



Hatch Digital Solutions in Phosphates

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Who is Hatch?

Roots over

60

Years



Experience in

150

Countries



65 Offices



Over

9,000

Great People

Project Delivery – Advisory – Digital – Operational Services



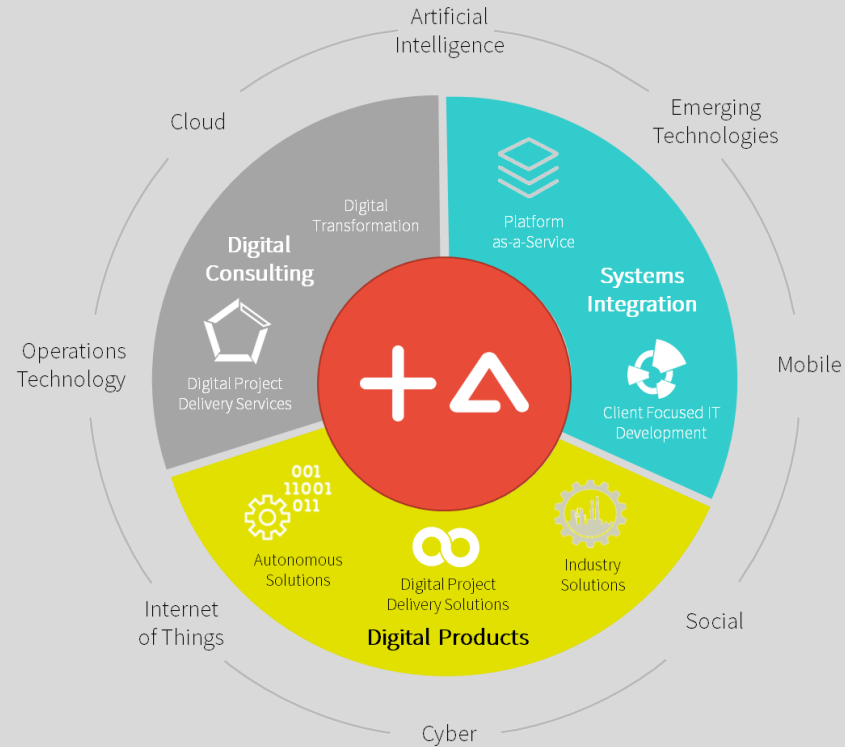
Hatch Phosphate Engineers Have Many Years of Practical Industry Experience

- + Phosphate Mining and Beneficiation
- + Rock Receiving, Grinding and Storage
- + Sulfuric Acid
- + Phosphoric Acid
- + Ammoniated Phosphate Fertilizers
- + Ammonia and Related Processes
- + Water, Steam and Power Balances
- + Phosphate Chemical Plant Utilities
- + Equipment Specification and Design
- + Material Handling





Digital Capabilities



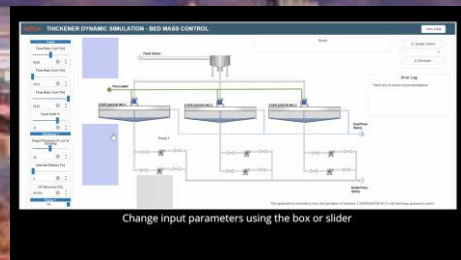
20+ Years delivering Digital Solutions for Industry Clients	350+ Staff dedicated to Digital Solutions, Machine Learning & Data Analytics
40+ Years delivering Control, Automation & Electrical Solutions	650+ Staff dedicated to Control, Automation & Electrical
20+ Years delivering Advisory Services and Business Improvements	40+ Disciplines related to Business Improvements
60+ Years of Technologies & Innovation	

