

Challenges in Satisfying the Need and Promotion of Modeling & Simulation Workforce

Panel, Winter Simulation Conference (WSC) 2021
Phoenix, AZ, USA. December 15, 2021

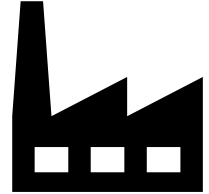
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<https://arajhans.github.io>



About me

- Industry practitioner

- Embedded controls and industrial automation for diesel engine manufacturing and applications at Cummins
- Data-driven + model-based approach at Bosch
- Model-based design problems from Toyota during PhD



- Academic researcher

- Control, robotics, AI/ML, formal analysis, more during MS at Penn
- Multi-formalism Model-Based Design, formal analysis during PhD at Carnegie Mellon
- Software and system architecture during PhD at Carnegie Mellon

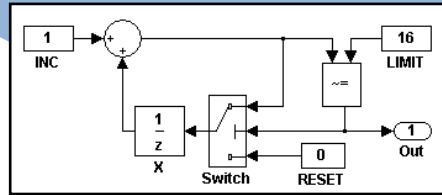


- Research Scientist

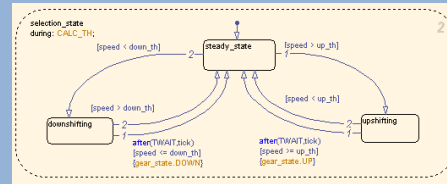
- Work on building a modeling and simulation platform
- Used by industry practitioners and academic researchers alike



[Modeling]: Model-Based Design and Systems Engineering



Simulink



Stateflow

```
function [symbols, weights] = gainctrl(rxsig, train)
% 1-tap adaptive equalizer using LMS or RLS algorithm

% Equalizer settings
lambda = 0.99;
Delta = 0.1+0i;
weights = 0+0i;

for n = 1:length(rxsig)
    u = rxsig(n); % received sample
    y = conj(weights) * u;
    if n<length(train)
        d = train(n);
    else
        d = detect(real(y)) + 1j*detect(imag(y));
    end
    % Single-tap RLS
    Delta = 1/(lambda/Delta + u*conj(u));
    G = Delta * u;
    e = d - y; % symbol estimation error
    weights = weights + G*conj(e);
    symbols(n) = y;
end
```

MATLAB

```
function [symbols, weights] = gainctrl(rxsig, train)
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end
```

