



UNIVERSITY OF  
**AUCKLAND**  
Waipapa Taumata Rau  
NEW ZEALAND

**ENGINEERING**

# Energy Digital Twins for Decarbonisation

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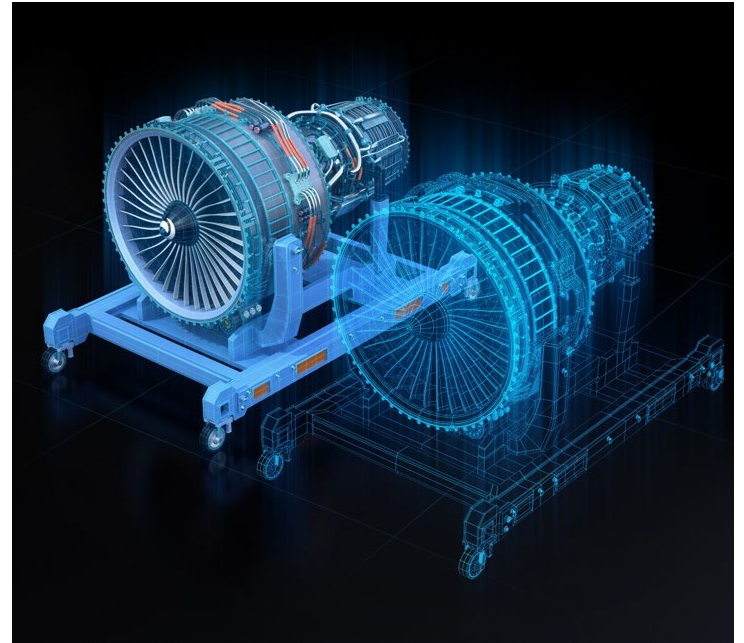
# Agenda

- What are Digital Twins?
- Energy Digital Twins for Decarbonisation
  - Ahuora Research
  - Gaps/Opportunities



Digitalisation word cloud, Chris Hamblin, Keynote, *Advances* 2021

# Digital Twins

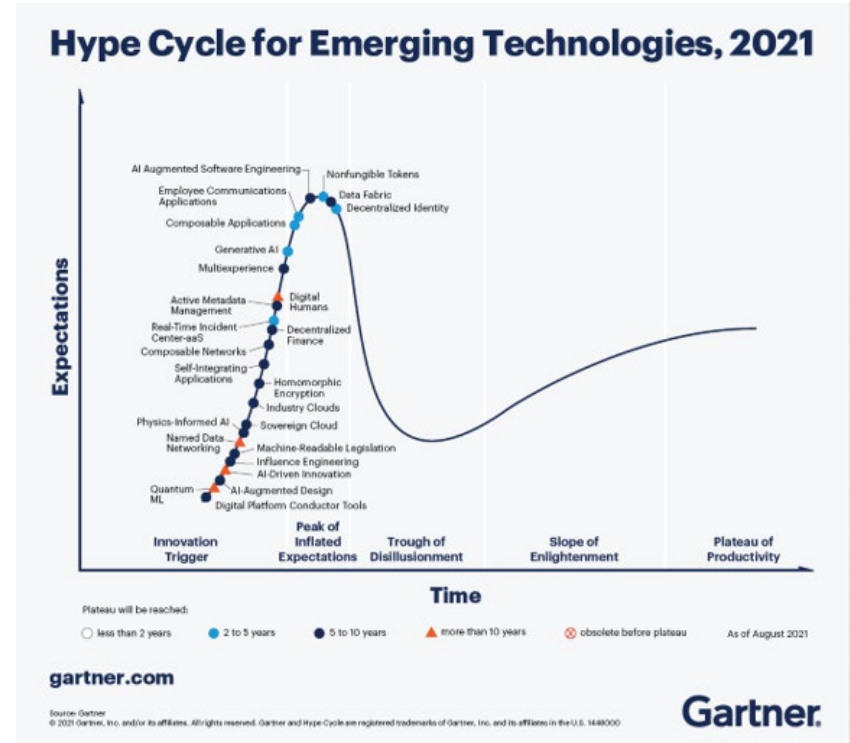


# Digital Twins

## Hype?

Focus on problem solving

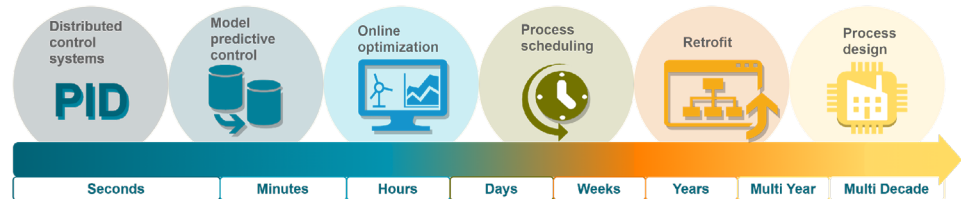
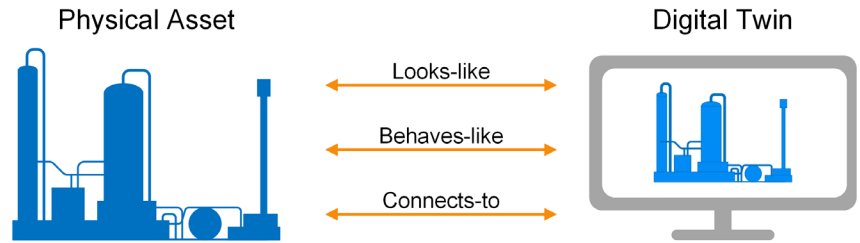
Not just new shiny tech!



