



Modeling and Simulation in Smart Manufacturing

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Haresh Malkani
Chief Technology Officer

Jim Davis
PI, Program Oversight



Topics

- ❖ CESMII's view on advanced sensing, control, platforms, and modeling (ASCPM) in Smart Manufacturing
- ❖ Smart Manufacturing requires the right data at the right time, in the right place, in the right format for human and machine actions.
- ❖ CESMII Projects have demonstrated benefits and shared methods (playbooks) in key industry verticals





Mission Strategy Role

Smart Manufacturing to drive next generation of U.S. Manufacturing Productivity and Environmental Sustainability



UCLA

Program Home

2017

**\$140M +
\$61M Renewal**

**Public Private
Partnership**

How

Monetize *Productivity, Precision, & Performance* at scale with **Advanced Sensing, Control, Platform, and Modeling for Manufacturing (ACSPM)**

180+ Partners

CESMII represents the **voice of manufacturing**; engaging the smart manufacturing ecosystem through a membership model



Manufacturers
Small, Medium & Large



System Integrators & Consultants



Machine Builders



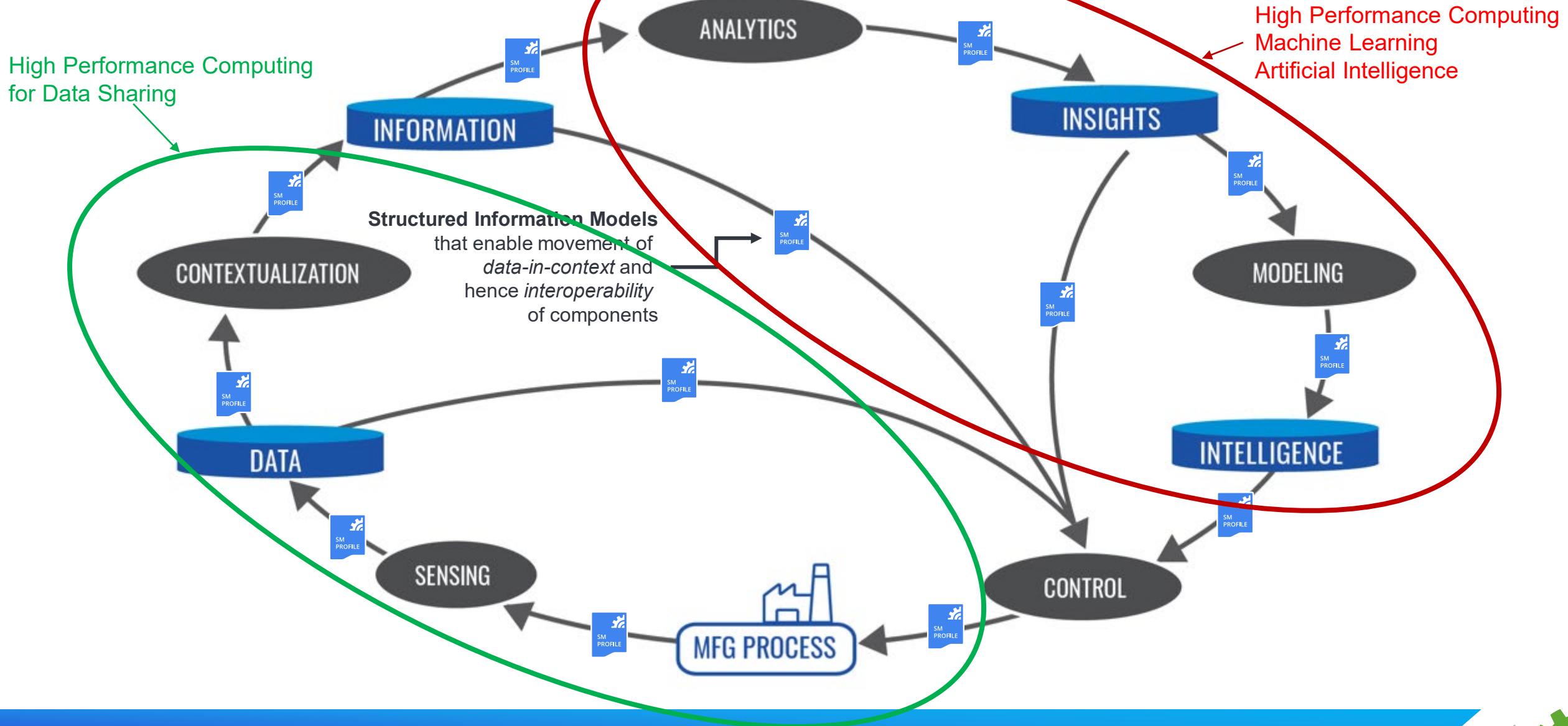
Technology Providers



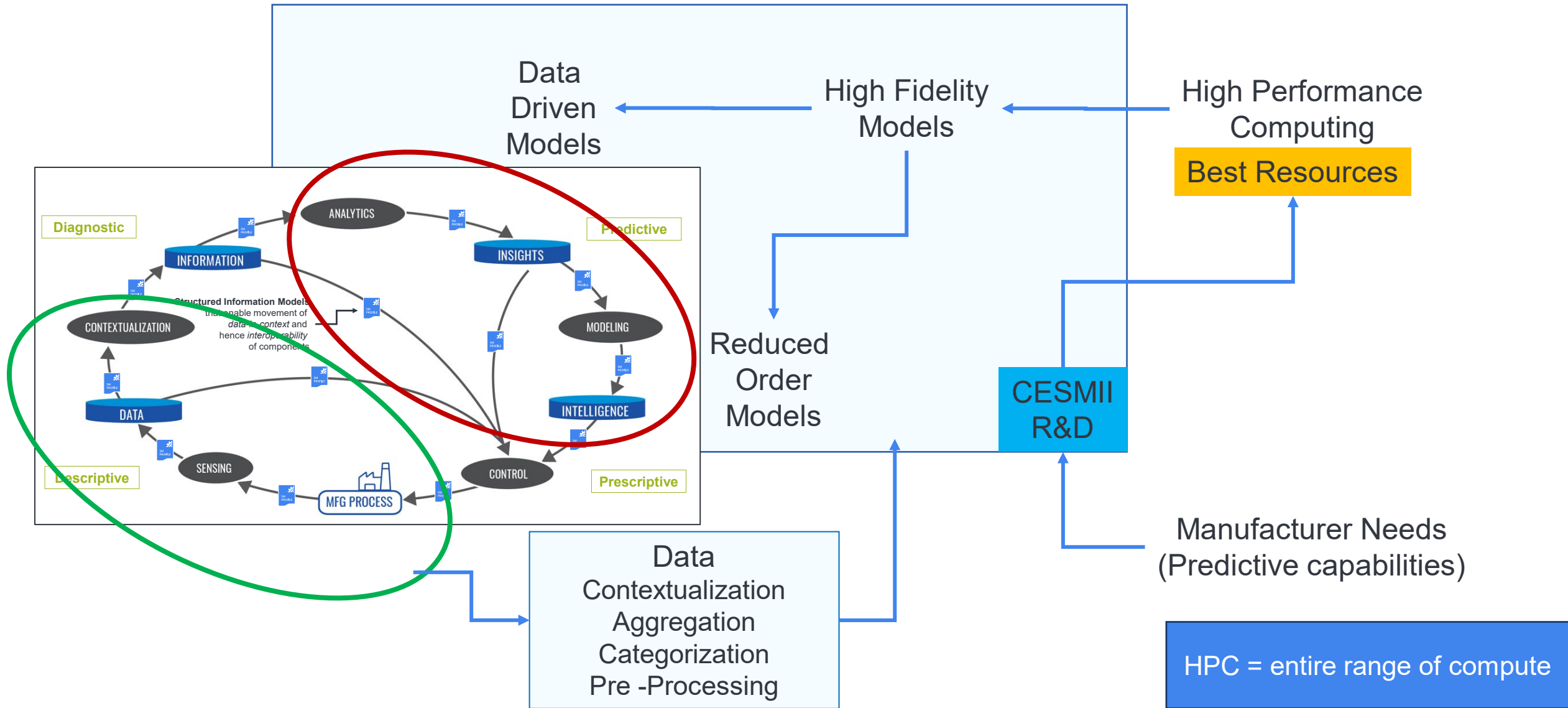
Academia & Labs



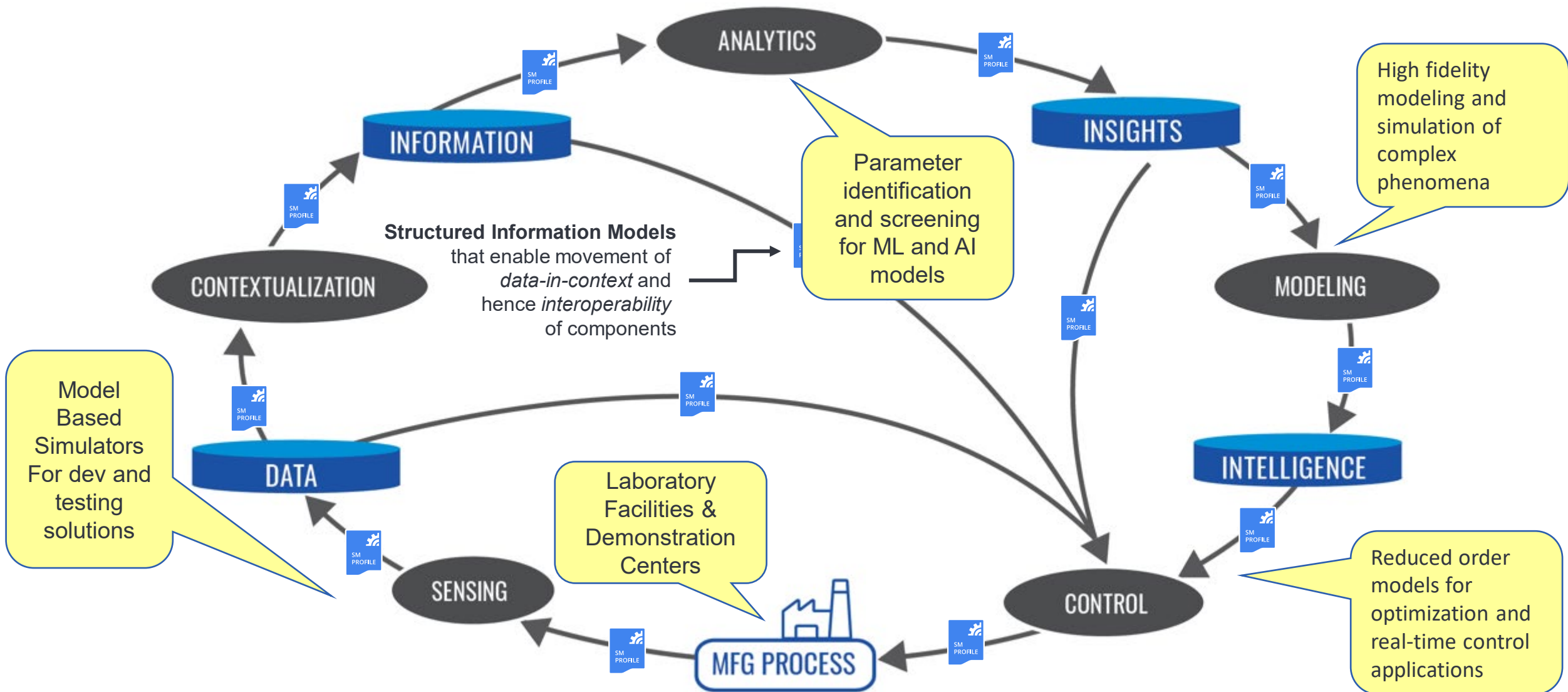
SM Technology Building Blocks and Information Flow



Leveraging HPC in CESMII



Where HPC and National Labs can Collaborate



