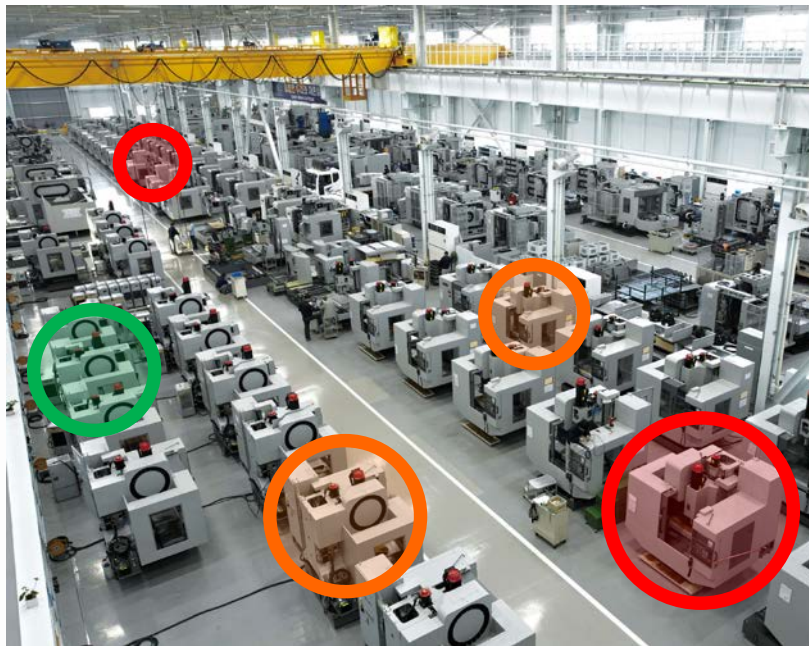


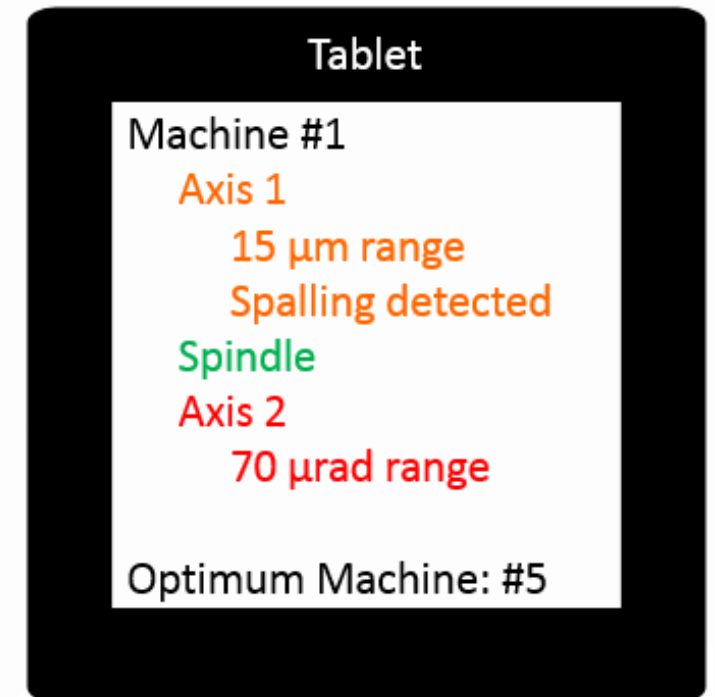
# Emerging Sensing Technologies Towards Smart Machine Tools



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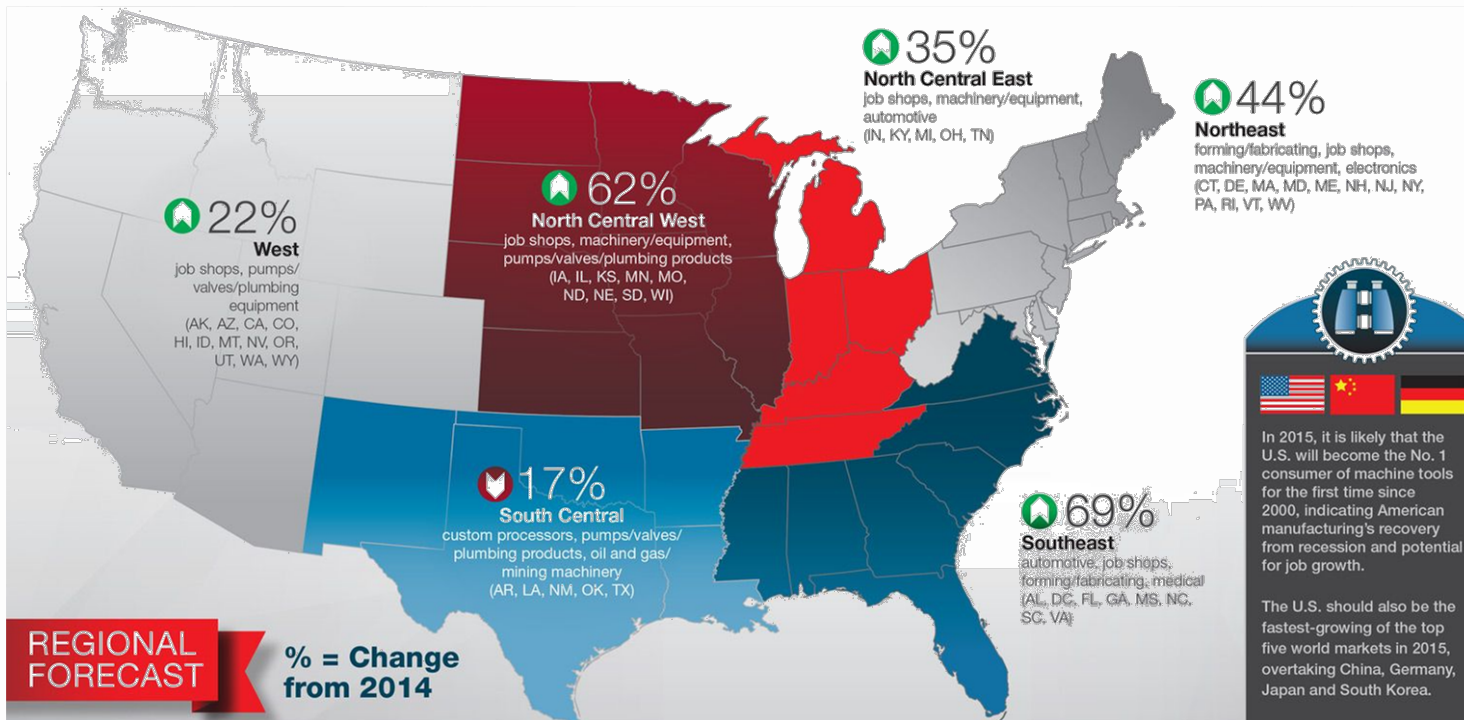
# NIST → Economic Growth

- NIST within U.S. Department of Commerce
- NIST promotes U.S. innovation by advancing measurement science, standards, and technology
- 6,500 Employees/Associates
- NIST partners with about 1,200 manufacturing specialists through manufacturing extensions

