## PI System Analytics, Fit for Purpose

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## PI System Analytics – Fit for Purpose

### **ABSTRACT**

Attend this talk as we cover scenarios to illustrate the different levels of analytics that are fit-for-purpose when using the PI System - for example, what calculations and analysis do you do in AF, when do you use MATLAB for advanced calculations that hook into AF and when do you call on "data science and machine learning".

Use cases will focus on equipment i.e. pump or motor or compressor etc. as well as on a process.



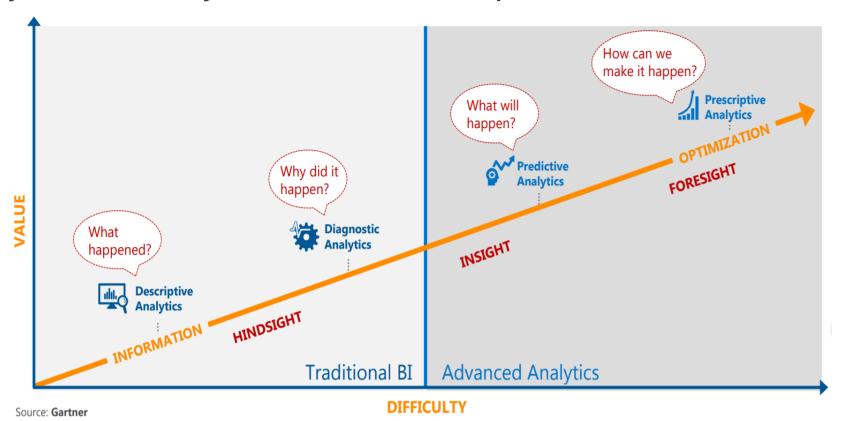
## Layers of Analytics – View Thru' Multiple Lenses

- Functional Scope Process Insight & Excellence
  - Descriptive, diagnostic, predictive, prescriptive
- Business Scope Improved Reliability
  - Usage-based Maintenance UbM
  - Condition-based Maintenance CbM
  - Predictive Maintenance PdM
    - Simple predictive (Advanced CbM)
    - Advanced predictive Statistical, Machine learning...
- Architectural Location
  - Edge device, Server or cloud based
  - Analytics during data collection?

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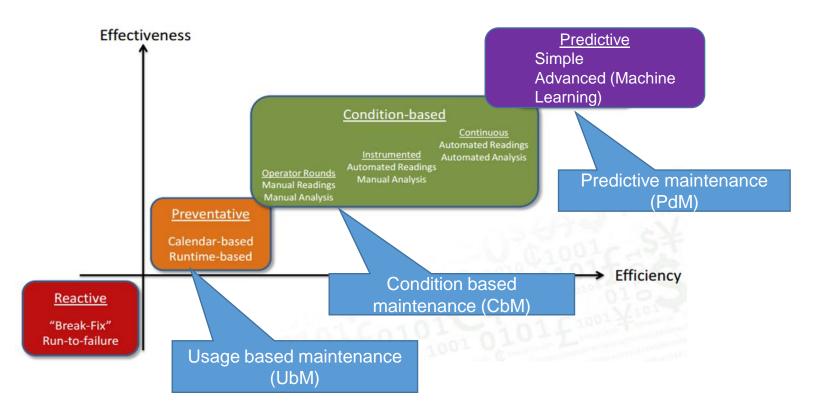
## Layers of Analytics - Process Operations



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## Layers of Analytics - Maintenance & Reliability





## Layers of Analytics – View Thru' Multiple Lenses

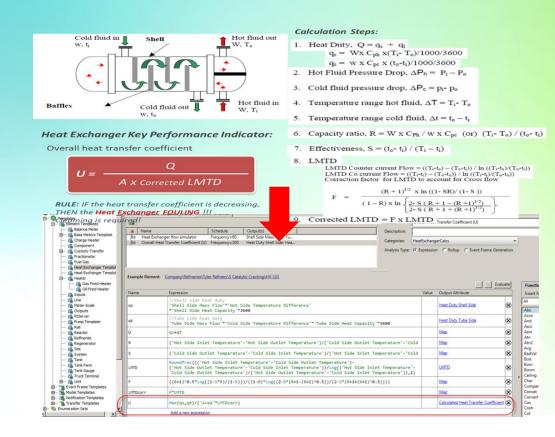
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## Descriptive Analytics - Pl Asset Analytics

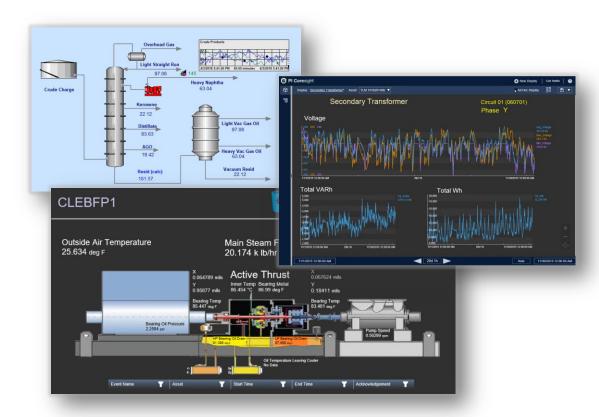
- Configure calculations for transparency and scale
- Math, statistical, and timebased functions
- Integration with MATLAB
- Testing and operationalization of predictive analysis models
- Condition-based notification
- Supports future data for forecasting





## Diagnostic Analytics — Trending and Event Awareness

- Access to operational data in real-time with tools suited to Operations.
- Supports ad hoc, self-service investigation.





