# Simulation Verification and Validation as a Service

"Advancing simulation theory, methodology, and practice through solving one challenge at a time."



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# My research focus is advancing ..

#### Domain knowledge using computational methods

#### **Urban Science**

- Home location prediction
- Tourist movements and sentiment
- Mobility analysis from sparse footprints

#### Cybersecurity

- Malware projections
- Malicious behavior modeling
- Simulation for cybersecurity

#### **Modeling and Simulation field**

Data-driven agents

Web-based simulation (http://cloudes.me)

Understanding the modeler

Verification and Validation (V&V)

- Spatial plots to convey simulation dynamics
- Statistical debugging
- Making a V&V service





## Summary

- Verification and Validation (V&V) is one of the most important steps in a modeling and simulation process.
  - There are over 170 V&V techniques proposed in the literature.
- Despite its importance and a vast number of available techniques, V&V is mostly applied in an ad-hoc manner using informal techniques or not applied at all.
- To improve V&V practice, this project aims to create a Verification and Validation (V&V) service accessible to a wide range of audience, including less technical people.





## Our team





## V&V terminology

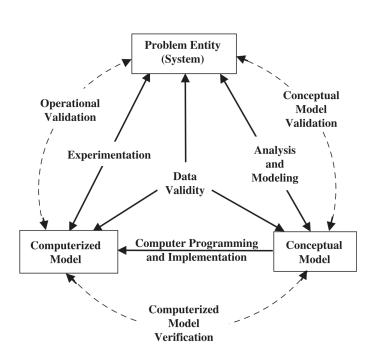
- **Verification:** the process of determining that a simulation is built correctly [1-3].
  - Involves examining simulations' structure, code, and behaviors to identify implementation errors.
- Validation: the process of determining that a simulation adequately reflects the modeled system [4-6].
  - Involves examining simulations' conceptual model, output data and its uncertainty, and sensitivity to parameter changes ...





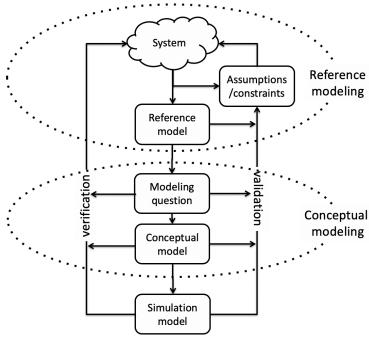
## V&V in Modeling and Simulation processes

## The model development process (simplified version)



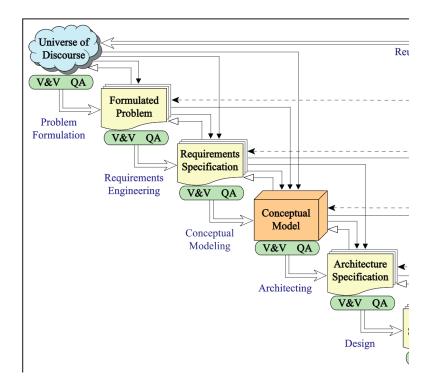
Sargent [5]

## The M&S System Development Framework



Tolk et al. [7]

#### A life cycle for modeling and simulation



Balci [8]



