



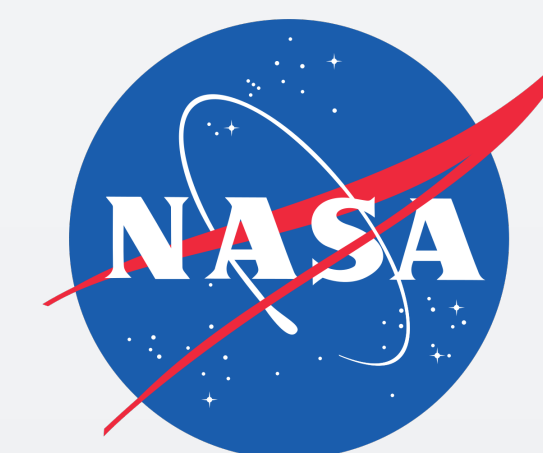
MIPAR

Image Analysis Software

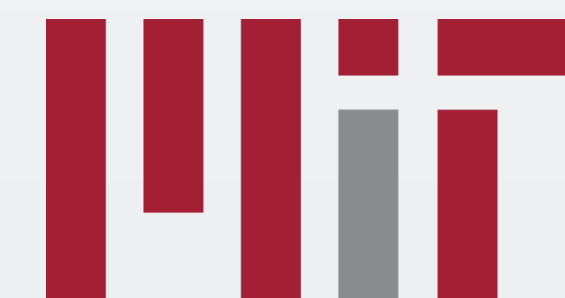
Metals characterization using deep learning
image analysis

Introduction to MIPAR

- ✓ Started in materials science
- ✓ Invented at research university
- ✓ Developed by actual users
- ✓ Spun-out in 2017
- ✓ 100s of schools and companies
- ✓ In over 40 countries



PennState



NATIONWIDE
CHILDREN'S



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UNIVERSITY

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MEDICINE

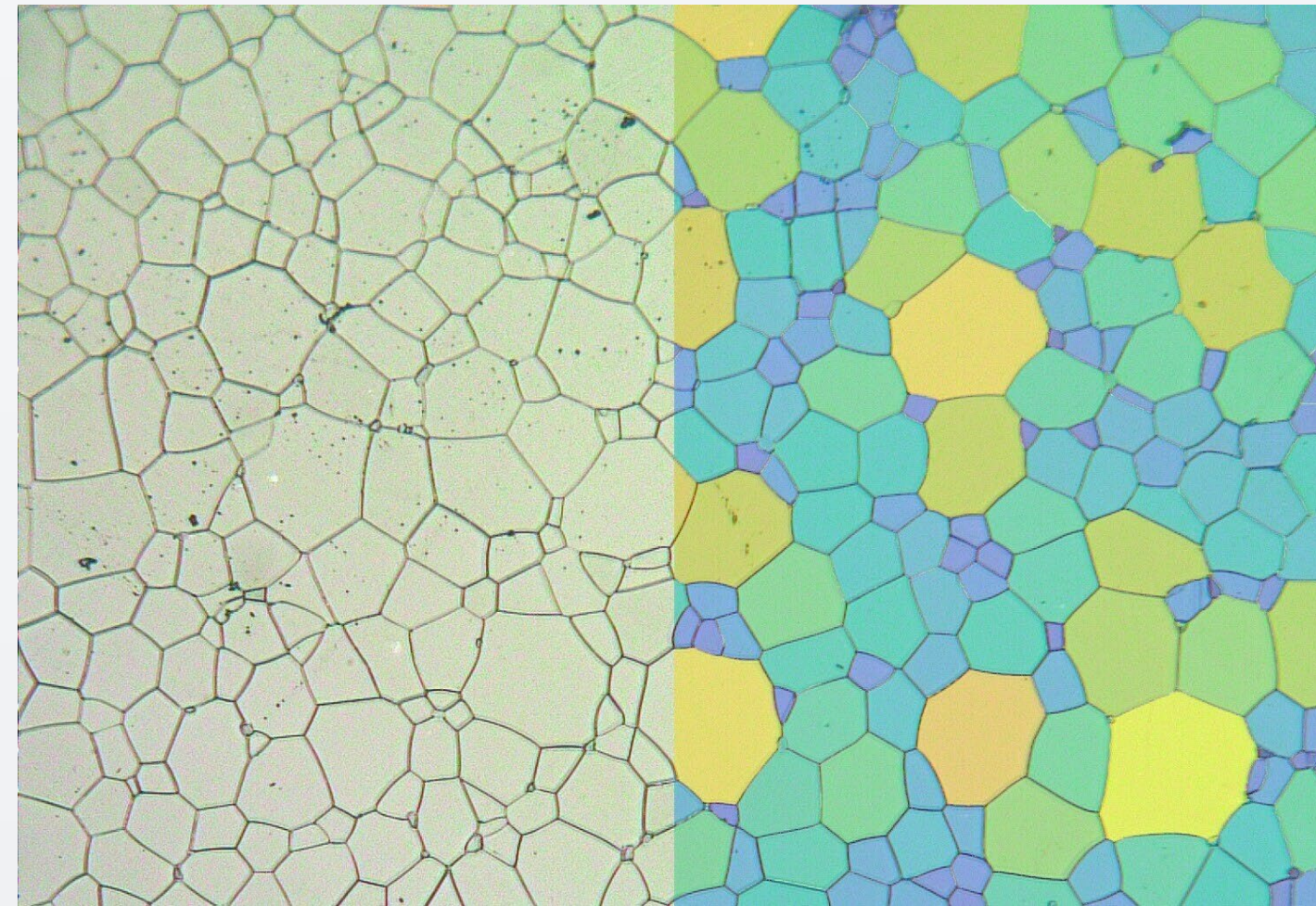
DARTMOUTH



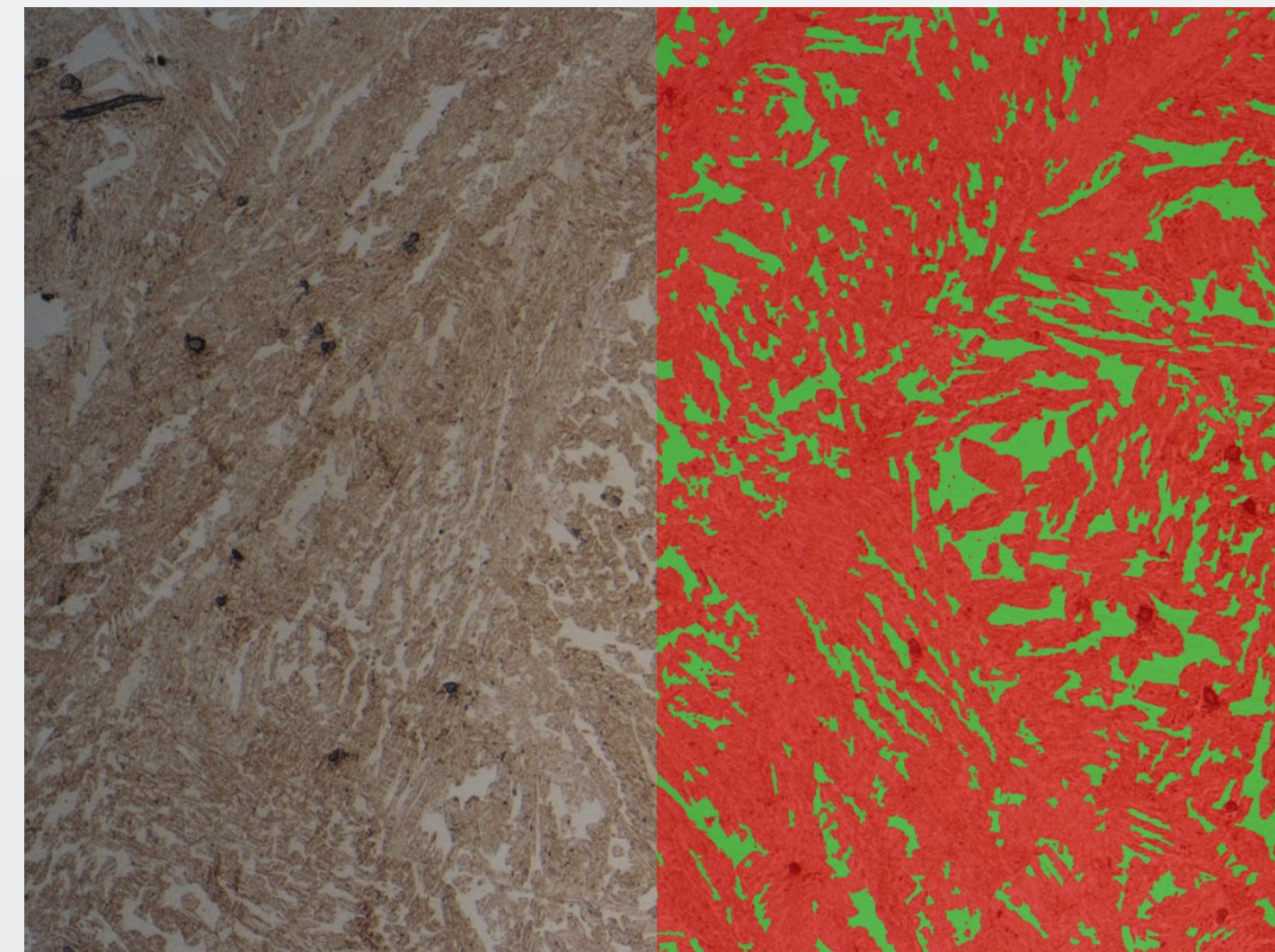
STEVENS
INSTITUTE of TECHNOLOGY
THE INNOVATION UNIVERSITY®

What is possible with Image Analysis for Metals Characterization?

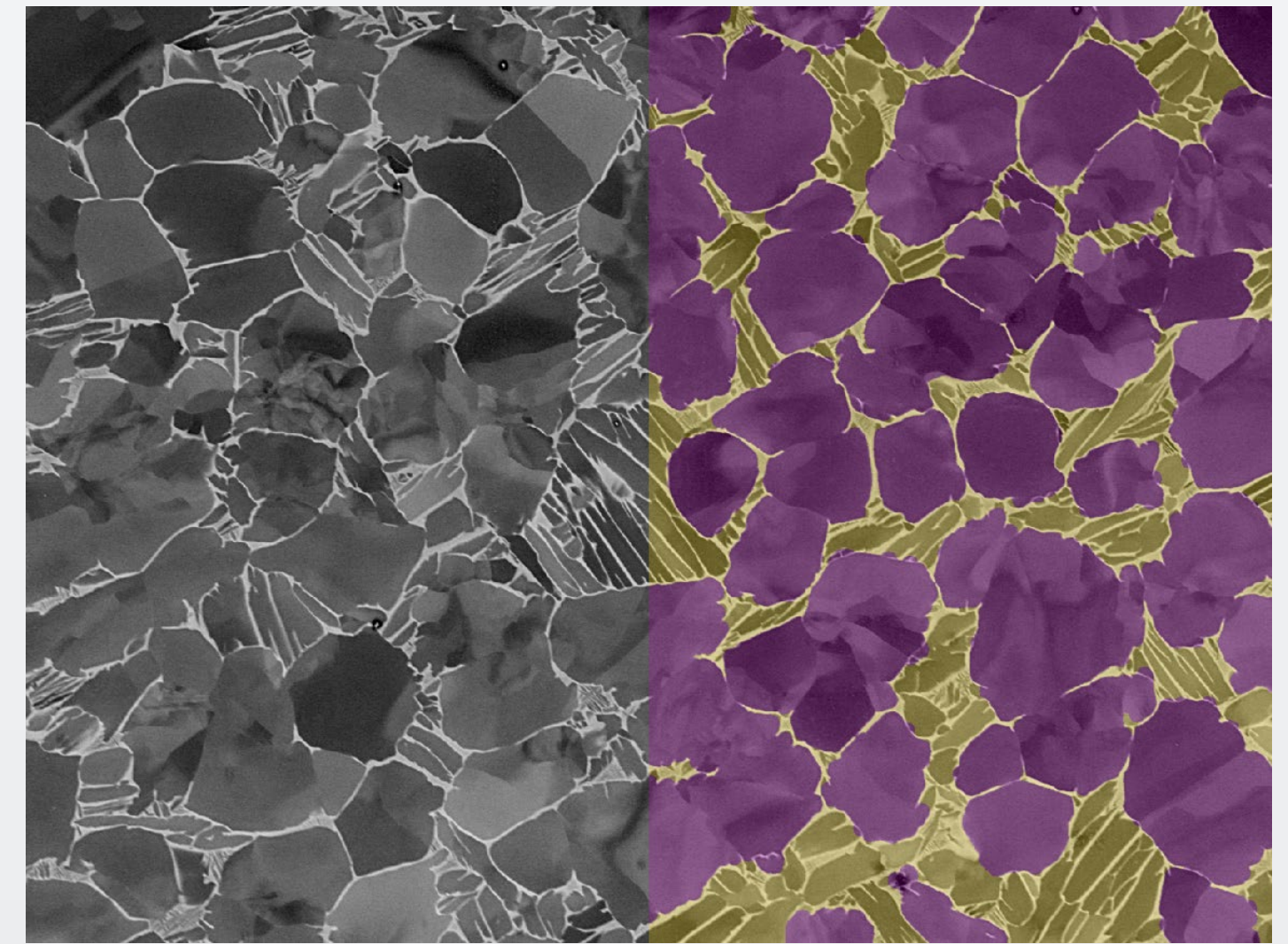
- ✓ Phase Analysis
- ✓ Grain Size Analysis
- ✓ Porosity Analysis
- ✓ Inclusions Analysis
- ✓ Layer Thickness Analysis
- ✓ Particle Analysis
- ✓ Defect Analysis
- ✓ Many more...



Copper alloy grain size measurement following ASTM E-112 standard.



Segments ferrite from surrounding martensite in martensitic stainless steel weld cross-sections.

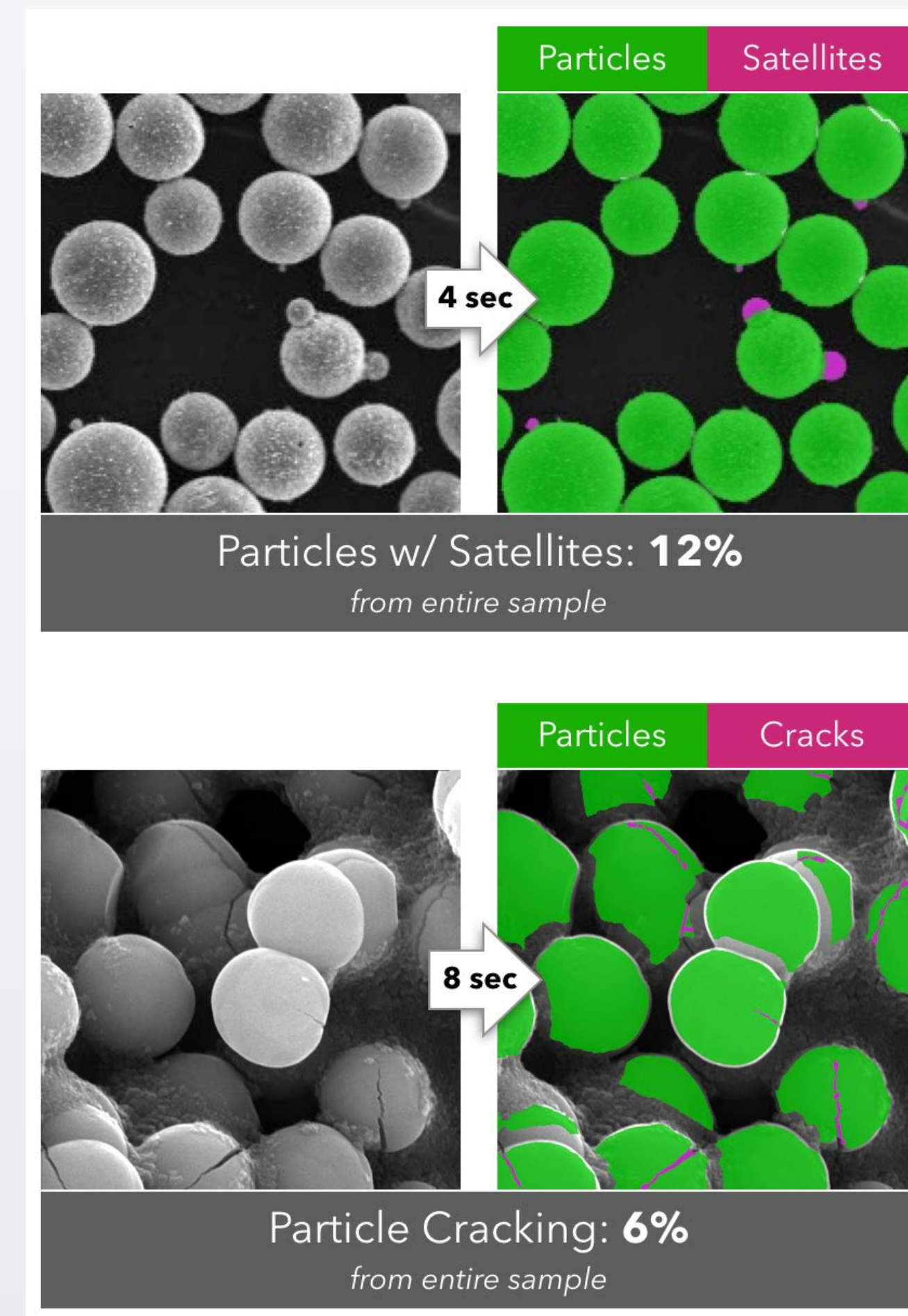


Segments rounder particles from acicular features in $[\alpha+\beta]$ -processed Ti-alloy microstructures.

Analysis Challenges

Challenges:

- Image analysis expertise
- Operator bias
- Long analysis time
- Low accuracy and reproducibility
- Difficult, complicated images
- Noisy microstructures
- Poor sample prep (scratches)
- Ambiguous feature boundaries
- Wide variety of contrast conditions
- Features of similar grey values
- Poor contrast



Deep learning addresses all these challenges, it improves image analysis, increases accuracy and throughput, without any image analysis expertise.



