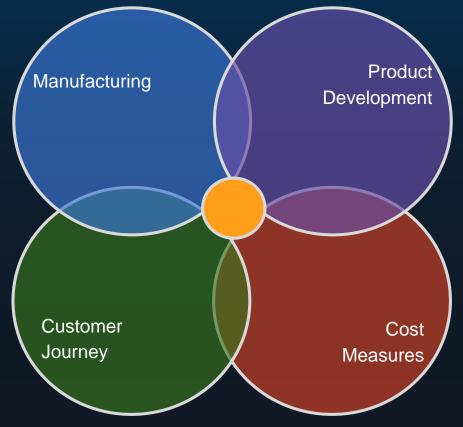


Predictive Analytics Approach with Time Series Data using Machine Learning

Sanket Amberkar SVP, Falkonry

20% Productivity Rise* From Digital Analytics

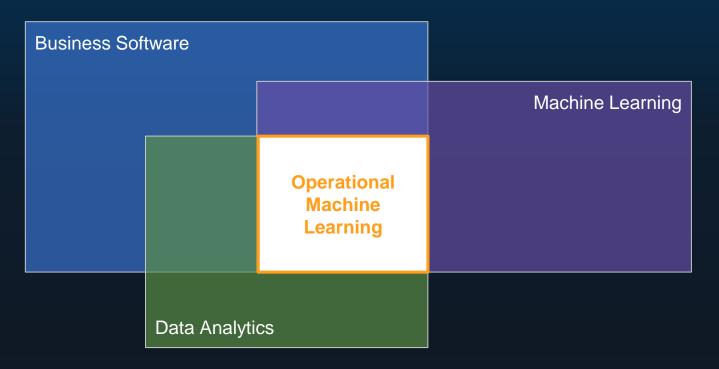
Improvements seen across key business vectors





Operational Machine Learning

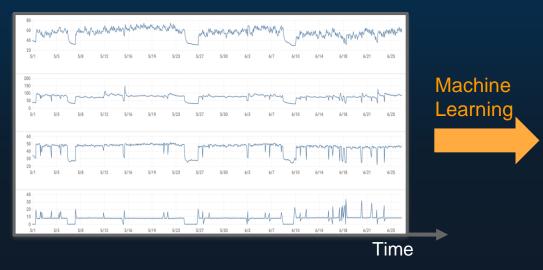
New market category to address massive data wave

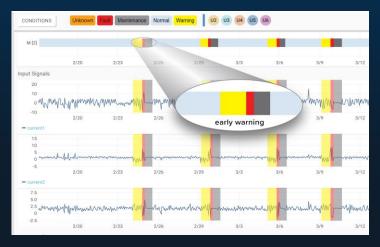




Time Series: The Dark Data Within Operations

Ubiquitous, but underutilized, insight-rich data in industrial operations





Dark, proprietary data

- Already generated in machinery
- No long term benefit
- Proprietary and restricted access

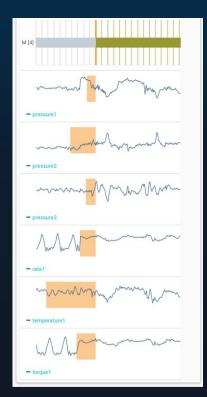
Operation throughput, quality, safety

- Discover unanticipated behaviors
- Find early warning signs
- Create reliable alarms



Patterns Provide Insight But Need To Be Discovered

Multiple challenges for conventional machine learning / deep learning approaches



Patterns are very complex

 Temporal patterns appear over windows of time - NOT in single snapshot

Behavior of interest are not adequately labeled

- Very few occurrences to learn from
- Need to support BOTH unsupervised and semi-supervised learning

Limitations of traditional approaches

 Traditional approaches require data scientists and do not scale or adapt to conditions

