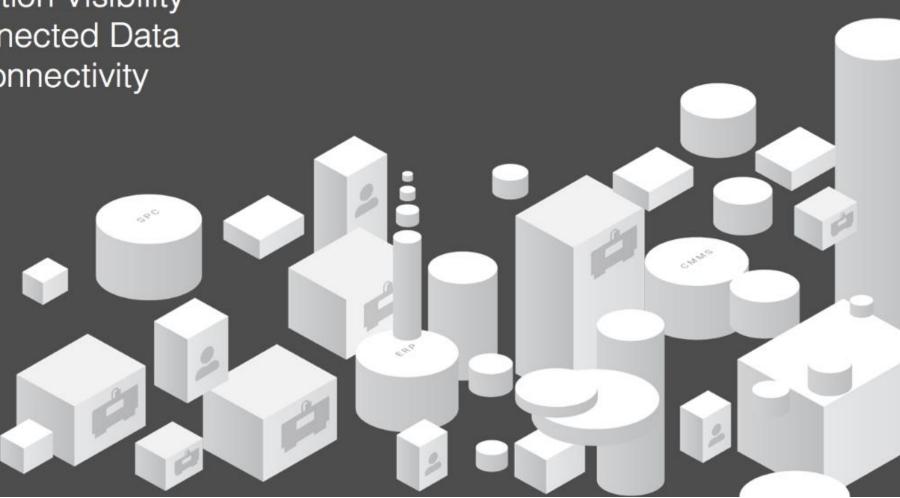


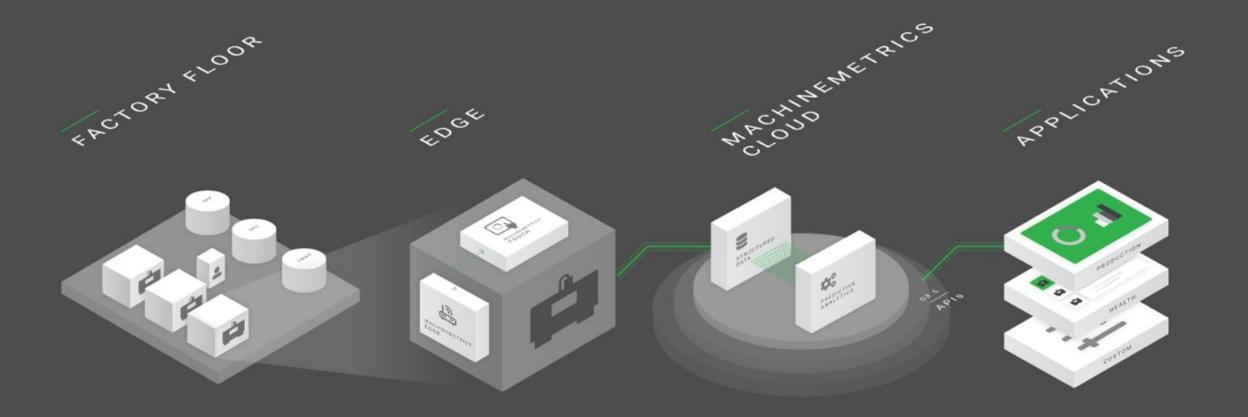
Manufacturing Analytics, Simplified

The Problem

Lack of Production Visibility Silos of Disconnected Data No Machine Connectivity