Power: Solve problems others can't, thanks to powerful Recipes



Speed: Solve problems faster with intuitive design and batch processing



Versatility: Solve problems across many application areas



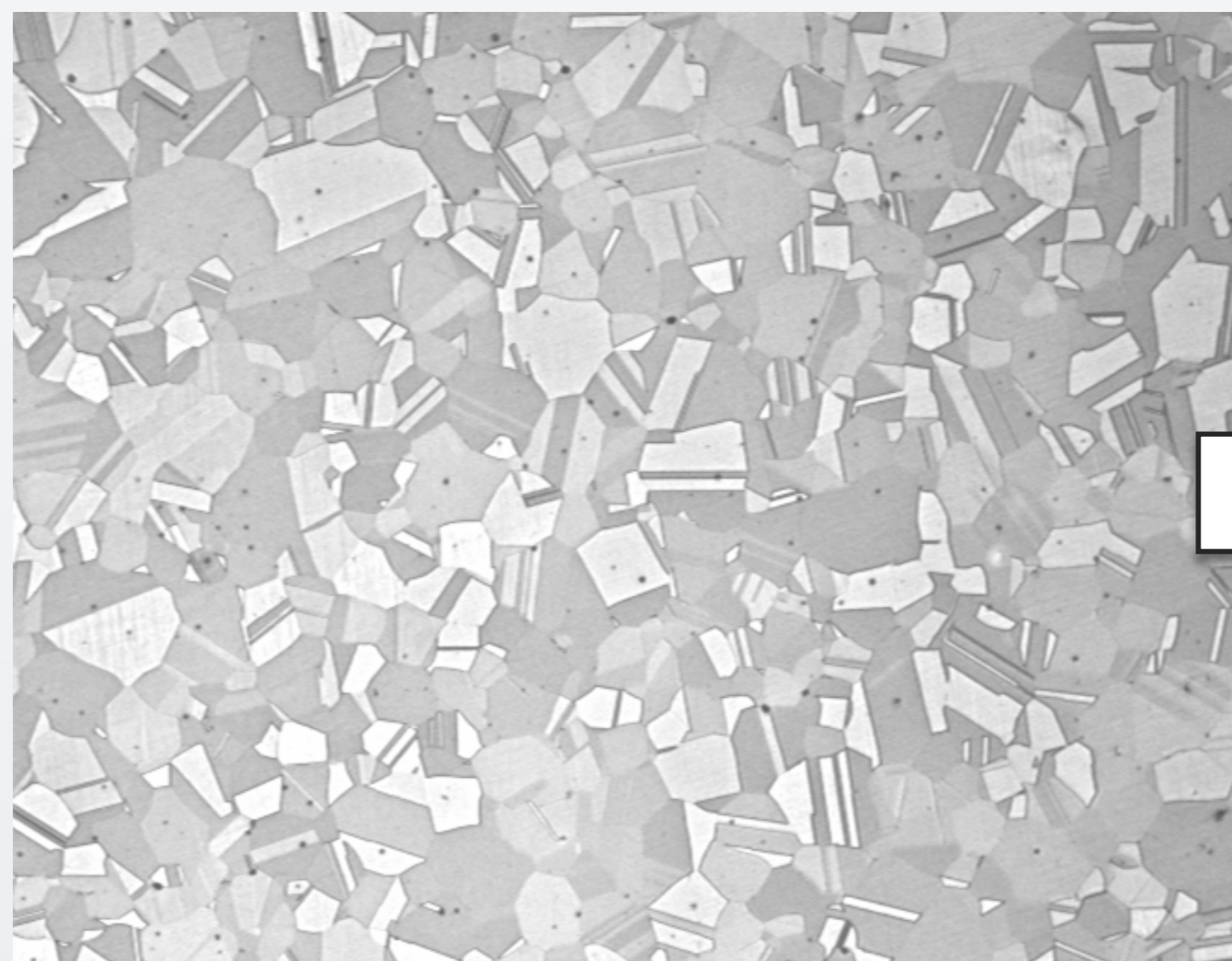
Objectivity: Reduce subjectivity in analysis using the Optimization Engine



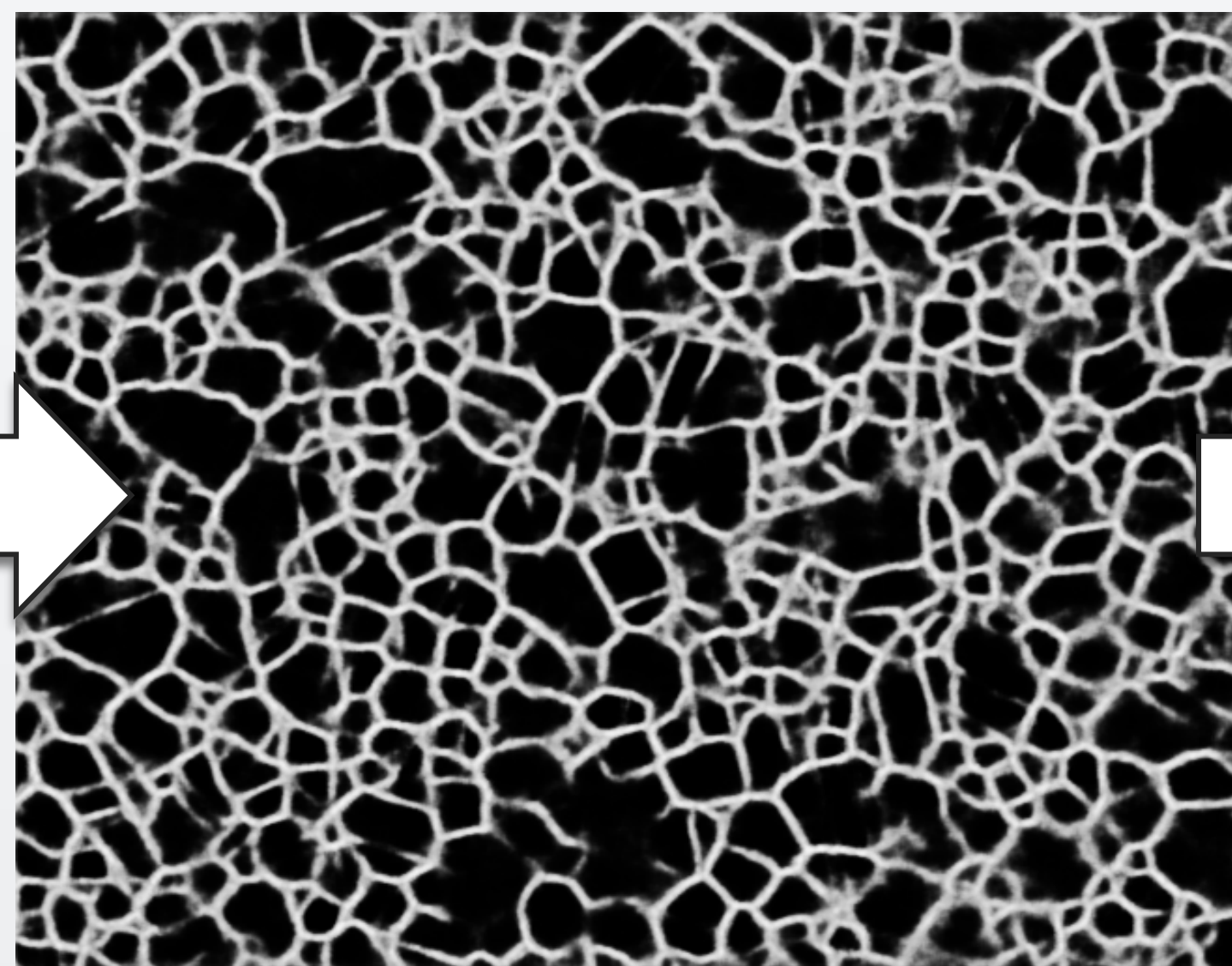
Expertise: Call on experts to rapidly deliver custom solutions

Grain Analysis - Twinned Grains in Brass

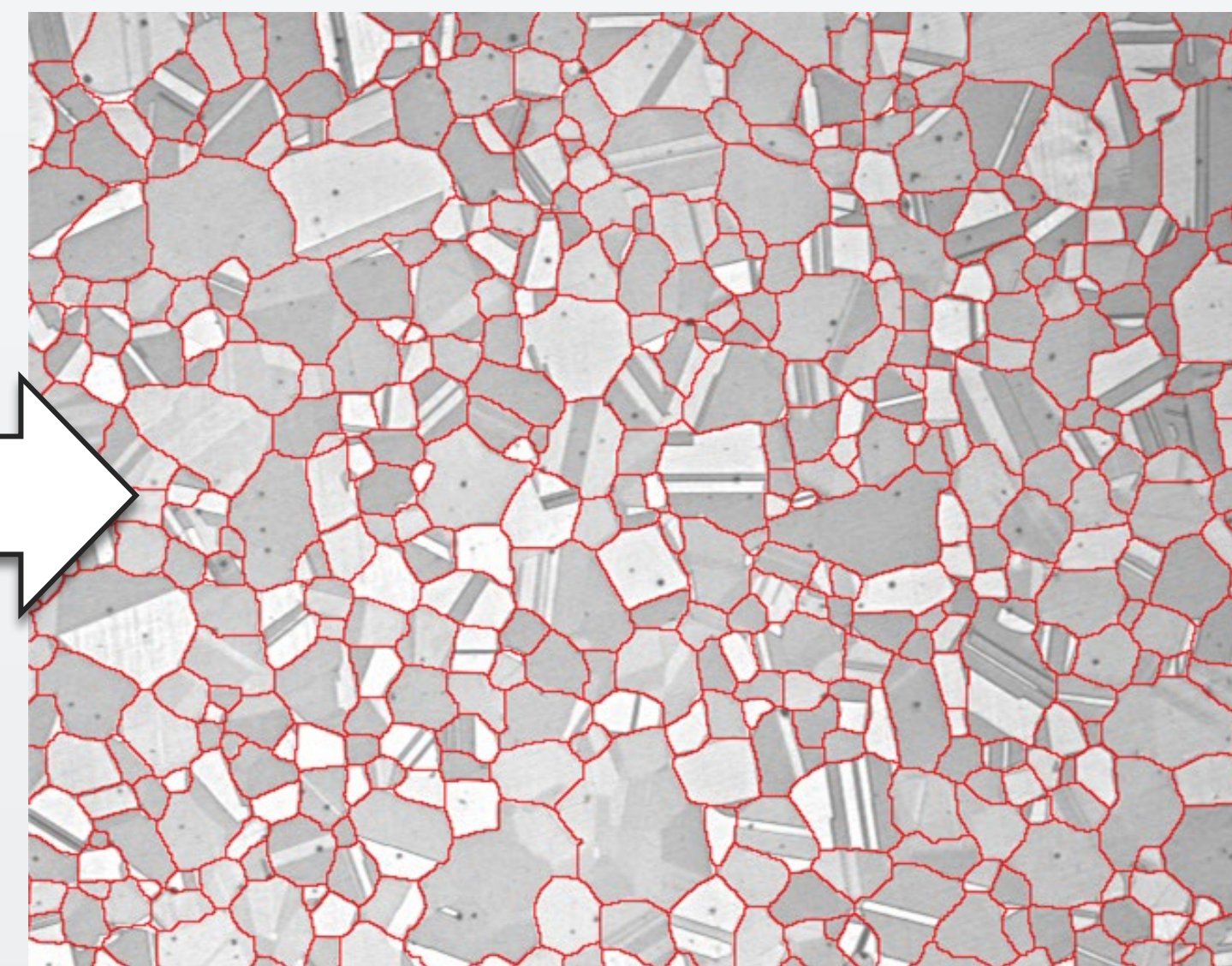
Original Image



Deep Learning Applied



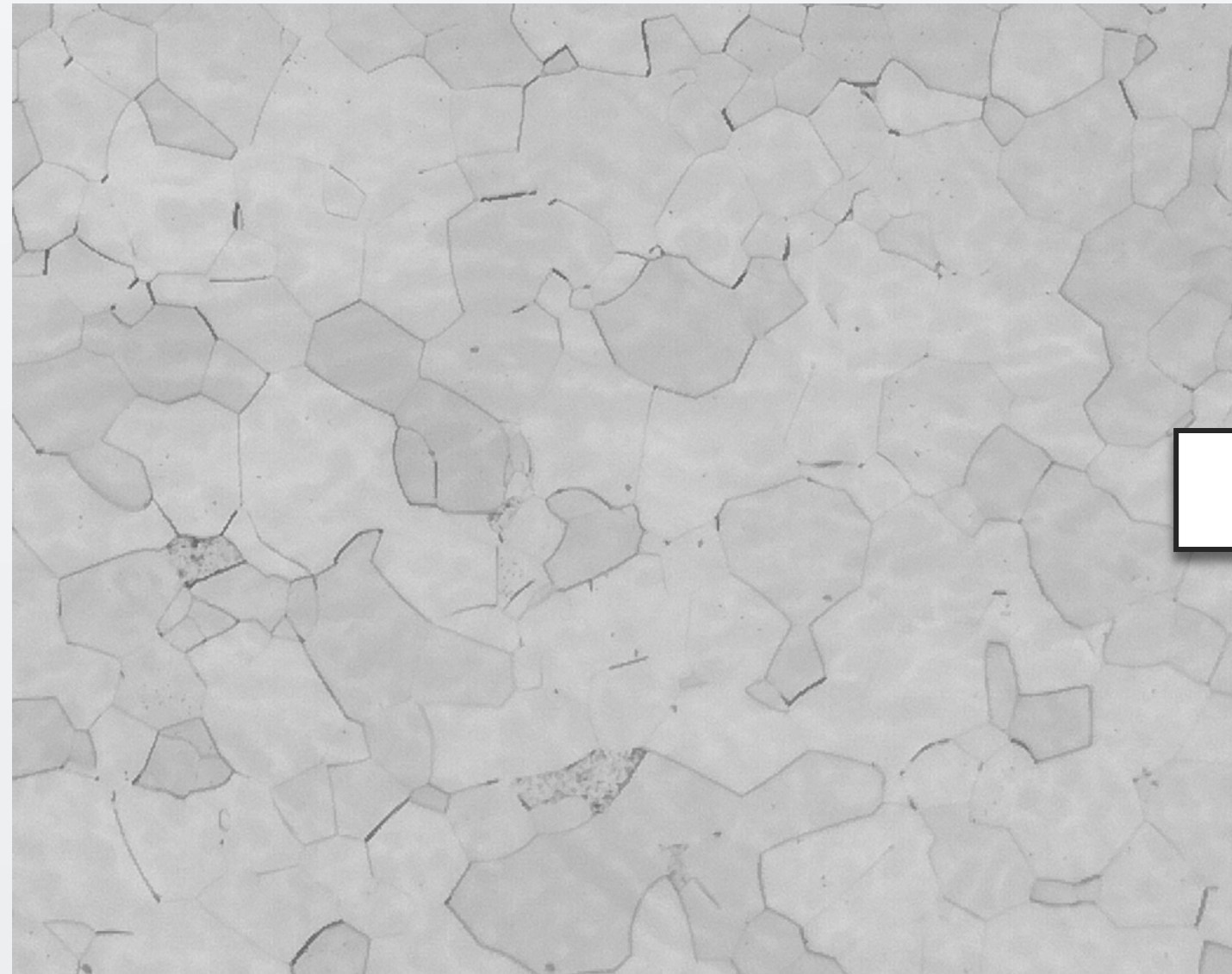
Final Segmentation



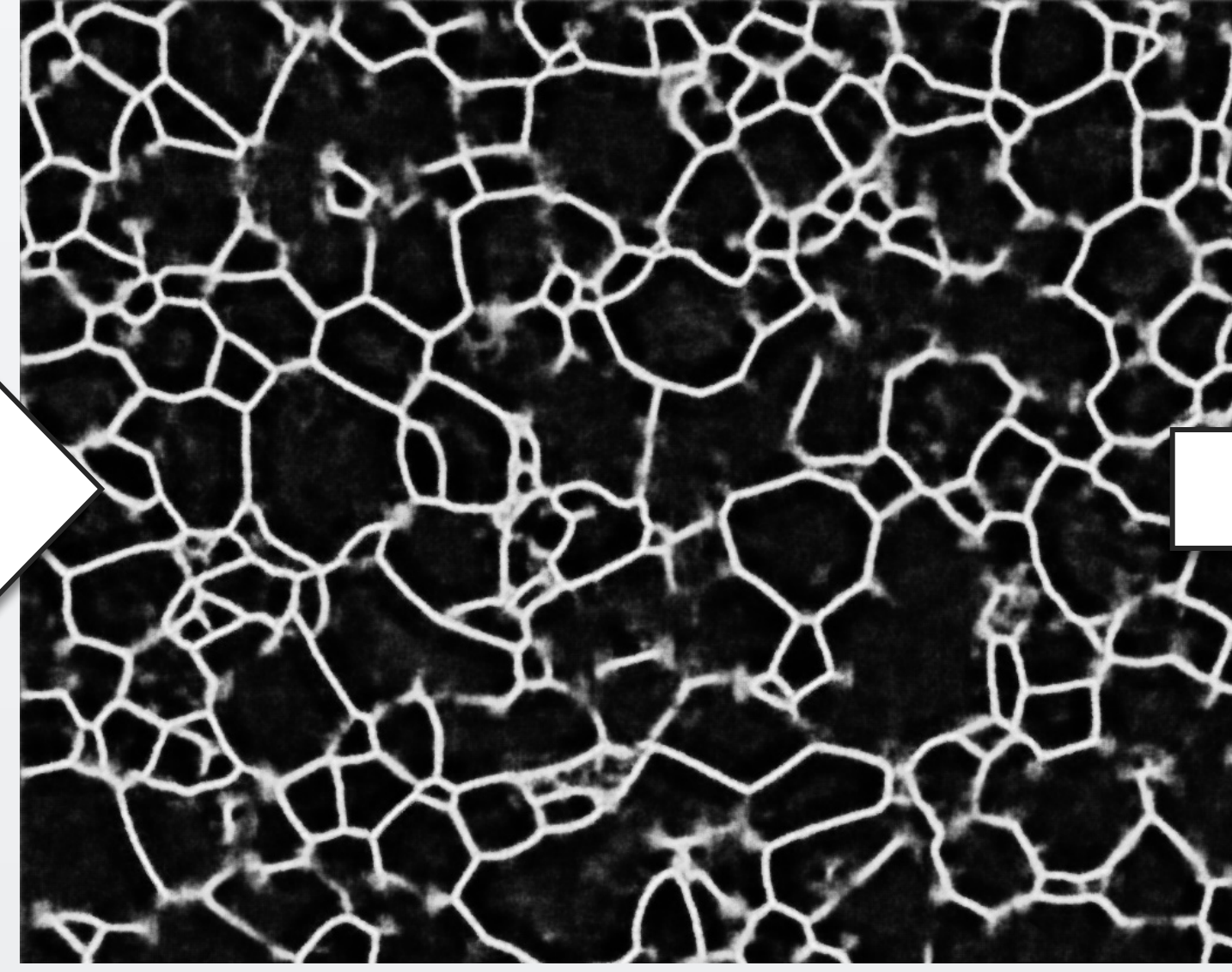
- ✓ Automated measurement of complex grains despite poor contrast
- ✓ Replace manual tracing
- ✓ Deep learning enables highly complex classification

Grain Analysis – Beta grains in Titanium

Original Image



Deep Learning Applied



Final Segmentation



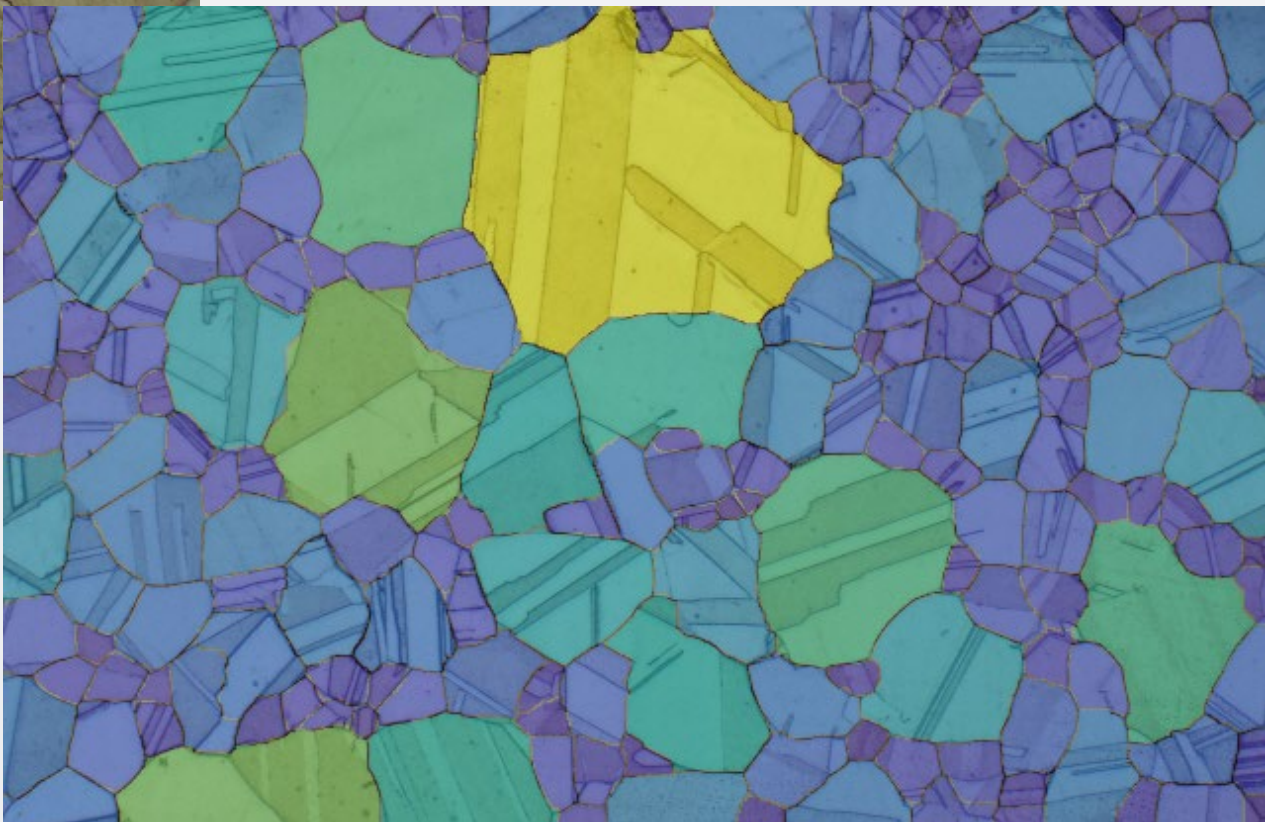
- ✓ Accurately detects beta grains despite very faint contrast
- ✓ Grain mean size and distribution measurements possible