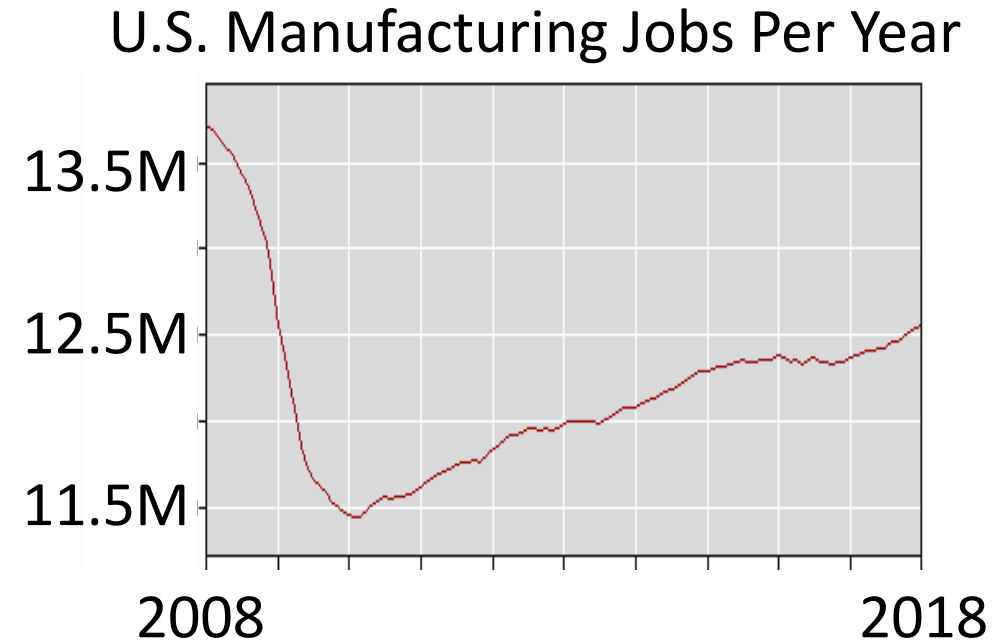


# Manufacturing = Economic Growth

- Manufacturing = 12.5M U.S. jobs & about 60% exports
- 2.8% economic growth for U.S. machine tool orders [Oxford Economics](#)



[Modern Machine Shop, 2015 Capital Spending Survey & Forecast](#)



[U.S. Bureau of Labor Statistics](#)

# Machine Tools are Vital for Production

- 100s of machine tools used in plants to mill precision parts
- 3+ axis motion



[Hyundai Wia Plant](#)



[5-Axis Machine Cutting of Helmet \(Daishin Seiki Corporation\)](#)

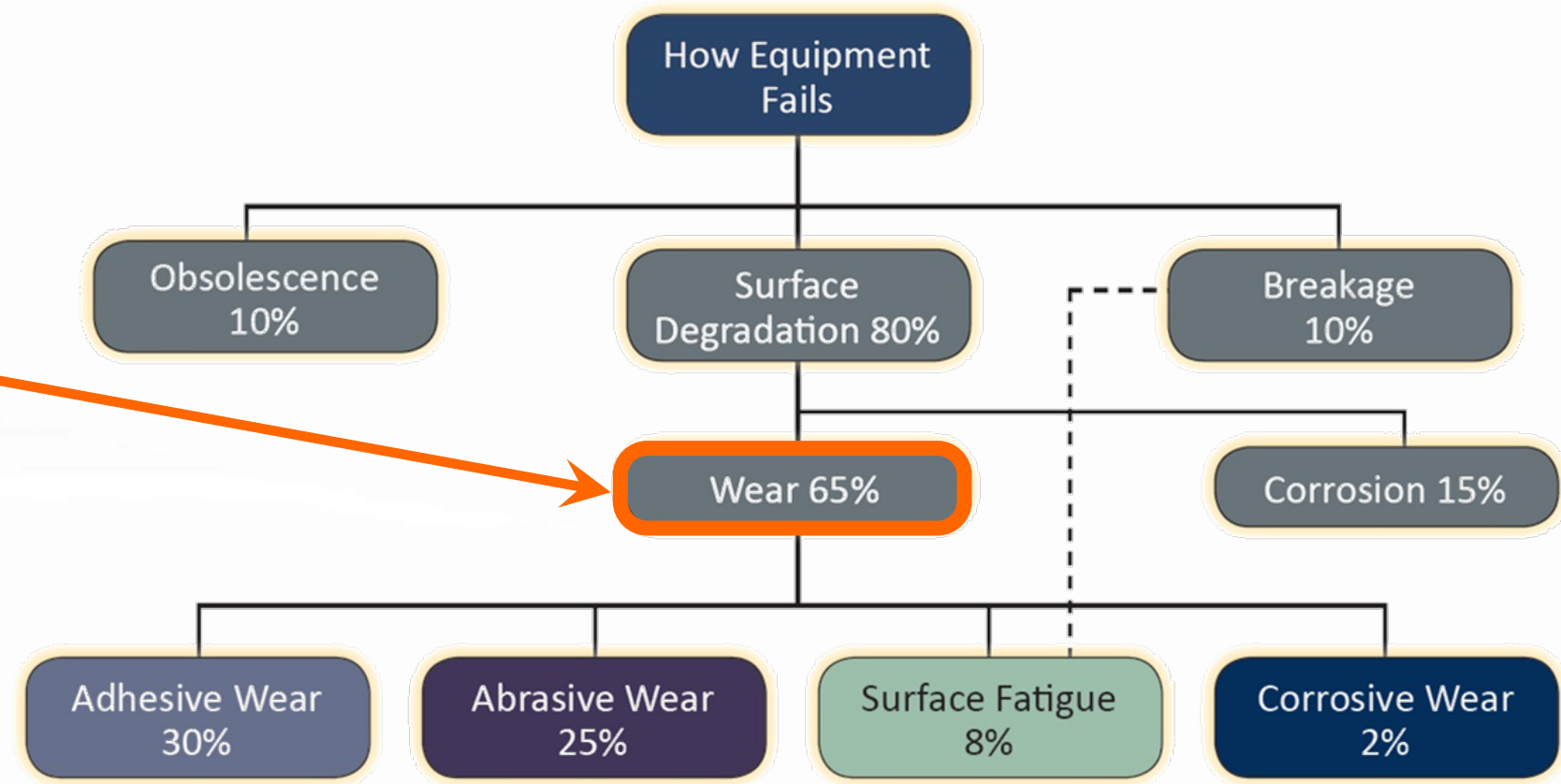
# Problem = Unplanned Downtime

- Faults/failures → 10s of \$Billions per year (> new machines!)
- Machine tool degradation causes performance changes and unplanned downtime

## Wear



[Machinery Lubrication \(2004\), Wear in Rolling Element Bearings and Gears](#)



[Reliabilityweb.com \(2018\), Lubrication FMEA: The Big Picture](#)

# Why Not Measure Health?

- Major manufacturers say routine tracking of performance is **too expensive**
- Accuracy a pro, but setup and operation time/cost a con
  - Offline
  - Lack of periodic data
  - Expensive

Laser → 1-2 days



[API](#)



Cap probes → hours



[IBS Precision Engineering](#)

Ballbar → 1 hour

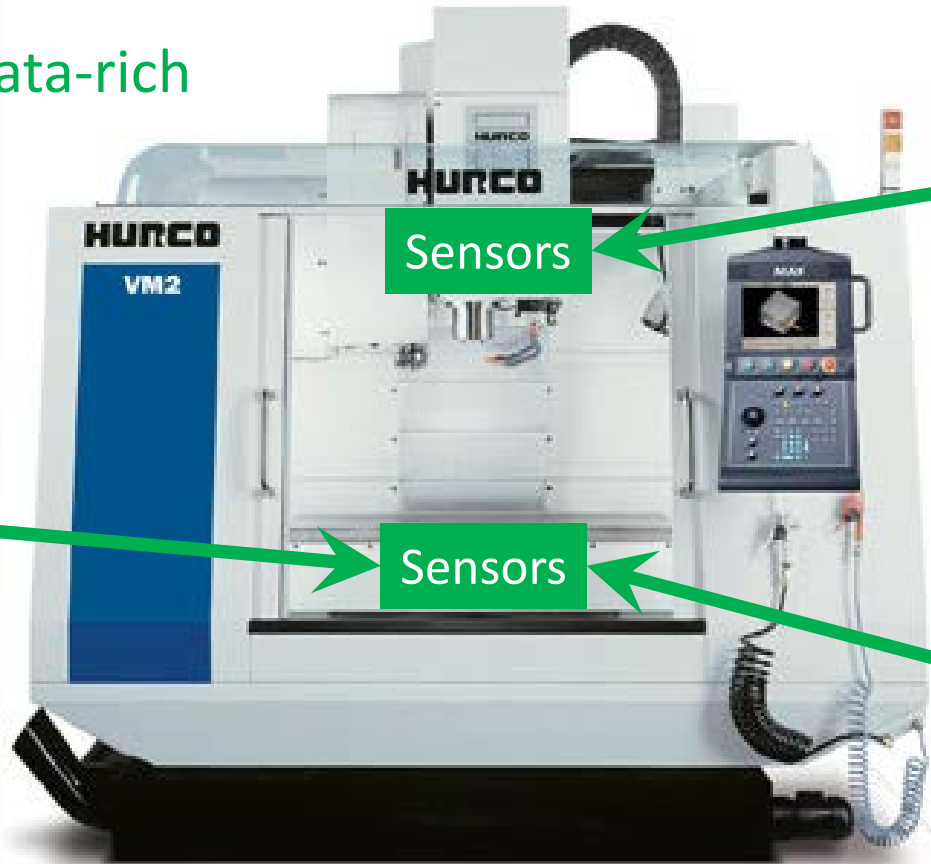


[Renishaw](#)