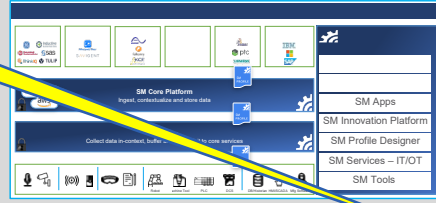
Project Examples where Modeling and ML has been used



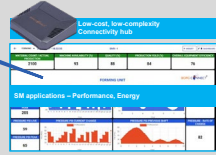
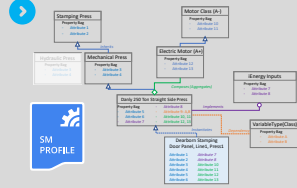
Steel Chemical Thermal Grinding Cement Aerospace

SMMs

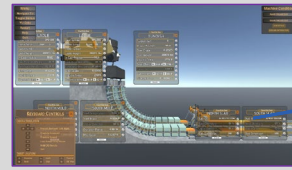
Standards based *plug and play infrastructure* for interoperability and cost effective SM solution implementation



Structured Information Models (SM Profiles) that enable movement of *data-in-context* and hence *interoperability* of components



Low cost hardware and reusable SM Apps to help SMMs target **10% improvement in energy intensity** and equipment efficiency on **CNC, paint booth and welding machines**