Grain Analysis – Copper Alloy

Original



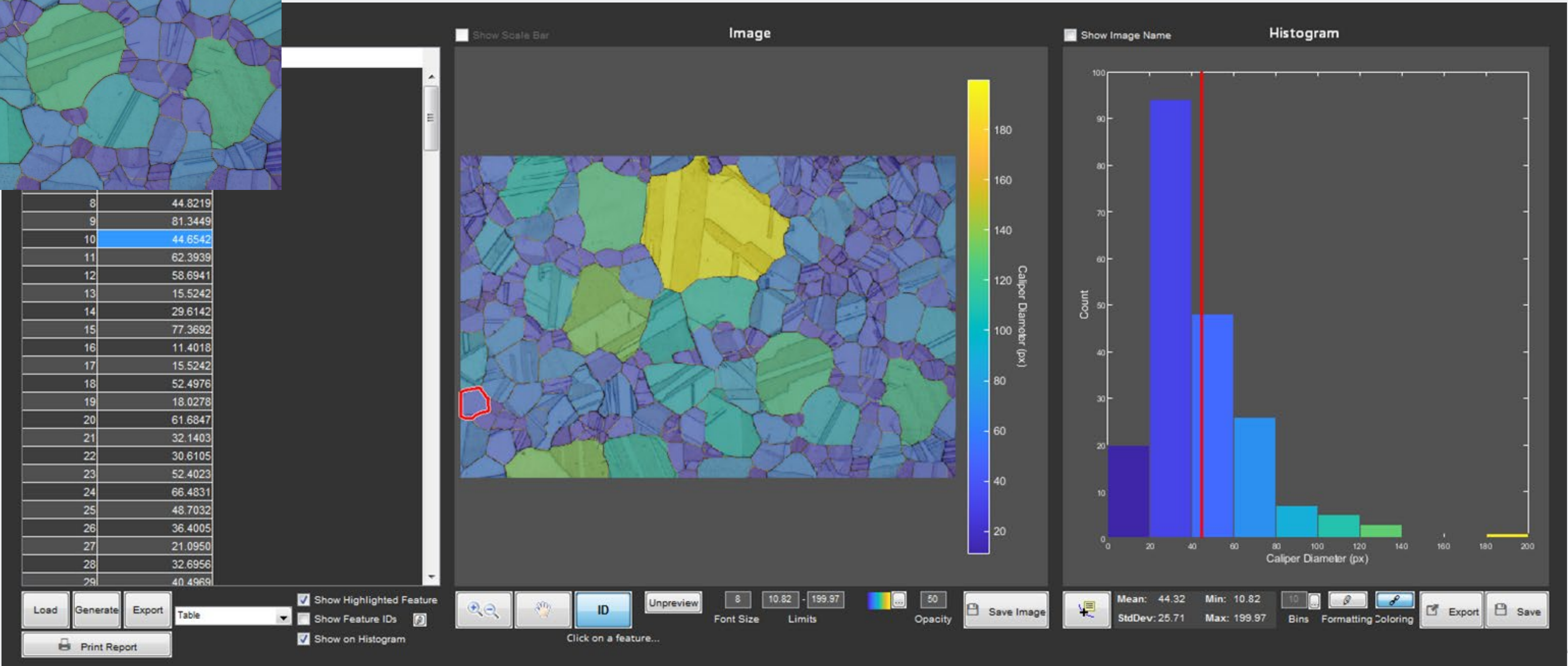
Identified Grains



✓ Measurements meet ASTM-E112 grain size guidelines

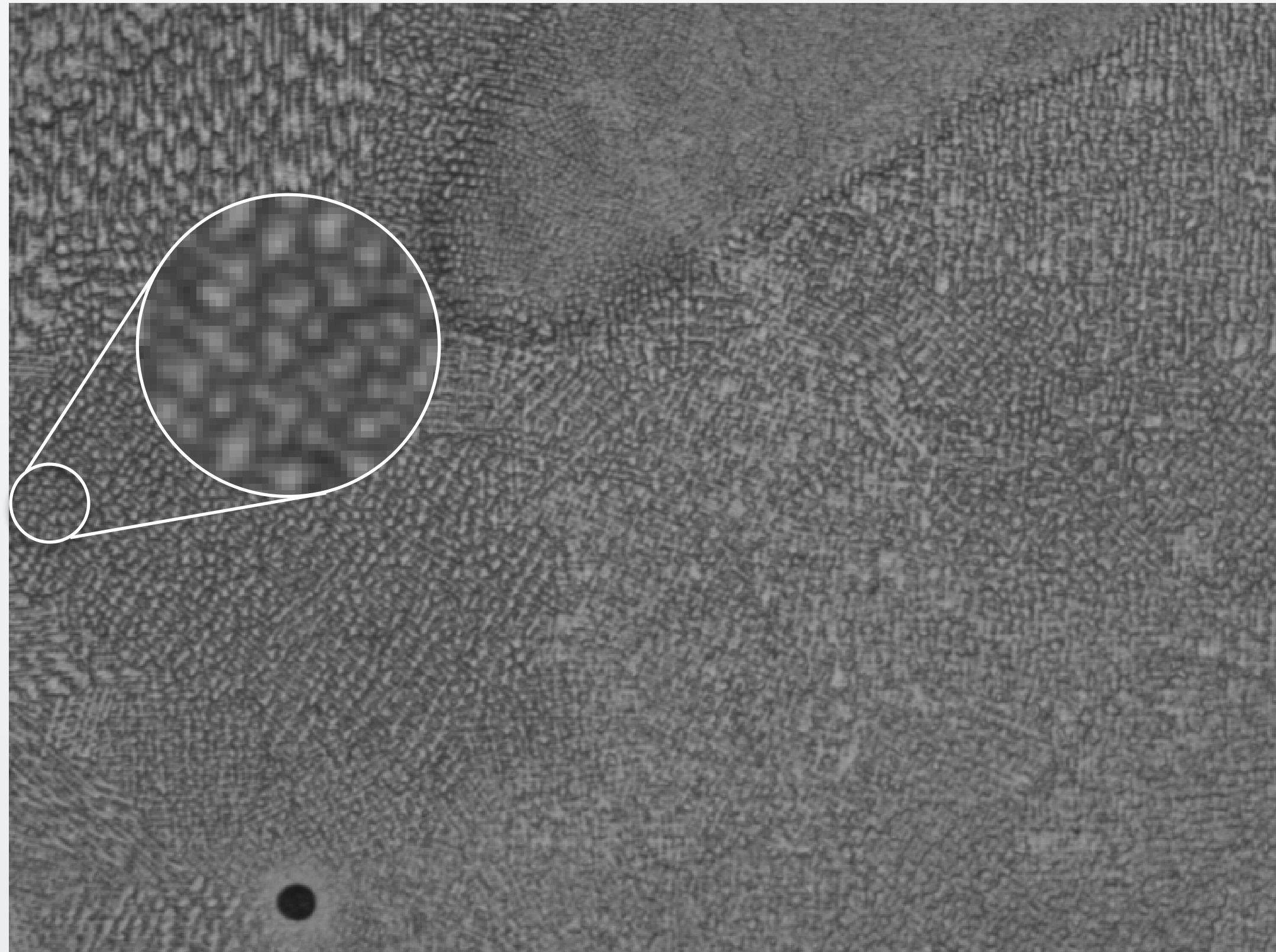
✓ Automated, unbiased results

Grain Size Measurements

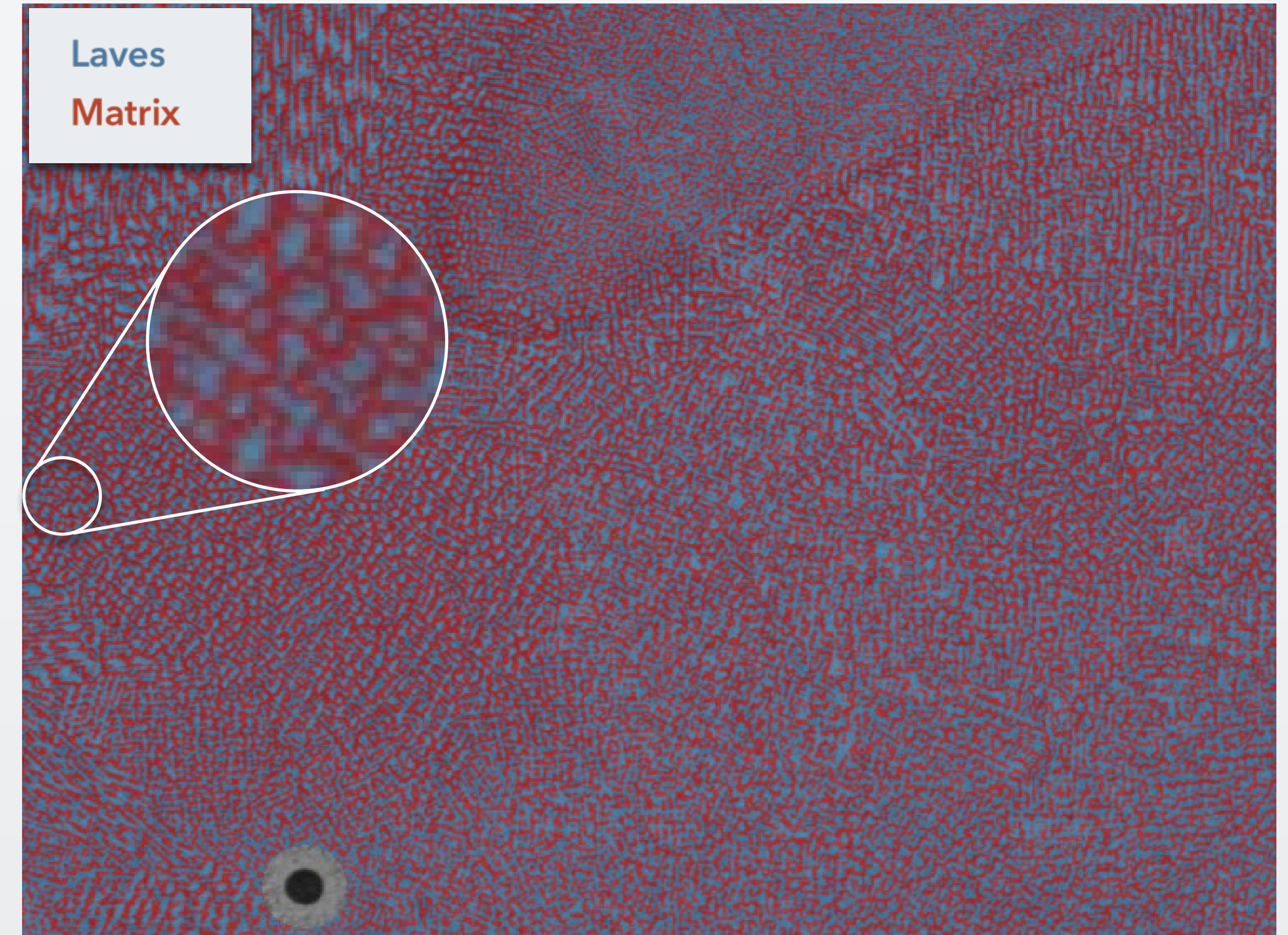


Phase Analysis – Laves in Inconel

Original



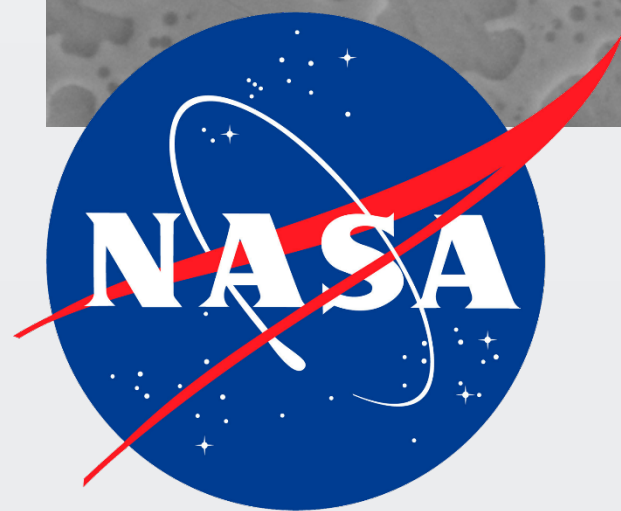
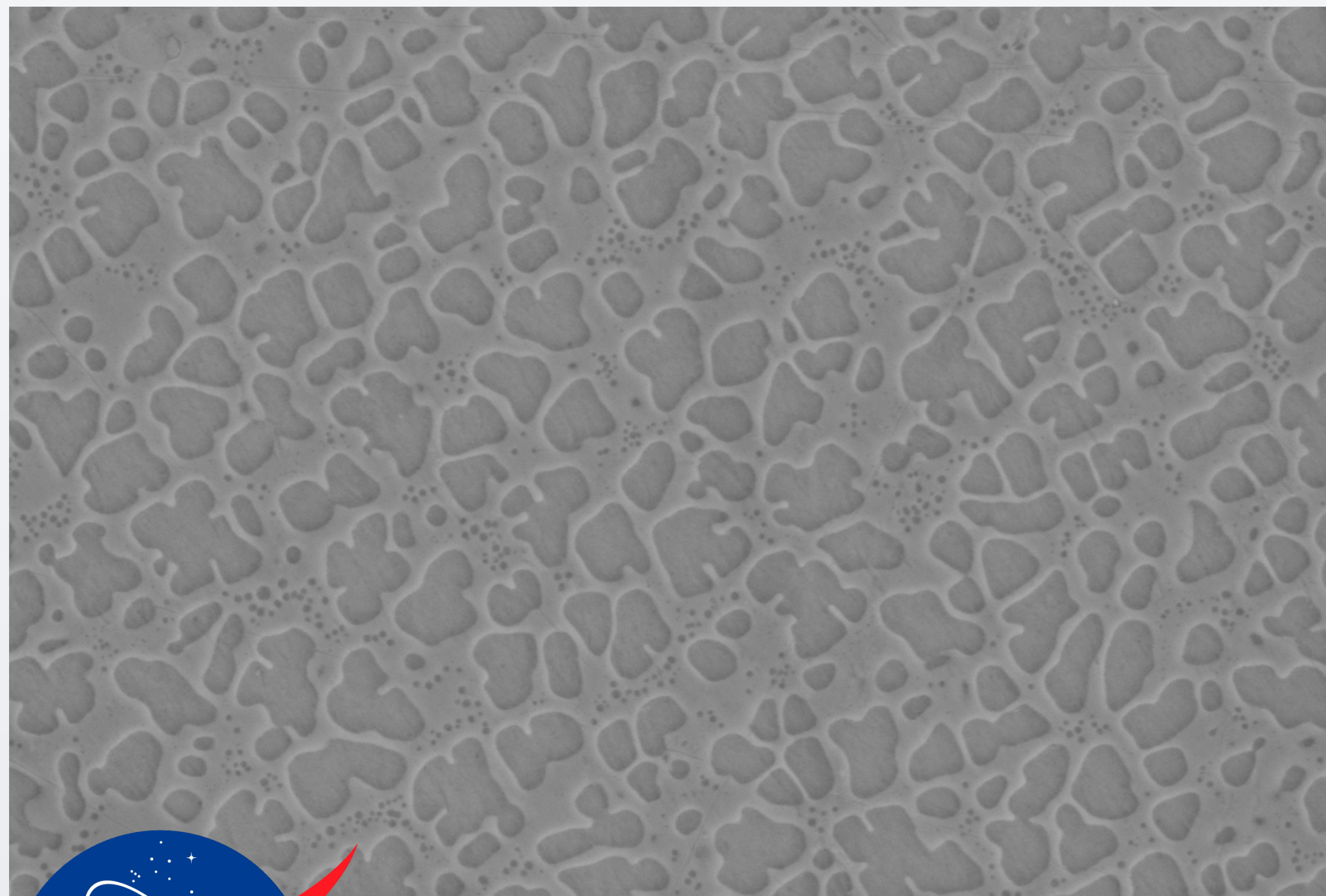
Phase Detection



- ✓ Phase fraction can be measured
- ✓ Challenging ultra-fine laves phase detected
- ✓ Robust recipe ignores pores and defects

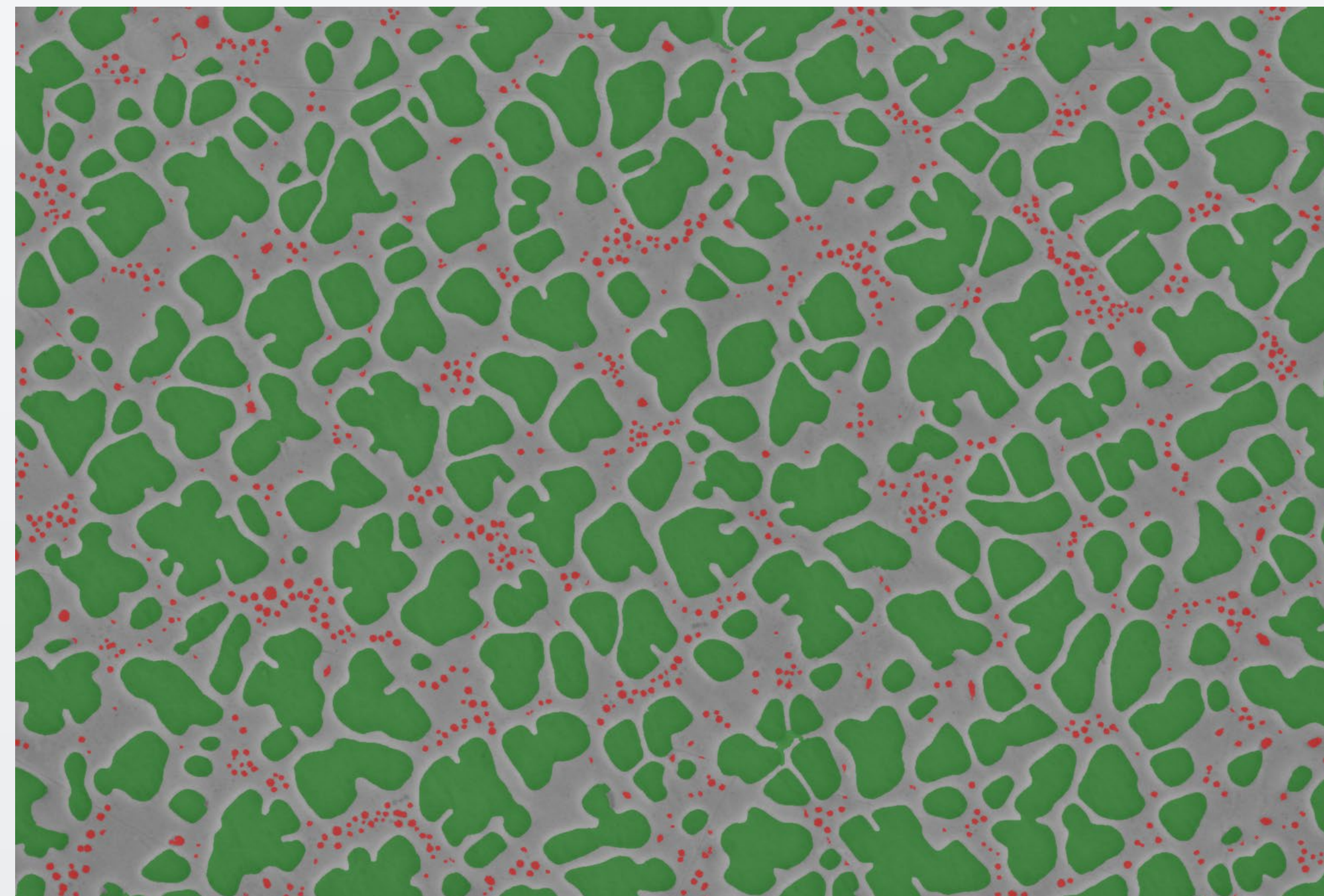
Phase Analysis – Particles in Nickel-base Superalloy