## Real-time Data is Different

- Transactional data is recorded in a tabular format with values associated by columns in each row.
- Real-time data is recorded with only time context, i.e. value and timestamp.

| → A <sup>B</sup> <sub>C</sub> leakno | AB compute_0002 | ▼ A <sup>B</sup> <sub>C</sub> city | ✓ A <sup>B</sup> <sub>C</sub> grade | ▼ A <sup>B</sup> <sub>C</sub> read_locat           | A <sup>B</sup> C map | ✓ A <sup>B</sup> <sub>C</sub> plat | ▼ A <sup>B</sup> <sub>C</sub> block | AB date_reptd      |
|--------------------------------------|-----------------|------------------------------------|-------------------------------------|--|----------------------|------------------------------------|-------------------------------------|--------------------|
| 7800201621                           | 00201621        | San Jose                           | 3                                   | Under Drway o/m                                    | 3411                 | F07                                | 040                                 | 11/28/2000 14:00:0 |
| 7801200081                           | 01200081        | Santa Clara                        | 3                                   | o/m in s/e cor of Humbolt Ave                      | 3411                 | B08                                | 010                                 | 1/5/2001 11:00:00  |
| 7801200091                           | 01200091        | Santa Clara                        | 3                                   | o/m 2' into property                               | 3411                 | D06                                | 028                                 | 1/4/2001 01:30:00  |
| 7801200121                           | 01200121        | Santa Clara                        | 2                                   | o/m, 3' from sidewalk                              | 3411                 | D06                                | 012                                 | 1/16/2001 10:00:0  |
| 7801200841                           | 01200841        | Santa Clara                        | 3                                   | 1% o/m under concrete pkstrip at e/end of drway    | 3411                 | A07                                | 028                                 | 8/27/2001 11:00:0  |
| 7801200851                           | 01200851        | Santa Clara                        | 3                                   | 1% under drway at curb & Gutter                    | 3411                 | A08                                | 015                                 | 8/28/2001 10:00:0  |
| 7803200121                           | 03200121        | San Jose                           | 3                                   | 1575 Parkveiw Ave.                                 | 3411                 | H07                                | 044                                 | 3/23/2003 09:48:0  |
| 7803200461                           | 03200461        | Santa Clara                        | 3                                   | 1% in svc tee area o/main                          | 3411                 | C07                                | 026                                 | 11/10/2003 07:33:  |
| 7806200241                           | 06200241        | Santa Clara                        | 3                                   | s/w cor Princeton Wy x Princeton Ct on main        | 3411                 | C07                                | 012                                 | 2/6/2006 13:15:00  |
| 7806200271                           | 06200271        | Santa Clara                        | 3                                   | S/E cor Homestead x Lawrence Exwy valve frme&cover | 3411                 | C07                                | 016                                 | 2/7/2006 11:40:00  |
| 7806200351                           | 06200351        | Santa Clara                        | 2                                   | O/M @ svc tee (Longside)                           | 3411                 | C08                                | 037                                 | 2/16/2006 10:00:0  |
| 7806200441                           | 06200441        | Santa Clara                        | 3                                   | over main next to srvc tee                         | 3411                 | D07                                | 048                                 | 3/8/2006 13:00:00  |
| 7806200481                           | 06200481        | Santa Clara                        | 2                                   | on main or tee                                     | 3411                 | D08                                | 052                                 | 3/10/2006 09:45:0  |
| 7806200491                           | 06200491        | Santa Clara                        | 2                                   | on main ovr sewer not venting to house             | 3411                 | D08                                | 053                                 | 3/10/2006 10:00:0  |
| 7806200501                           | 06200501        | Santa Clara                        | 2                                   | btwn #s 3145 & 3155 Mauricia Wy on main or tee     | 3411                 | D08                                | 800                                 | 3/10/2006 11:25:0  |
| 7806200511                           | 06200511        | Santa Clara                        | 3                                   | on tee S/O driveway                                | 3411                 | D08                                | 056                                 | 3/10/2006 14:00:0  |
| 7806200541                           | 06200541        | Santa Clara                        | 3                                   | on tee   | 3411                 | D08                                | 049                                 | 3/15/2006 13:30:0  |
| 7806200561                           | 06200561        | San Jose                           | 2                                   | ovr main btwn Greendale & Auburn on Albany         | 3411                 | E08                                | 014                                 | 3/16/2006 13:45:0  |
| 7806200611                           | 06200611        | Santa Clara                        | 3                                   | 15' from drway about 15" in parkstrip @svc tee     | 3411                 | F07                                | 041                                 | 3/22/2006 13:45:0  |
| 7806200641                           | 06200641        | Santa Clara                        | 3                                   | 3% OVER MAIN NEXT TO SEWER                         | 3411                 | G08                                | 012                                 | 3/23/2006 14:00:0  |
| 7806200651                           | 06200651        | San Jose                           | 3                                   | on main or srvc tee                                | 3411                 | F08                                | 072                                 | 3/24/2006 11:15:0  |
| 7806200681                           | 06200681        | Santa Clara                        | 2+                                  | 5" in parkstrip fr/swk over tee on main 6' from    | 3411                 | G07                                | 006                                 | 3/28/2006 13:40:0  |
| 7806200701                           | 06200701        | Santa Clara                        | 3                                   | 36' EO W p/l Olympus. 2% In water box              | 3411                 | G08                                | 053                                 | 3/28/2006 13:00:0  |
| 7806200711                           | 06200711        | Santa Clara                        | 2                                   | F/O o/main (under tree)                            | 3411                 | H06                                | 023                                 | 3/29/2006 11:00:0  |
| 7806200721                           | 06200721        | Santa Clara                        | 2+                                  | o/svc/tee about 3' from drway in parkstrip         | 3411                 | G07                                | 014                                 | 3/29/2006 13:10:0  |