Algoma Blast Furnace Digital Twin



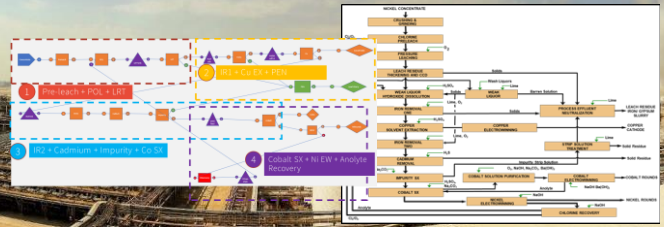
- Scope: Study and Implement
- Benefit: Operator Guidance
- Complexity: Blast Furnace
- 2nd Benefit: Process Improvement

Copper Mining Major Dynamic Simulation & Decision Support



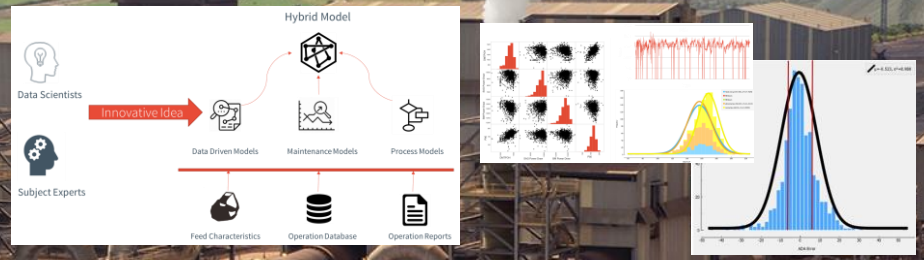
- Scope: Study and Implement
- Benefit: Simulation Planning
- Complexity: Real-time data
- 2nd Benefit: Operating Training

Diversified Mining Major Integrated Production & Maintenance Scheduling



- Scope: Study
- Benefit: Coordinated Planning
- Complexity: Multiple Systems
- Challenge: Optimized Production

Gold & Copper Mining Major – Case Study#2 Soft Sensor Data Development



- Scope: Study
- Benefit: Predict P80 Particulate Size
- Complexity: Hybrid ML Model
- 2nd Benefit: 95% within 6 microns



Case Study #1: Railcar Loading Optimization

Problem Statement:

Overloading phosphate rock into railcars resulting in surcharges and penalties in excess of **millions** of dollars per year imposed by railroad company.

Constraints:

- + Dynamic loading, constant & variable motion
- + Variable railcar type & rock mixture
- + Limited capital

Solutions:

- + Retrofit loadout system
- + Install a new loadout system
- + Use data and digital technology to increase control during railcar loading with existing system