# What is a Digital Twin?

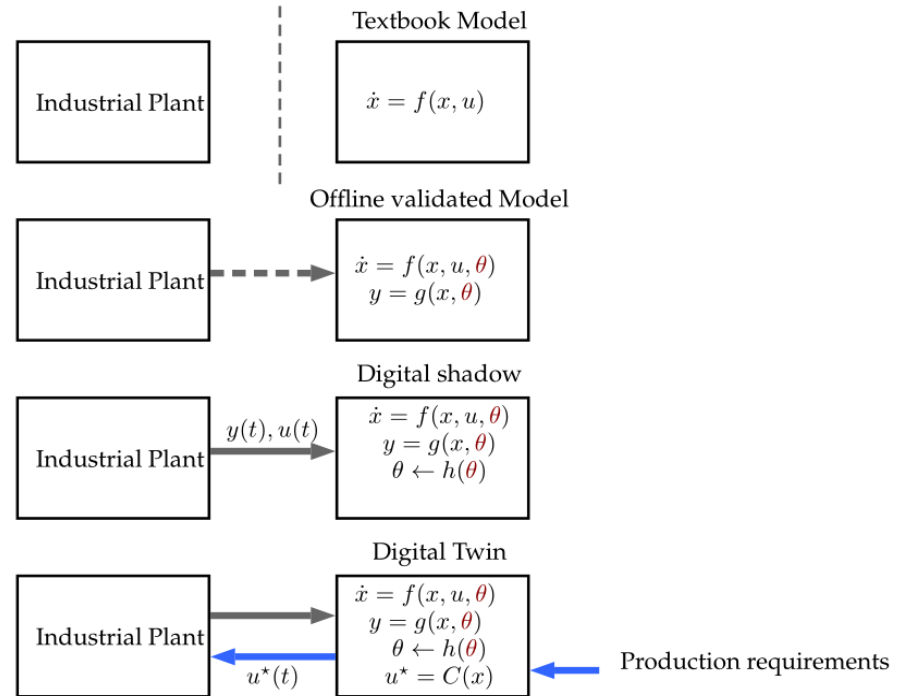
A digital representation that **looks-like**, **behaviours-like**, and **connects-to** a physical system

With the **goal to optimise** decision-making across all time horizons



# Digital Twin Classification

- Digital Model
  - Non-automatic data flow
- Digital Shadow
  - One-way automatic data flow
- Digital Twin / Digital Manager
  - Two-way automatic data flow



# Digital Twin Classification

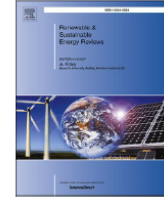
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## Energy digital twin technology for industrial energy management: Classification, challenges and future



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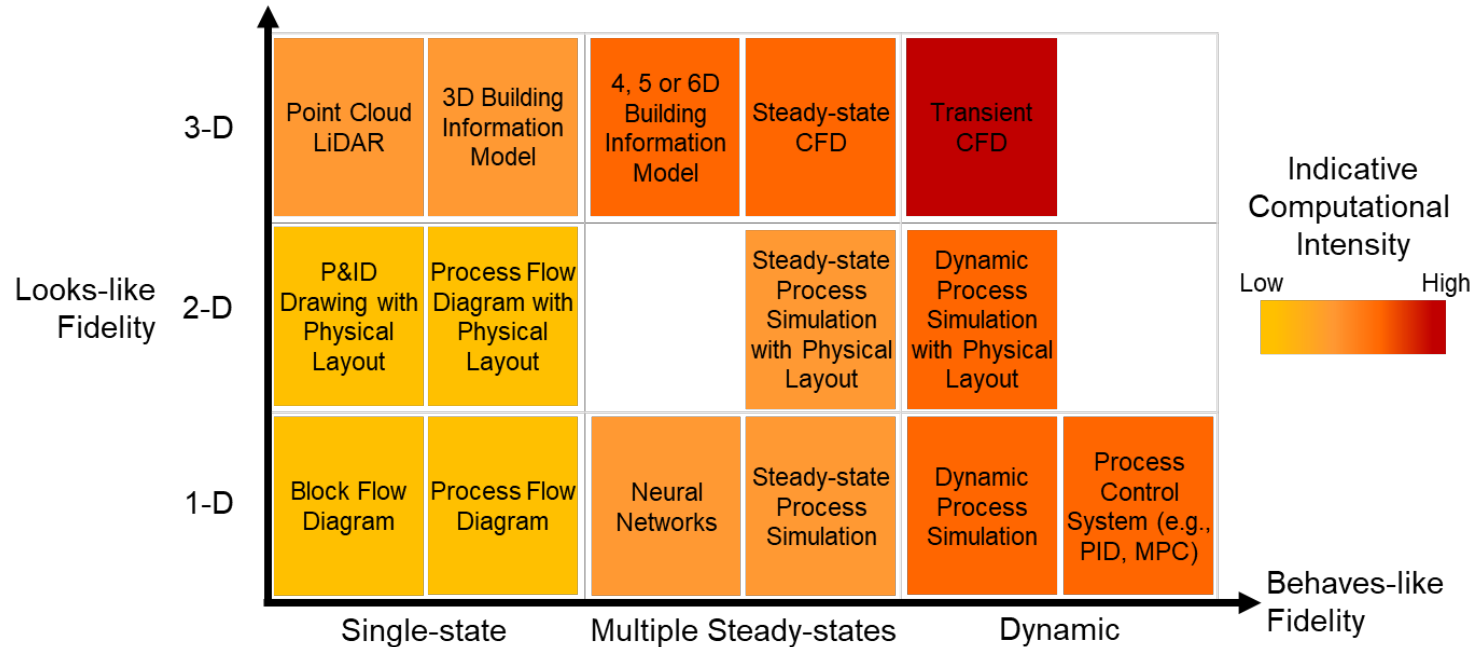
<sup>c</sup> Ahuora – Centre for Smart Energy Systems, School of Engineering, University of Waikato, Hamilton, 3240, New Zealand



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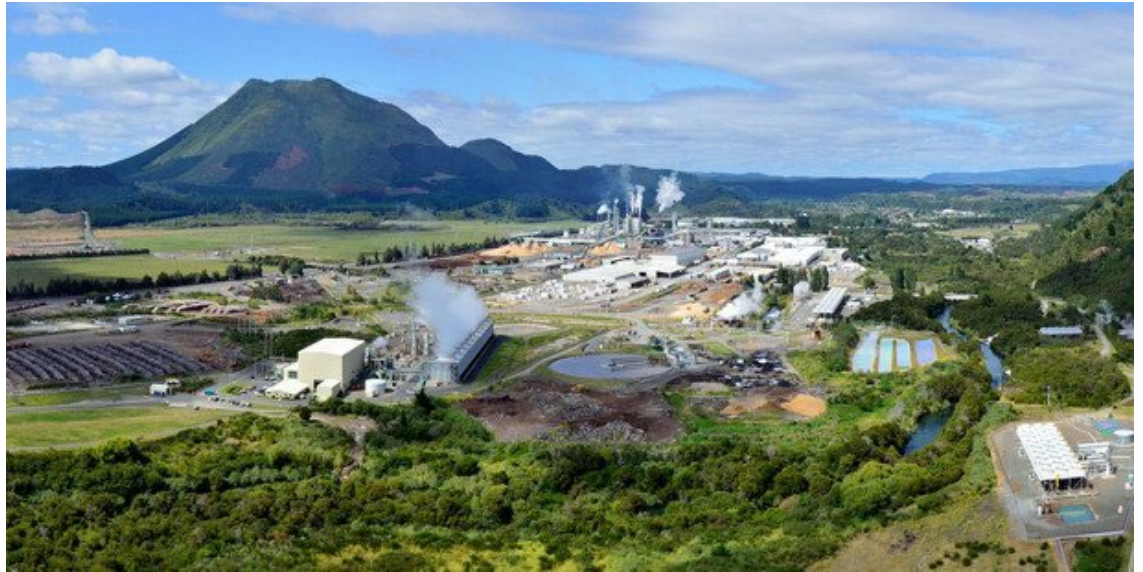