56.902 03-SEP-2016 11:23 AM



## Real-time Data Requires Context

Time

63.781 03-SEP-2016 11:19 AM



56.902 03-SEP-2016 11:23 AM

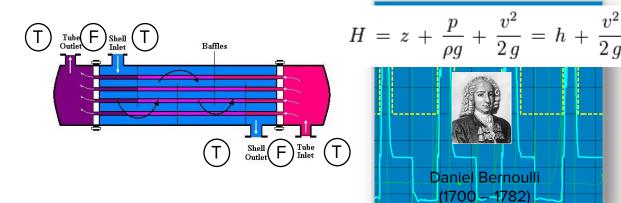


58.341 03-SEP-2016 11:41 AM

**Asset** 

#### **Broice tisticAlEtiot**ns

Location

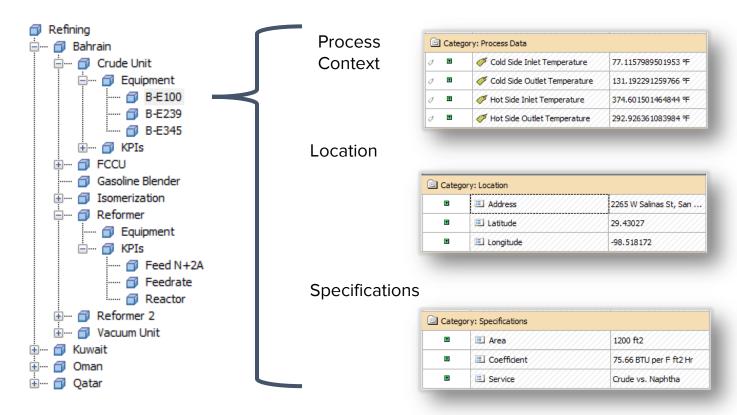




## Real-time Data Requires Context

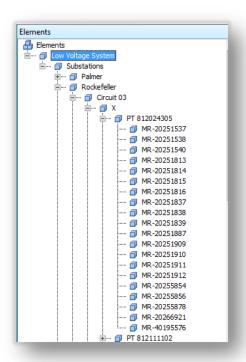
#### Asset Hierarchy

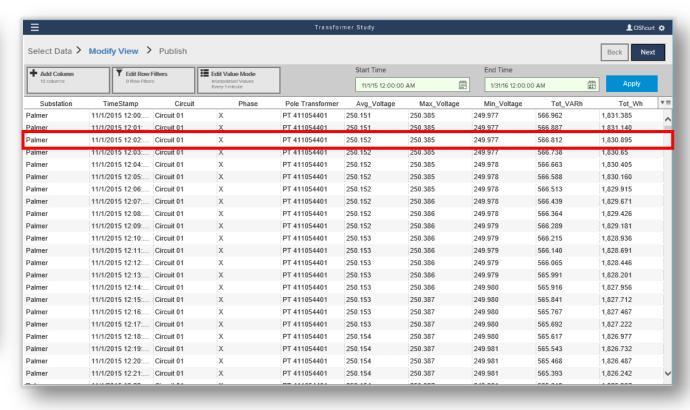
- Plant
- Process
- Assets
- Process Context
- Location
- Specifications