Original



T.M. Smith, P. Bonacuse, J. Sosa, M. Kulis, L. Evans, *A quantifiable and automated volume fraction characterization technique for secondary and tertiary γ' precipitates in Ni-based superalloys*, Materials Characterization, Volume 140, 2018, Pages 86-94

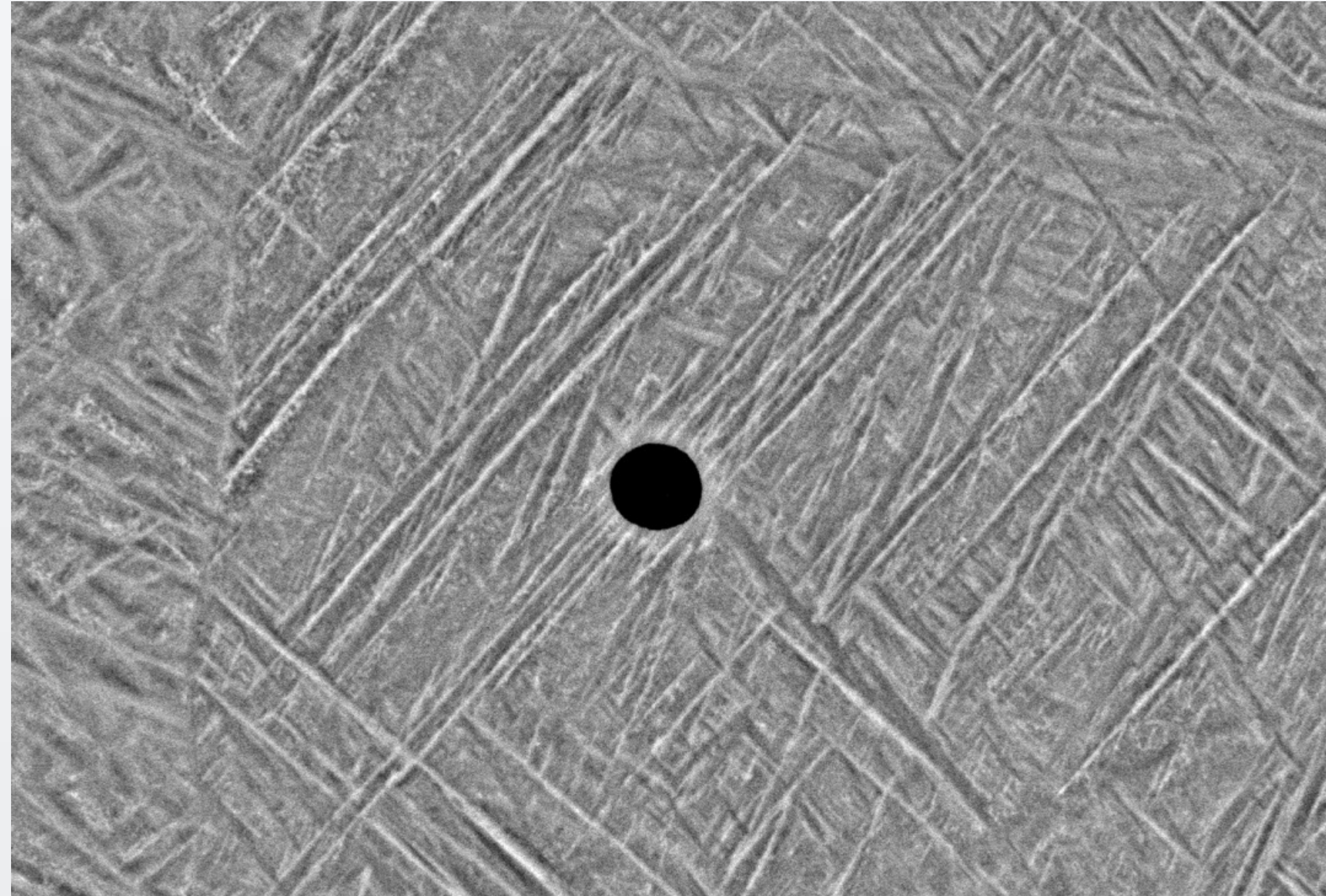
Particle detection



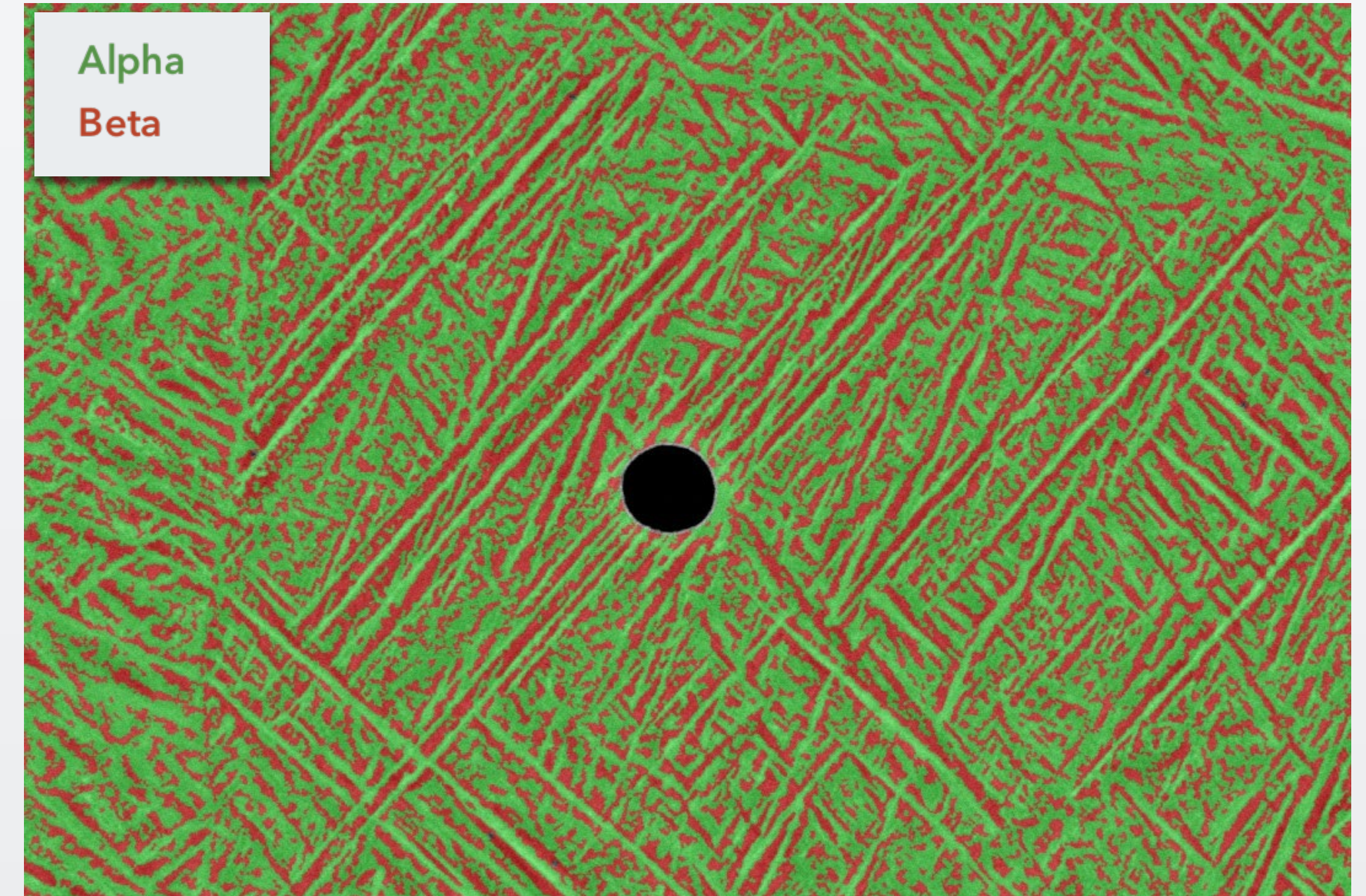
- ✓ Area fraction can be measured
- ✓ Tough to distinguish particles segmented
- ✓ Fully automated workflow

Phase Analysis – Alpha and Beta in Titanium

Original



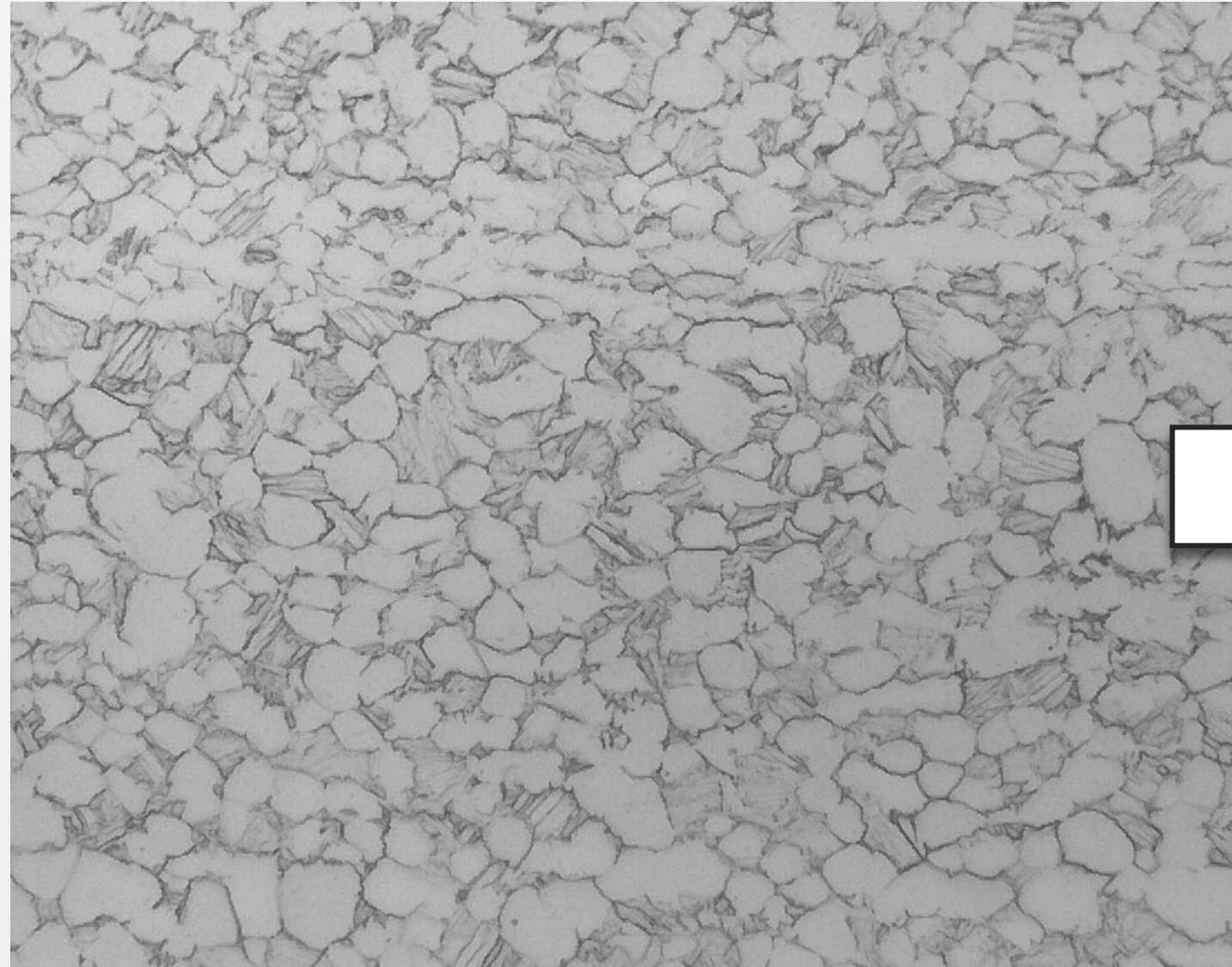
Phase Detection



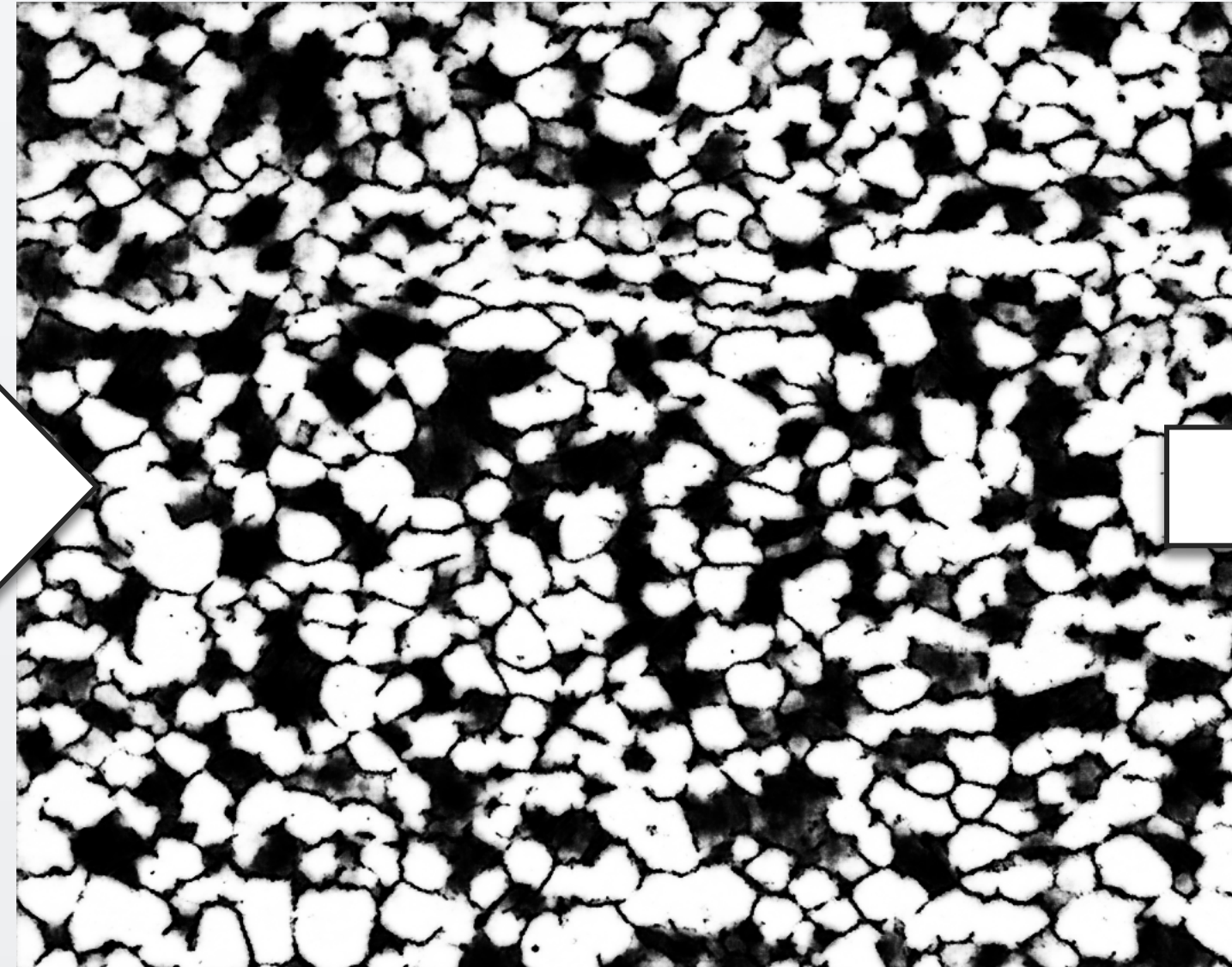
- ✓ Phase fraction can be measured
- ✓ Complex alpha and beta phases detected
- ✓ Robust recipe ignores pores and defects