# GOAL: Smart Machine Tools

- Industry challenge: “Machine health in 5 min?”
- On-machine measurement science to diagnose performance and root-causes
  - ~~Offline~~ Online
  - ~~Lack of periodic data~~ Data-rich
  - ~~Expensive~~ Inexpensive

Linear Axis Health Tracking  
[How?]

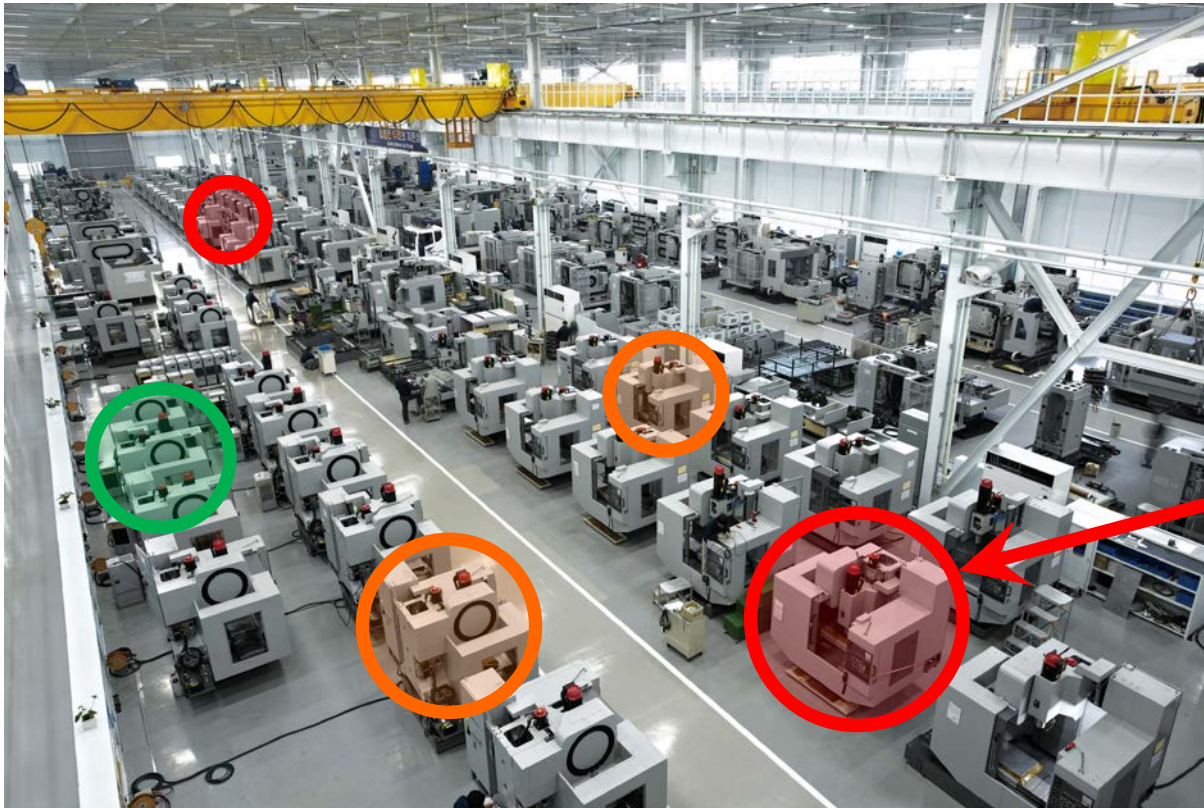


Spindle Health Tracking  
[How?]

Squareness Health Tracking  
[How?]

# GOAL: Smart Machine Tools

- Make machine tools self-aware with diagnostics of performance & root causes
- Predict part errors based on health tracking & optimize asset management



Hyundai Wia Plant

## Tablet

Machine #1

Axis 1

15  $\mu\text{m}$  range

Spalling detected

Spindle

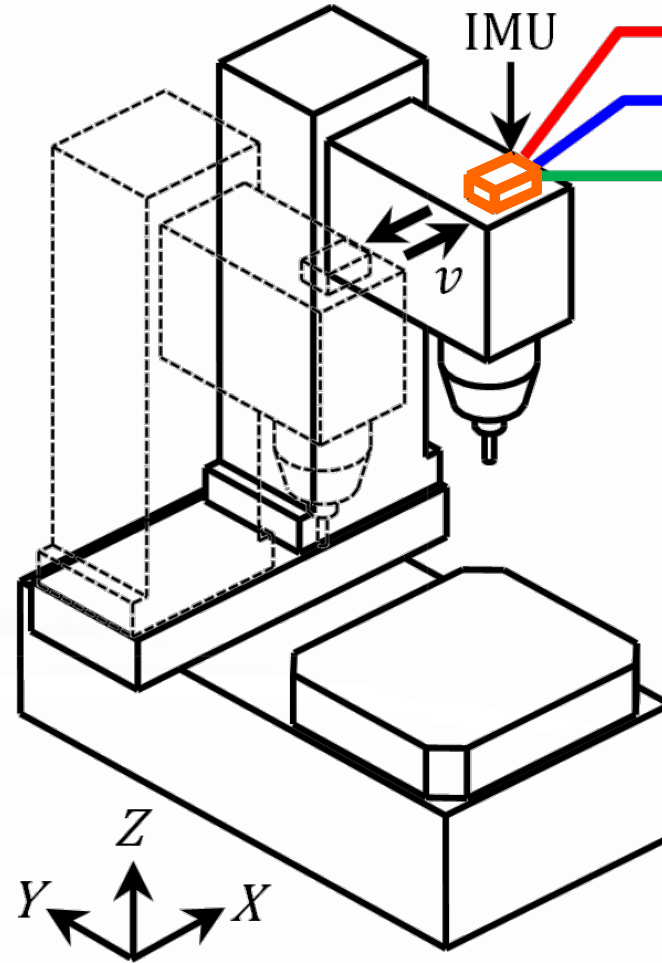
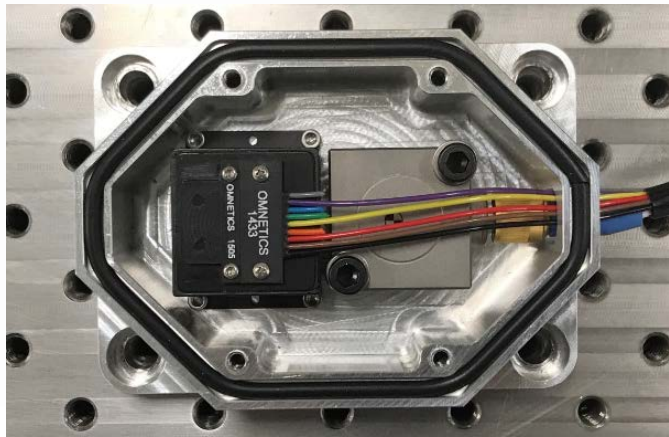
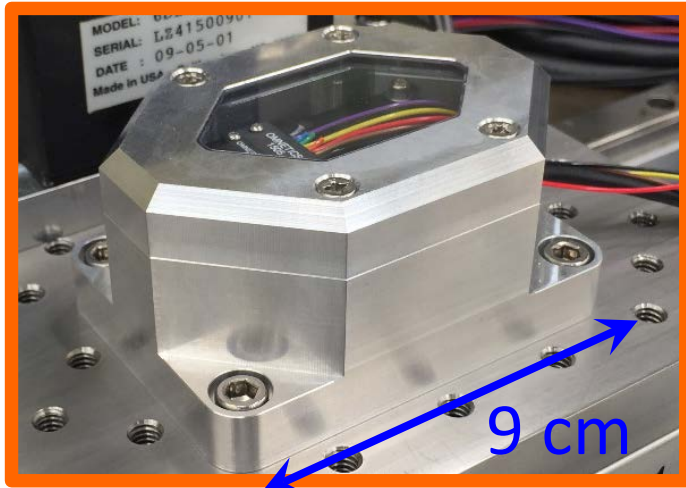
Axis 2