## PI AF Provides Context to Real-time Data



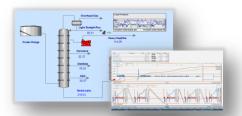




## Supporting Analytics with Contextualized Data

Real-Time Decision Analysis

Retrospective & Predictive Analysis



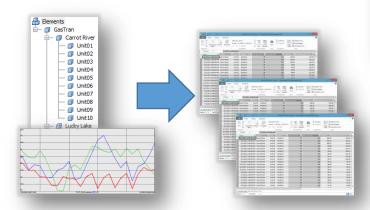
Time and Event Trending & Awareness

Specialized Models Simulation & Optimization

$$Q=rac{\Delta P_{DD}*kh}{141.2\mu B_0\Big\{lnrac{r_e}{r_w}-rac{3}{4}+S\Big\}}$$

Descriptive
Condition & Performance

PI Integrator for Business Analytics



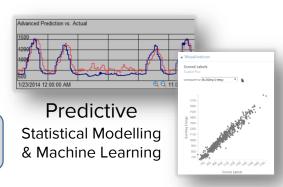
Time, Event and Asset Context

Tabular Context

Common Ground between Technological Contexts



Visual
Dashboards &
Multidimensional Assessment



## Diagnostic Analytics – Multidimensional Visualization, Dashboards

Business Analysis

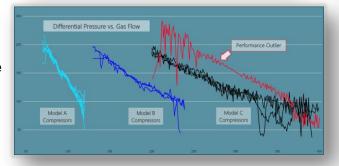
Product inventories





**Dashboards** Collaboration

**Asset Performance** *Benchmarking* 



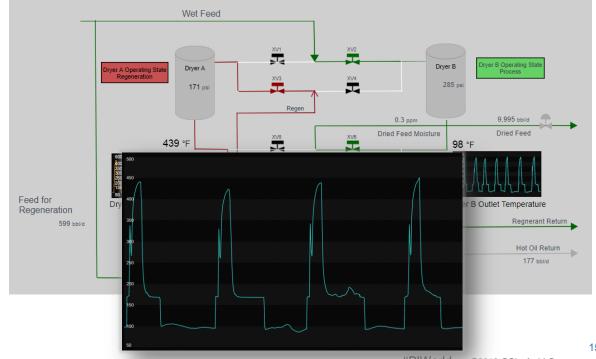


Analytics
Measurement
Correlation

## Feed Drying Process - Process and Regeneration Cycles Also see PI World 2018 Layers of Analytics Hand-on Lab

- Molecular sieve dryers remove water from hydrocarbon feedstock before entering reactor
- Proper regeneration is critical to avoid corrosion in acidic reaction
- Cyclic operation between **Process and Regeneration** cycles
- Regeneration cycle is indicated by high be outlet temperatures

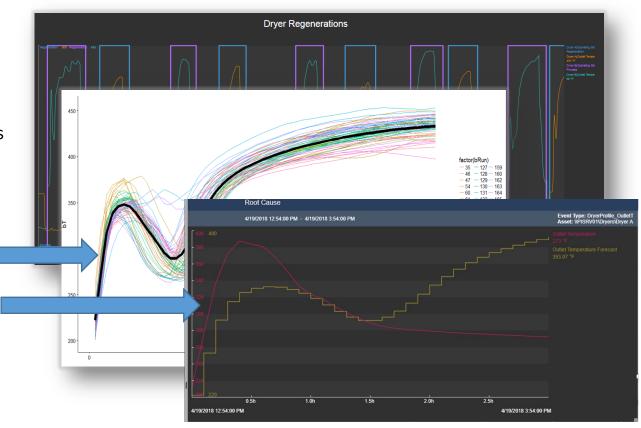
## **Dryer A RegeneratiorDryer B Regeneration**





## Predictive Analytics – Dryer Regeneration Guidance for Operations

- During Regeneration, monitor bed Outlet Temperature against a modeled profile, notify operator of deviations
- Prepare data using AF Analytics and Event Frames
- Publish dataset for model development and training
- Develop model in R/MATLAB
- Operationalize model using AF Analytics and R/MATLAB

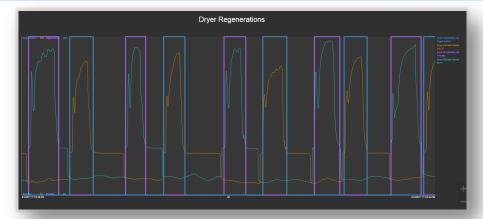




## Feed Dryer Status – Regeneration Event Frames

- AF Analytic defines the beginning and end of regeneration cycle
- Digital state for each dryer with Process of Regeneration states
- Start temp. = 170 F, End temp = 175 F
- Confirm five hours since last regeneration to avoid short cycles caused by initial temperature fluctuation
- Backfill through 2017

```
If('Outlet Temperature' >= 'Outlet Temperature|Start of Regeneration Temperature'
    And PrevVal('Operating State', '*-5h') = "Process")
Then (If PrevVal('Operating State', '*')="Regeneration"
        Then NoOutput()
        Else "Regeneration")
Else
    (If('Outlet Temperature' <= 'Outlet Temperature|End of Regeneration Temperature'
        And PrevVal('Operating State', '*-5h') = "Regeneration")
Then (If PrevVal('Operating State', '*') = "Process"
        Then NoOutput()
        Else "Process")
Else NoOutput())</pre>
```