C, C++ S-functions

Unified representation

Graph level & algorithm
level analysis

Modeling semantics level
analysis

Implementation level
analysis

C code

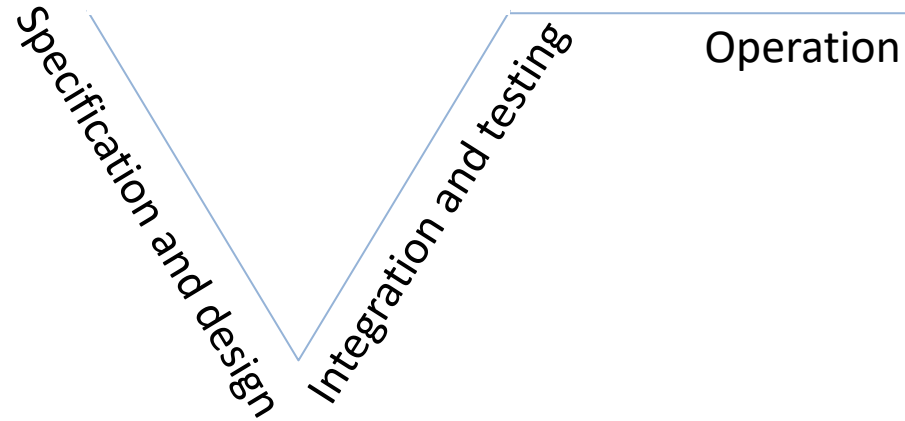
C++ code

HDL code

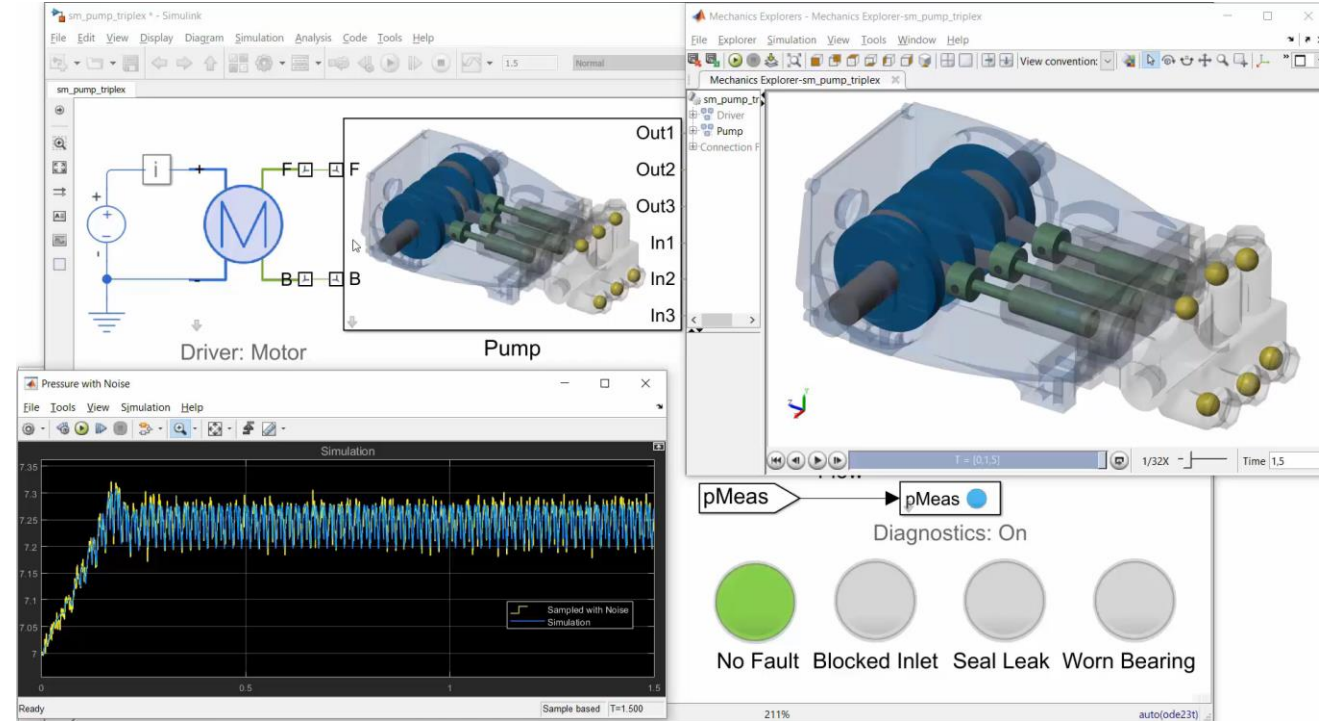
PLC code

GPU code

[Modeling]: Model-Based Operation with Digital Twins

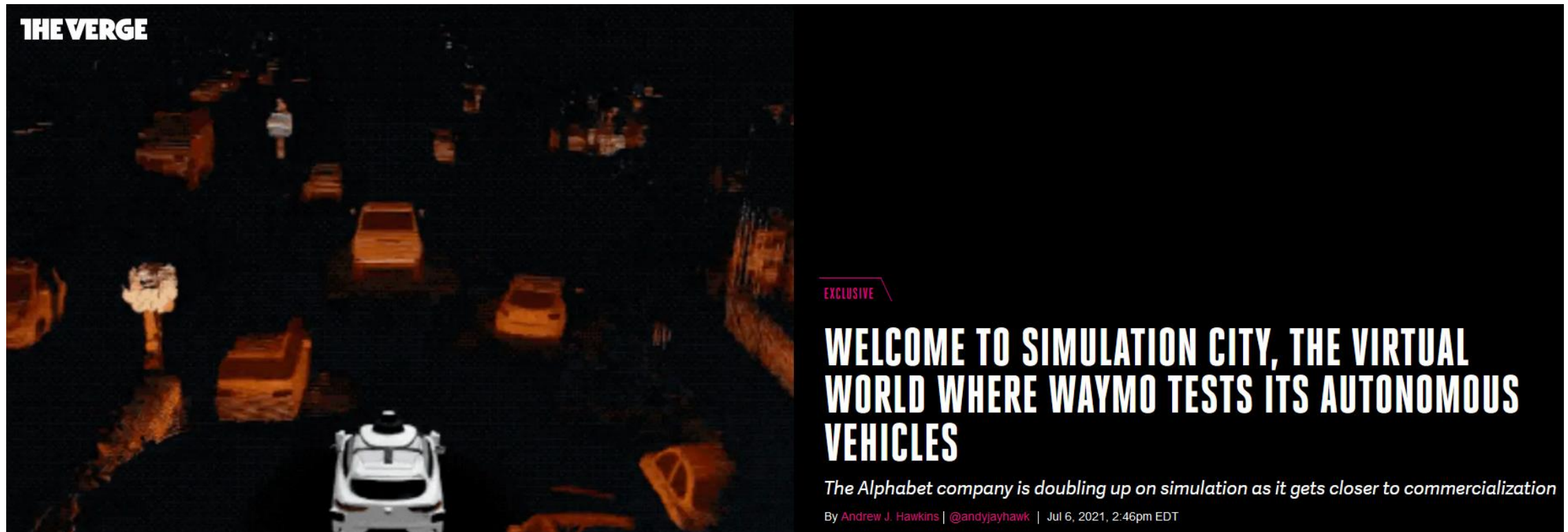


Challenges in the Operation and Design of Intelligent Cyber-Physical Systems, S. Castro, P.J. Mosterman, **A.H. Rajhans**, and R.G. Valenti, book chapter, *Complexity Challenges in Cyber Physical Systems: Using Modeling and Simulation (M&S) to Support Intelligence, Adaptation and Autonomy*, S. Mittal and A. Tolk, eds., Wiley, 2019.



<https://www.mathworks.com/discovery/digital-twin.html>

[Simulation] Increasing relevance (example): Billions of 'Simulation miles' driven by autonomous vehicles

