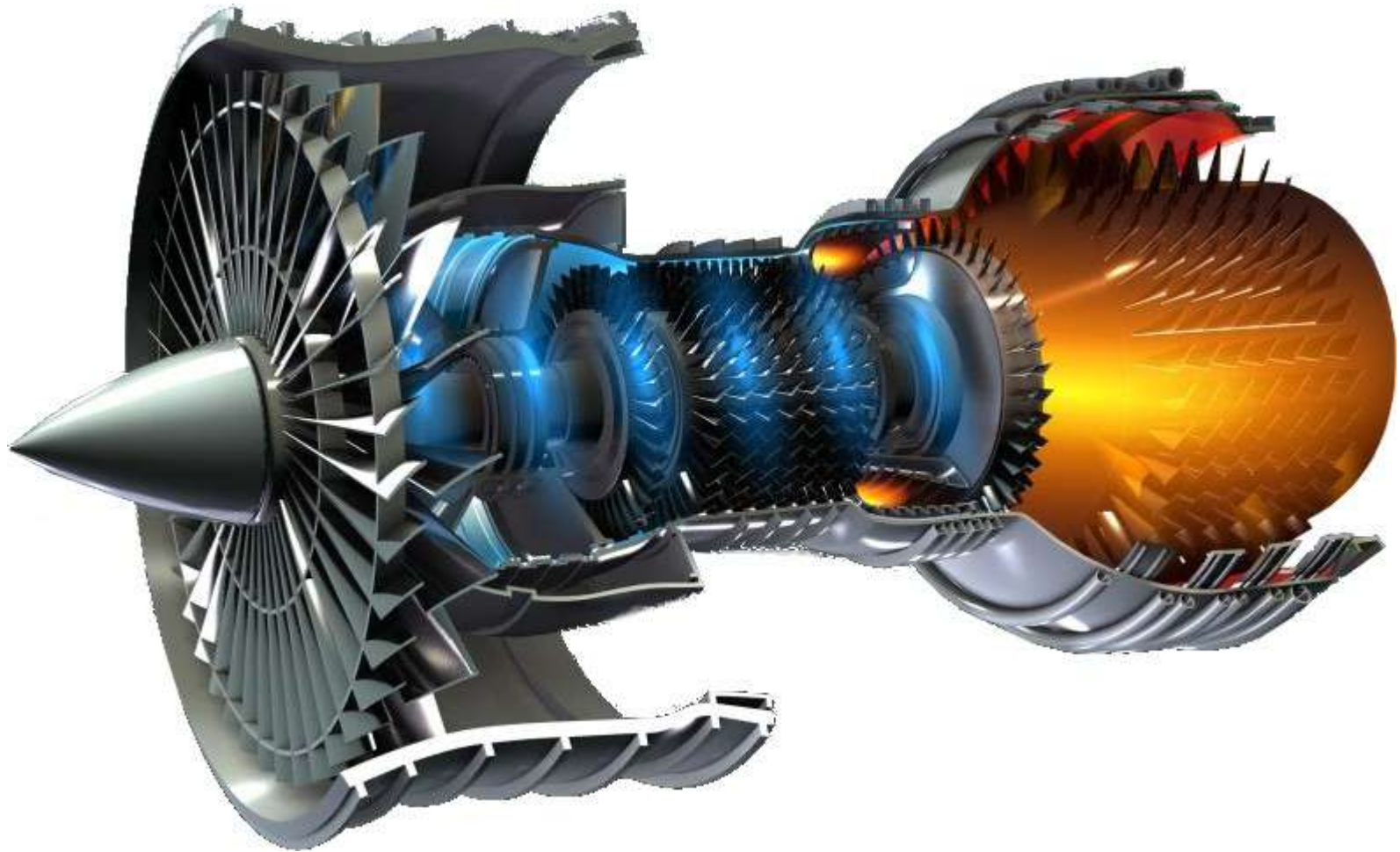


# Merging properties with the neural network





# Schematic of a jet engine



# Target properties

Elemental cost < 25 \$kg<sup>-1</sup>

Density < 8500 kgm<sup>-3</sup>

γ' content < 25 wt%

Oxidation resistance < 0.3 mgcm<sup>-2</sup>

Processability < 0.15% defects

Phase stability > 99.0 wt%

γ' solvus > 1000°C

Thermal resistance > 0.04 KΩ<sup>-1</sup>m<sup>-3</sup>

Yield stress at 900°C > 200 MPa