# Digital Twin Classification





# Energy DTs



# Energy Digital Twins



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## Advanced Energy Technology Platform

Govt funded, industry support  
\$12.5 Million / 7 years  
12 initial industry partners  
rep >50% of NZ process industry  
Started October 2020

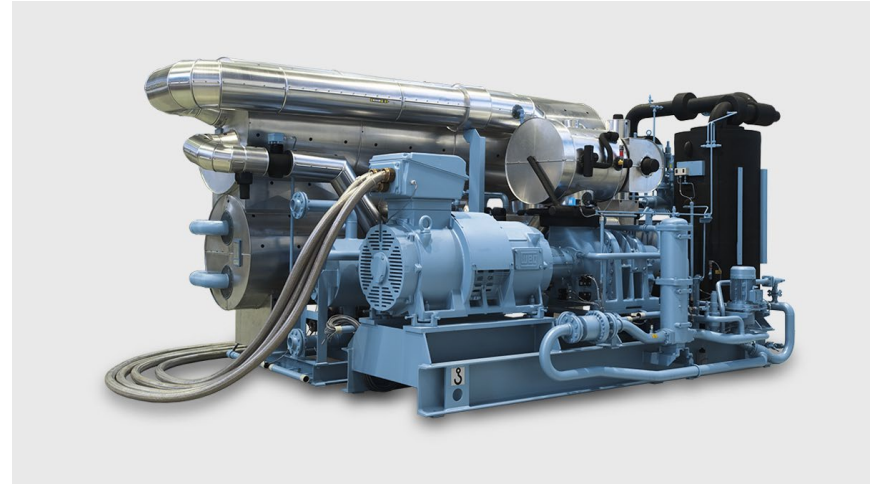
11 Academics  
3 Post Docs  
12 PG students  
15 UG students

# Ahuora Research

- **Energy Digital Twins for Process Heat Decarbonisation**
- Re-engineer the way we **use, convert,** and **provision** energy for process heat using a smart systems approach
  - Plant efficiency
  - Boilers & Heat pumps
  - Renewable energy
- Produce open-access software tools for NZ industry
- Develop the next generation of **Digital Twin** technology called a **Adaptive Digital Twin**
  - Smart design and operation

# How will Digital Twins help?

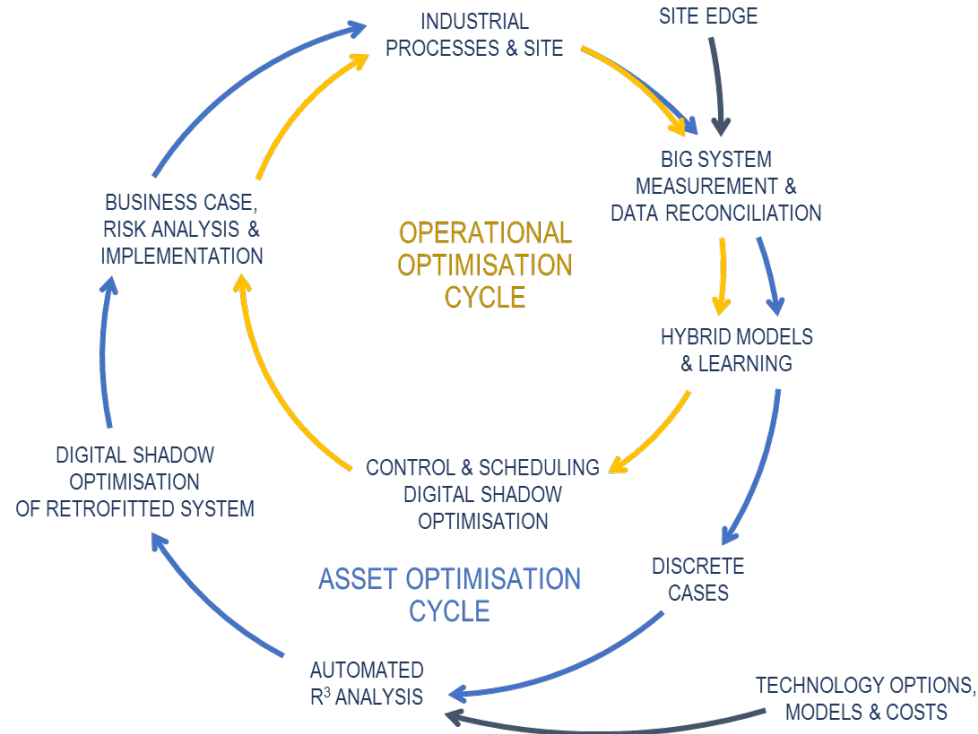
- Real time optimisation & control
- Evolve Energy Assets for efficiency
  - Retrofit, Replace, Retire (R3)
- Integration and optimisation of energy
- Energy storage
- Energy procurement
- Emissions management