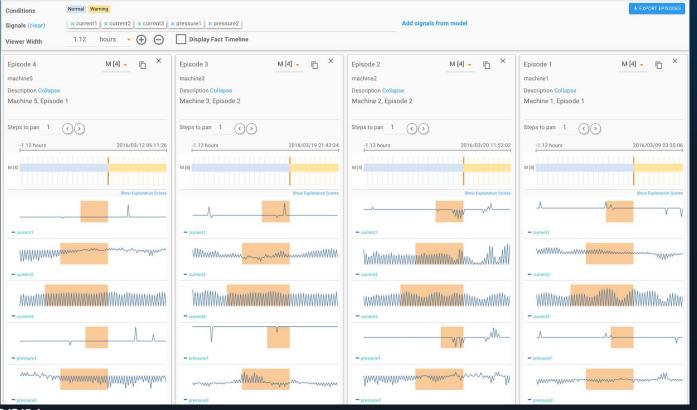
Real-time data is not perfect

 Standard analytics middleware do not handle synchronization or gaps in data



Visualizing Key Patterns in Important Signals

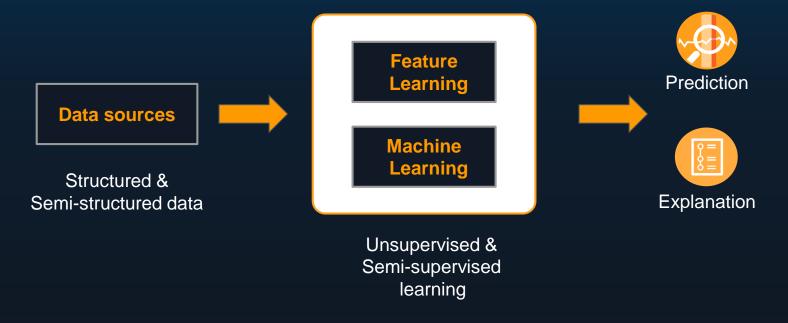
Patterns are not all the same to human observer





Emerging Understanding of "Data Scientist In a Box"

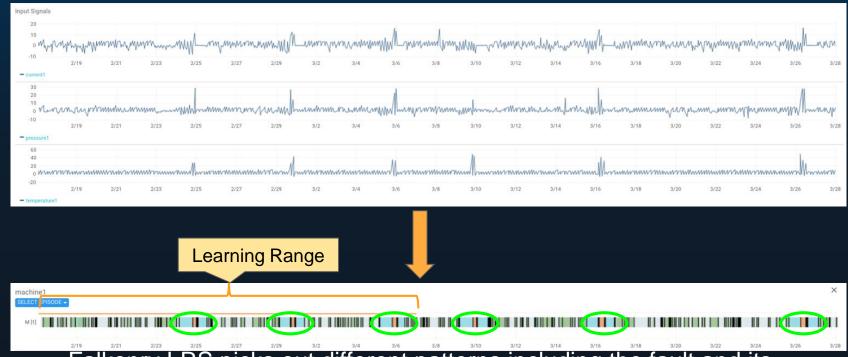
Essential for the industrial subject matter experts to self-service machine learning





Unsupervised Learning of Patterns

Learning on partial data



Falkonry LRS picks out different patterns including the fault and its precursor.