Morphology Classification - Globular Alpha

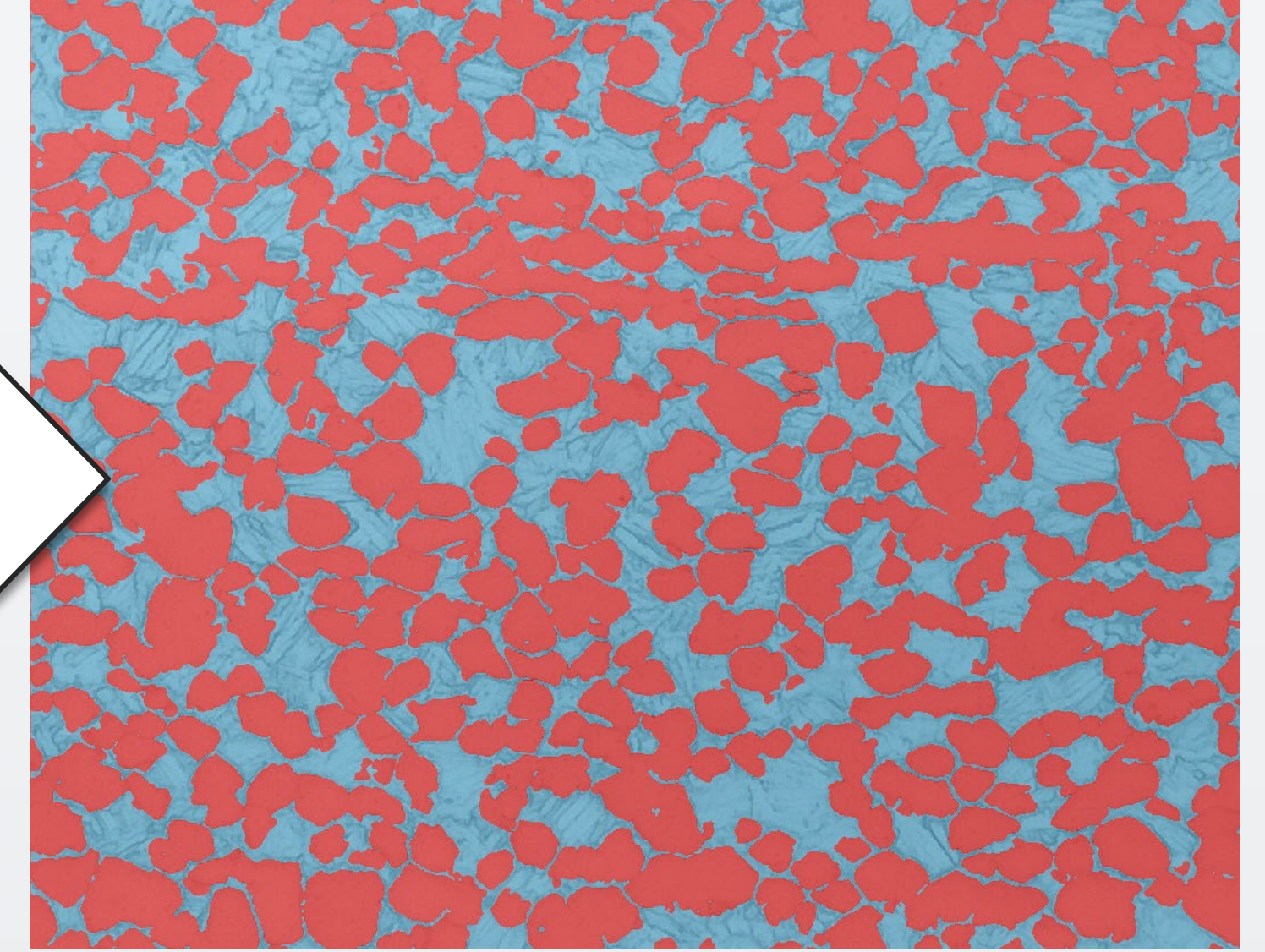
Original Image



Deep Learning Applied



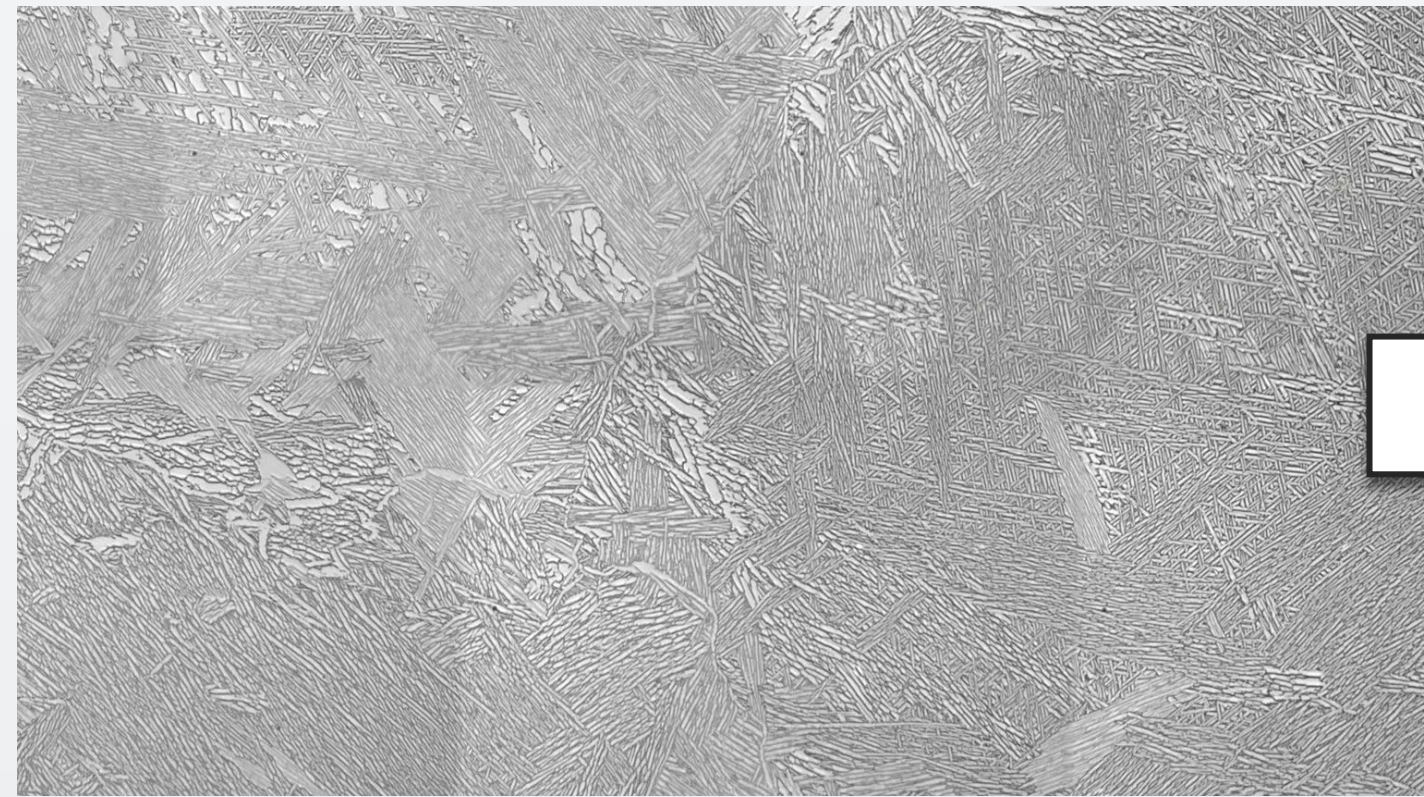
Final Segmentation



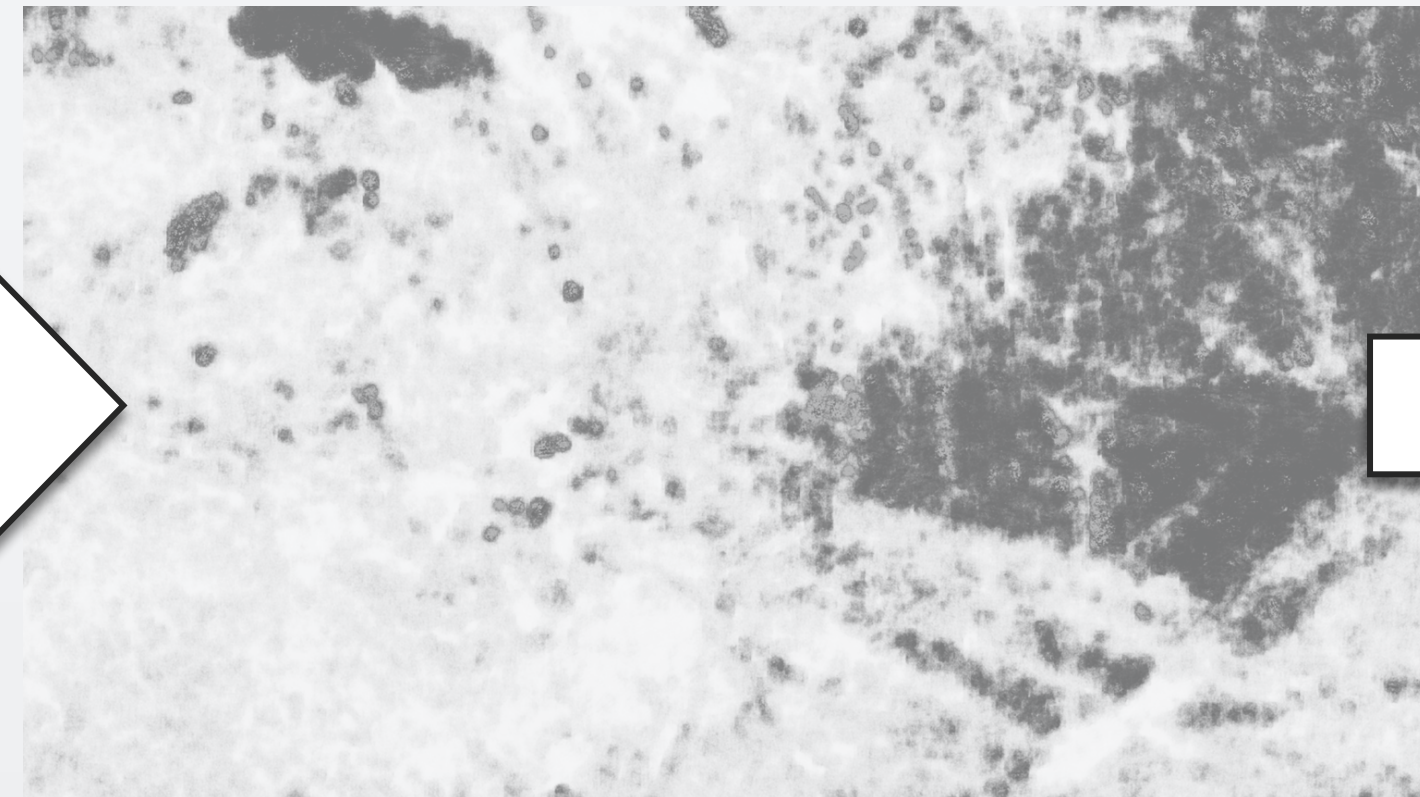
- ✓ Accurately and automatically measure globular alpha fraction
- ✓ Replace heavy amounts of manual correction
- ✓ Globular percentage and size measurements possible

Morphology Classification – Colony vs. Basketweave

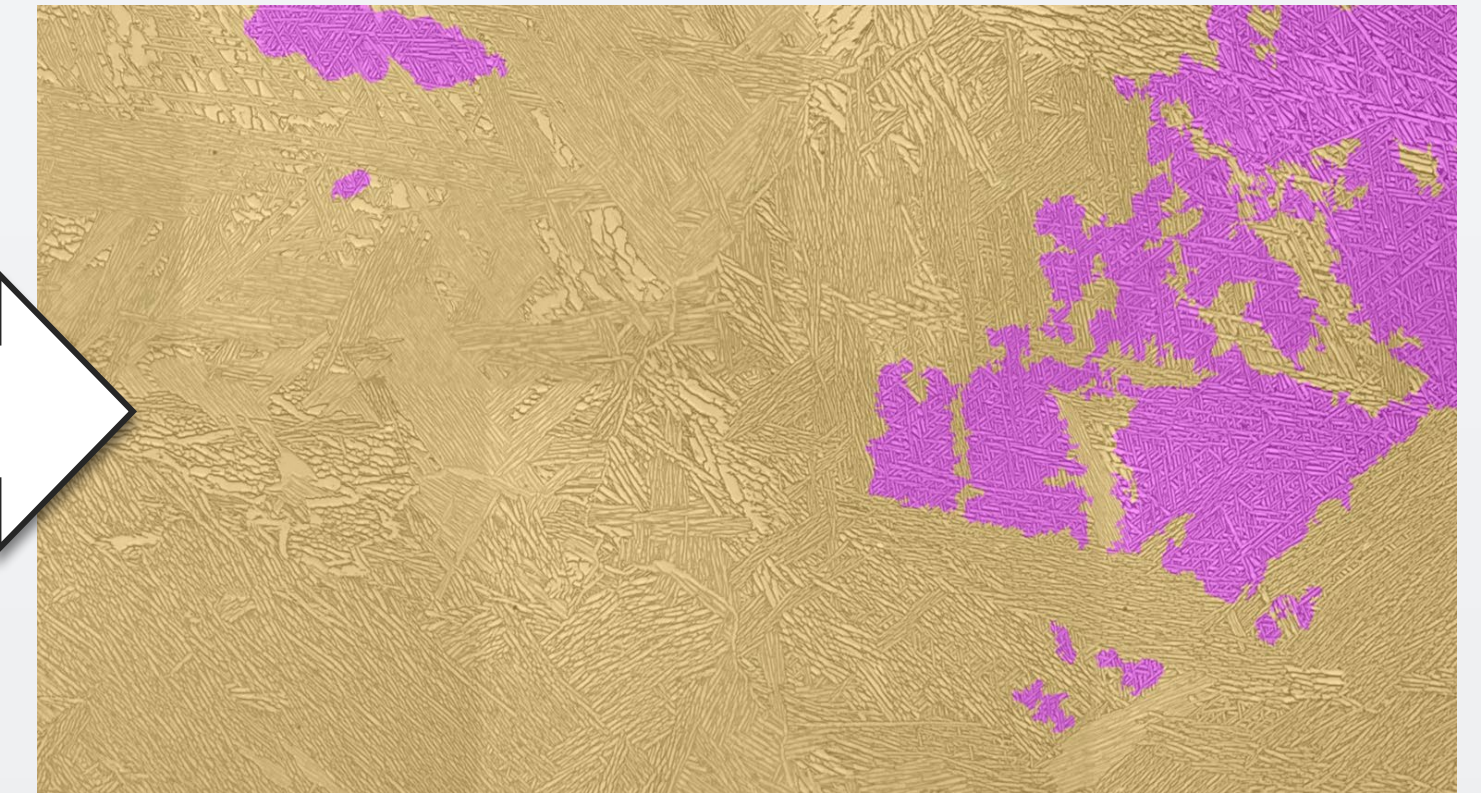
Original Image



Deep Learning Applied



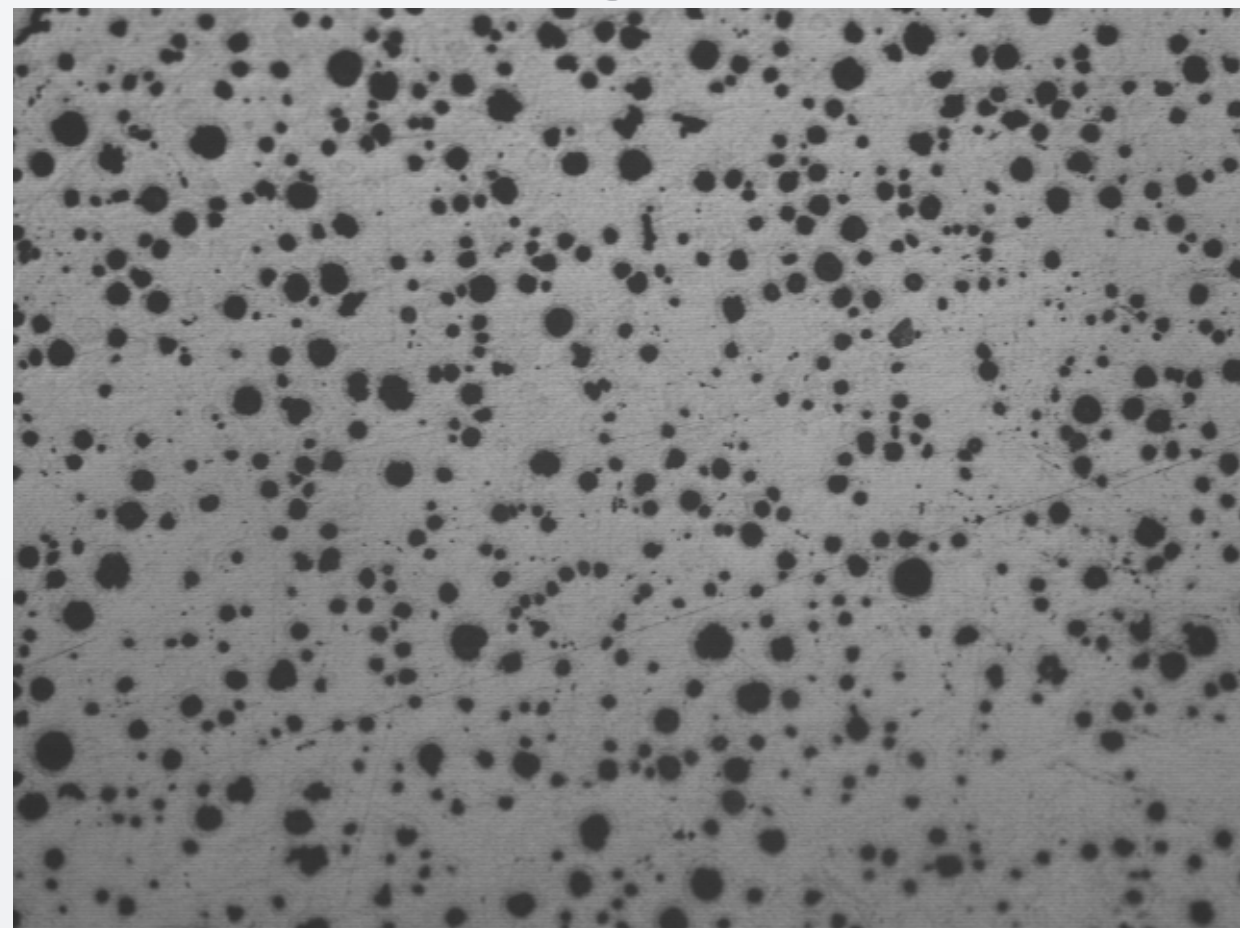
Final Segmentation



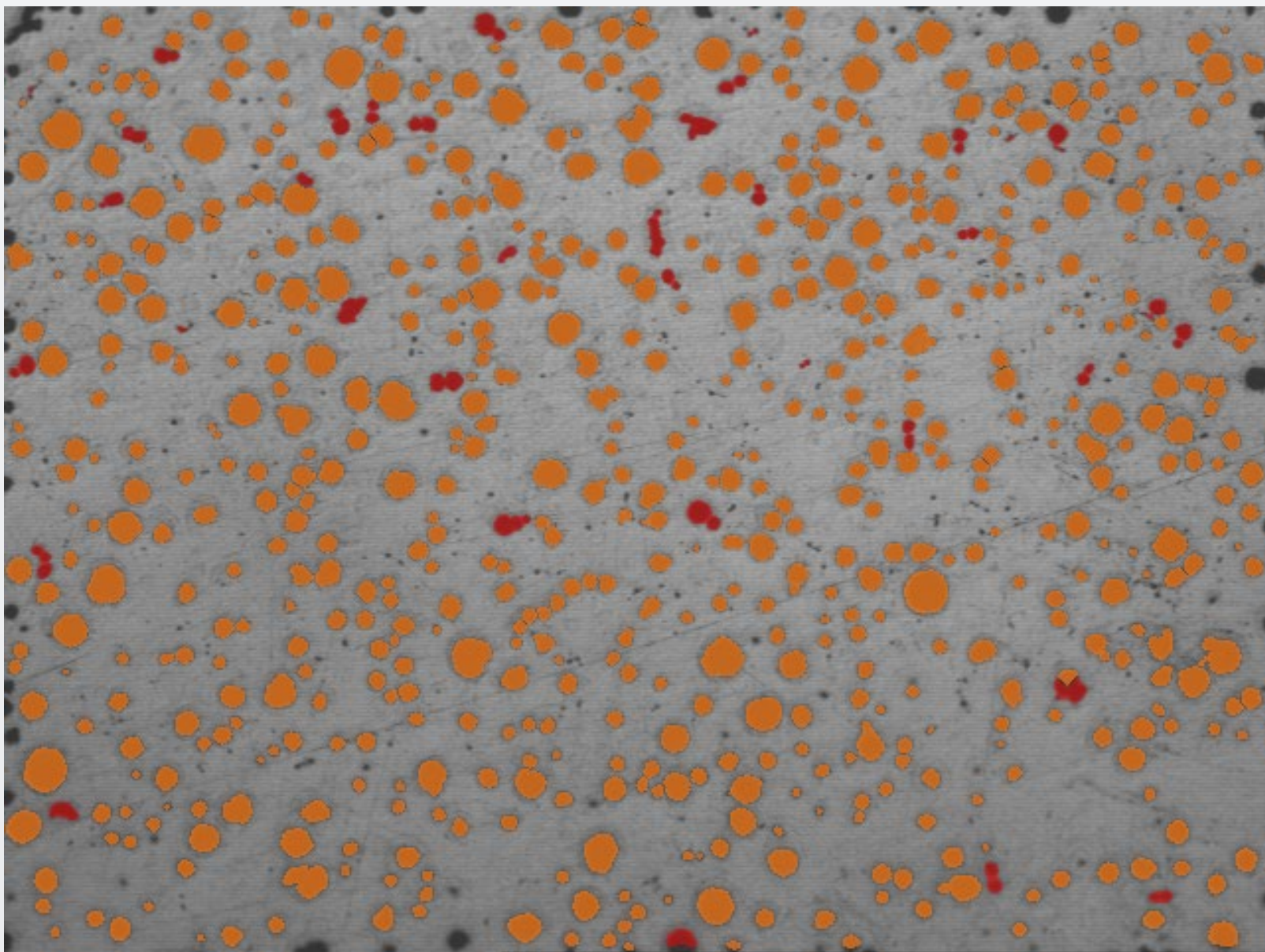
- ✓ Automated classification of morphologies based on image texture
- ✓ Replace tedious point-counting and user bias
- ✓ Deep learning enables highly complex classification