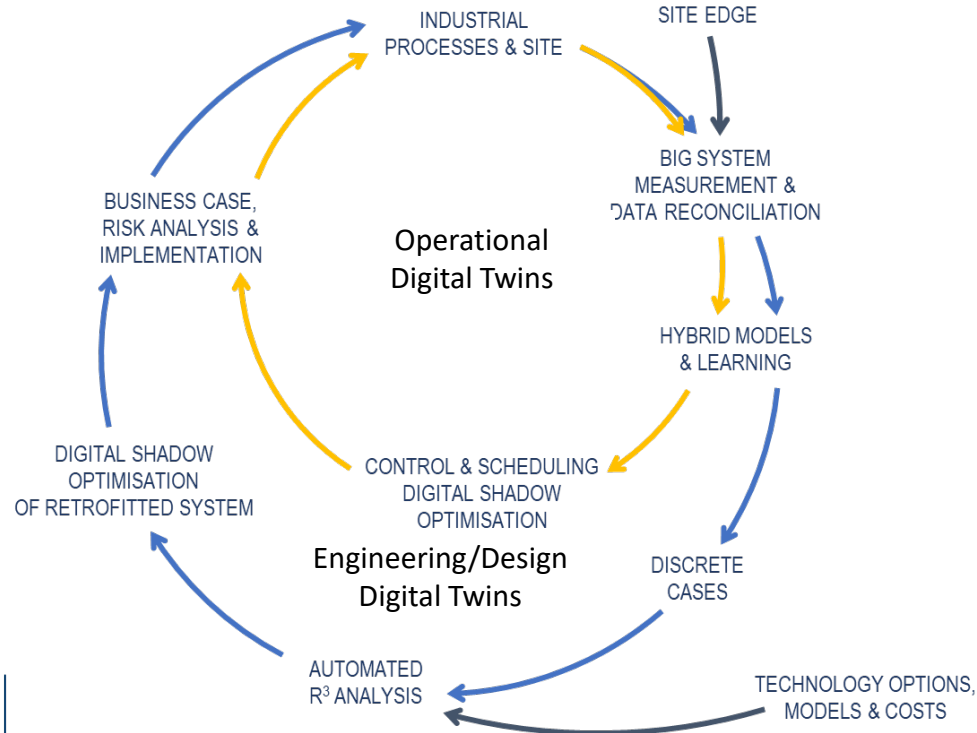
## Example

Industrial Heat Pumps  
Design, Integration & Operation

# DTs & Improvement Cycles



# DTs & Improvement Cycles



# Tool Development

- Tool development necessary
- Existing ones are rebranding
  - e.g. process simulation
- New methods to exploit industry 4.0, IoT, big data, machine learning
- Integration between DTs
  - e.g., energy DT & business DT