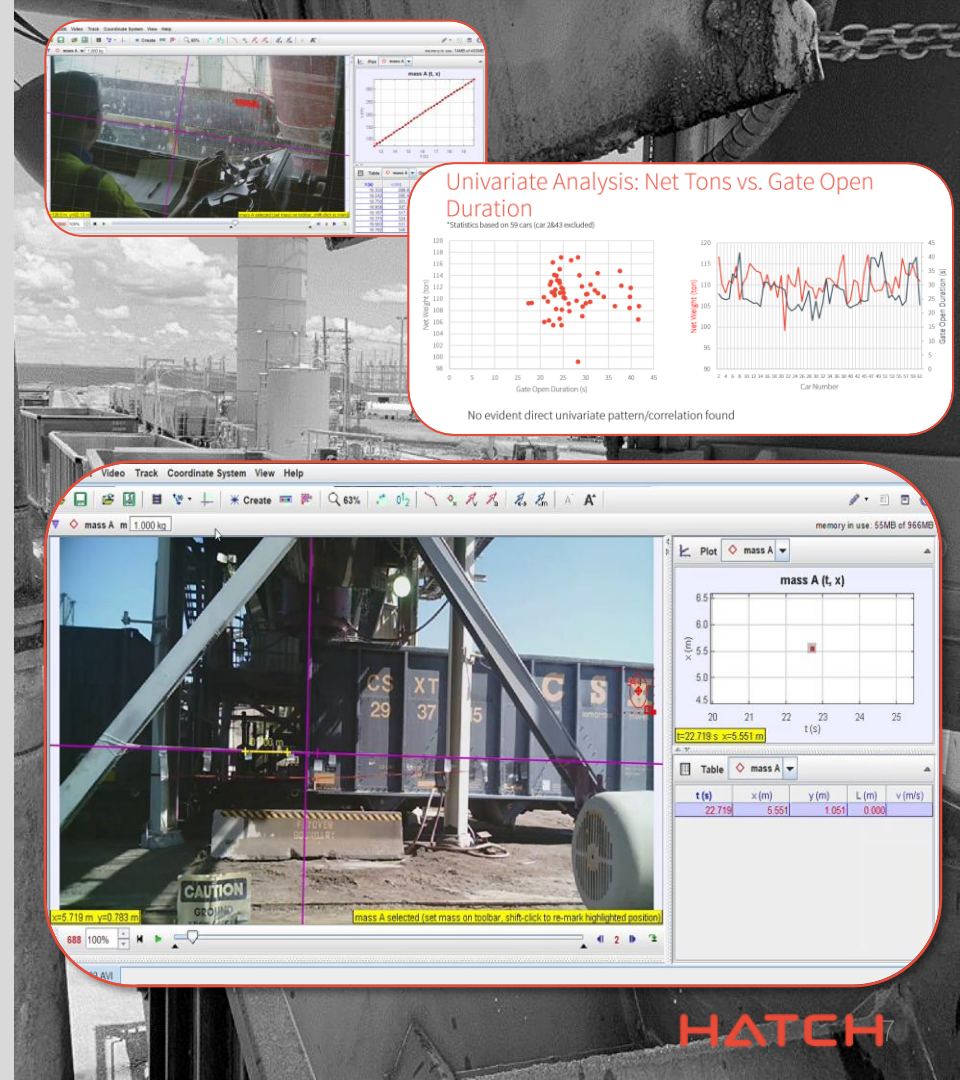


Case Study #1: Railcar Loading Optimization

Approach:

Completed FEL1 Conceptual Study to evaluate all potential solutions. Ultimately, the client chose to advance studies for a digital, data-driven solution

- + Data collection
 - + Video camera, data historian, train manifest
- + Data extraction & data cleansing
 - + Car position
 - + Car velocity – dynamic & always changing
 - + Gate opening/closing times
 - + Chute position
 - + Bin level
 - + Loadout sequence timing
 - + Loaded length of the railcar in each loading stage
- + Data alignment



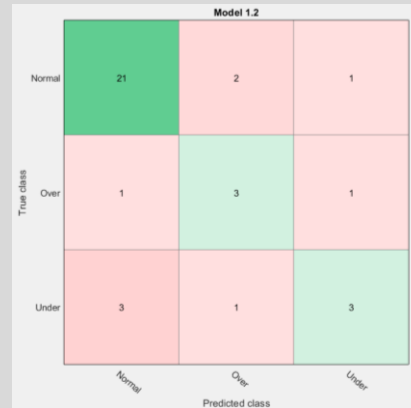


Case Study #1: Railcar Loading Optimization

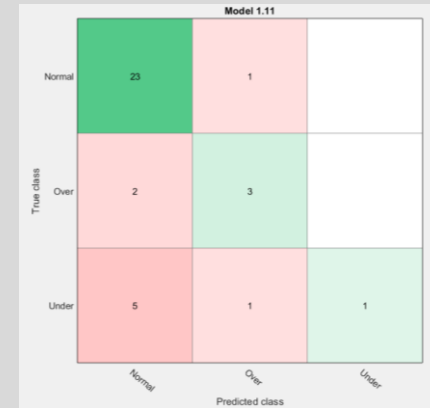
Results and Next Steps:

- + Improve data historian data granularity
- + Set a laser sensor to measure car velocity and integrate into historian
- + Collect data for 3-5 month time period
- + Add variables to improve model accuracy (moisture, bulk density, etc.)
- + Validate the model performance
- + Model deployment and Beta testing
- + Model revision
- + Deliver a monitoring system

Model: Classification Tree
Accuracy: 75%



Model: Ensemble
Accuracy: 75%



True/False Analysis



Case Study #2: Soft Sensor development of Hydrocyclone P80

Problem Statement:

Accurate measurement of Hydrocyclone overflow P80 is challenging. This variable is required to calculate the grinding circuit efficiency and to model the operation performance.