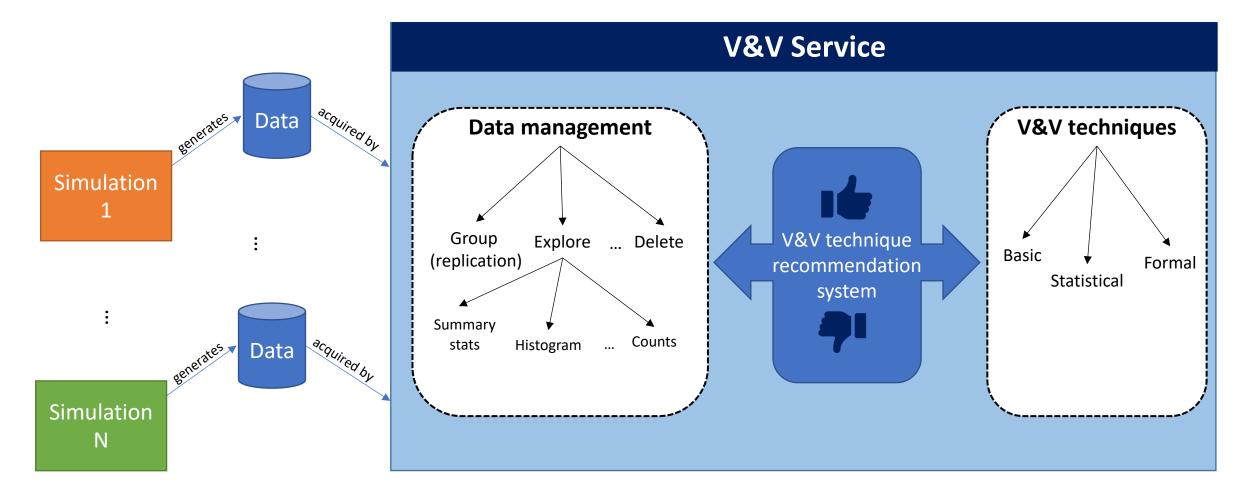
## Challenges in applying V&V

- Resource requirement (e.g., time) associated with V&V yields
  - Not conducting V&V at all
  - Using informal V&V techniques
- Tradition of use using the same V&V techniques established by their peers, perhaps decades ago
- High learning curve, especially for formal techniques
- Lack of commonly accepted solutions yield
  - non-reusable efforts
  - time lost





## Our proposal – a schematic view





## V&V techniques to be included

#### Basic

- Visualization
  - Scatterplot, time series, spatial, histogram, heatmap, 3D, bar chart, box plot, network (graph)
- Animation
  - Traces, events, network evolution, change of histogram
- Event validity

#### Statistical | N

- Simulation output validation
  - Historical data validation
  - Confidence intervals (uncertainty estimation)
  - Statistical tests
  - Distribution fitting
  - Network measures
- Sensitivity tests