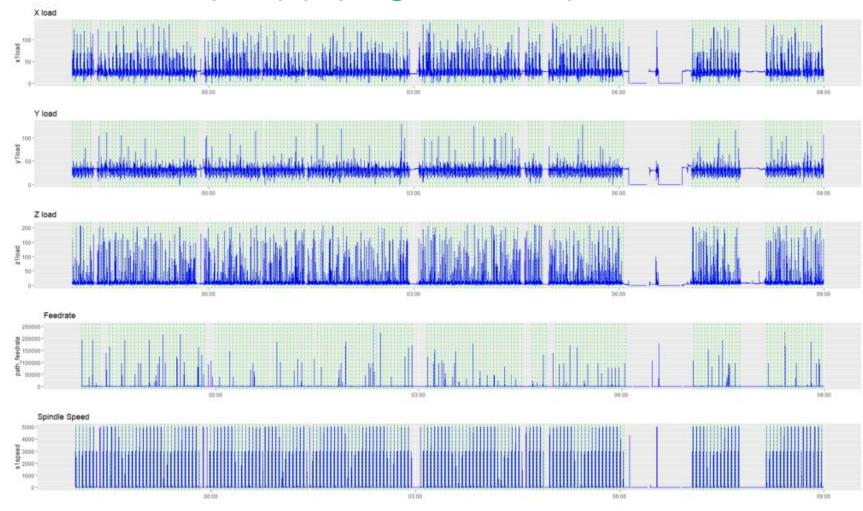


The Solution

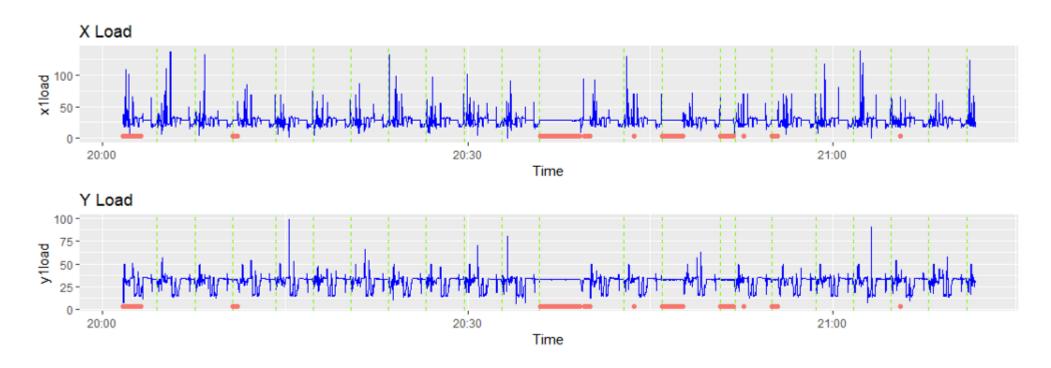




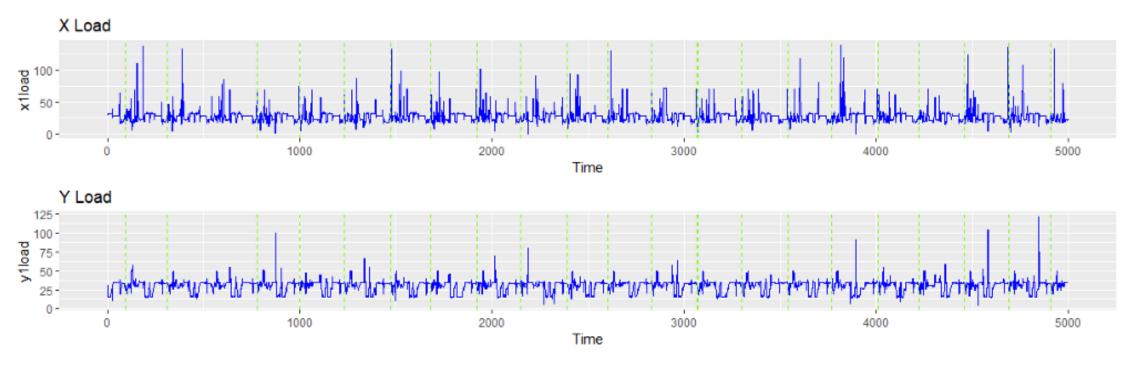




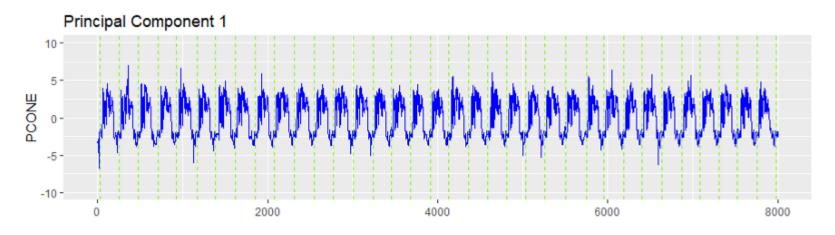
Add Part Counts