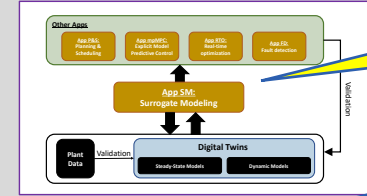


Digital Twin of a **Steel Continuous Caster** enables predictive maintenance worth **\$2M/strand**



Data analytics and anomaly detection targets **5% improvement in yield** and **5% decrease in energy consumption** in powder based Additive Manufacturing

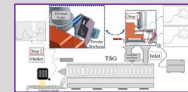
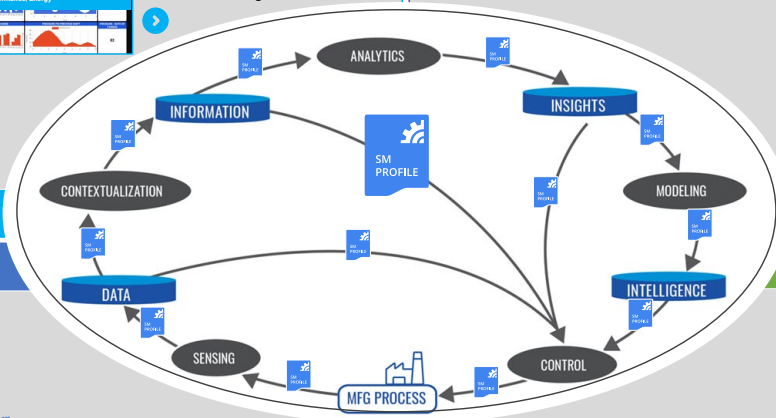
Process Prediction & Optimization Models for Air Separation Units (**Chemical**) can lead to **10% reduction in energy consumption**



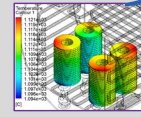
Chemicals

Food

Energy Monitoring and Machine Learning Model for Energy Consumption in **Food Industry** leads to **5% reduction in energy waste, 25% relative improvement in yield**



Model based process optimization results in **>30% energy reduction** in wet granulation in **Pharma**

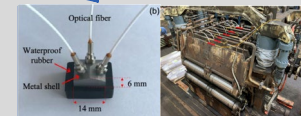


Monitoring, modeling and control solutions optimizes **thermal processes** for aerospace composite parts, **reducing energy use by 36%**

Thermal

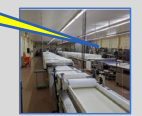
Steel

DIAGNOSTIC
DESCRIPTIVE



3D Displacement and Optical Strain Sensor for **Steel Continuous Caster** enables performance improvement and quality potentially worth **\$90M/yr**

Paper



Off the shelf sensors, low cost gateway, visualization and analysis tools to optimize cooling tunnel performance for a small food manufacturer eliminates downtime and improves quality for **nutrition bars**

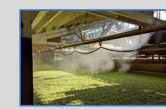


Low cost Edge hardware and computing solution using visual and process information provides **affordable SM implementation for SMMs**

Drying



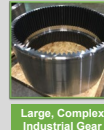
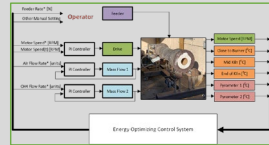
ML Based Soft Sensor for Entrained Air Content in Browstock Washing (**Pulp and Paper**) reduced defoamer usage by **35%** and **water usage by 10%**



Sensing and modeling solution to reduce **hop drying** times by **14%**, and a **10% reduction in energy usage**.

Smart Manufacturing Building Blocks

Multi-physics predictive models and Advanced Controls lead to optimized operating conditions resulting in **10-15% reduction in energy usage** in **Cement Kilns**



Hybrid predictive models **reduce energy consumption per part by 37%** for large **industrial gear grinding operations**

Grinding

Cement

Audio & Vibration sensing, Systems level hybrid modeling, and **surrogate control** of machine vibrations and tool wear prediction results in **25% reduction in energy usage, 35% downtime**



Sensing, modeling and control solution results in **elimination of impurities and water usage** in precipitation and dewatering stages for monoclonal antibodies **bio pharma process**

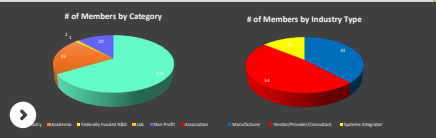


Aerospace

SM Learning Kit with Cost effective hardware and software, complemented by training modules to upskill the SMM workforce and talent pipeline

Purdue and industrial partners created an **ABET accredited 4-yr BS Degree program** focused on SM technologies integrated with state-of-the-art facilities with industry grade equipment