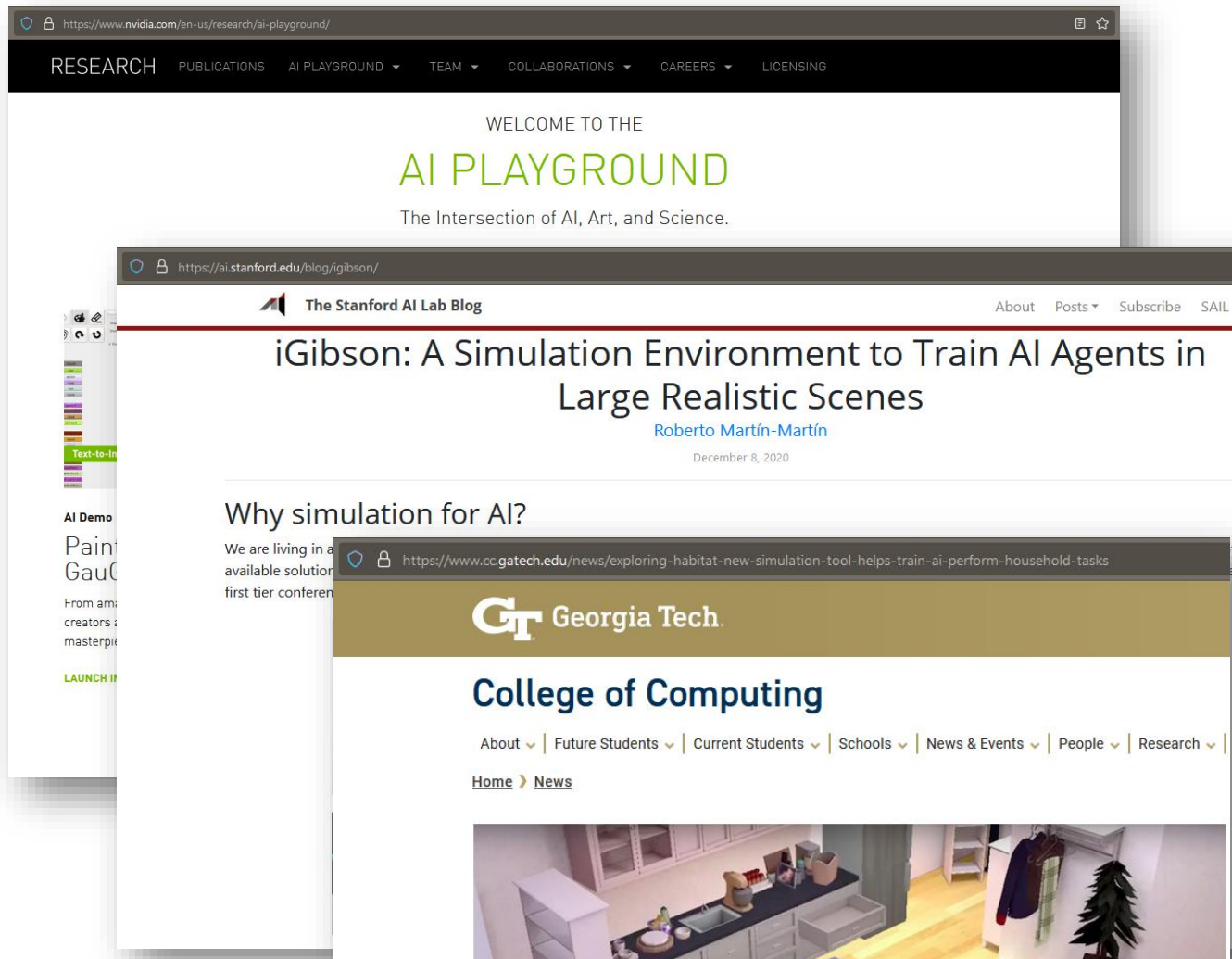


<https://www.theverge.com/2021/7/6/22565448/waymo-simulation-city-autonomous-vehicle-testing-virtual>

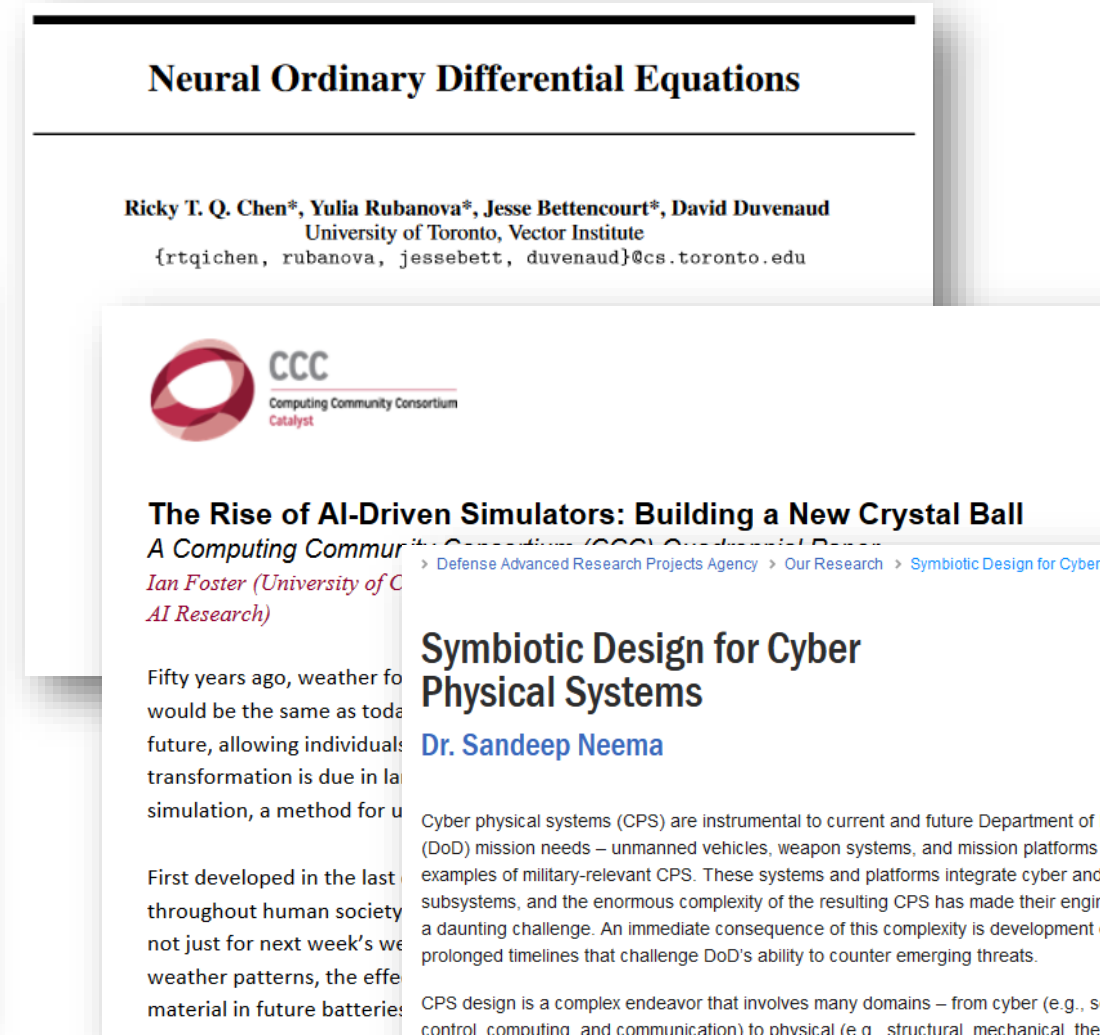
<https://techcrunch.com/2019/07/10/waymo-has-now-driven-10-billion-autonomous-miles-in-simulation/>