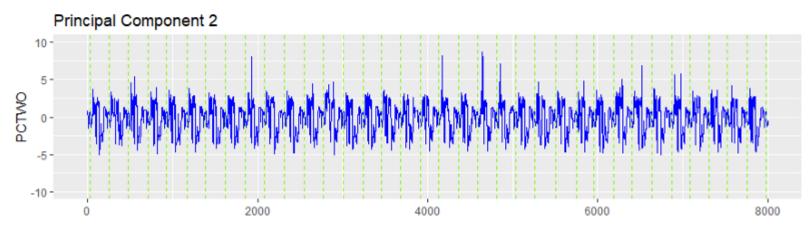


Remove periods of inactivity

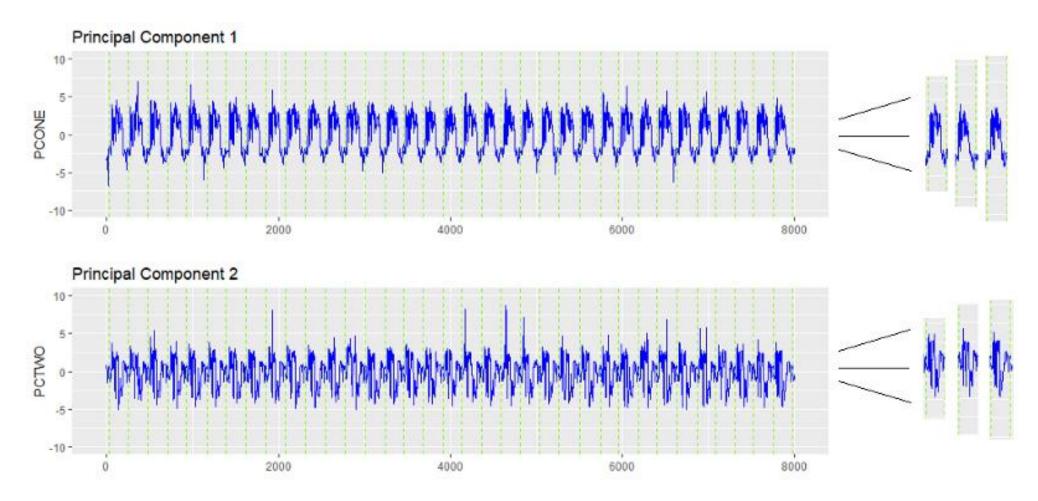


Obtain cleaned signal

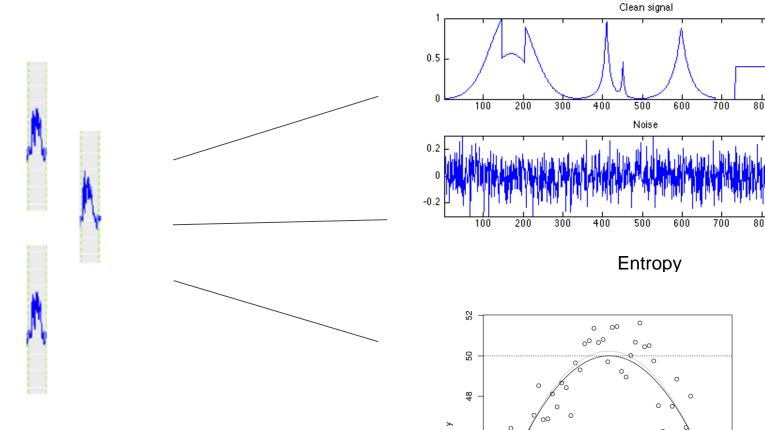




Apply Principal Components Analysis (PCA)