## Feed Dryer Bed Age — "Dryer Bed Processing Age"

- AF Expression analytic determines processing age of molecular sieve desiccant
- Enables bed balancing for maximum service
- Calculate Lifetime Total Dried Feed, converts total volume from a volumetric rate
- Processing age:

Lifetime Total Dried Feed Loaded Wt. of Mol. Sieve

Backfill through 2017

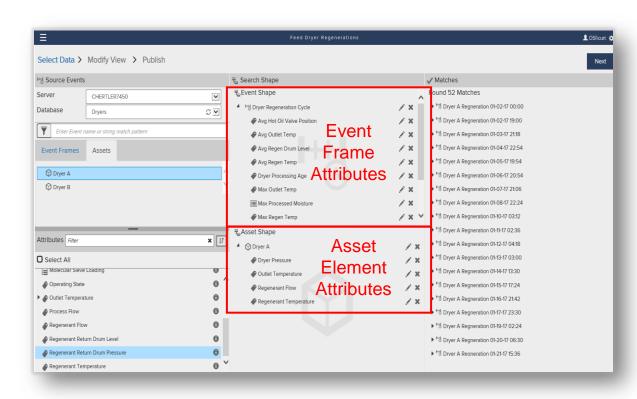


```
If ('Operating State' = "Process"
    And Not(BadVal('Process Flow'))
    And Not(BadVal(PrevVal('Process Flow','*'))))
Then 'Lifetime Total Dried Feed' +
    TagTot('Process Flow', PreviousProcessFlowTime,'*')
Else NoOutput()
```



## Dryer Regeneration — Publishing Summarized Dataset

- Leverage AF model to Select,
   Shape and Publish tabular
   views to a variety of endpoints
- Event Views publish Event Frame data in either Summarized or Sampled structures
- Sampled view combines
   aggregations taken over the
   Event Frame duration with
   Asset data sampled at intervals
   throughout the duration