New paradigms with the advent of AI

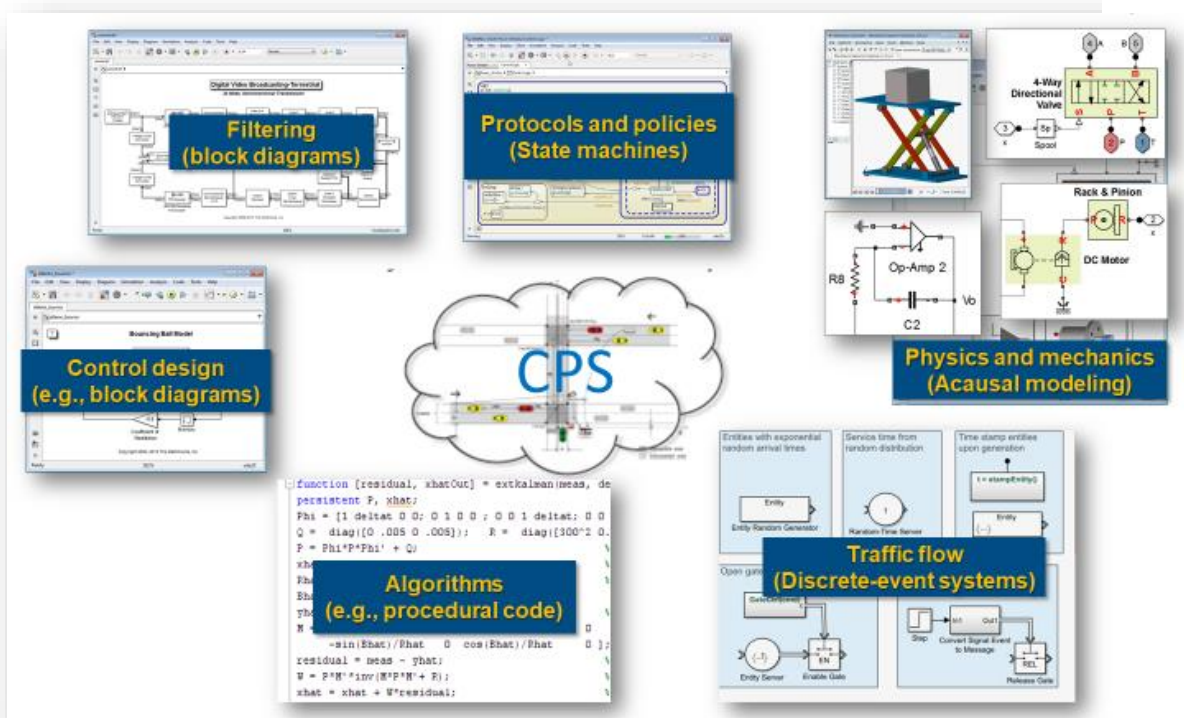
Simulation for AI (examples)