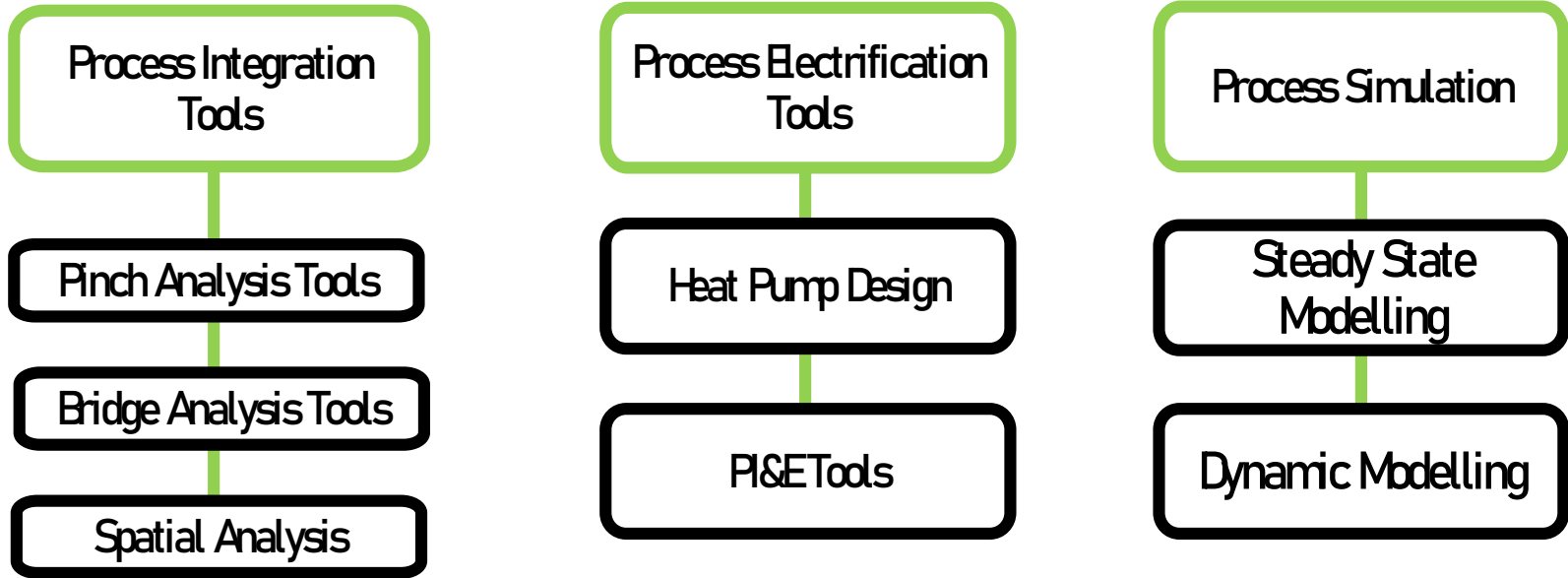


# Open Source Platform

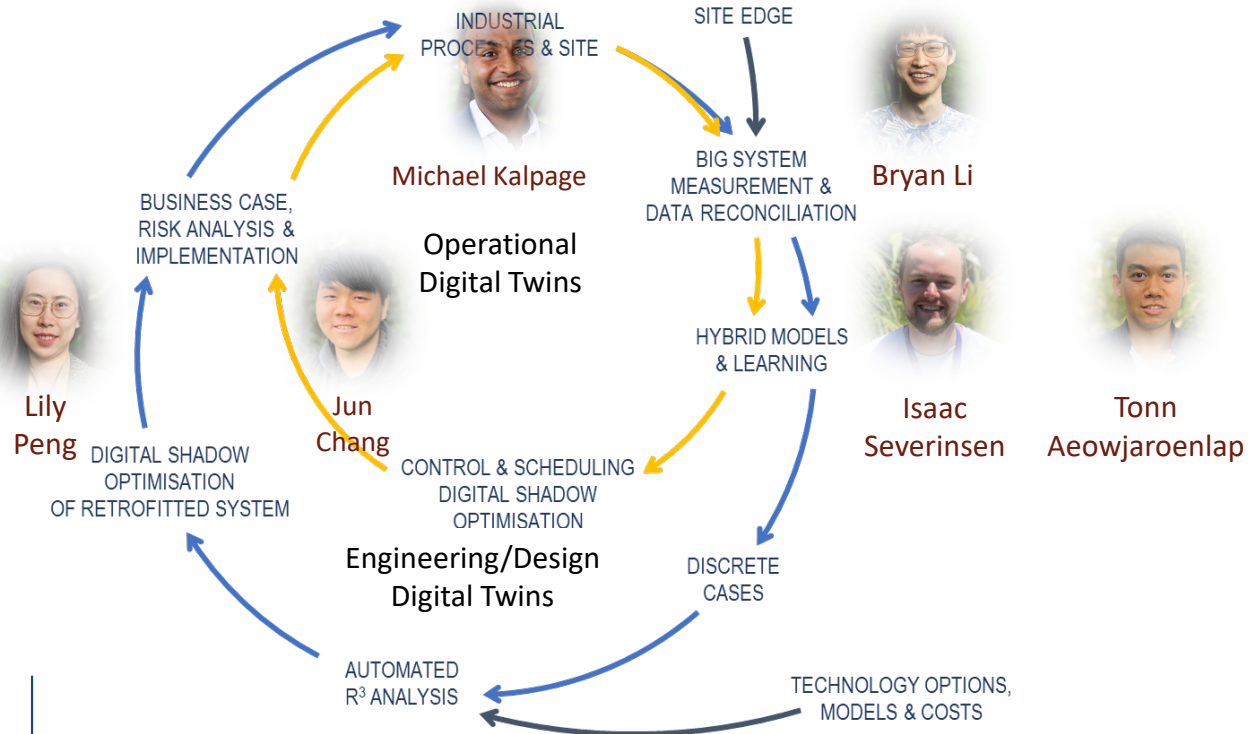


Institute for Design of  
Advanced Energy Systems

# Open Source Platform



# UOA Ahuora Research



Wei Yu



Tonn Aeowjaroenlap

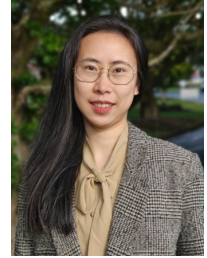
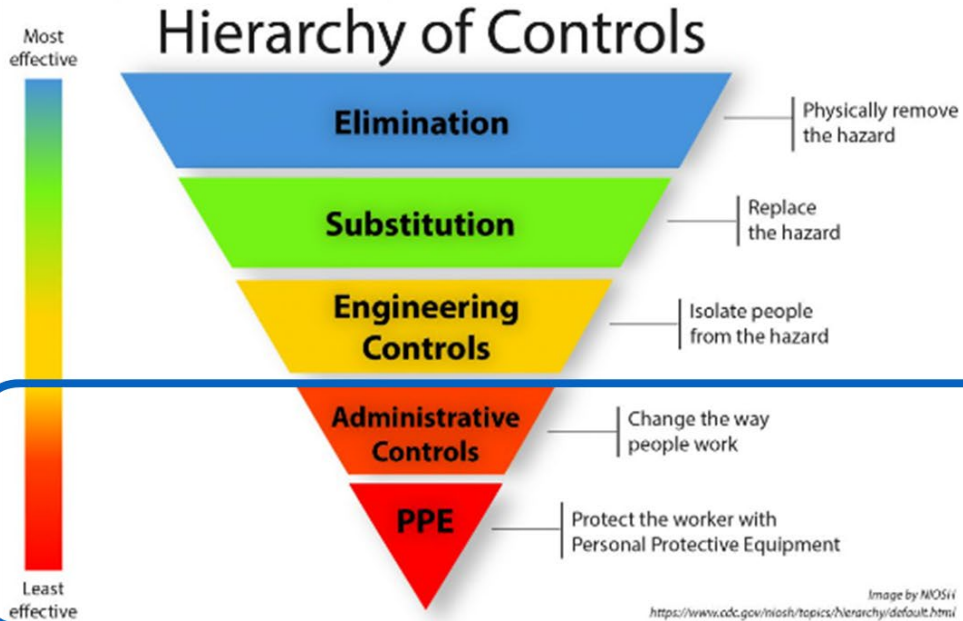


Brent Young



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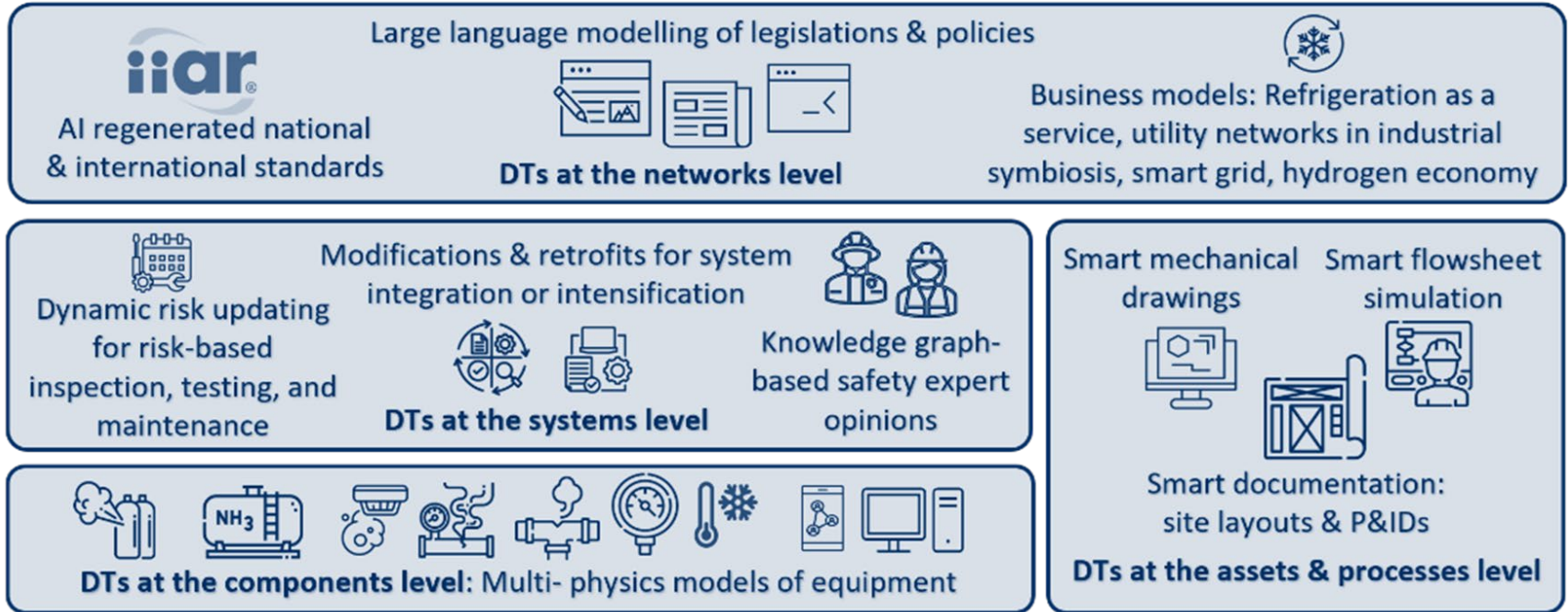
# Process Safety DTs