Methods

- + Sampling and lab analysis
- + Online particle size analyzer
- + Soft sensor

Soft sensor development Constraints:

- + Availability of good quality data
- + Variable operational conditions and ore types
- + Enough representative sample for modeling



+ Case Study #2: Soft Sensor development of Hydrocyclone P80

Approach:

Soft sensor development through hybrid modeling

Steps:

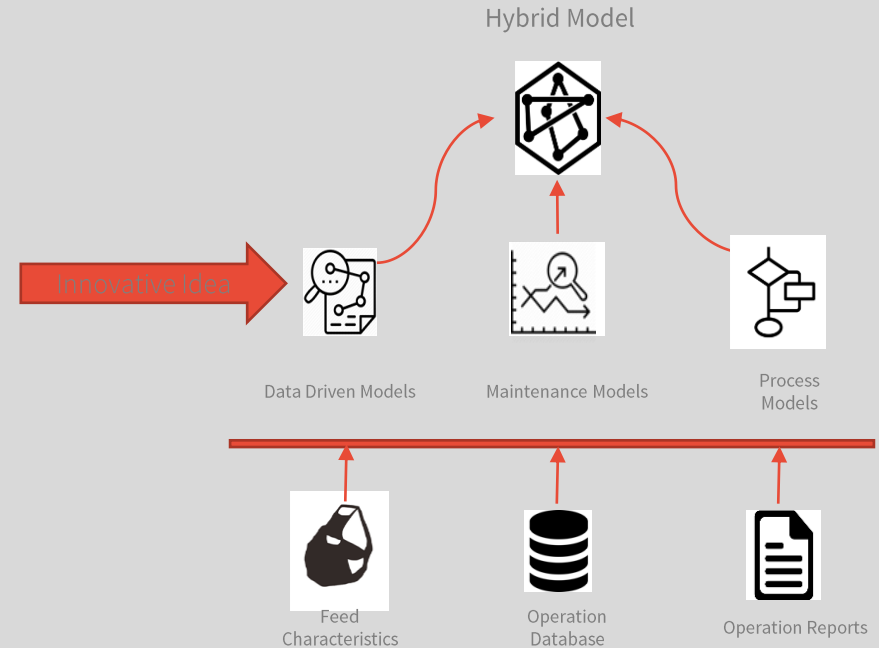
- + Data Collection
- + Data pre-processing and exploration
- + Hybrid modeling
- + Model validation
- + Deployment



Data Scientists



Subject Experts



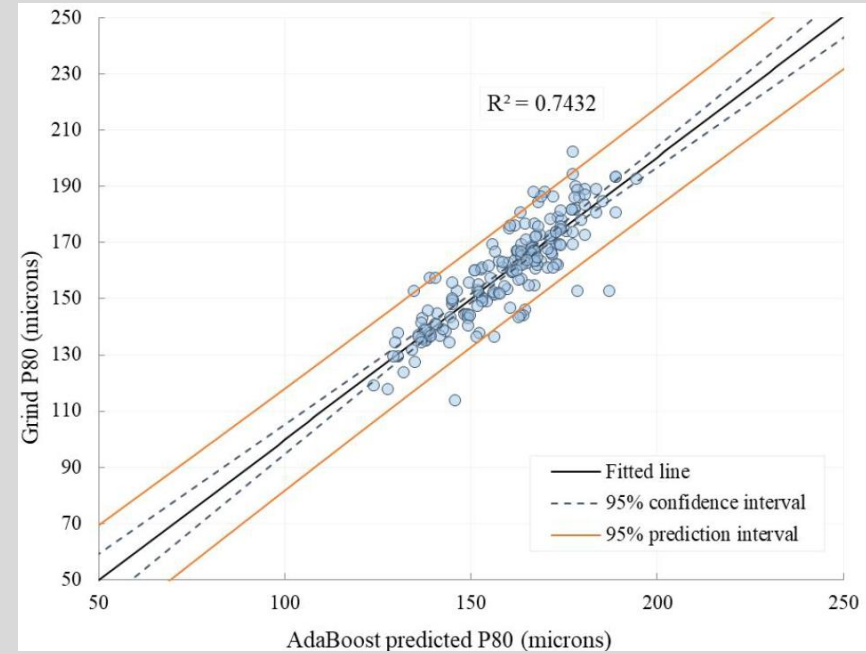
+ Case Study #2: Soft Sensor development of Hydrocyclone P80