Apply PCA/Pull out Part Signatures



42

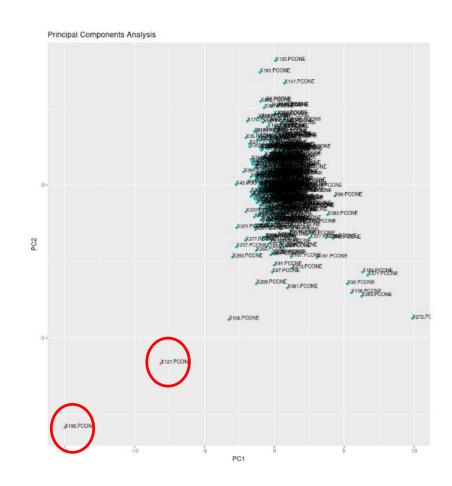
Curvature

Determine Time Series Features of each Part Signature

Others: Autocorrelation Maximum change of mean Flat spots

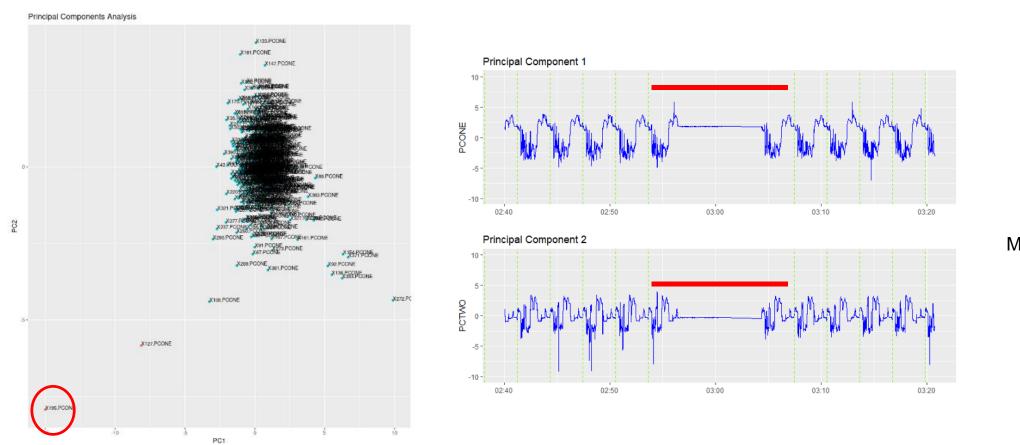
| entropy [‡] | ACF1 [‡] | Ishift [‡] | vchange [‡] | fspots [‡] | curvature [‡] | spikiness ÷ | name [‡] |
|----------------------|-------------------|---------------------|----------------------|---------------------|------------------------|--------------|-------------------|
| 0.5791507 | 0.9541931 | 1.389647 | 0.6904390 | 17 | 9.5747627 | 1.490440e-06 | X2.PCONE |
| 0.5845898 | 0.9557680 | 1.381937 | 0.6170758 | 13 | 10.7799720 | 9.267802e-07 | X3.PCONE |
| 0.5619560 | 0.9616677 | 1.508141 | 0.7500458 | 18 | 9.6537984 | 7.909221e-07 | X4.PCONE |
| 0.5937982 | 0.9581793 | 1.523913 | 0.6597335 | 16 | 10.0559587 | 1.908598e-06 | X5.PCONE |
| 0.5775437 | 0.9653088 | 1.494504 | 0.7770098 | 19 | 10.5869821 | 1.339215e-06 | X6.PCONE |
| 0.6125979 | 0.9387312 | 1.605756 | 0.7763621 | 23 | 9.0914199 | 2.076235e-06 | X7.PCONE |
| 0.6002039 | 0.9507429 | 1.489281 | 0.7380794 | 14 | 9.4734195 | 1.766317e-06 | X8.PCONE |
| 0.5931458 | 0.9512399 | 1.512260 | 0.8086808 | 15 | 11.1473992 | 1.373689e-06 | X9.PCONE |
| 0.5874797 | 0.9499952 | 1.389640 | 0.7259521 | 19 | 9.9868468 | 1.487491e-06 | X10.PCONE |
| 0.6009636 | 0.9608396 | 1.561277 | 0.7500236 | 16 | 11.1157820 | 1.837510e-06 | X11.PCONE |
| 0.5807226 | 0.9498116 | 1.632102 | 0.7401149 | 16 | 9.4350794 | 1.388574e-06 | X12.PCONE |
| 0.5841583 | 0.9555851 | 1.543700 | 0.7869859 | 18 | 9.5975107 | 1.996555e-06 | X13.PCONE |
| 0.5940686 | 0.9487545 | 1.308387 | 0.5884752 | 14 | 9.6741774 | 2.015899e-06 | X14.PCONE |