Lilly Peng



# Process Safety DTs

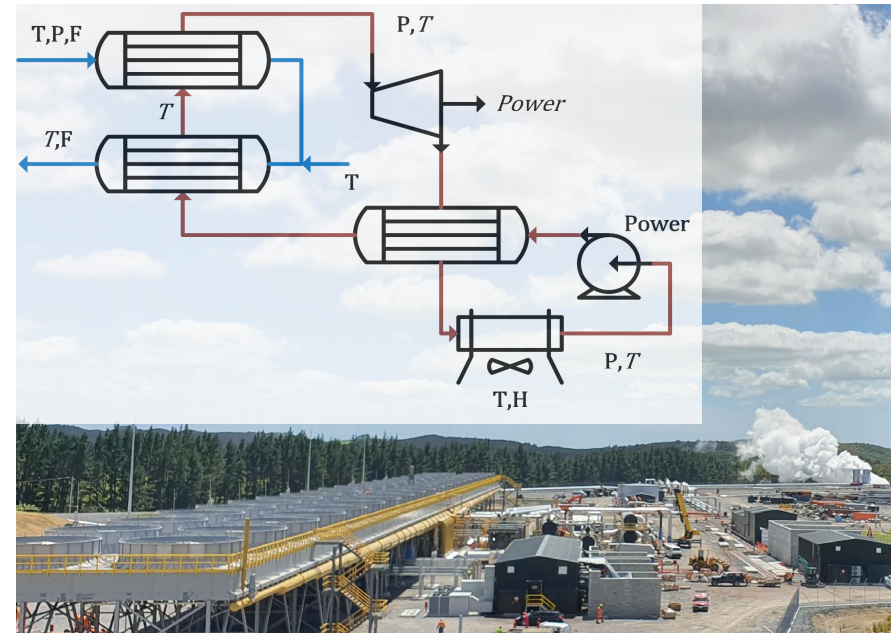
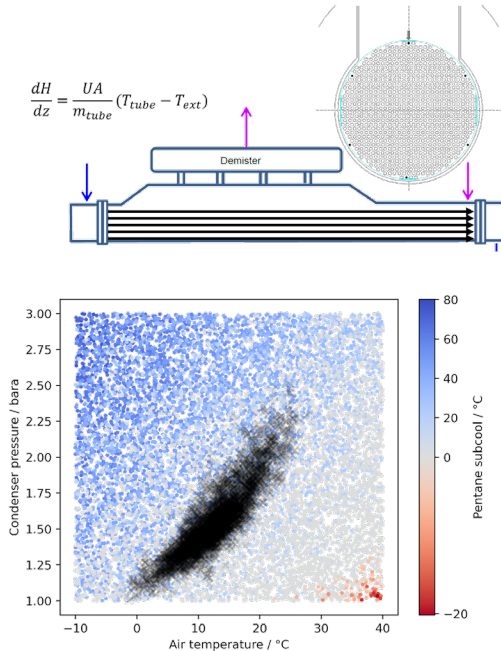


# Digital Modelling



Isaac Severinsen

- **Efficient, dynamic, digital twin models** of unit operations using modern regression
- First Principles:
  - $$\frac{dH}{dz} = \frac{UA}{m_{tube}} (T_{tube} - T_{ext})$$
- Data Driven:

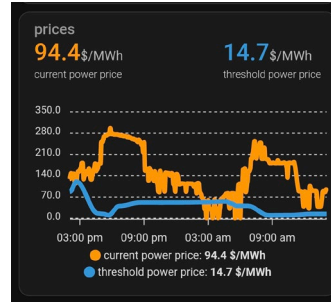




# Digital Modelling

- **Demand Response**

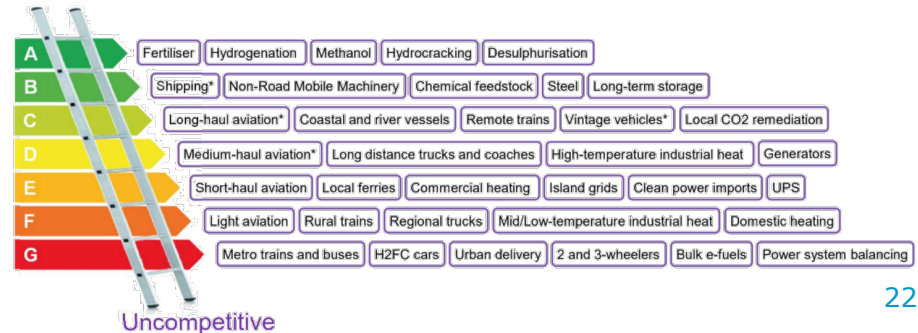
- Residential
  - Hot water
- Industrial
  - Hydrogen



## Clean Hydrogen Ladder

Liebreich Associates

Unavoidable





# Time Series Forecasting



Tonn  
Aewjaroenlap

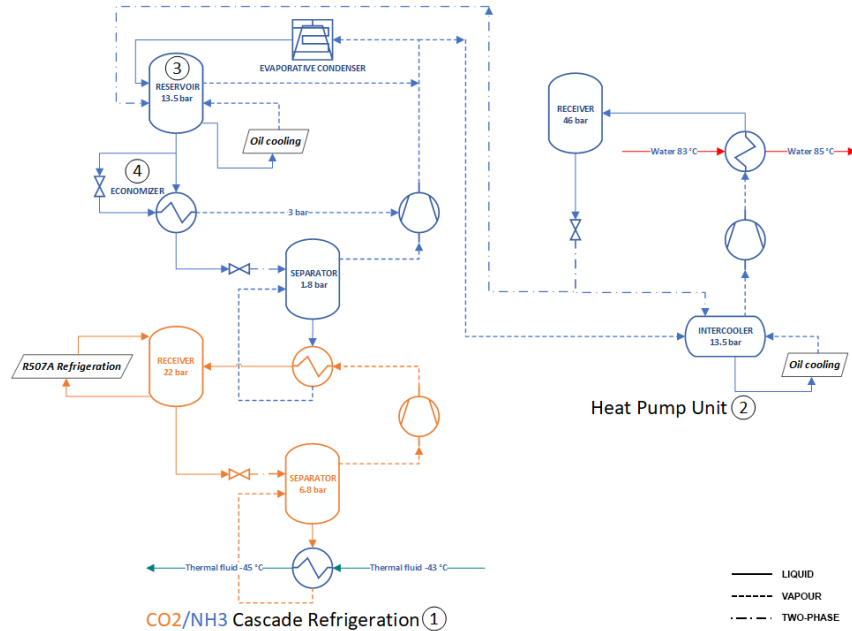
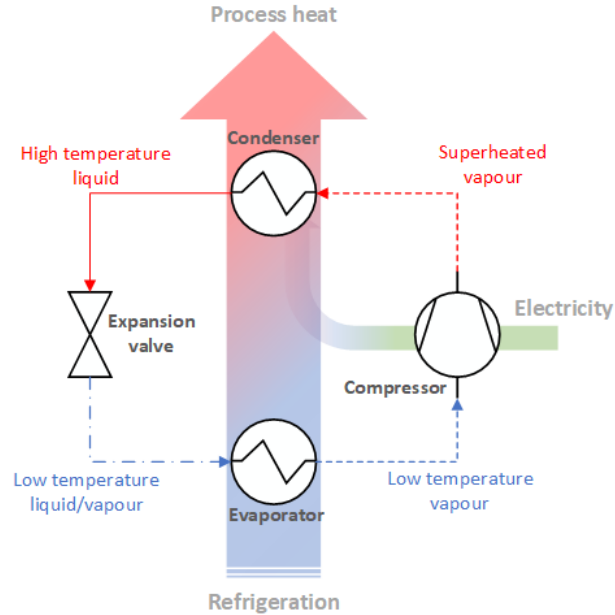
## Machine Learning for Time Series Forecasting