Results:

- + Average Error: 3-5%
- + 95% of estimations are within 6 microns of the true value
- + Hybrid modeling presents better results than analytical modeling

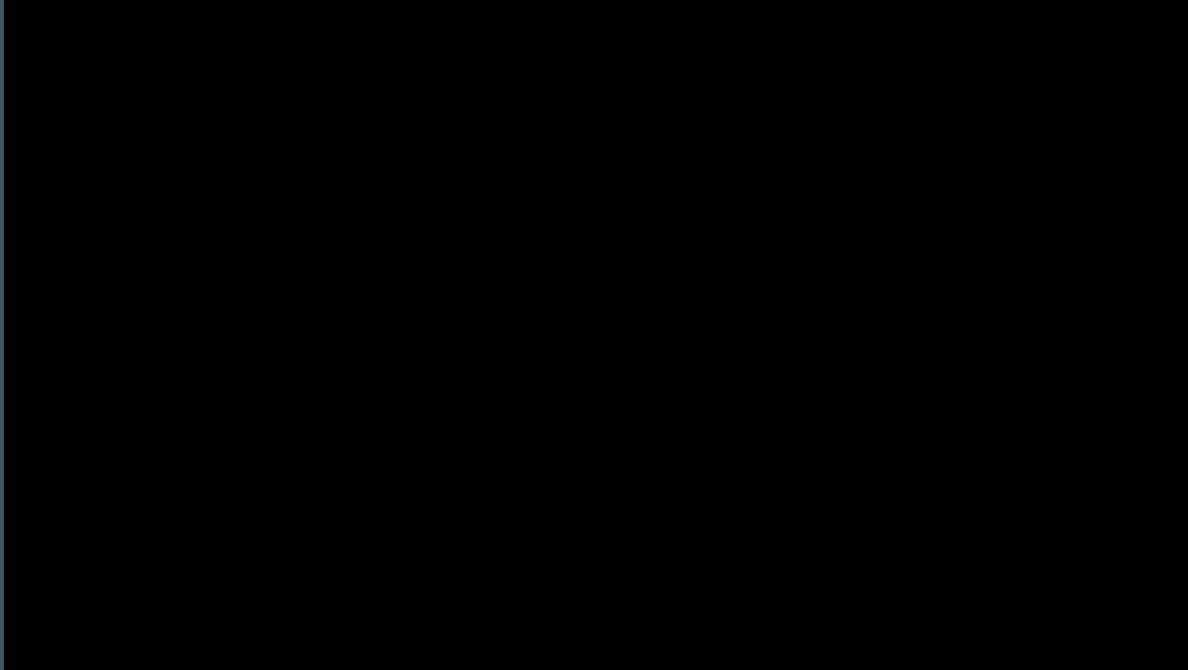
Next step

- + Soft sensor deployment
- + Optimize operational modes
- + Operator training



Method	MSE	RMSE	MAE	R2
Analytical	135.163	11.626	8.127	0.489
Hybrid	81.054	9.003	6.418	0.731

+ Hatch Digital Technology in Action



Thank you.

For more information,
please visit www.hatch.com