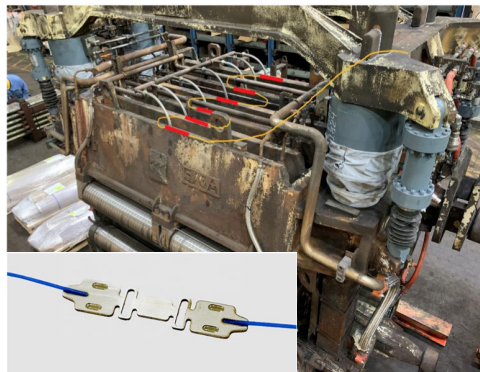
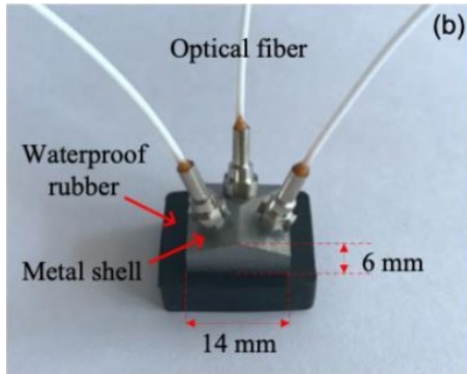
National Presence - Smart Manufacturing Innovation Centers: Engage Manufacturing & Supply Chains where they are - local presence, test beds, training...



Smart Manufacturing in Steel Continuous Casting

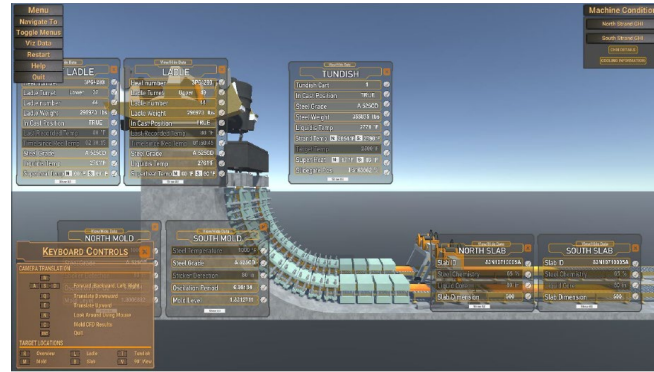
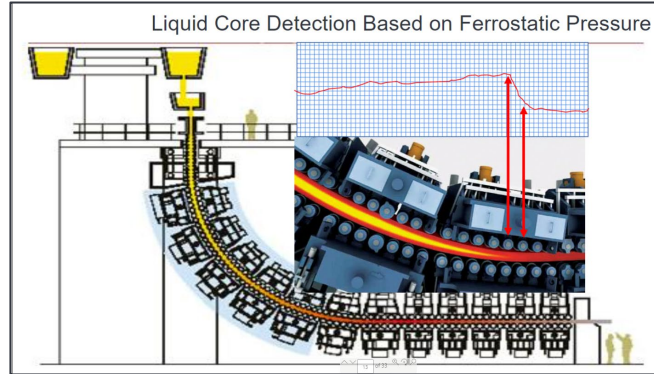
ArcelorMittal, RPI, Purdue, Missouri Science & Technology University