- Machine Learning Approach: Trends, Patterns, Fluctuation, Outliers
- Time Series Modelling: e.g., Naïve, ARIMA, ANN
- Applications: Process and Energy Optimization in the Dairy Industry

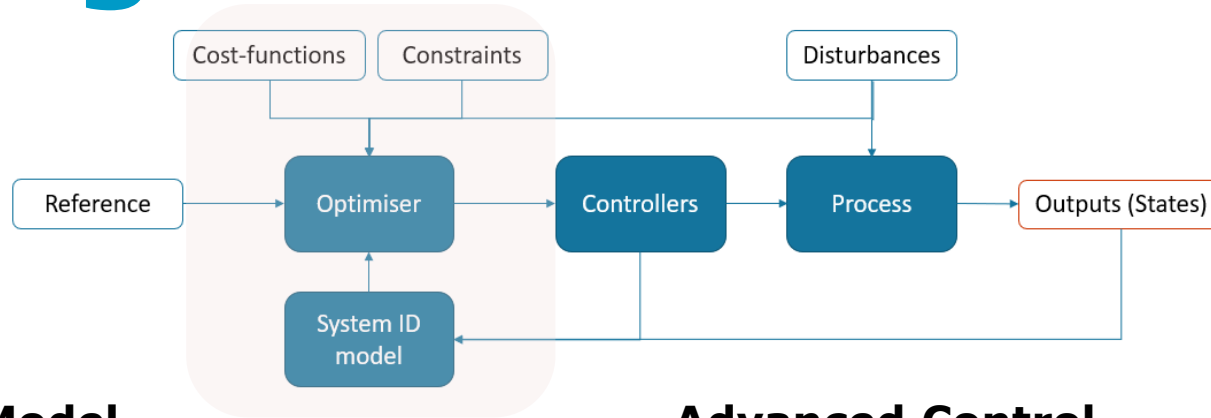
# Refrigeration Control



Jun Chang



# Refrigeration Control



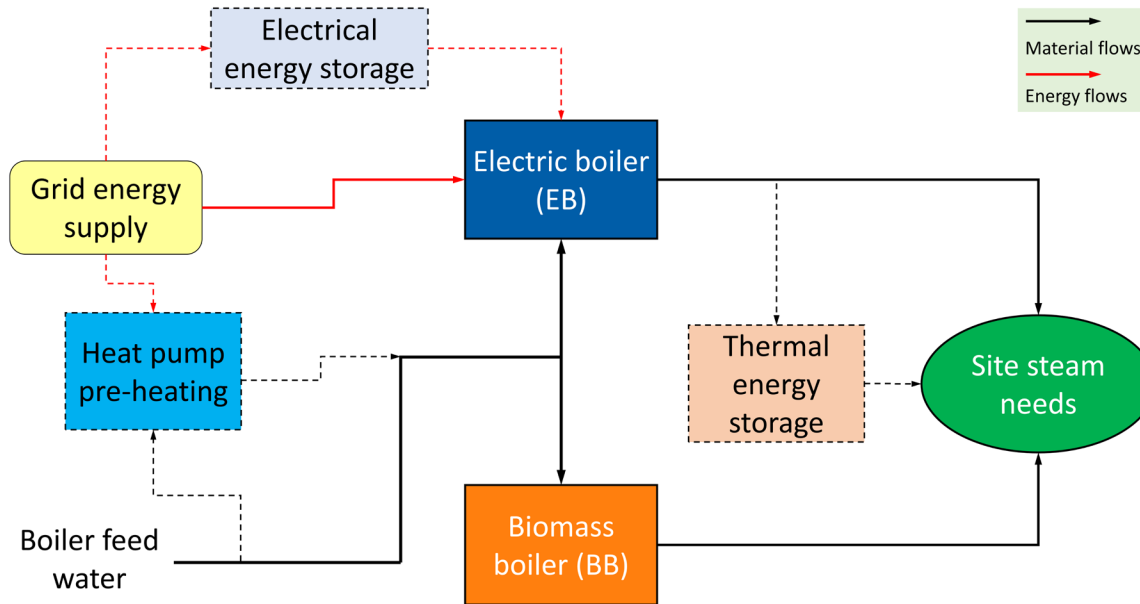
## Dynamic Model

- Identifying operational issues and potential improvements
- Developing advanced control methods

## Advanced Control

- Stable operation closer to design
- Economic benefit

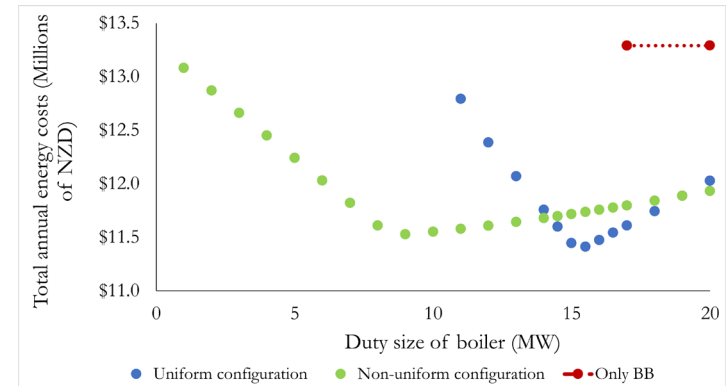
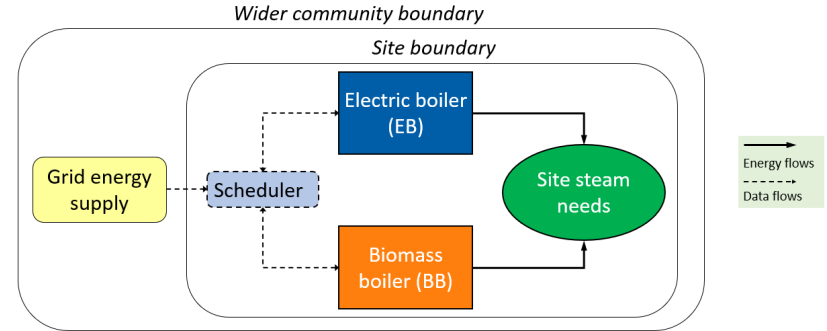
# Industrial energy flexibility