Steel Inclusions

Original



Identified and Classified



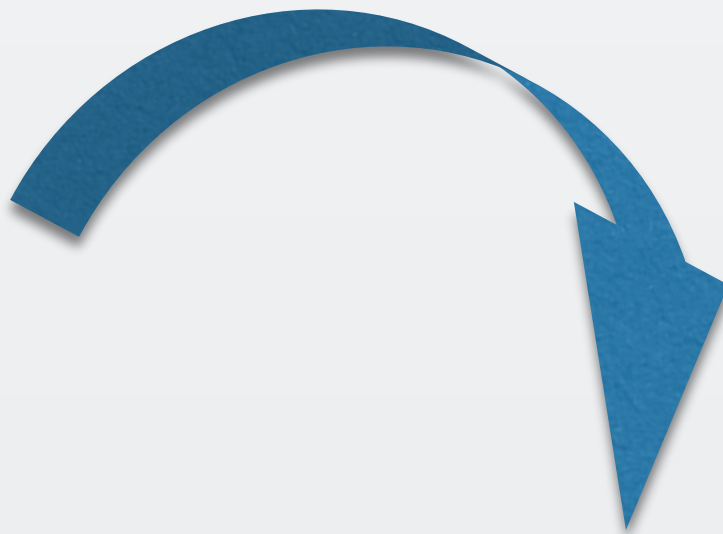
Non-nodular Graphite
Nodular Graphite



Measurements meet ASTM-A247 graphite characterization in steel guidelines



Tailored recipes to internal standards

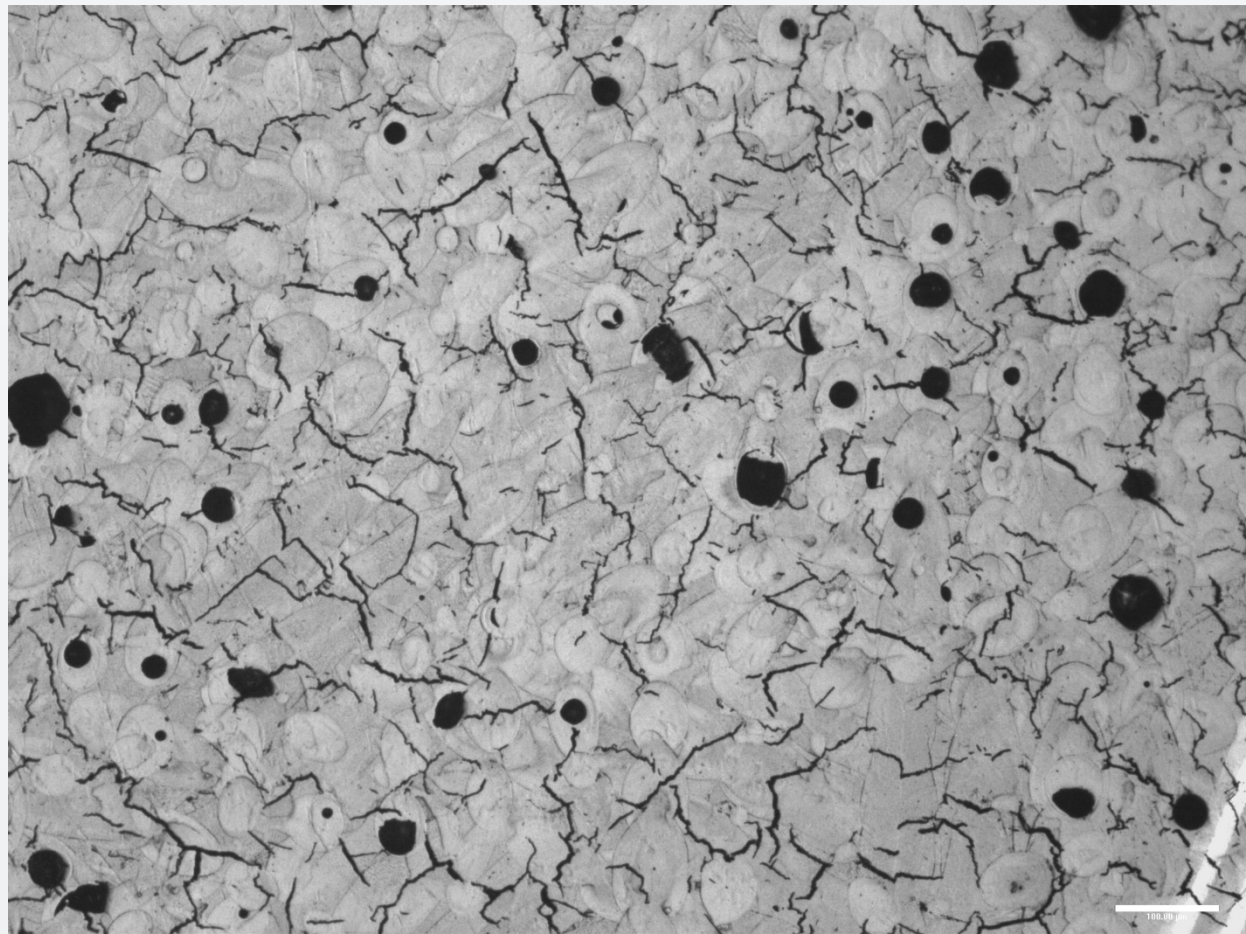


Nodularity Measurement

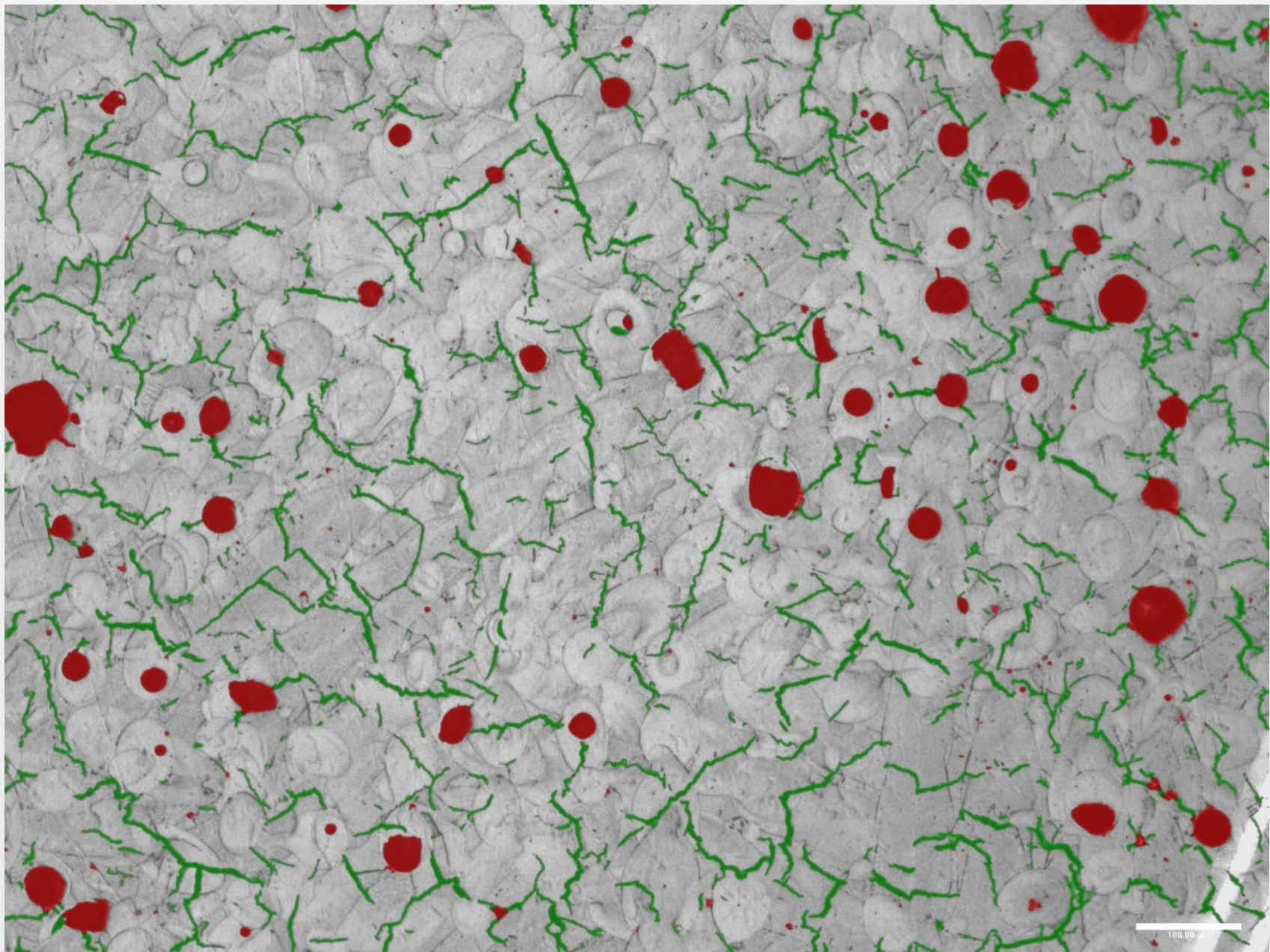
Measurements		
	Layer	Area Fraction (%)
	ASTM Nodularity Percentage	94.4780

Defects Analysis – Additive Manufacturing

Original



Identified and Classified



Pores
Cracks



Calibrate recipe to match existing techniques



Facilitates workflow integration



Crack + Pore Measurement

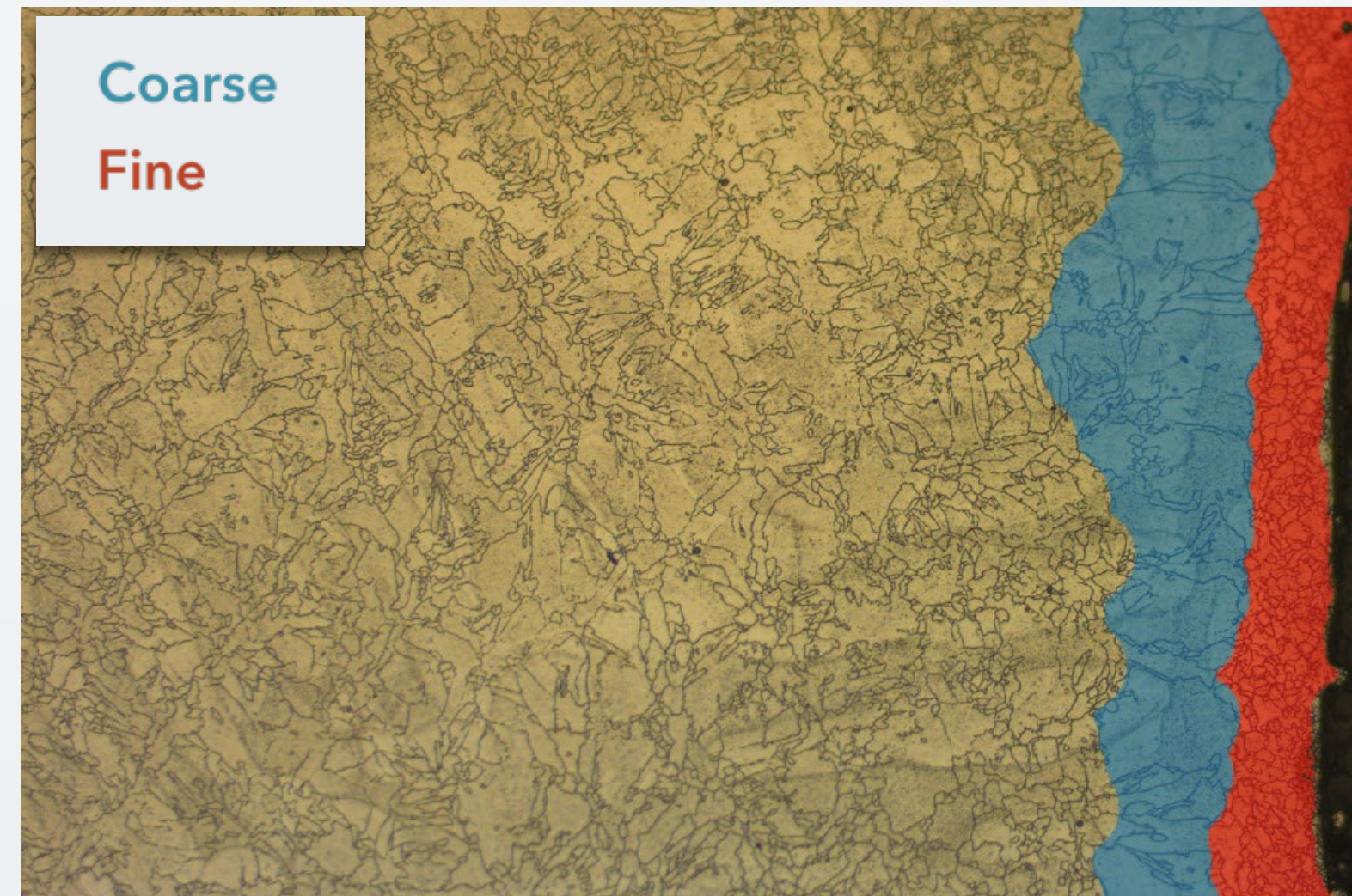
Measurements			
	Layer	Area Fraction (%)	Number Density (features/ μm^2)
	Pores	3.7940	1.4408e-04
	Cracks	5.9420	9.5184e-04