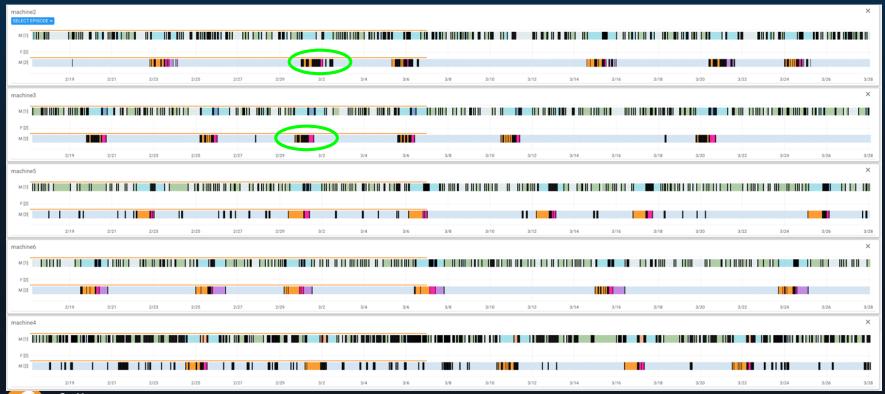


Semi-Supervised Learning of Patterns

Adding "facts" to learn patterns



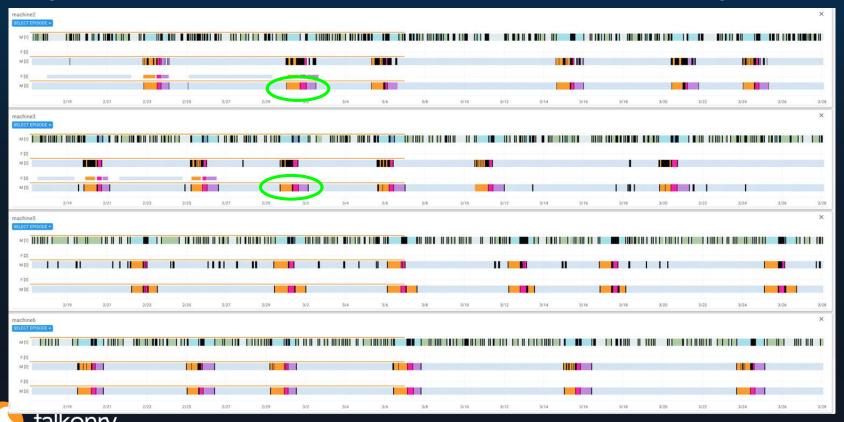
Issues Mapping Initial Model to Other Machines Some confusion on categorizing Machine # 2





Easily Addressed With A Few Additional Facts

Adding data from Machine #2 improves the prediction for all remaining machines



Episode Comparison to Study Patterns

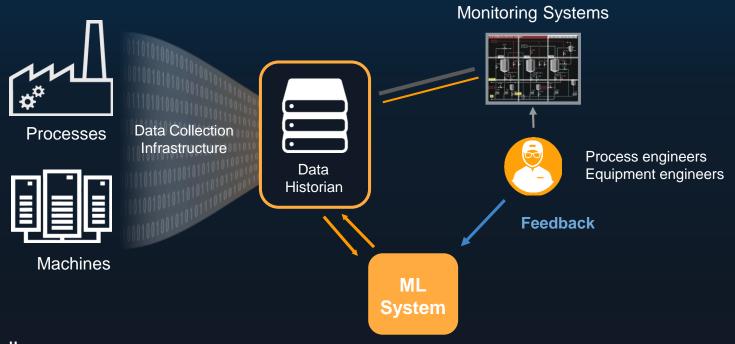
Distinct transition from normal operation to warning condition





Condition Monitoring with Predictive Analytics

Smart manufacturing and Smart factory





Use Cases Across Industries

Production optimization: throughput, quality, safety, and yield improvements



Oil & Gas Operations

- Detect pre-shutdown patterns
- Real-time alerts for uncontrolled emissions



Power & Energy Operations

- Fault classification of power electronics
- Distributed asset monitoring



Semiconductor Manufacturing

- Predictive maintenance of equipment
- Optimize machine utilization



Mining & Metals Production

- Discover equipment downtime patterns
- Real-time production throughput adjustment



Automotive Manufacturing

- Detect deviations in discrete manufacturing
- · Real-time quality estimation of welding



Chemical Manufacturing

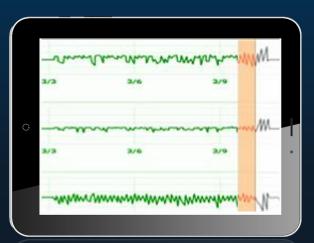
- Quality estimation of batch process
- Monitor machine health



Falkonry LRS

A strategic approach to digital operations transformation

- No data scientists required
- High value information from time series data
- Discover invisible patterns in minutes
- Ready-to-use machine learning is a strategic tool



www.falkonry.com