70  $\mu\text{rad}$  range

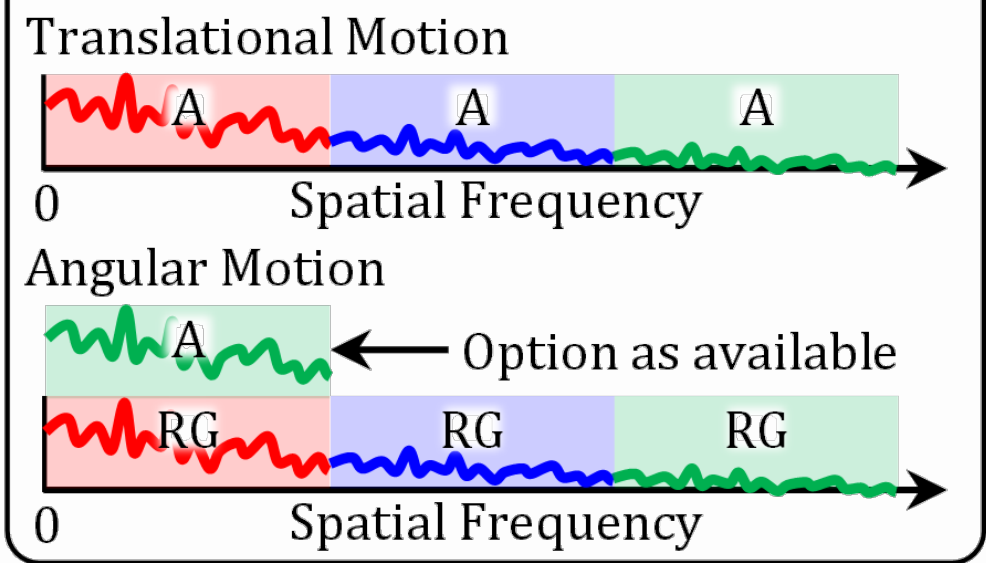
Optimum Machine: #5



# IMU for Linear Axis Monitoring



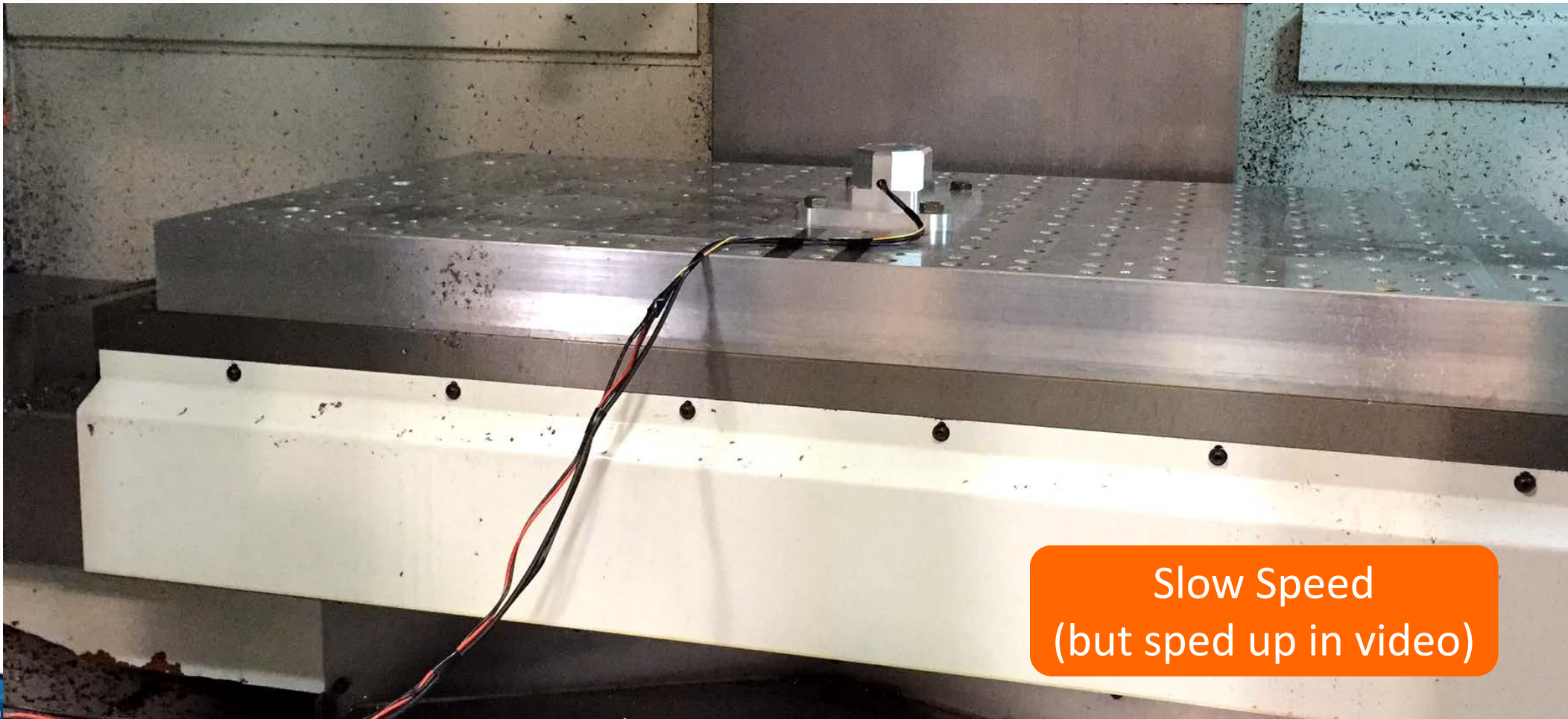
Data Fusion with Accelerometer (A) and Rate Gyroscope (RG) Data



[Vogl G.W., Donmez M.A., and Archenti A. \(2016\) Diagnostics for geometric performance of machine tool linear axes. \*Annals of the CIRP\* 65\(1\): 377-380.](#)