# **Event Frame Event Frame Event Frame Event Frame**

## Dryer Regeneration - Sampled Event Publication

#### Interpolated Values – 6 min.

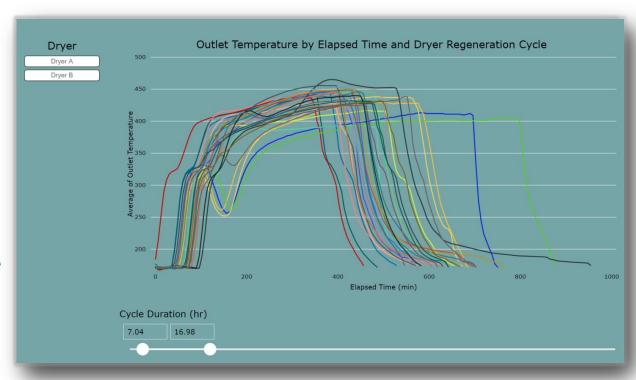
#### Event Frame Attributes\Features

|           | Dryer   | Time Stamp                                 | Duration | Elapsed Time | Dryer Pressure       | Outlet Temperature | Regenerant Flow      | Regenerant Tempe | Dryer Regeneration Cycle            | Avg Outlet Temp | Avg Regen Temp | Dryer Processing Age | Total Processed Feed |
|-----------|---------|--|----------|--------------|----------------------|--------------------|----------------------|------------------|-------------------------------------|-----------------|----------------|----------------------|----------------------|
|           | Dryer A | 1/2/2017 12:00:00 AM                       | 5.3      | 0            | 170.4697             | 436.9              | 603.2525             | 496.1            | Dryer A Regneration 01-02-17 00:00  | 319.9179        | 229.7132       | 0.0005072668         | 4474.716             |
|           | Dryer A | 1/2/2017 12:06:00 AM                       | 5.3      | 6            | 170.4824             | 437.8              | 603.6448             | 496.2            | "                                   | "               | "              | "                    | "                    |
|           | Dryer A | 1/2/2017 12:12:00 AM                       | 5.3      | 12           | 170.495              | 438.6              | 605.063              | 496.4            | "                                   | "               | "              | "                    | "                    |
| _{        | Dryer A | 1/2/2017 12:18:00 AM                       | 5.3      | 18           | 170.5076             | 439.5              | 599.6411             | 496.8            | "                                   | "               | "              | "                    |                      |
|           |         |  | : •      |              |                      |                    |                      |                  |                                     | "               |                |                      | "                    |
|           |         | :  | •        | :            | :                    | :                  | :                    | :                | "                                   |                 | "              | "                    | "                    |
|           | Davor A | 1/2/2017 5:18:00 AM                        | 5.3      | 318          | 204.1571             | 173.8              | 314.5962             | 287.9            | "                                   | "               | "              | "                    | "                    |
|           | Dryer A | +  | 9.6      | 0            |                      | -                  |                      | 480.7            | Dryer B Regneration 01-02-17 07:00  | 357.6974        | 404.2589       | 0.05128649           | 2742.962             |
|           | Dryer B | 1/2/2017 7:00:00 AM<br>1/2/2017 7:06:00 AM | 9.6      |              | 169.723              |                    | 596.6678             | 484.8            | Diver B Regileration 01-02-17 07:00 | 331.0314        | 404.2303       | 0.03120049           | 2142.502             |
|           | Dryer B |  | 9.6      | 6<br>12      | 170.4792<br>171.0217 | 170.4              | 598.8013<br>597.2024 | 487.9            | "                                   | "               | "              | "                    | "                    |
|           | Dryer B | 1/2/2017 7:12:00 AM                        | 9.6      | 12           | 171.0217             | 170.4              | 597.2024             | 487.9            | 66                                  | "               | "              | "                    | "                    |
| $\preceq$ |         |  |          |              |                      |                    |                      |                  | "                                   | "               | "              | "                    | "                    |
|           |         | :  | :        | :            | :                    | :                  | :                    | :                | 66                                  | "               | "              | "                    | "                    |
|           |         |  |          |              |                      |                    |                      |                  | "                                   | "               | "              | "                    | "                    |
|           | Dryer B | 1/2/2017 4:36:00 PM                        | 9.6      | 576          | 168.8051             | 174.9              | 896.8521             | 173.8            | -                                   |                 |                |                      |                      |
|           | Dryer A | 1/2/2017 7:00:00 PM                        | 11.3     | 0            | 169.5046             | 170                | 596.4086             | 425.6            | Dryer A Regneration 01-02-17 19:00  | 332.5292        | 364.0818       | 0.1004348            | 5302.277             |
|           | Dryer A | 1/2/2017 7:06:00 PM                        | 11.3     | 6            | 170.3642             | 170.1              | 598.5709             | 442.7            | "                                   | "               | "              | "                    |                      |
|           | Dryer A | 1/2/2017 7:12:00 PM                        | 11.3     | 12           | 170.2456             | 170.2              | 600.7331             | 466.3            | "                                   | "               |                |                      | "                    |
| _{        |         |  |          |              |                      |                    |                      |                  |                                     |                 | "              | "                    | "                    |
|           |         |  | : .      | : .          |                      | :                  | : •                  | :                | "                                   | "               | "              | "                    | "                    |
|           |         | •  | •        | •            | •                    | •                  | •                    | •                | "                                   | "               | "              | "                    | "                    |
|           | D A     | 1/3/2017 4:54:00 AM                        | 11.3     | 504          | 167.147              | 196.4              | 5 47 0570            | 173.4            | "                                   | "               | "              | "                    | "                    |
| $\geq$    | Dryer A |  |          | 594          |                      | +                  | 547.8572             |                  |                                     |                 |                | 1                    |                      |
|           | Dryer B | 1/3/2017 8:48:00 AM                        | 9.3      | 0            | 169.3378             | 170.2              | 592.8909             | 491.6            | Dryer B Regneration 01-03-17 08:48  | 357.8753        | 399.4613       | 0.1699348            | 6347.083             |
|           | Dryer B | 1/3/2017 8:54:00 AM                        | 9.3      | 6            | 168.1517             | 171.1              | 617.2303             | 490              | "                                   | "               | "              | "                    | "                    |
|           | Dryer B | 1/3/2017 9:00:00 AM                        | 9.3      | 12           | 167.7706             | 205.2              | 617.502              | 488.7            | "                                   | "               | "              | "                    | "                    |
| $\preceq$ |         |  | : •      |              |                      | : •                |                      |                  | "                                   | "               | "              | "                    | "                    |
|           |         | :  | •        | :            | :                    | :                  | :                    | :                | "                                   | "               |                |                      |                      |
|           |         |  |          |              |                      |                    |                      |                  |                                     |                 | "              | "                    | "                    |
| l         |         |  |          |              |                      |                    |                      |                  | "                                   | "               | "              | "                    | "                    |



## Diagnostic Analysis - Event Frame Evaluation

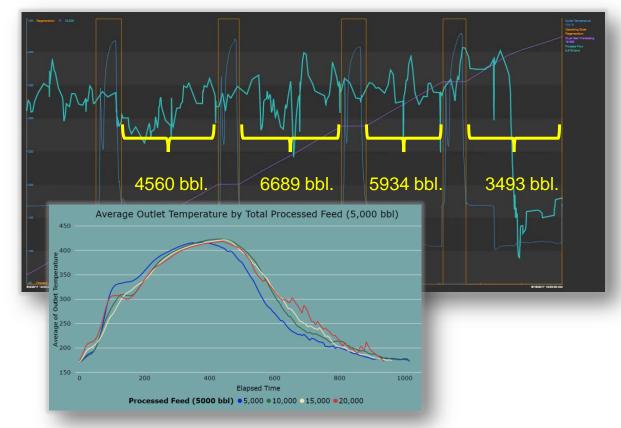
- Sampled Event View dataset imported into Power BI.
- Shows outlet temperature profiles for all Event Frames with filters for dryer asset and cycle duration.
- Filter Event Frames to remove outliers from analysis.
- Acceptable Regeneration cycle durations between 7 and 17 hours.