AI for Simulation (examples)

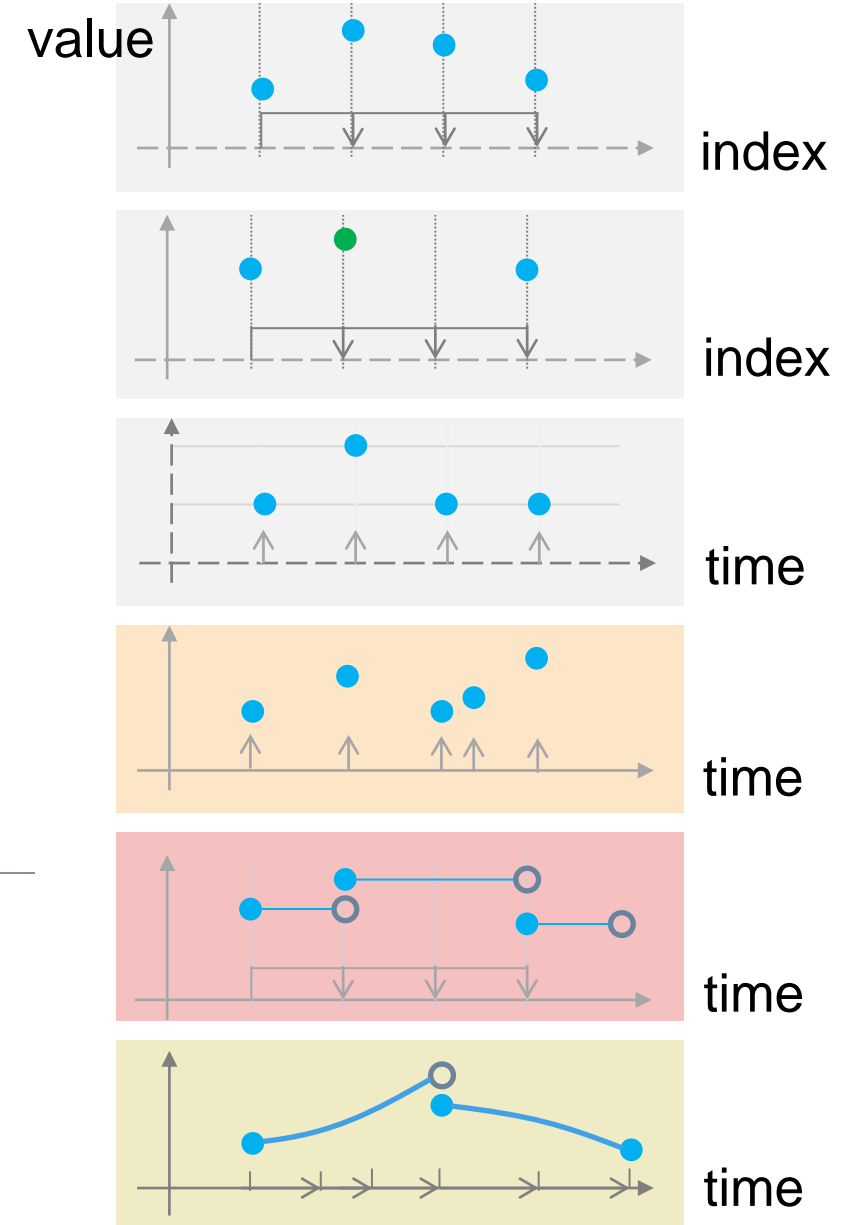


Research challenges (example): addressing heterogeneity



Multi-Model Heterogeneous Verification of Cyber-Physical Systems,
A. Rajhans, PhD Thesis.

Simulation of Hybrid Dynamic Systems, P.J. Mosterman, **A. Rajhans**, A. Mavrommati, R.G. Valenti,
Springer Encyclopedia of Systems and Control, Second Edition



Summary

- Modeling and simulation continues to play a pivotal role, from design time to operation time
- Deployment landscape increasingly complex with IoT scenarios
- New world of opportunities with the advent of AI
- Fundamental questions about multi-formalism multi-scale analysis still relevant
- Need for curricula and continued education in Modeling and Simulation