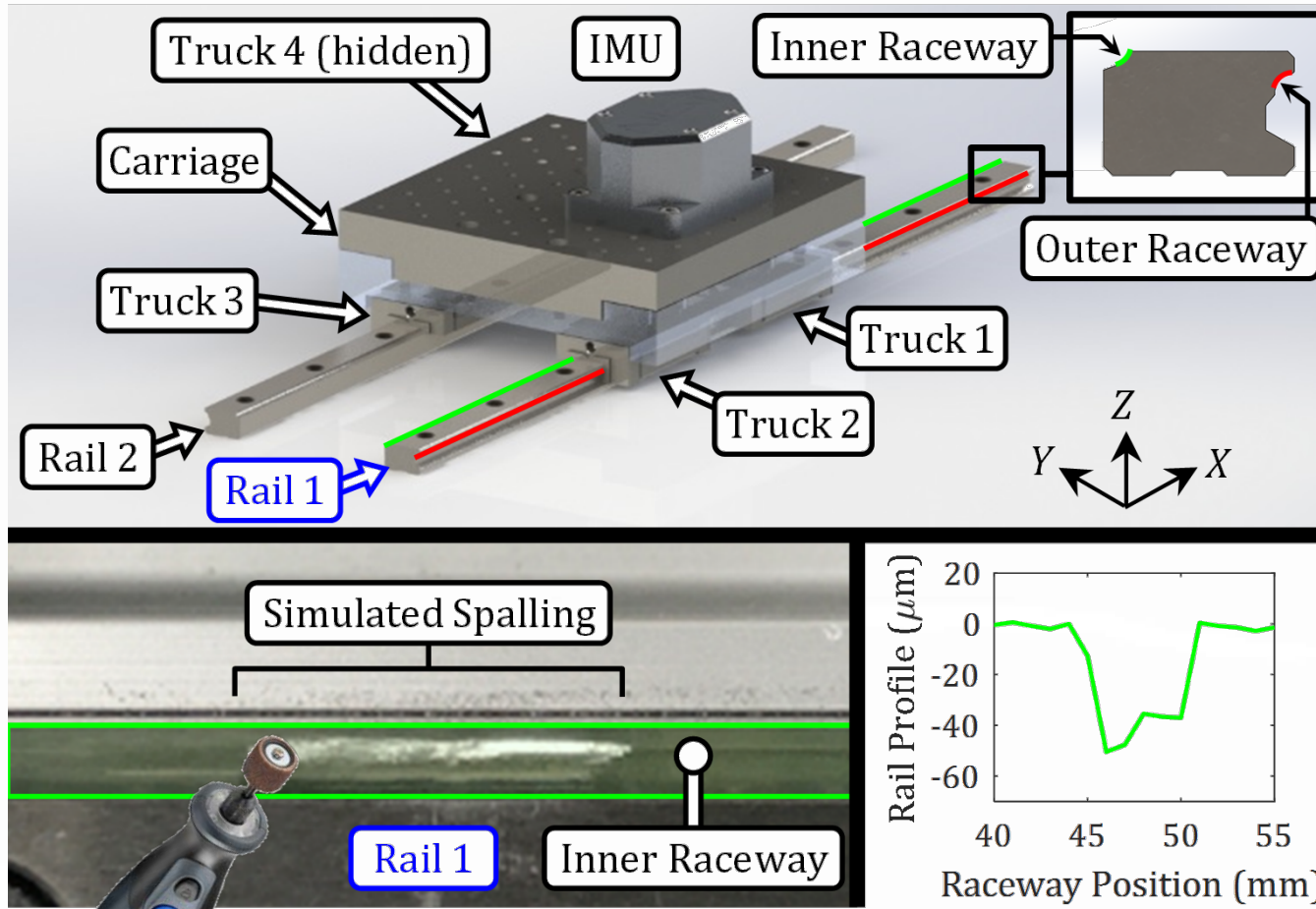
# IMU Data Collection

- Each run uses 3 different axis speeds
- IMU can live within machine tool for usage with no setup