## Dryer Regeneration - Additional Feature for Refinement

- Determine if total barrels of feed processed during the Process cycle prior to each regeneration affects outlet temperature profile
- Analysis in Power Bl



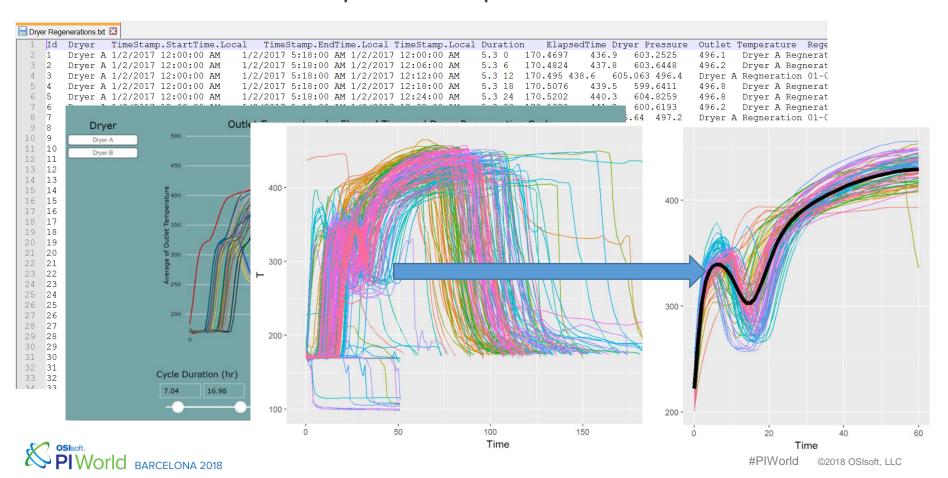


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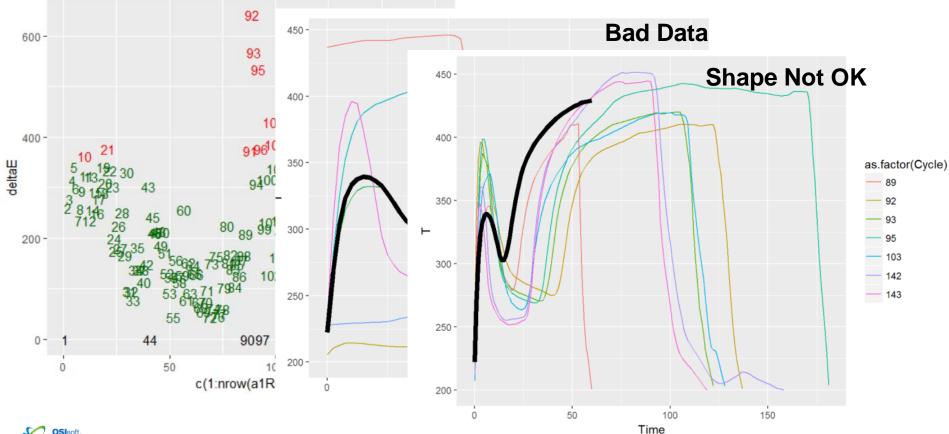
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- •



## Predictive and Prescriptive - Shape Metrics - Golden Run



## Shape Metrics - Regen Cycles Not OK or Bad Data



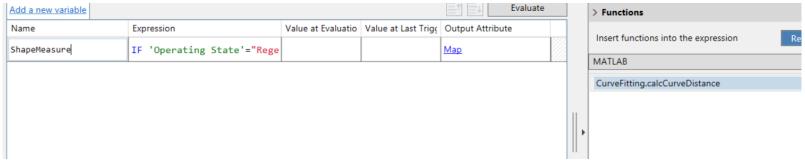
## Operationalize - Expected Temperature Profile (Prescriptive)





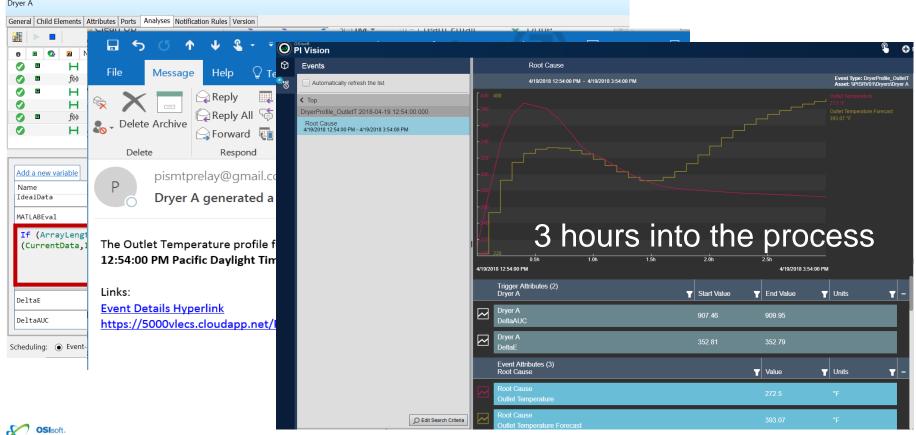
## Shape Metrics - Operationalize the Model

Score the real time Temperature profile data is the Temperature profile as expected? can the difference from ideal be stated quantitatively? even if dissimilar, did we deliver enough energy? what false alarms can I avoid? after an alert, what corrective actions can I take?