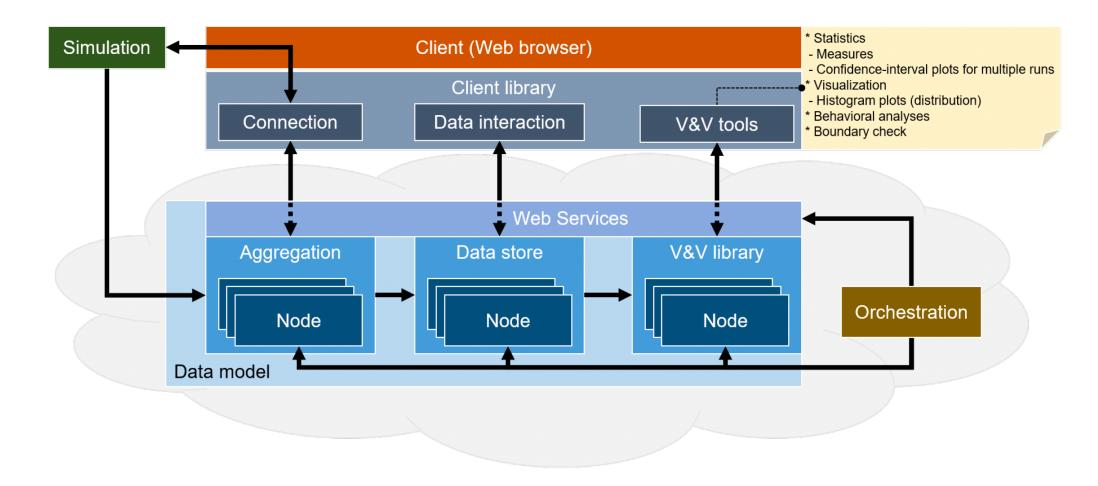
### Formal 🔀

- Boundary checks via predicates
- V&V calculator via statistical debugging



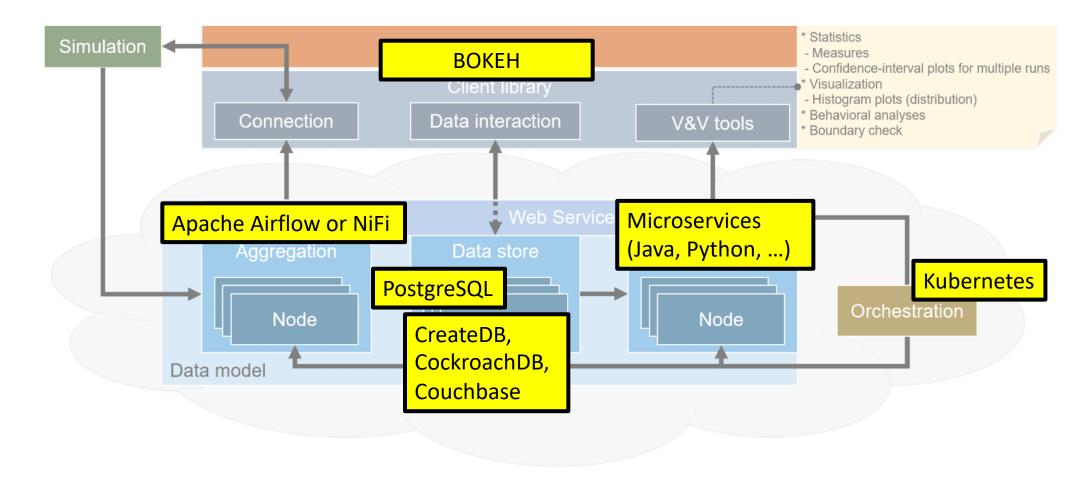


## System architecture





# Software implementation (planned)





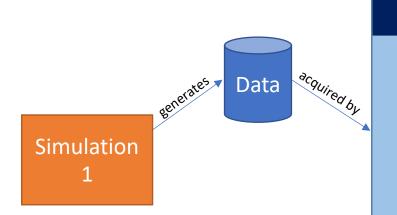
## Planned features

- User experience
  - Seamless integration of data logistics for the user
  - Personal data via user management
  - Ability to recognize replications and certain data types (e.g., spatial)
  - Third party integration with webbased simulation tools
  - Custom reporting dashboard sharable via a web link
    - Can be used as a supplemental document for research papers

- System
  - Independent of the simulation method and software tool
    - Agent-based simulation, discrete-event simulation, system dynamics, ...
  - Self-evolving V&V technique recommendation system



# Proof of concept implementation so far



#### **BOKEH Server Apps**

- Time series data visualization
- Trace data visualization/animation
- Network visualization





## Roadmap (contingent on funding)

#### January 2020

Kick off

#### 2020

- Create basic V&V tools
  - User interface sketches and use-case diagrams for the selected techniques
  - Microservice implementation
- Master Bokeh for creating custom V&V tools
- Distributed database test and integration
- Prototype user interface (private alpha)

#### 2021

- Data management features
- User management features (private beta)
- Create more advanced V&V tools
- Tool/library integrations
- Orchestration (public beta)



## Challenges

- Tool/library integrations
  - No standard in data collection methods
  - Making users minimally interrupted
- Auto-recognition of data types and important columns
- Computational (i.e., financial) cost

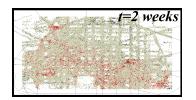


## Implications for researchers



Improve V&V practices – moving the Modeling and Simulation field ahead

Exploration and validation of massive simulations (e.g., millions of agents)





The V&V recommendation system can change the way we conduct V&V

Seamless integration: third party service for cloud-based systems





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Thank you for listening!