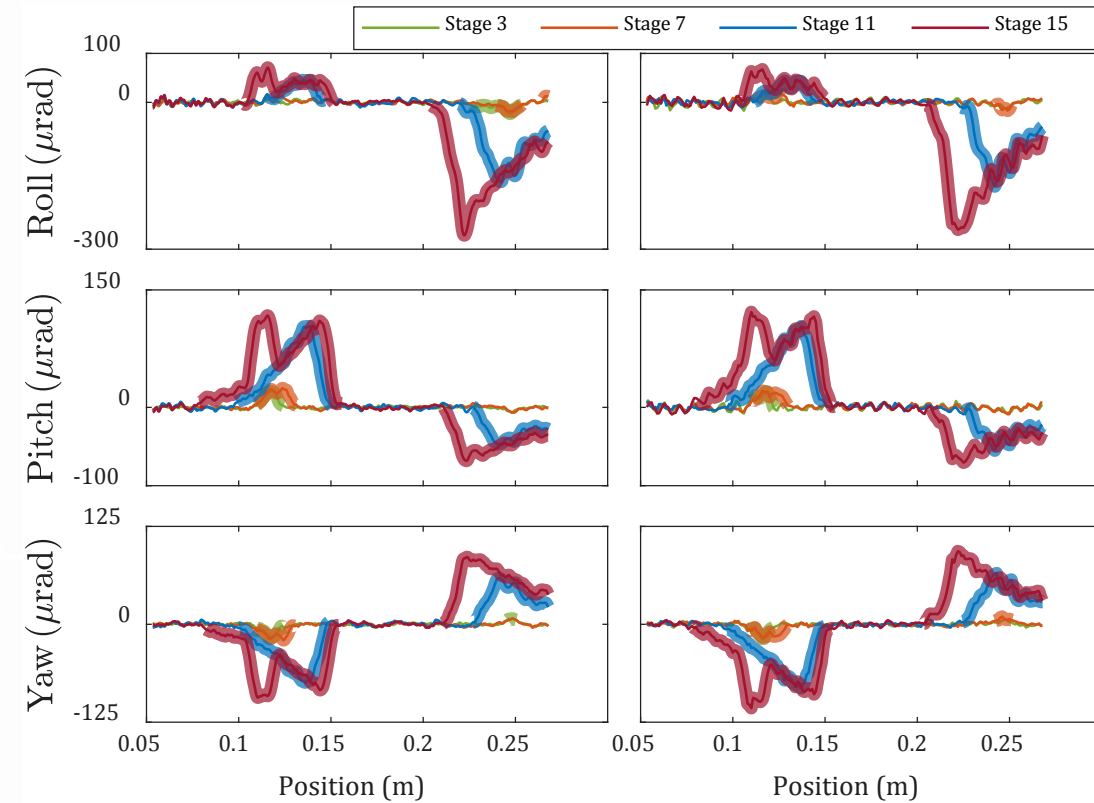


# NIST Linear Axis Testbed

- Testbed to study IMU-based method & diagnostics / root-cause analysis



## $\Delta\text{Error vs. Position}$

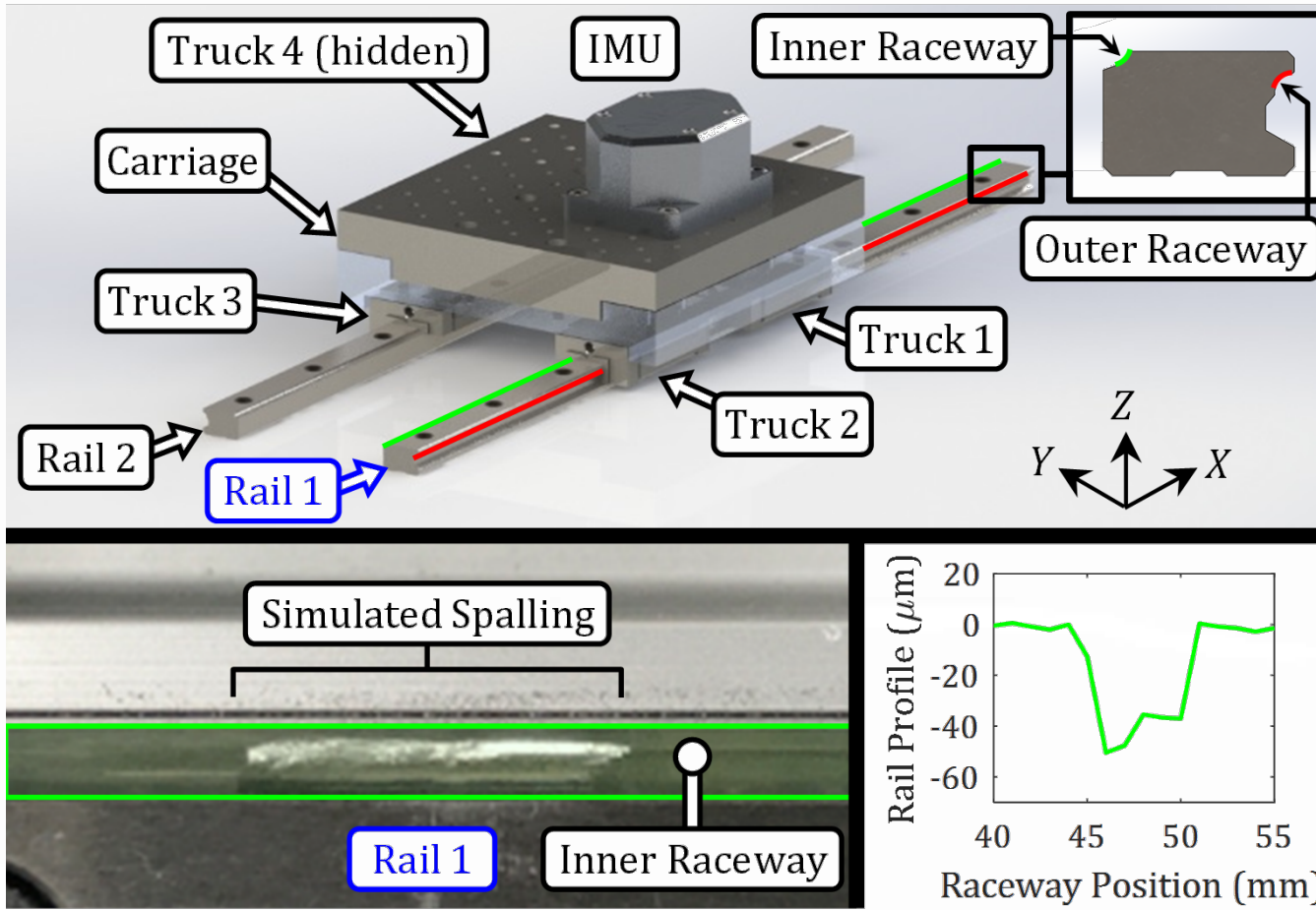


IMU

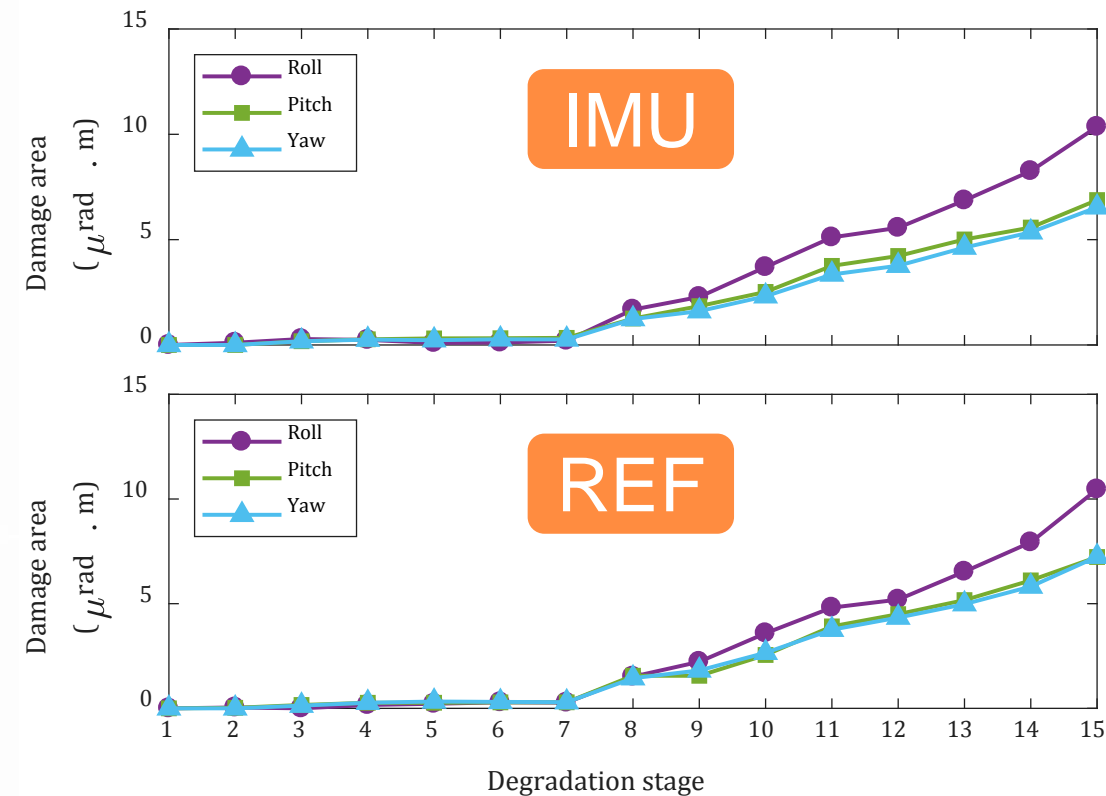
REF

# NIST Linear Axis Testbed

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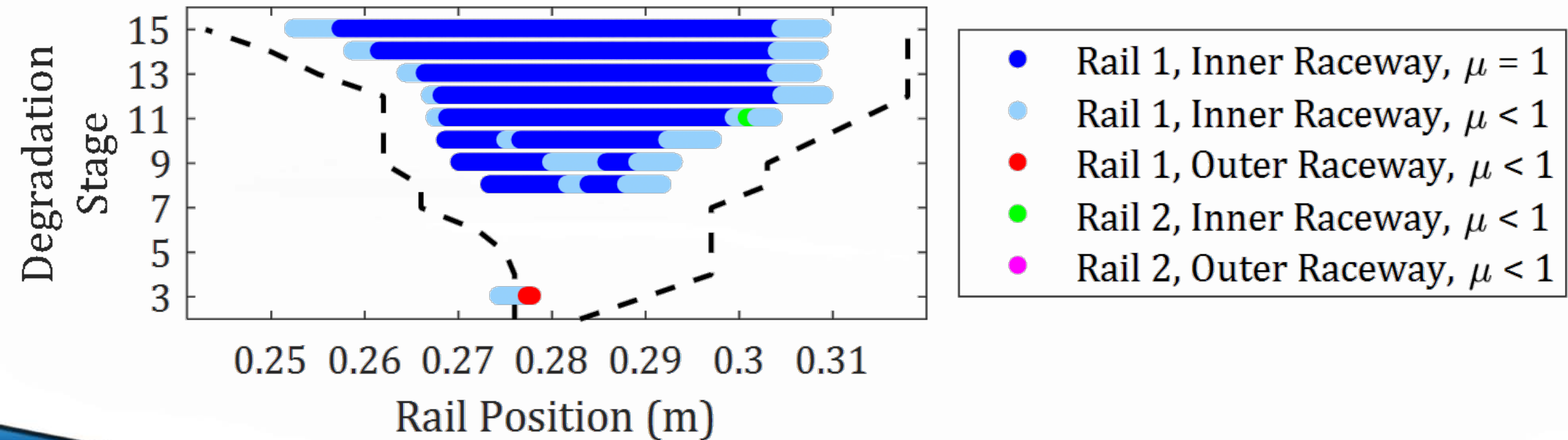