Shape Metrics - Operationalize the Model



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•



## Maintenance – Usage and Condition based

- Usage-based Maintenance UbM
  - Motor Run-hours
  - Compressor starts/stops
  - Transformer Load Tap Changer Counts of Operations, Count thru's Neutral
  - ...
- Condition-based Maintenance CbM
  - Delta P across a filter
  - High bearing temperature
  - High vibration
  - ...



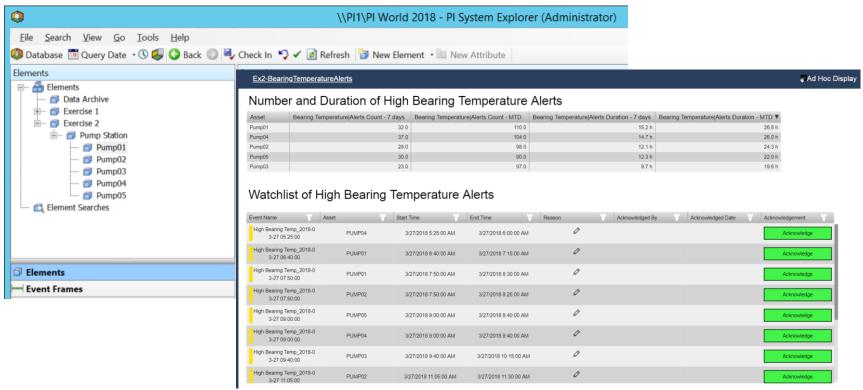
## Maintenance – Usage based

### See PI World 2018 CBM Hand-on Lab



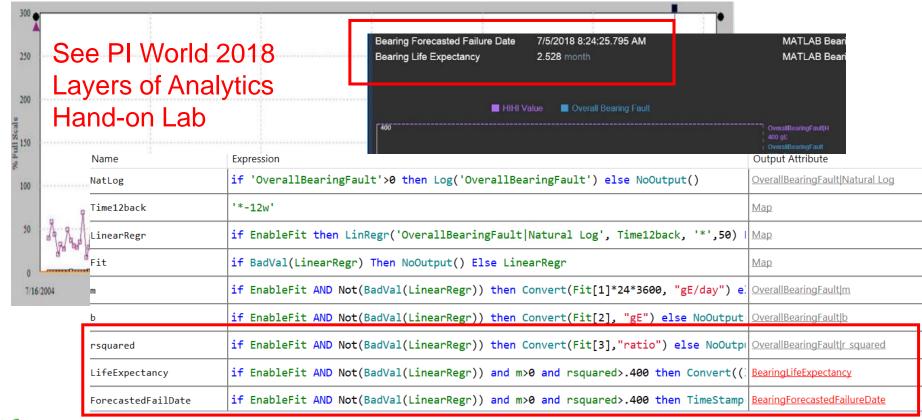
## Maintenance – Condition based

### See PI World 2018 CBM Hand-on Lab





## Maintenance – Predictive – RUL (remaining useful life)





## Predictive – Statistical, Machine Learning ...

Predict engine failure – Principal Components - TechCon 2016

100 engines, 20+ sensors per engine, aggregated data per cycle ~200 cycles of operation per engine how long to failure?

Link

Anomaly detection (HVAC - Air Handler) - Support Vectors -TechCon 2017

7 sensors

Link

~6 months of operations, 5 minute data
damper stuck open? temperature transmitter failed? air supply fan constraint?

Shape Metrics (profiles of operating variables) - PI World 2018 Lab

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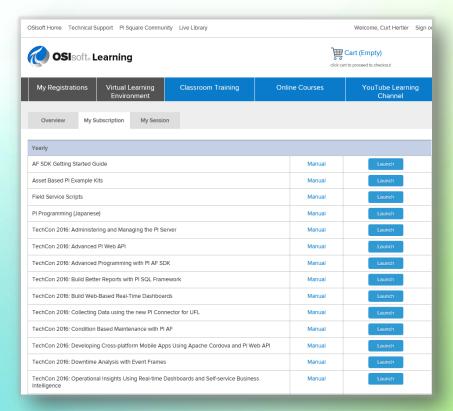
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  - Analytics during data collection? (National Instruments, InsightCM)

•



## OSIsoft Virtual Learning Environment

- Access to the hands-on labs developed for the past two Users Conferences (~40)
  - PI Products
  - PI System Development
  - Condition Based Maintenance
  - Analytics with PI System Data
- Hosted PI System on the Microsoft Azure Cloud
- Monthly or Yearly Subscription
  - Available to all customers via credit card payment
  - Free to EA Customers and Dev Club Members
- Great for Customer Demos
  - Elevate Awareness for OT and Data Science (IT?)
- https://learning.osisoft.com



## **THANK YOU!**





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## Questions?

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ありがとうございました
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