Layer Thickness Analysis – Grain-Band Identification

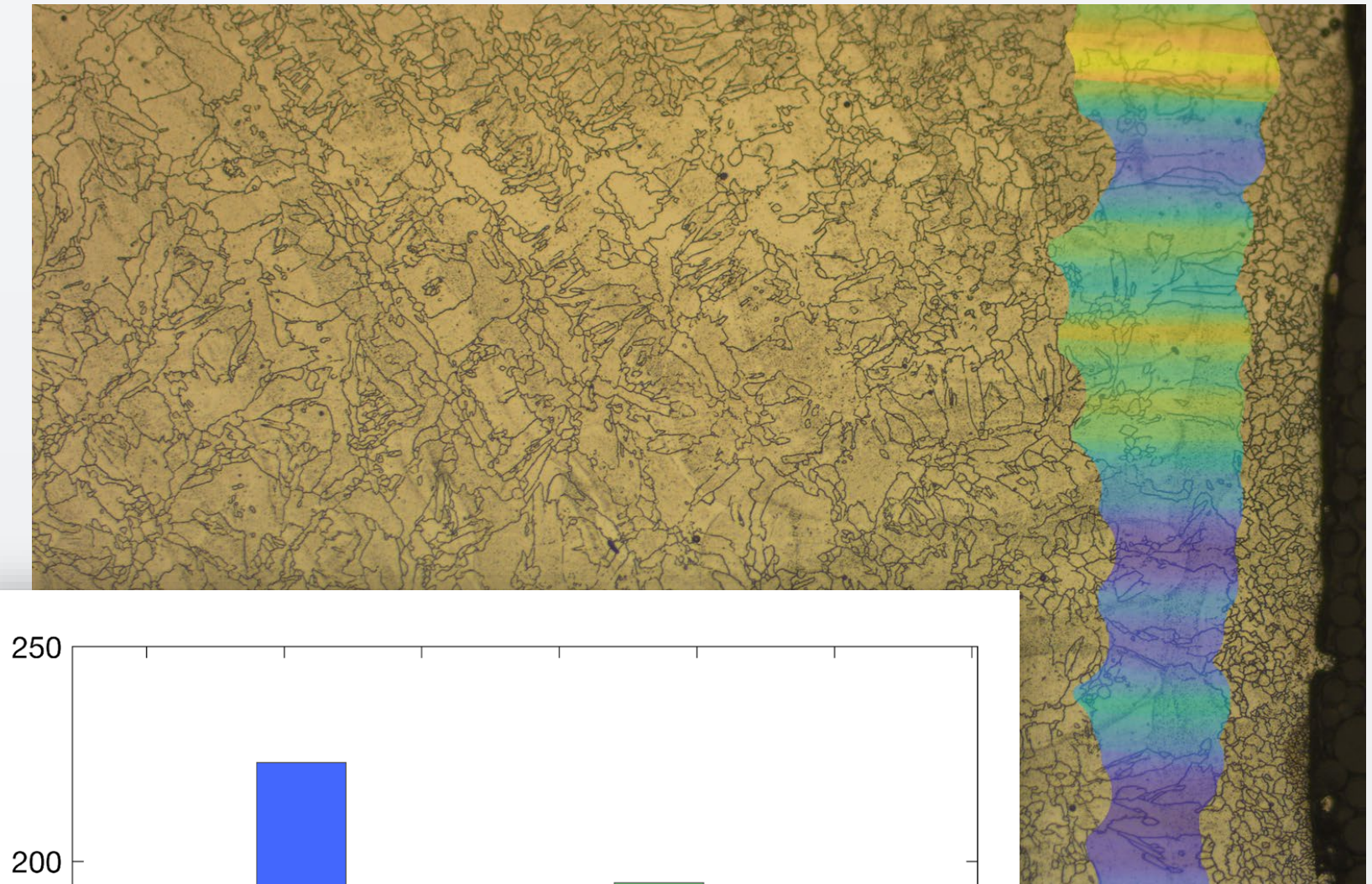
Original



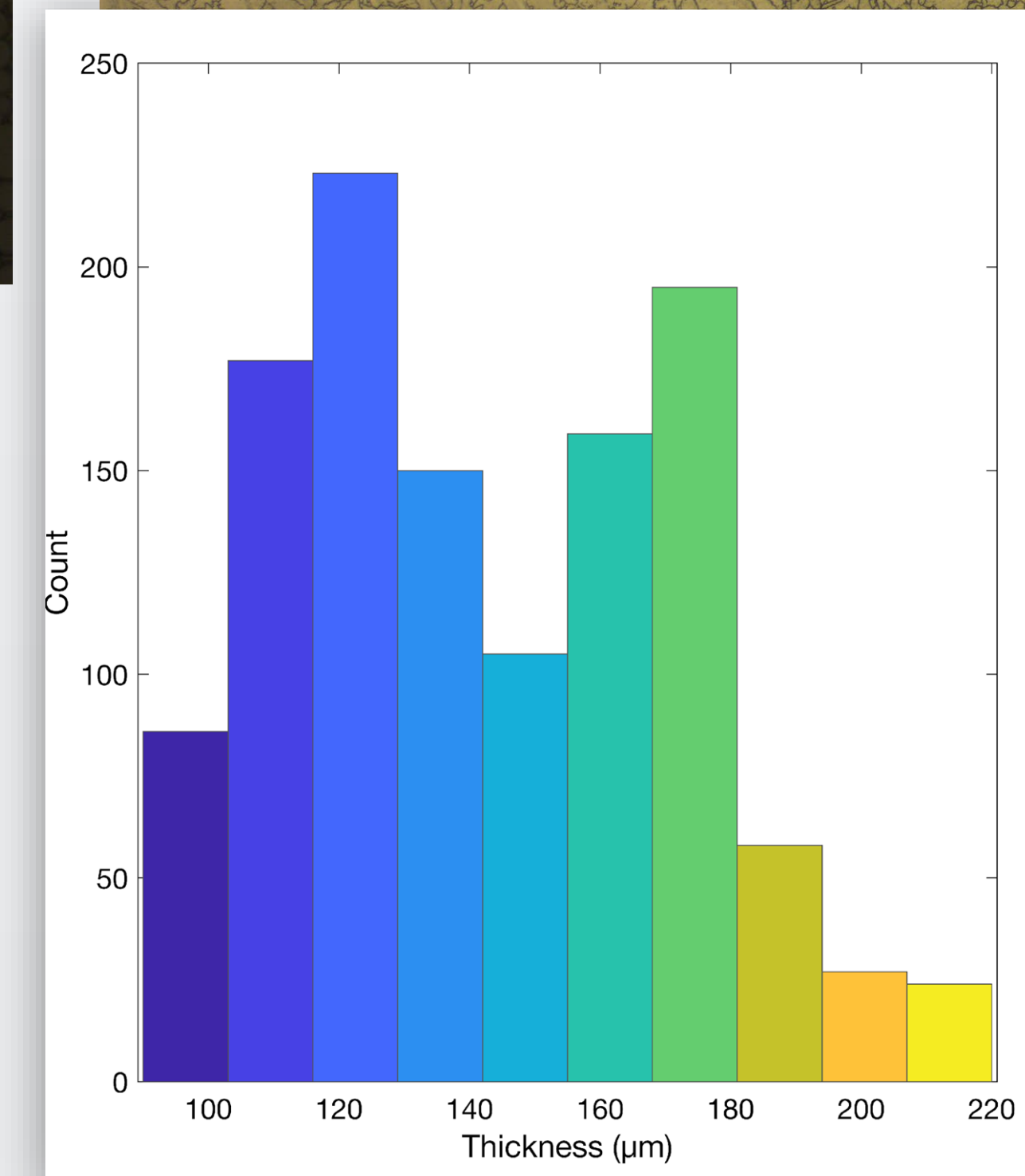
Grain-Band Identification



Thickness Measurement

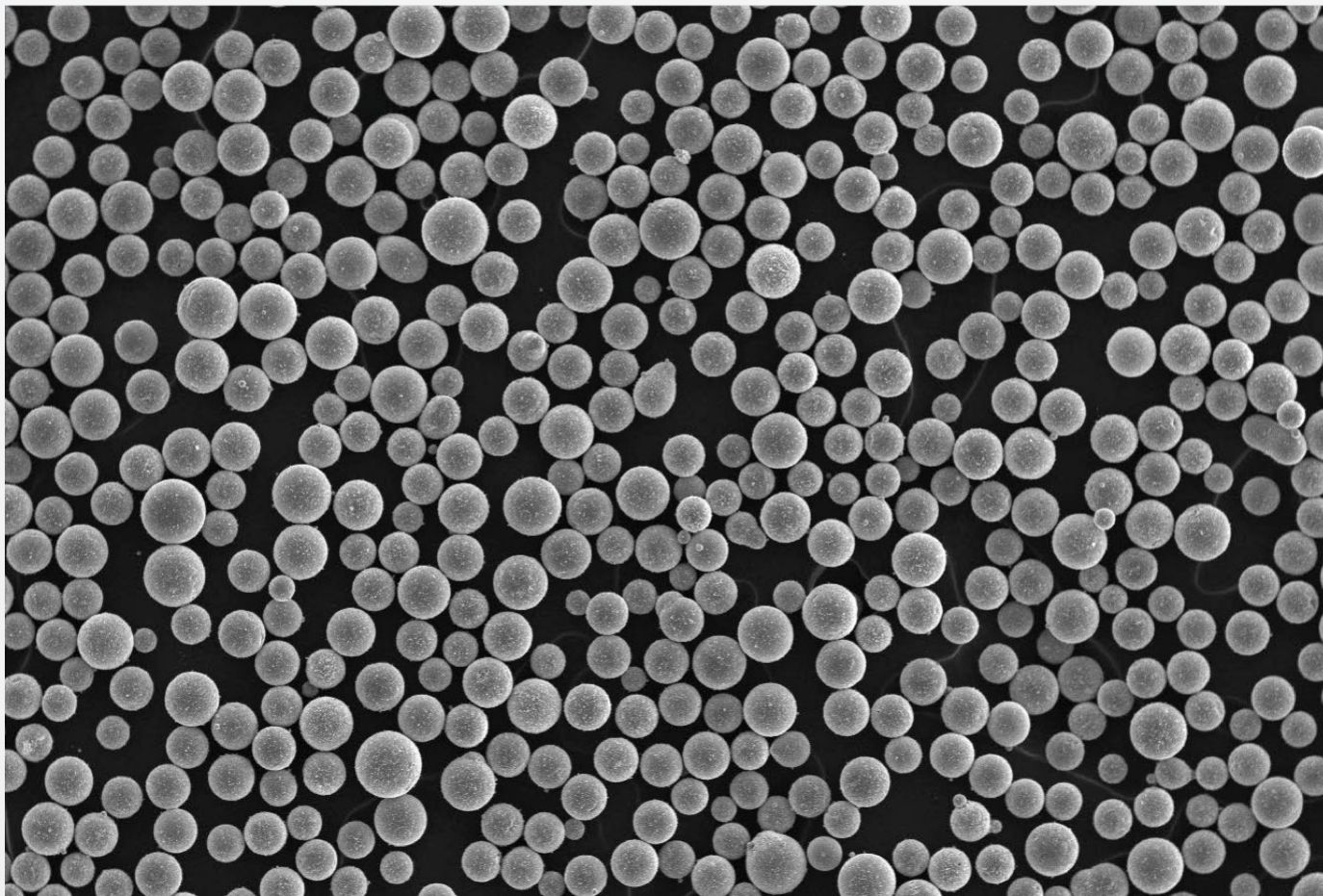


Band widths can be measured

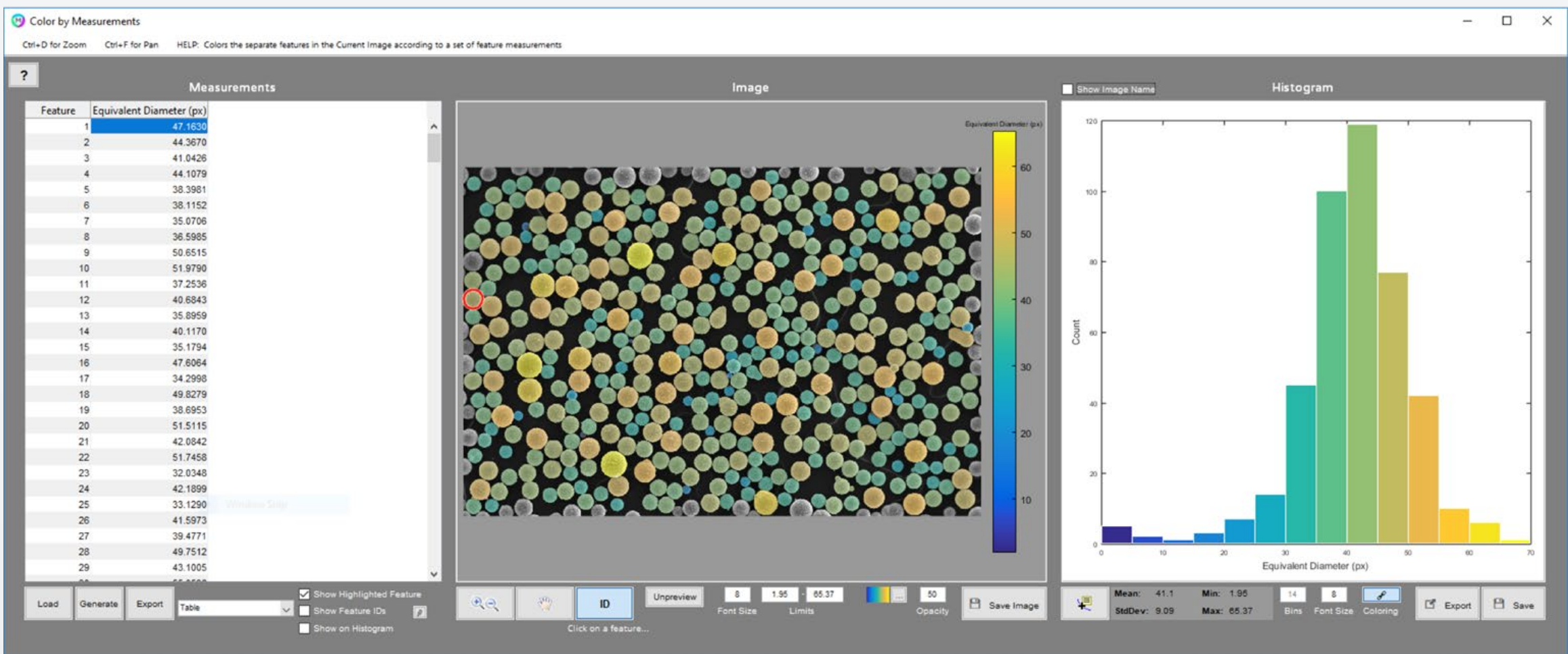


Powder particles – Size and Shape Measurements

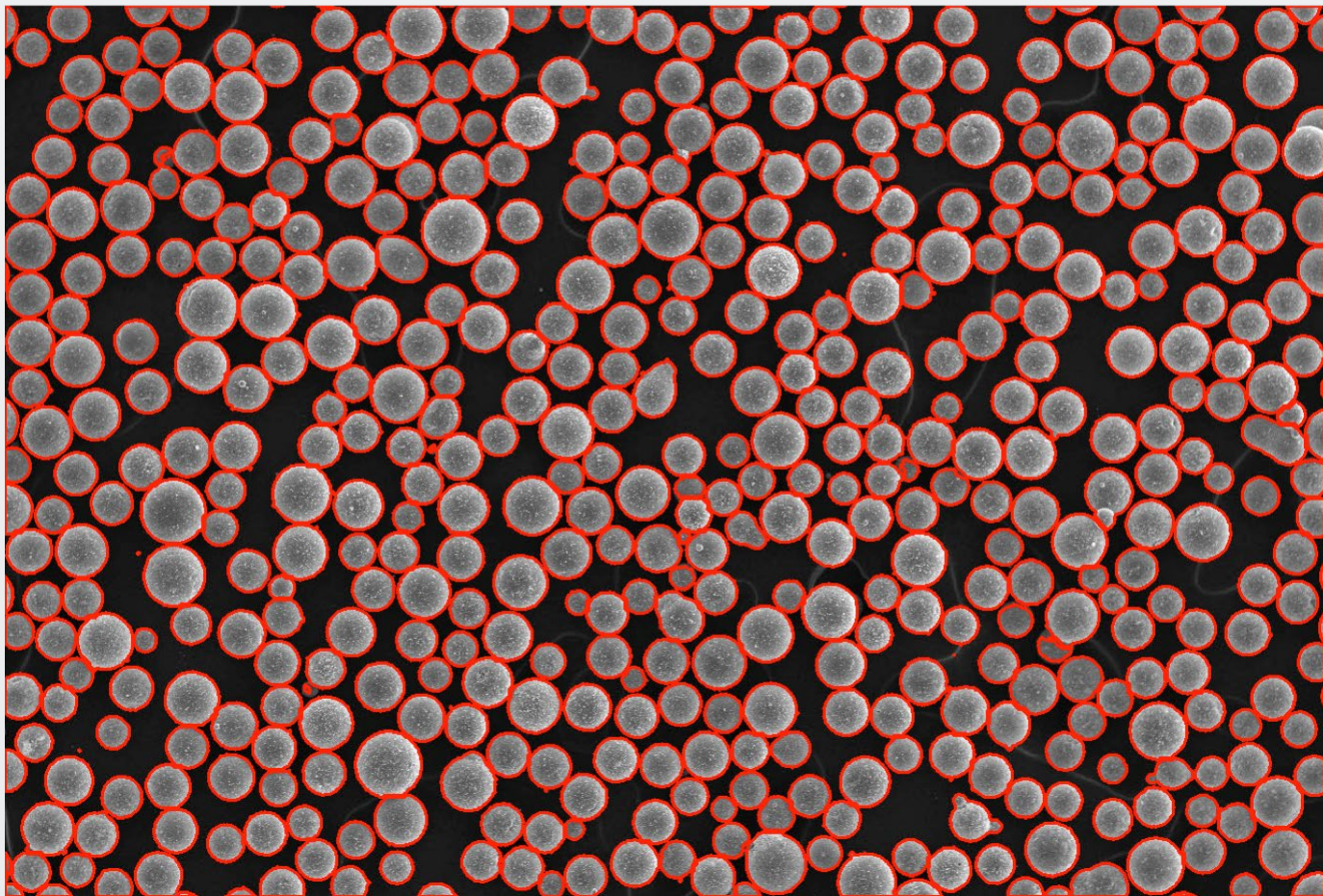
Original



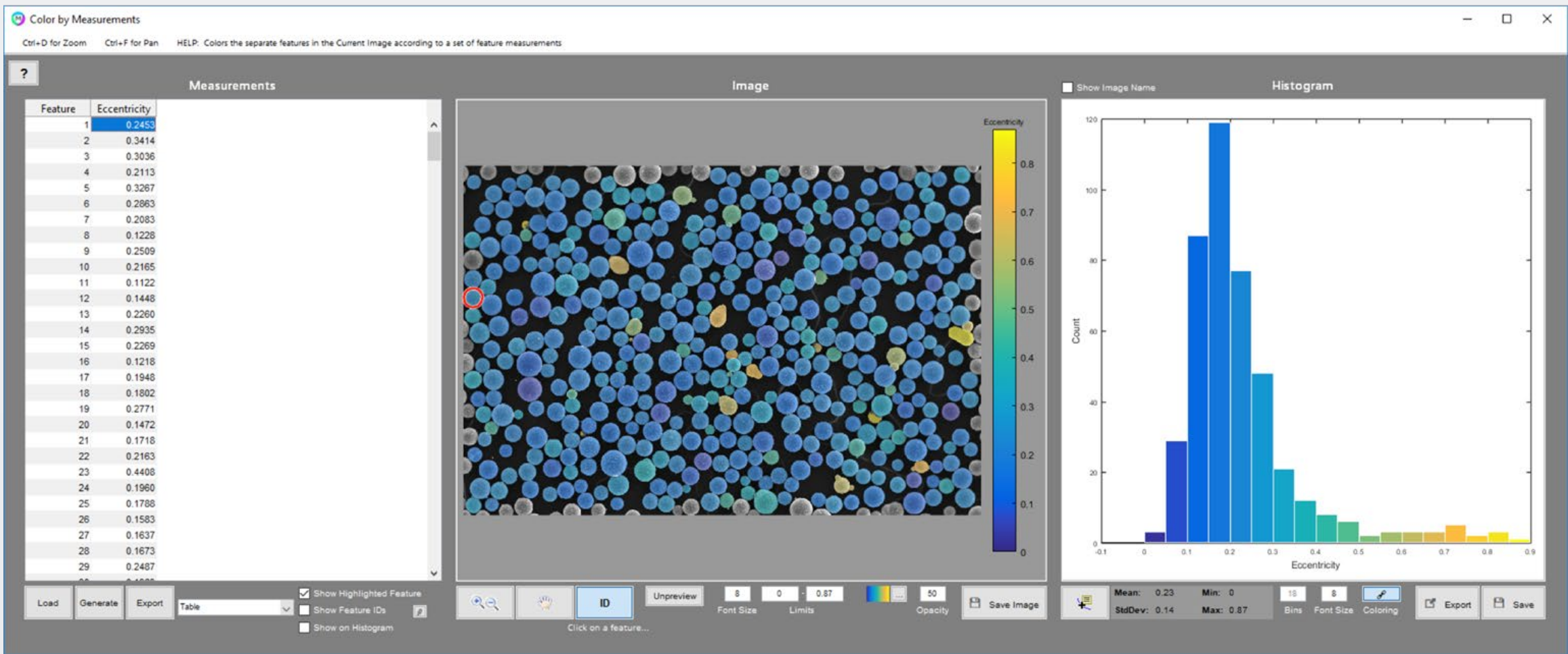
Size Measurement



Identified Particles



Shape Measurement

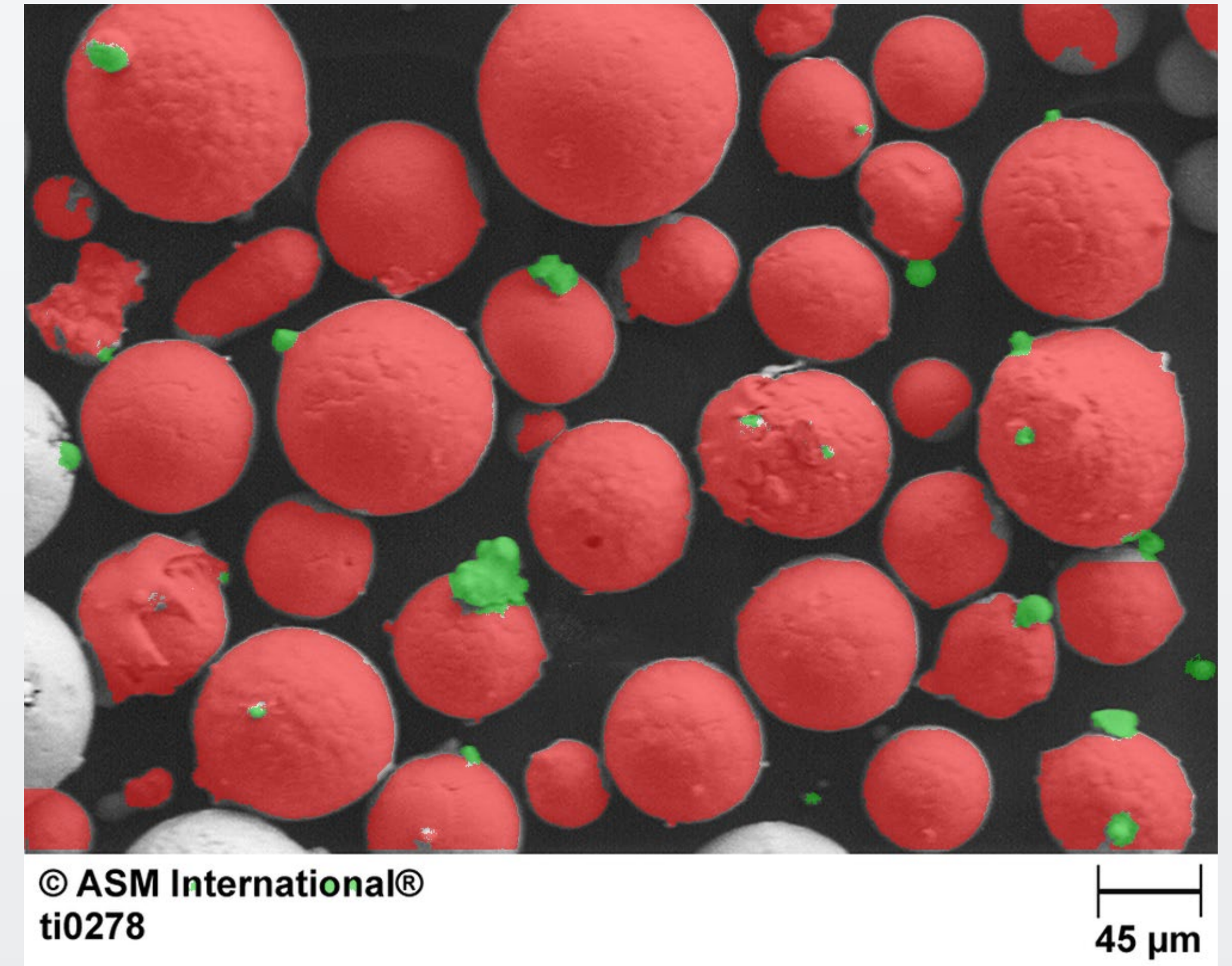


SEM Image of Particles is Segmented and Characterized by Size (Diameter) and Shape (Eccentricity)

Original



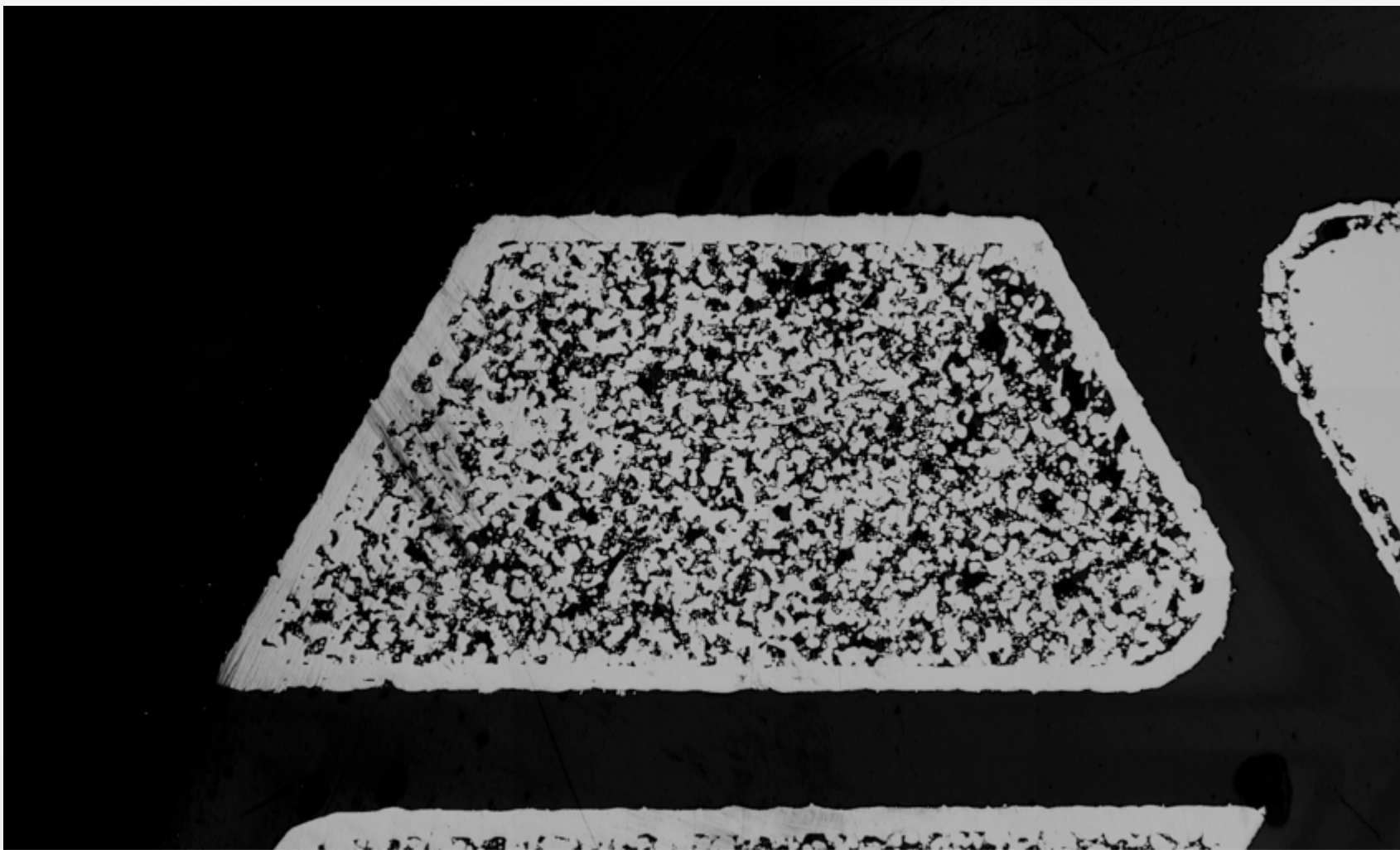
Particle detection



- ✓ Diameter of particles can be measured
- ✓ Fully automated satellite detection