3D Sliding and Debonding Sensor



Optical Strain Sensing

Liquid Core and Plugging Detection



Continuous Caster Digital Twin

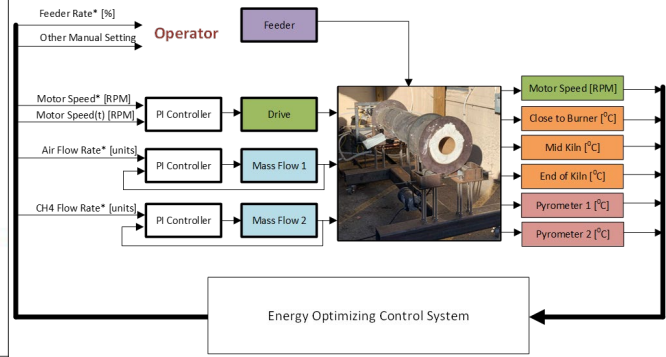
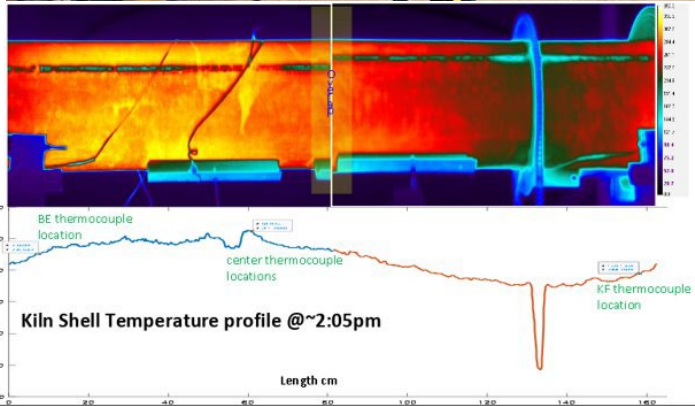
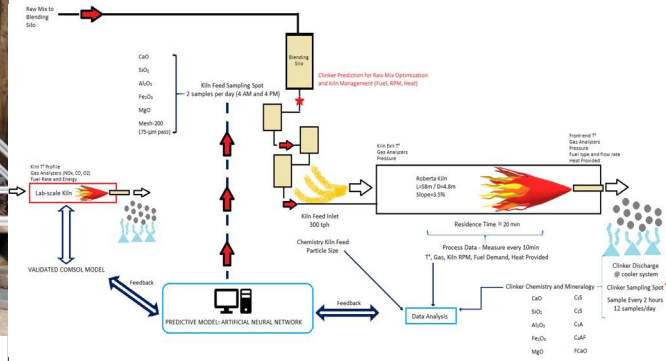
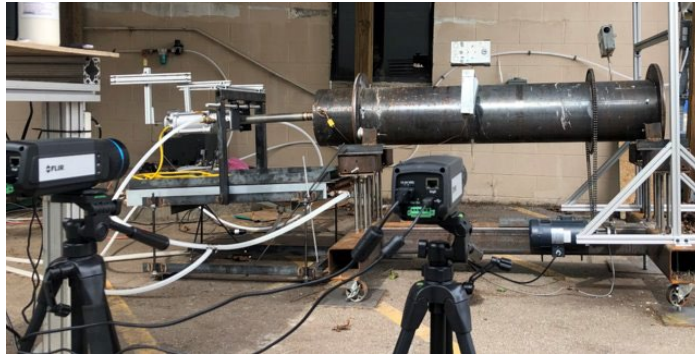
- Data acquisition infrastructure implemented and configured for caster health monitoring
- Advanced strain measurement and 3D displacement sensors to detect liquid core in continuous steel caster developed and tested
- Digital twin for simulating caster operation developed and demonstrated for maintenance applications
- Machine learning based model developed to predict caster plugging.

Significance and Impact: Realtime sensing and predictive modeling will improve caster performance and downstream product quality. Potential impact of \$90M in energy savings for steel industry from improved quality, and \$2M/strand from predictive maintenance.