## Metric vs. degradation stage



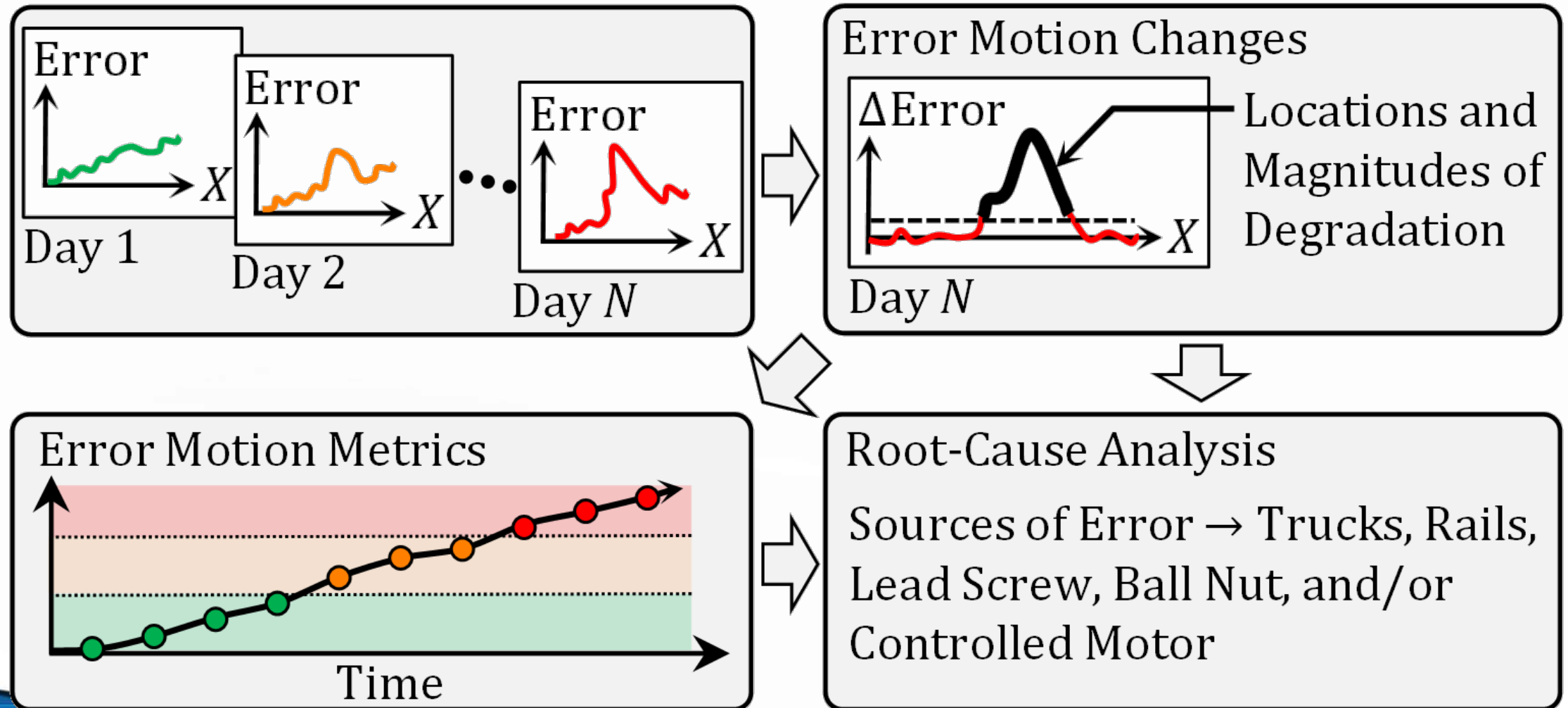
# Root-Cause Analysis for Rail Wear

- Find root cause of changing error motions
- 4 possible physical causes: inner/outer raceway damage on Rail 1 or 2
- Root-cause analysis correctly identified spalling on inner raceway of Rail 1



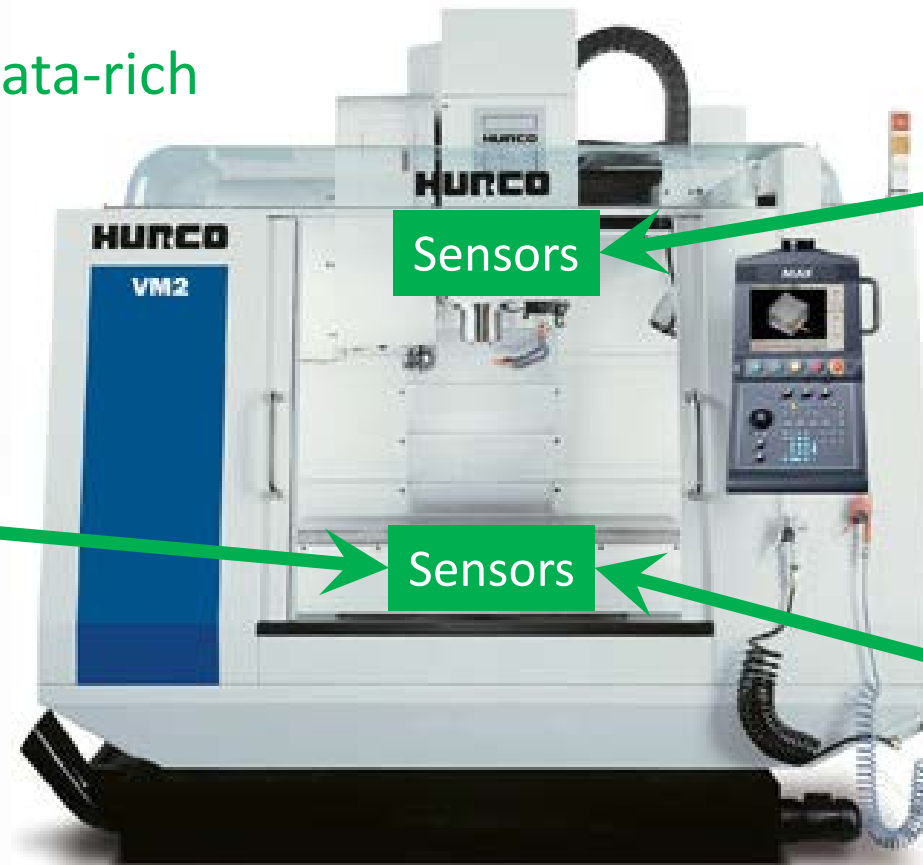
# IMU for Linear Axis Health Tracking

- Research Opportunities to use IMU for Comprehensive Root-Cause Analysis



# GOAL: Smart Machine Tools

- Industry challenge: “Machine health in 5 min?”
- On-machine measurement science to diagnose performance and root-causes
  - ~~Offline~~ Online
  - ~~Lack of periodic data~~ Data-rich
  - ~~Expensive~~ Inexpensive



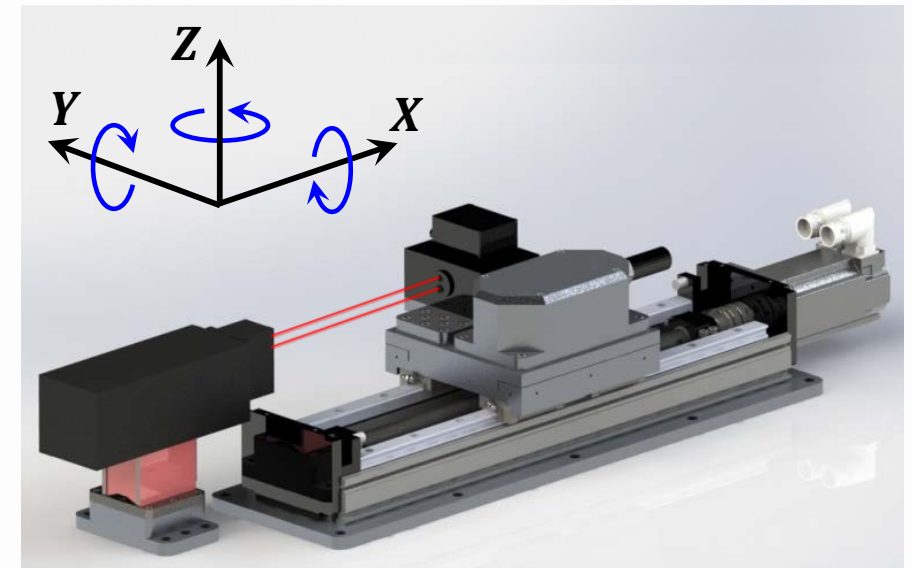
Spindle Health Tracking  
~~[How?]~~ TBD