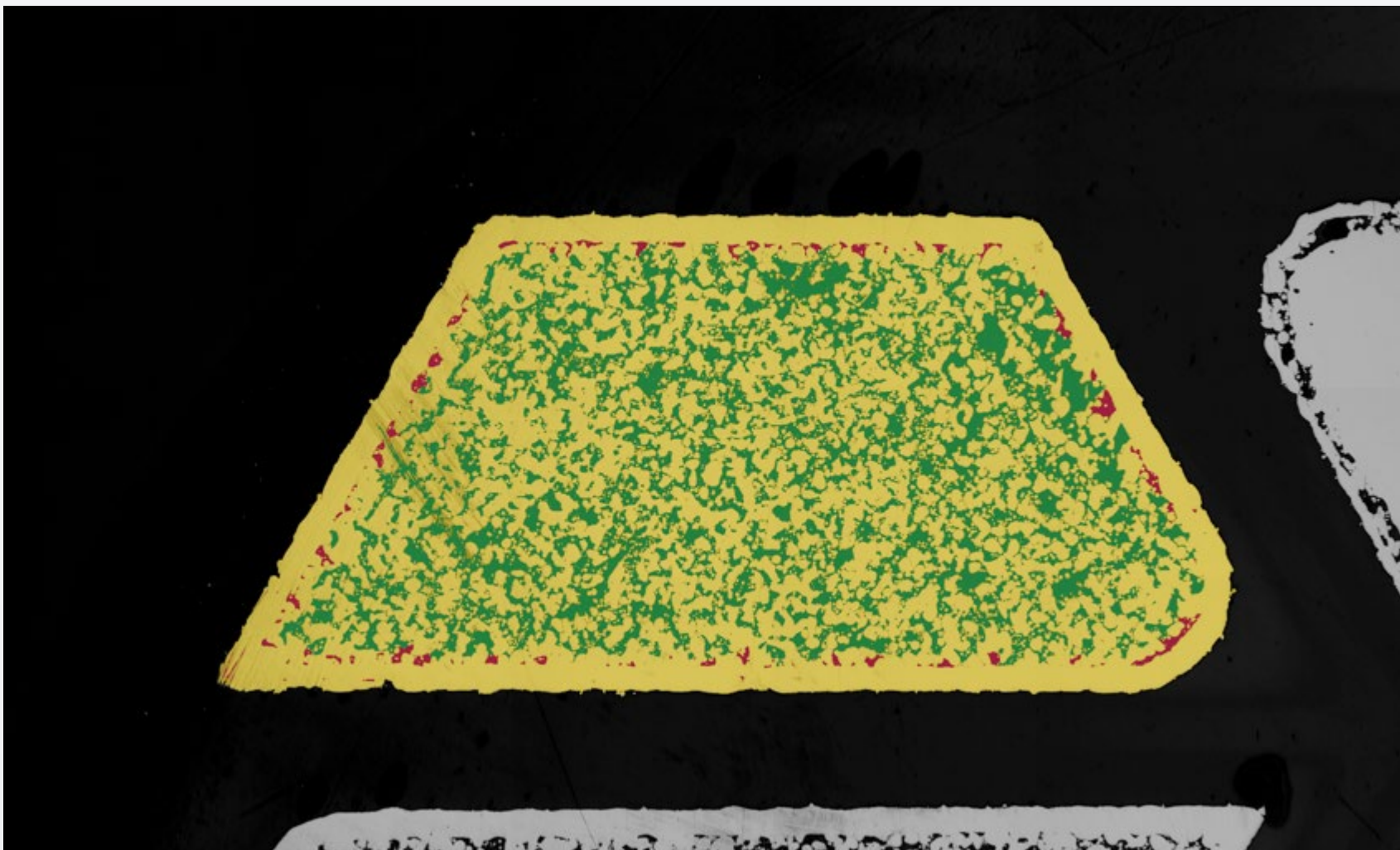
Porosity Analysis – Additive Manufactured Parts

Original

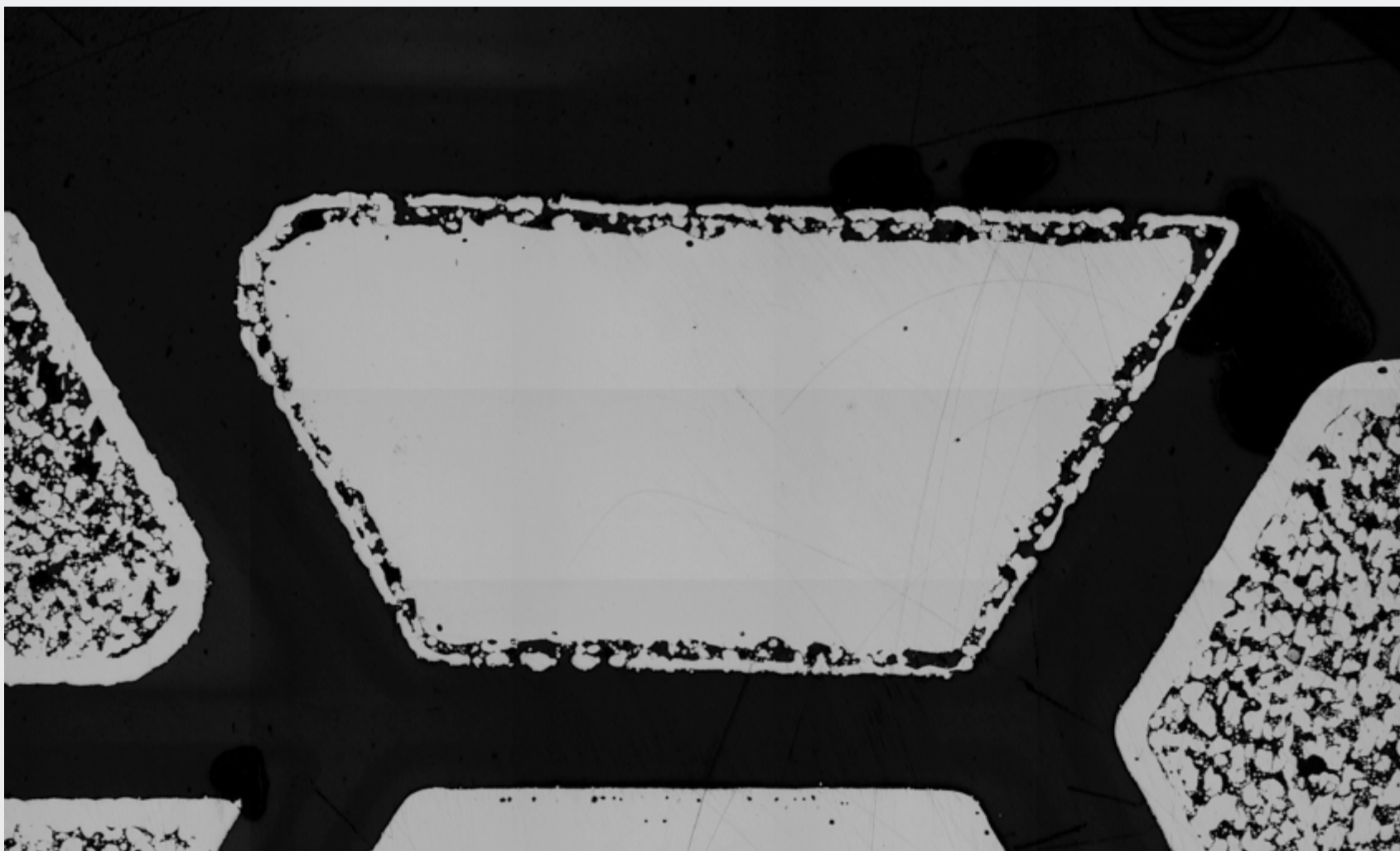


15 sec

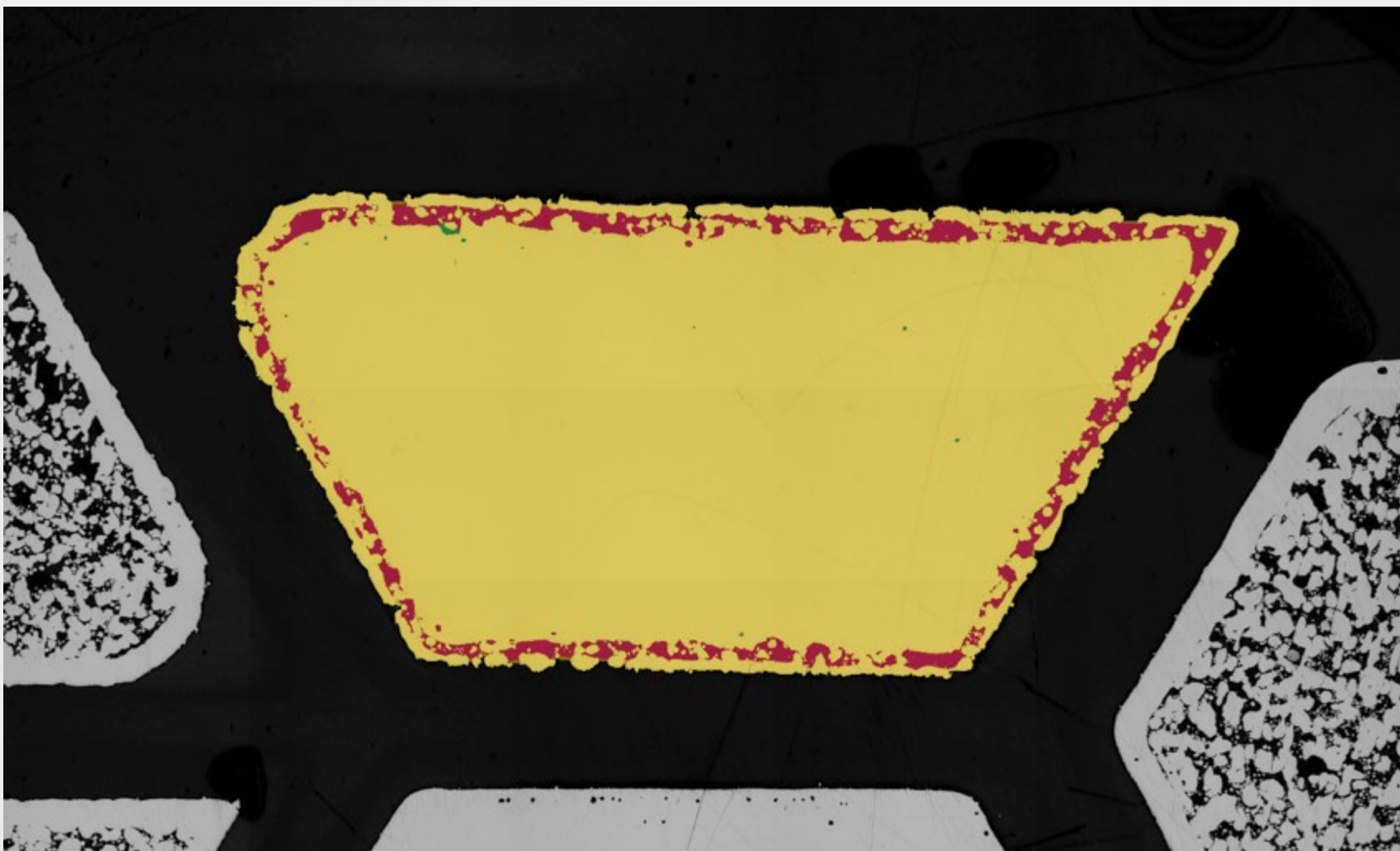
Solid Porosity



	Layer	Area Fraction (%)
	Part	100
	Border Pores	5.6770
	Bulk Pores	31.9670
	All Pores	26.0900



15 sec



	Layer	Area Fraction (%)
	Part	100
	Border Pores	26.3390
	Bulk Pores	0.0742
	All Pores	6.2600



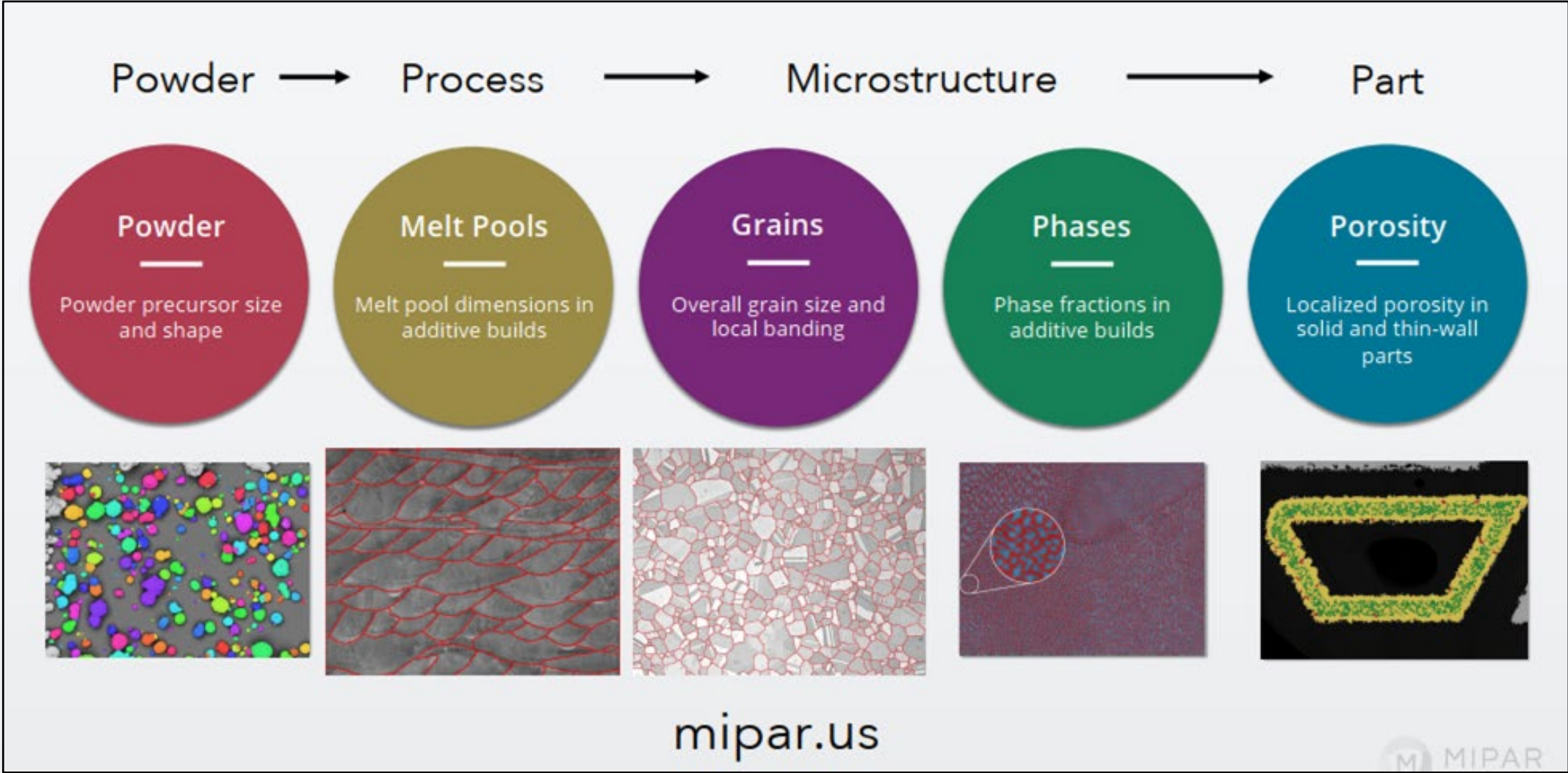
Single recipe accurately measures porosity at each extreme



Perform analysis in batch

Metals Applications

Additive Manufacturing



CASE STUDY:
Smart Defect Analysis of Additively Manufactured Nickel Superalloys
30 October 2019

Unit 15 Oxford Industrial Park
Yarnston, Oxfordshire, OX5 1QU, UK
www.oxmet-technologies.com
company reg. no. 10687859 | VAT REG. NO. 268 5780 53

Grain Analysis

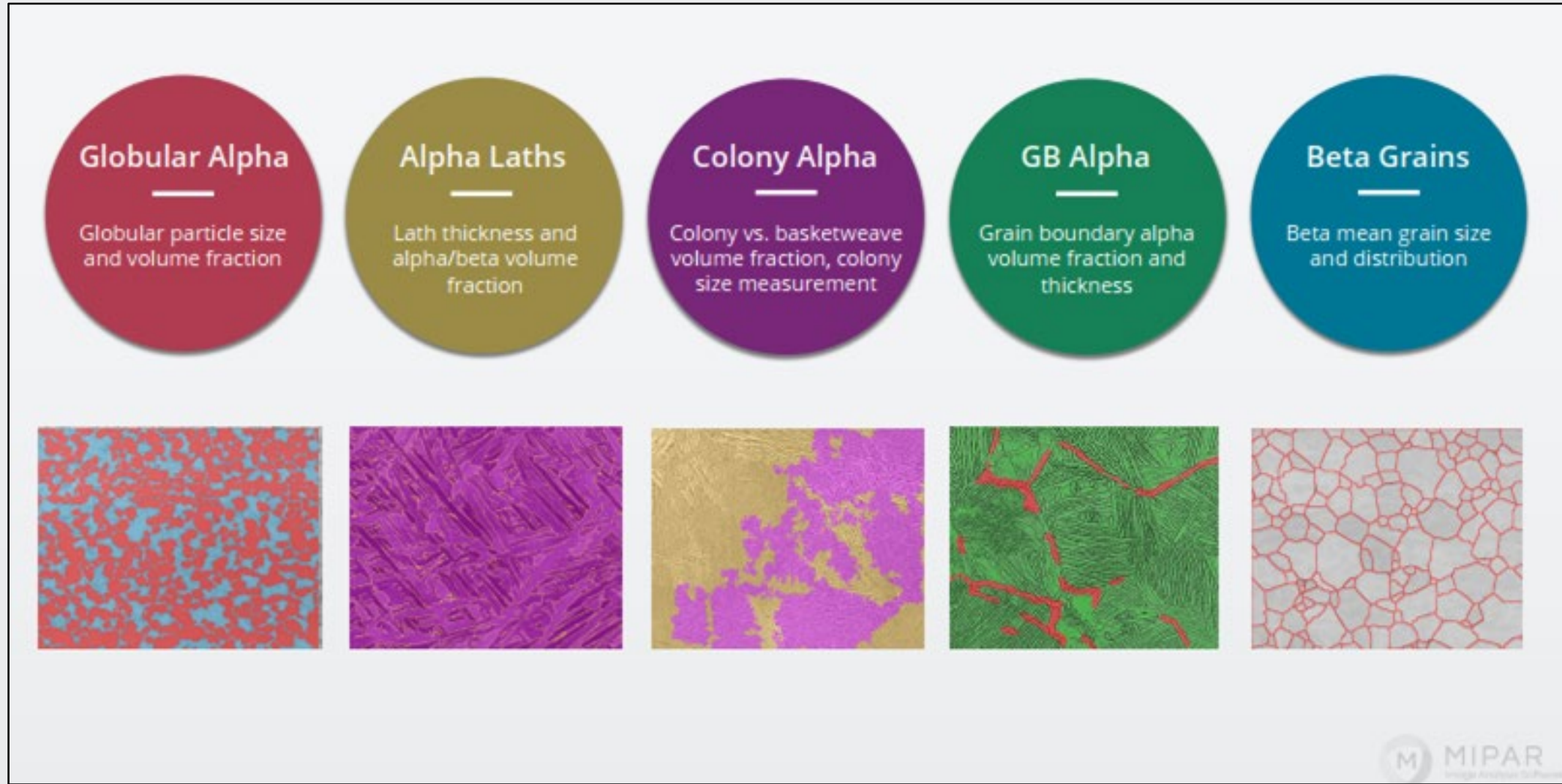
Standard Grains
Detected based on local darkness or brightness along boundaries

Contrast Grains
Detected based on grain-to-grain grayscale or color contrast

Complex Grains
Detected based on local complex pattern differences (e.g., twinning)

MIPAR Image Analysis Software
614-407-4510 • mipar.us • info@mipar.us

Titanium Research



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ADVANCED MATERIALS & PROCESSES

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ADVANCED CHARACTERIZATION

AUTOMATED MICROGRAPH ANALYSIS

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