Smart Manufacturing for Cement

University of Louisville, Argos USA



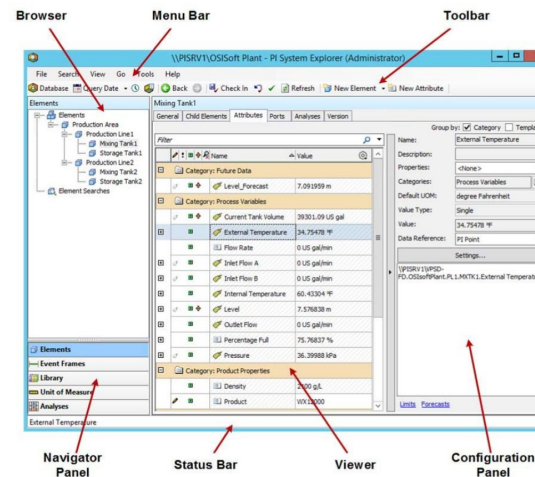
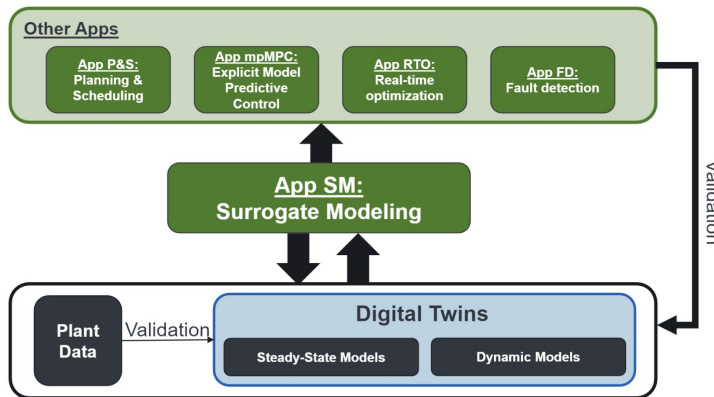
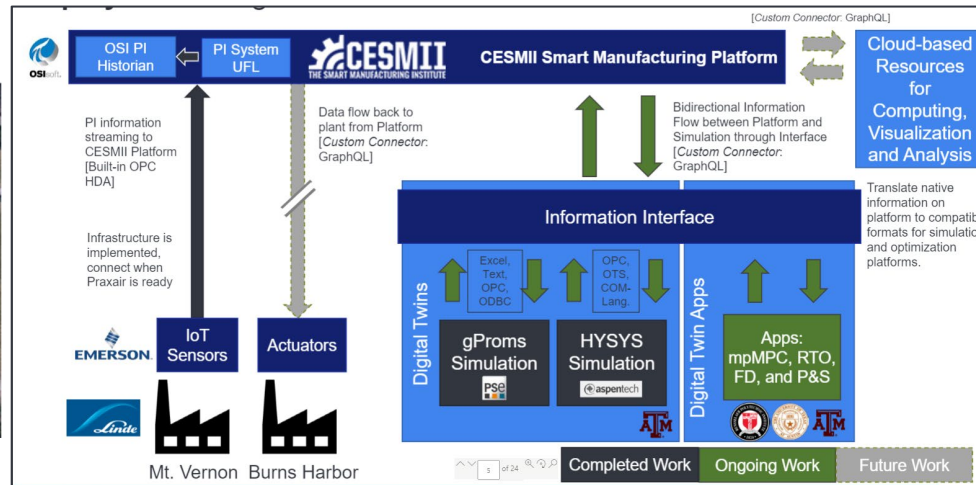
- Lab scale kiln constructed and instrumented with burner and sensors for conducting experiments
- Multi-physics thermal and flow models developed and validated with instrumented kiln
- Machine learning model developed to predict clinker quality based on operational parameters
- Real-Time Process Assessment and Control System developed for energy optimization

Significance and Impact: Validated multi-physics predictive models will lead to optimized operating conditions contributing to up to 15% reduction in energy usage in production kilns