Obtain Time Series Features for each Part Signature



Apply PCA on Time Series Features and Find Outliers with DBSCAN

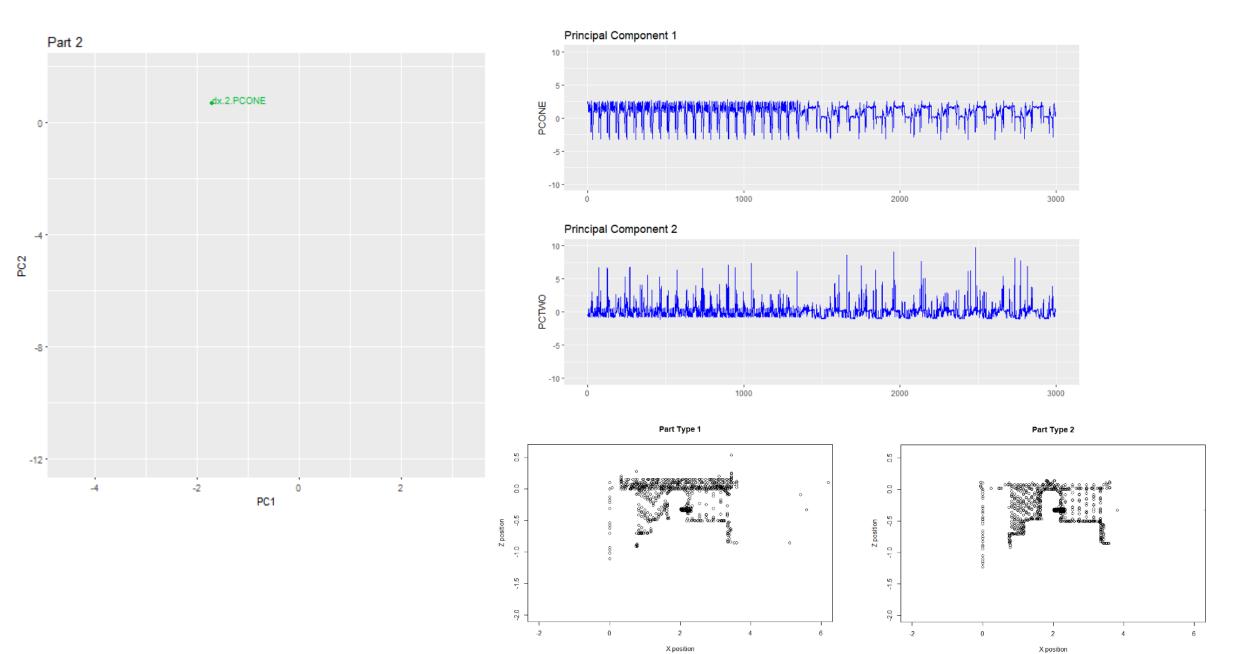
Results

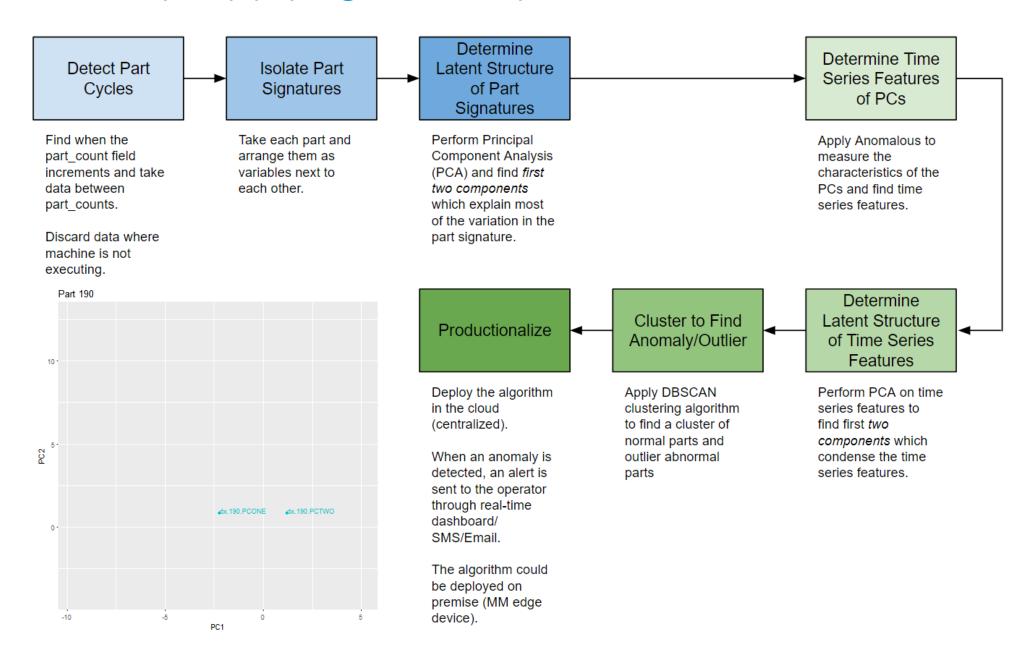


Machine Stall

Apply PCA on Time Series Features and Find Outliers with DBSCAN

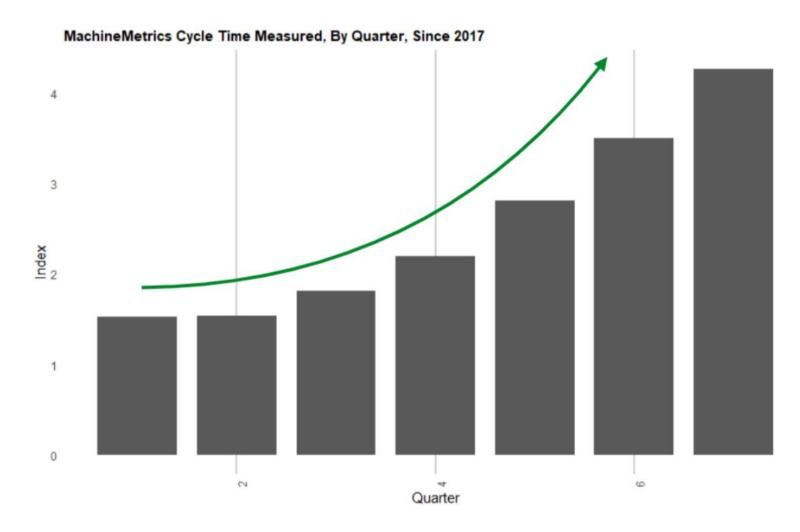
Alternative Use Case





"We believe a new, more powerful, business model has evolved...When built right, they create a reinforcing cycle: Their products get better, allowing them to collect more data, which allows them to build better models, making their products better, and onward."

- WSJ





Appendix

A Virtuous Cycle

Expansion

Customers expand with MachineMetrics and more data is fed to our algorithms



Reception

Customers receive data products and are incentivized to connect more machines to MachineMetrics

Data Capture

Data is captured at high frequency from machines connected to our cloud service

4

Analysis

Data is analyzed and useful products are released to customers (benchmarking, anomaly detection, etc.)