Tensile strength at 900°C > 300 MPa

Tensile elongation at 700°C > 8%

1000hr stress rupture at 800°C > 100 MPa

Fatigue life at 500 MPa, 700°C > 10<sup>5</sup> cycles

# Composition

Cr: 19%



Co: 4%



Mo: 4.9%



W: 1.2%



Zr: 0.05%



Nb: 3%



Al: 2.9%



C: 0.04%



B: 0.01%



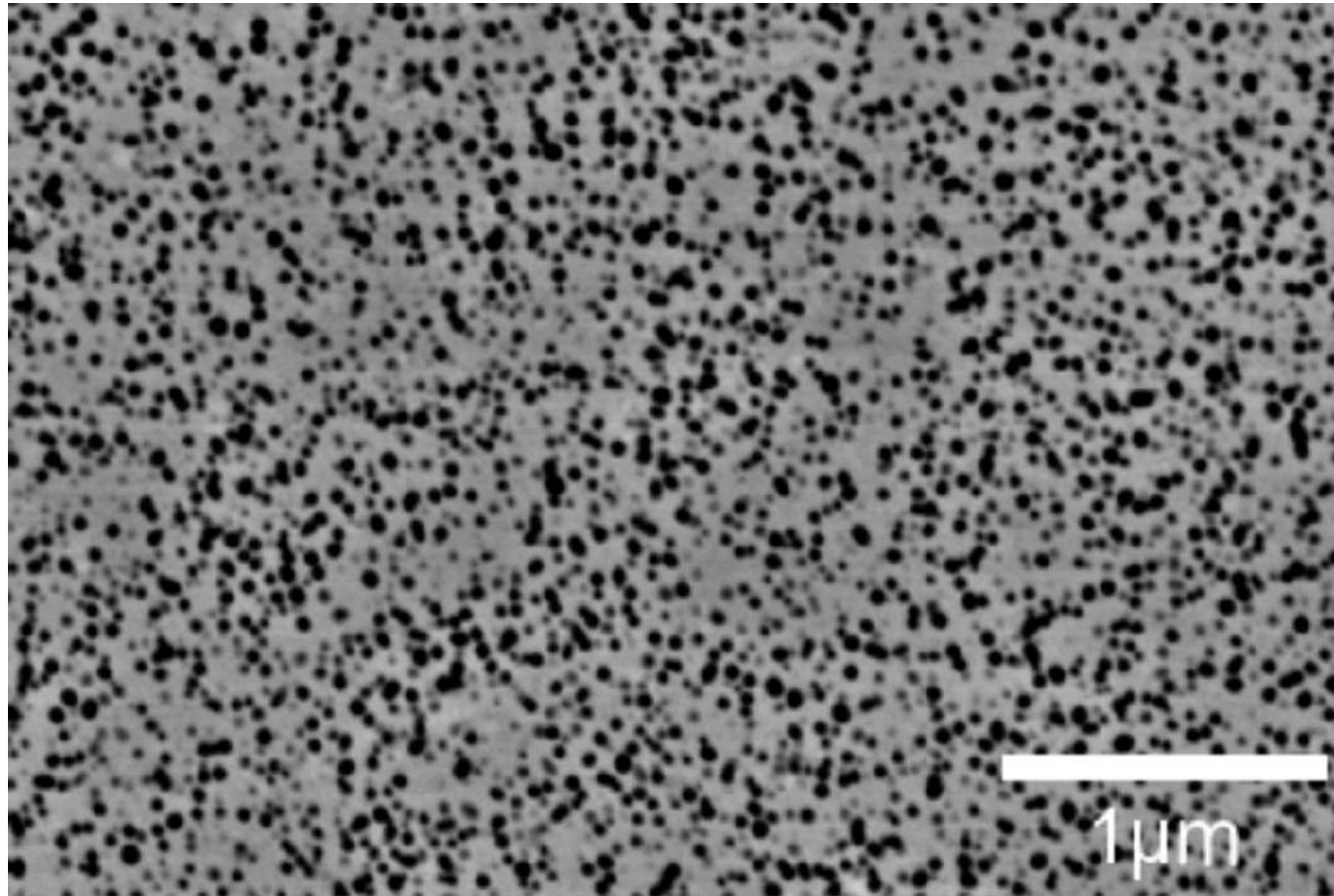
Ni



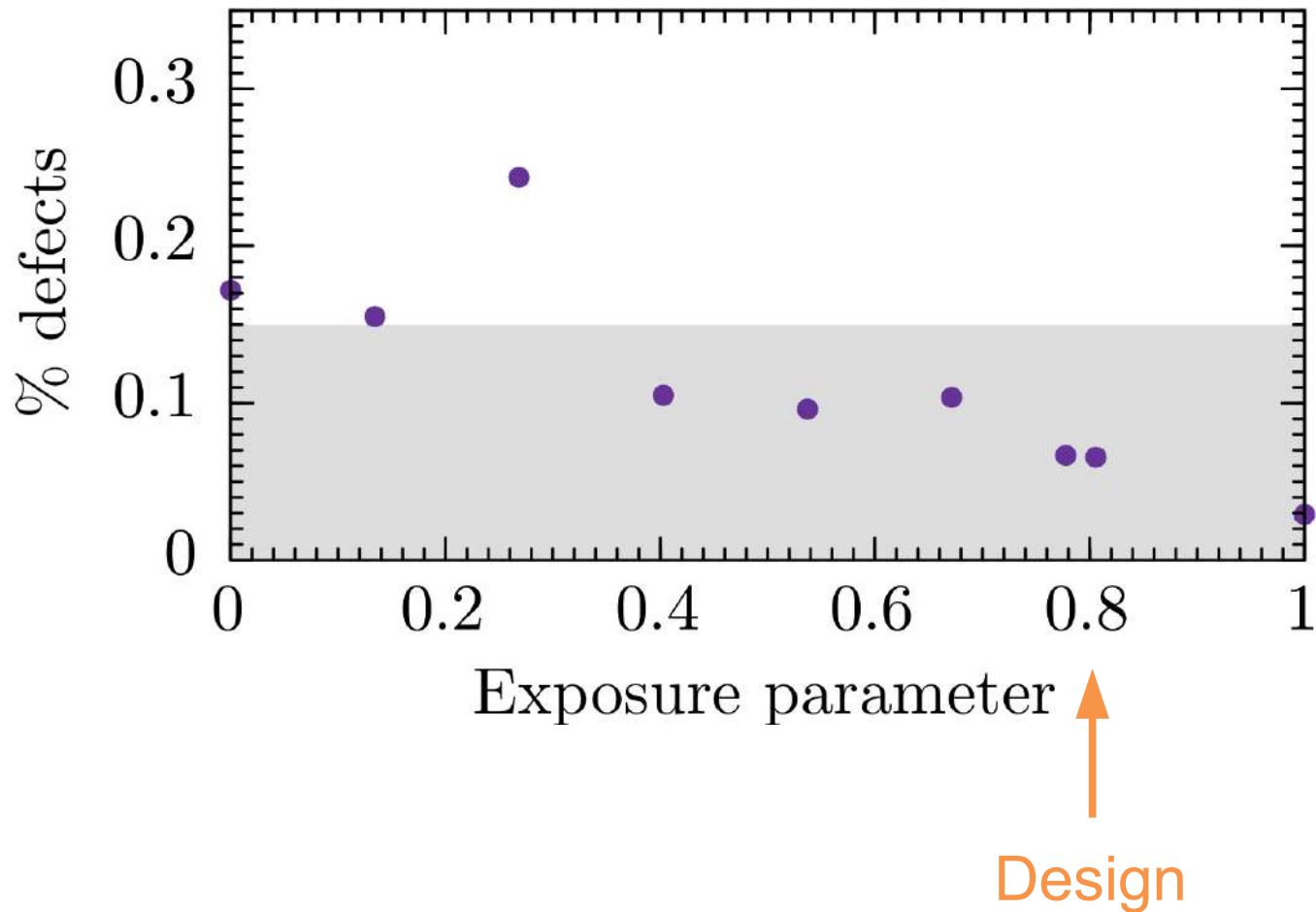
Expose 0.8



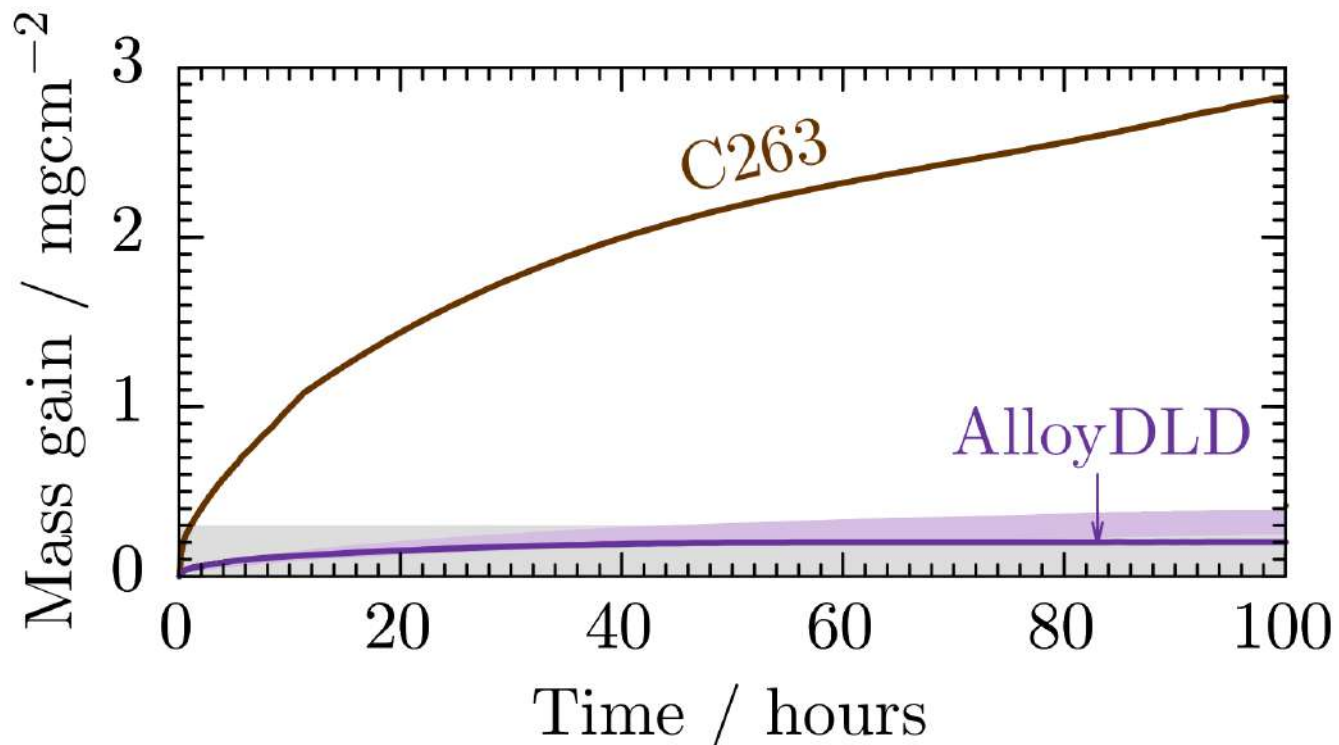