Smart Manufacturing in Chemical Industry

Texas A&M, Emerson, AspenTech, PSE, RPI, OSIsoft, UT Austin

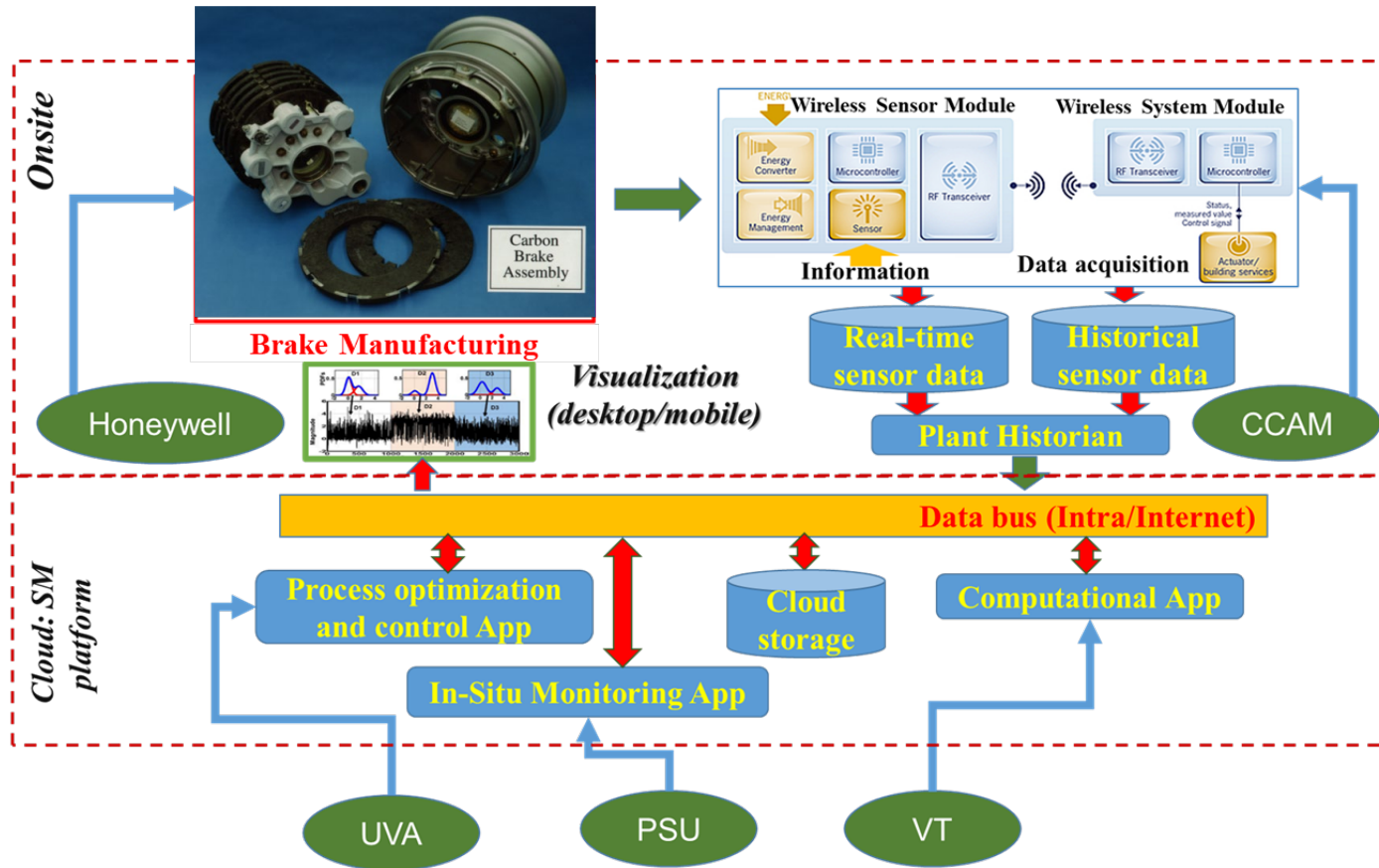


- Steady state and dynamic models (Digital twins) developed and validated for predicting operational behavior of Air Separation Unit (ASU)
- Surrogate models developed for ASU control application including fault detection, real-time optimization, scheduling and predictive control
- Real-time asset monitoring solution for the ASU and auxiliary equipment has been implemented
- Asset templates for ASU equipment developed

Significance and Impact: Predictive modeling and real-time monitoring for air separation units will lead to increase in operating efficiencies and energy savings worth \$10M/yr for one large manufacturer, with potentially similar impact to other manufacturers with similar ASUs.

Smart Manufacturing in Composite Brake Mfg

Virginia Tech, Honeywell, University of Virginia, Penn State University, Commonwealth Center for Adv. Mfg.



- Data acquisition and platform infrastructure developed
- Computational Models for Energy Consumption and Product Quality Prediction developed & validated
- Process anomaly detection algorithm developed and validated
- Physics based and data driven prediction models developed and validated for process optimization

Significance and Impact: Automated process monitoring and control will lead to a reduction of 15% in energy consumption for Honeywell's CVI process

Engage with us!



Democratizing SMART MANUFACTURING



EDUCATED, DATA-DRIVEN CULTURE



SMART ASSETS



SMART DECISIONS



OPERATIONS & SUPPLY CHAIN VISIBILITY

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Backup



Data Centered Smart Manufacturing

Asset Improvement

Distributed Operations

Line Operation/ Factory Improvement

Data Supply Chain

Arcelor Mittal
Hot Rolling & Casting
Digital Twin & ML
Productivity/Quality
Steel

Argos
Pyro-processing
Digital Twin & ML
Control
Cement

Honeywell Aerospace
Composite Brake
Physics ML
Quality
Aerospace

Rayonier
Moisture Defoamer
Physics ML
Productivity
Pulp & Paper

Raytheon
Precision Parts
Physics ML
Quality
Additive Mfg

Linde
Hydrogen Production
ML and Digital Twin
Thermal Treatment

Linde
Air Separation
Distributed Operations
Physics ML
Oil & Gas

General Dynamics
Forging Heat Machining
Digital Twin &
Interoperability
Metal

Nova Chem
Ethylene Plant
AI/ML Qualitative
Diagnostics
Chemical

Tyson Foods
Energy Productivity
Plant wide modeling
Food

US Car
Multi Source
Multi System
Interoperability
Roadmap
Automotive

Seagate & Coalition
Machine Processes
Data Sharing
Semiconductor

General Mills
Supply Chain
Interoperability
Agriculture

Johnson & Johnson
Supply Chain
Interoperability
Pharma

J&J, General Mills, P&G
Inter-Supply Chain
Resilience
Supply Chain

Small


Medium


Large


Supply Chain Interoperability

Supply Chain Resilience



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