Linear Axis Health Tracking  
~~[How?]~~ IMU

Squareness Health Tracking  
~~[How?]~~ IMU

# Lesson #1 – Smart & Metrological

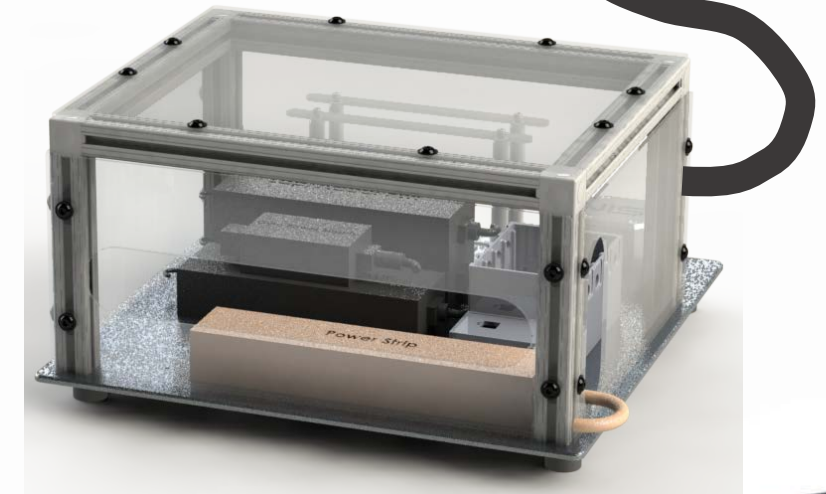
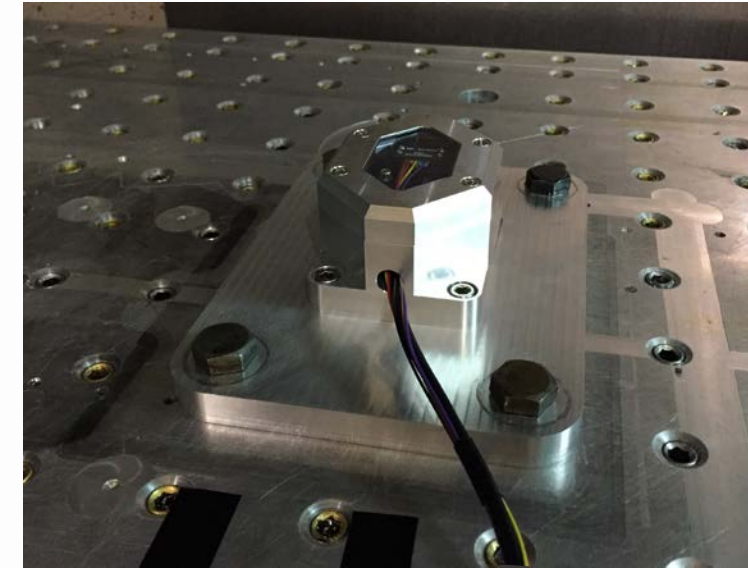
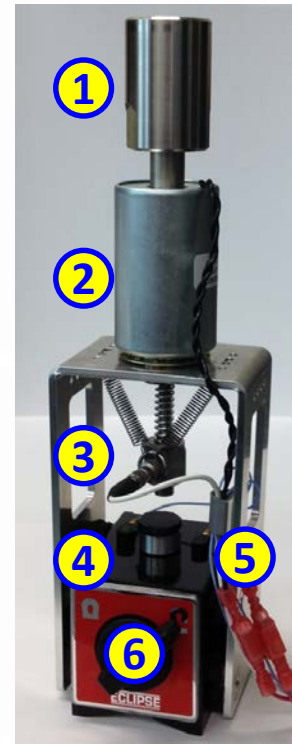
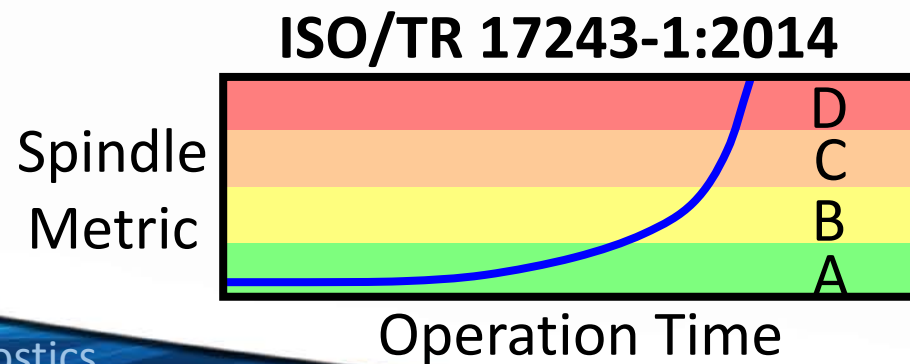
- **Traceable – Data is traceable to NIST**
  - Sensors calibrated along “measurement chain” to NIST
- **Dimensional – Results are physical quantities**
  - Inspired by international machining standards
  - Tracking  $\Delta$  error motion  $> 2 \mu\text{m}$  and  $> 6 \mu\text{rad}$
  - Physical quantities can be measured
- **Verify and validate – If possible!**
  - Compare results to those from traceable independent reference
  - Even complicated diagnostics can be shown to be correct





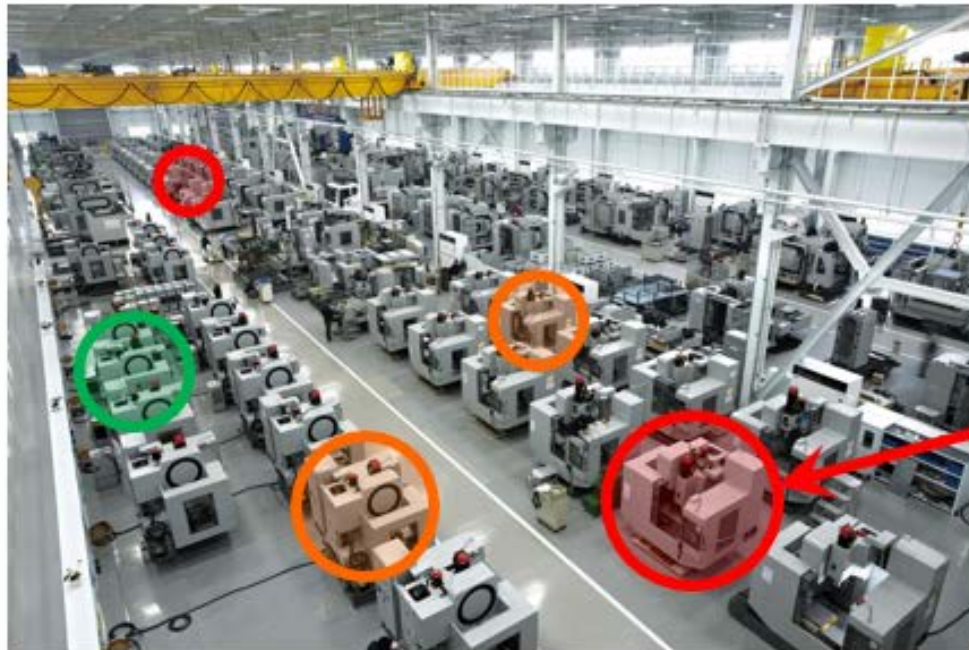
# Lesson #2 – Smart & Simple

- **Simple analytics**
  - Can be explained and standardized
  - More robust because tested more easily
  - Easier to implement for great adoption
  - Goal- or physics-based thresholds
- **Simple user setup**
  - Plug and play solutions
  - Vendor neutral for flexibility



# Lesson #3 – Future Directions

- Make smart machine tools with *online, data-rich, and inexpensive* diagnostics & prognostics of performance & root causes of faults/failures
- Predict part errors based on health tracking & optimize asset management



[Hyundai Wia Plant](#)

Tablet

Machine #1

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Axis 2  
70  $\mu\text{rad}$  range

Optimum Machine: #5

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