Michael Kalpagé

# Industrial energy flexibility

- Simulation approach
  - 30-minute time intervals
- Determining best use of cheap energy
- **Next steps:**
  - Stochasticity
  - Multi-criteria assessment
  - Reinforcement learning(?)
  - Forecasting revisit



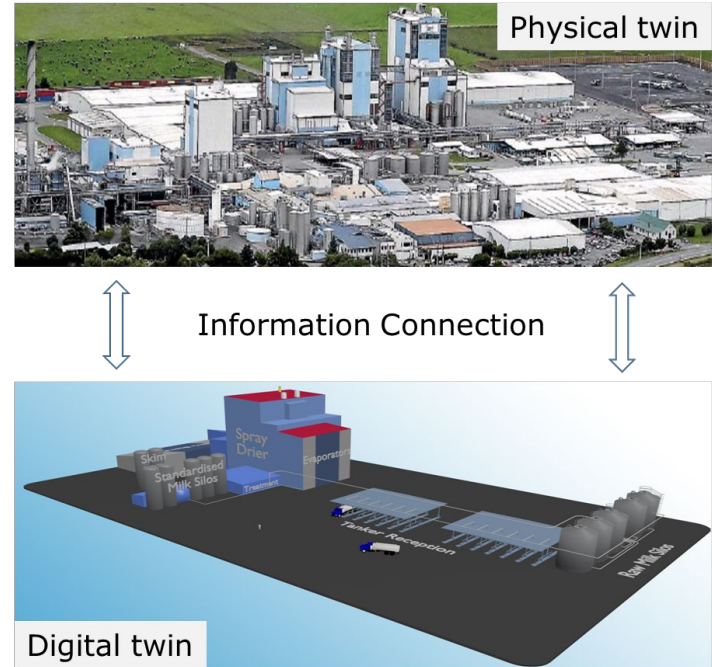
# Multi Plant Clusters



## Dynamic Large Scale Digital Twin for Optimization of Multi-plant Industrial Clusters Bryan Li

- To develop a novel digital twin to dynamically simulate and optimize the use of energy and product streams for large-scale multi-plant industrial clusters.
- To ultimately identify the types of new businesses which could join the cluster to bring about mutual benefits.

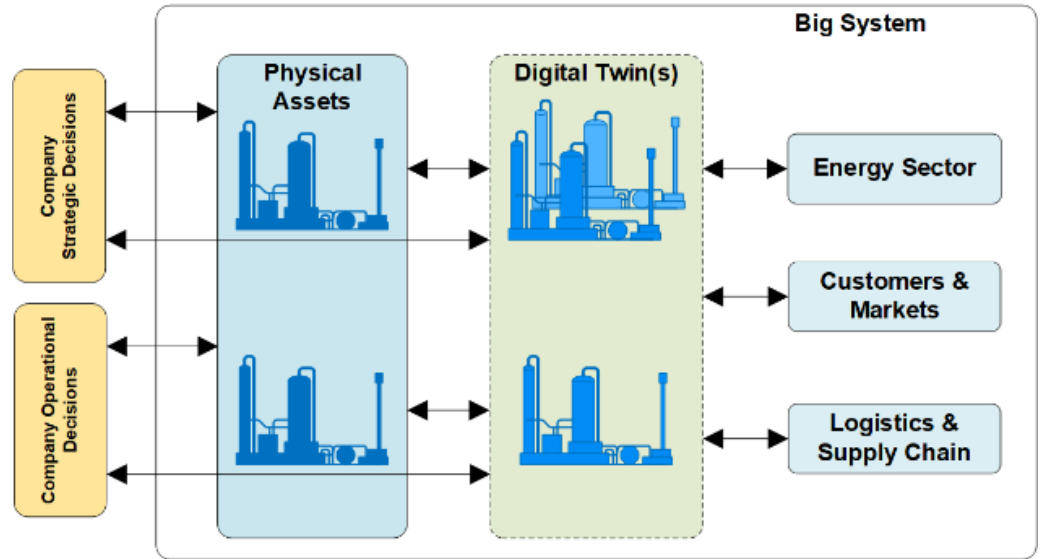
# Energy and Business DTs





# Energy and Business DTs

- In this talk and in our research we have so far focused on company level DTs
- For decarbonization & demand response, DTs **need** to include: The '**Big System**', i.e., the company, the grid, and the community DTs



# New research proposed

## Energy Demand Response Dynamic Digital Twins

- A system and a framework of dynamic digital models and twins
- That will integrate energy digital twins and business digital twins
- To provide optimal demand response and flexibilization for industry, business and residential

W. Yu et al.

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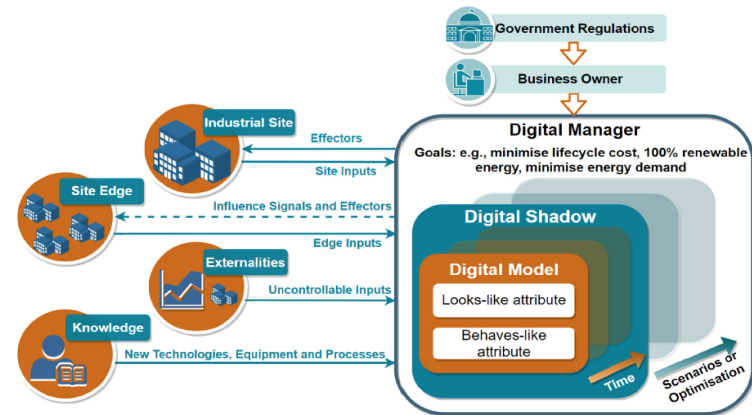


Fig. 8. A framework for the application of Energy Digital Twin technology (including Digital Model, Digital Shadow, and Digital Manager) to the process and energy industries.

# Acknowledgments

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