# Microstructure



# Testing the processability: horizontal printing



# Testing the oxidation resistance

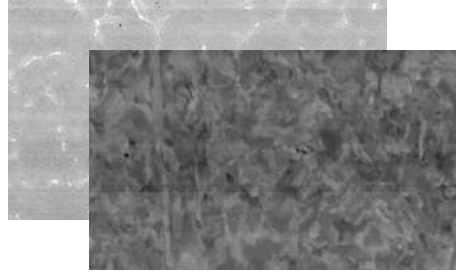


# Printing a component for an engine

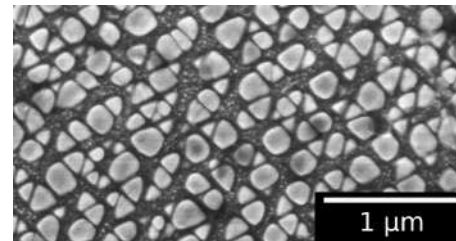


# More materials designed

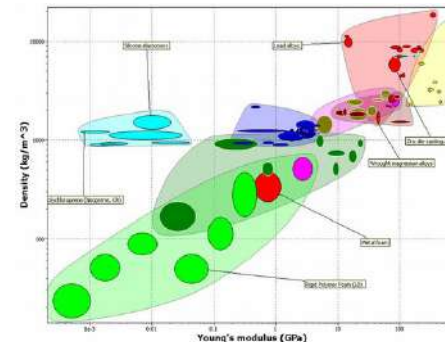
Molybdenum  
forging alloys



Ni-base alloy  
for discs



Found 192 errors in  
materials databases



**GRANTA**  
MATERIAL INSPIRATION



# even more materials designed

Battery design  
with DFT and  
experimental data



Designing lubricants  
with DFT and  
experimental data



In situ repair



# Summary

Merge different experimental quantities, physical laws, and computer simulations into a **holistic** design tool

Designed and experimentally verified alloy for **direct laser deposition**

**Generic**, applications in materials, drug design, and beyond