

# CAREER: Towards Optimized Operation of Cost-Constrained Complex Cyber-Physical-Human Systems



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<https://www.albany.edu/~dz973423/projects/nsf-career-2020/index.html>



## Vision:

**Systematically describe** cost-constrained complex cyber-physical-human systems and **optimize their operation**

## Cyber-Physical-Human Systems (CPHS) Challenges:

- Sensing, processing & transmitting data **under resource constraints** (e.g., energy, time)
- Fuse **heterogeneous data** (in terms of fidelity, informativeness and cost) to satisfy application requirements
- **State-dependent communication** and prone to **sensing errors**
- Dynamics and cyber variables are **intertwined with/alterd** by **human behavior**

Accurate and Scalable Estimation and Control for CPHS is hard!

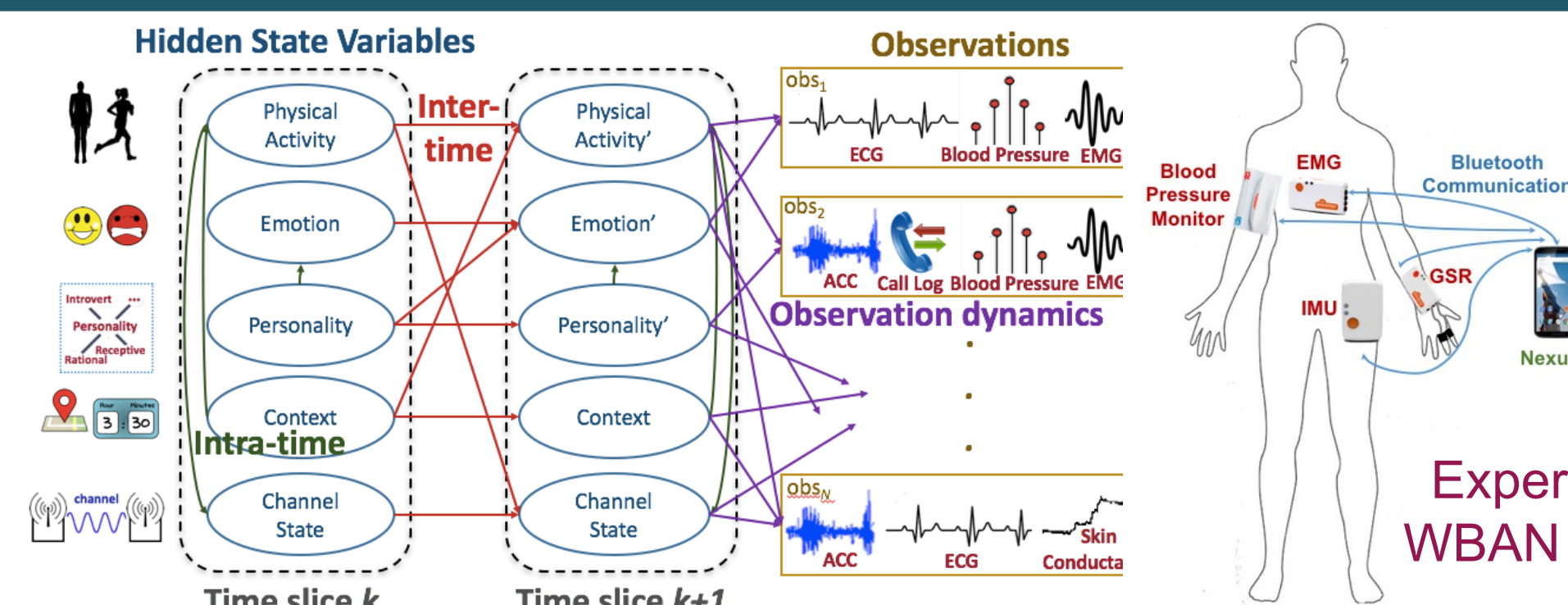
## Scientific Impact:

- More **realistic stochastic dynamic models** and **representation of interactions** for complex CPS
- **Dynamic fine-grained state estimation strategies** for complex CPS
- **Fundamental limits** of dynamic fine-grained state estimation for complex CPS
- Formally integrate **impact of humans-in-the-loop**
- **Control strategies** for optimizing CPS operation with **complex dynamics** and **heterogeneous capabilities**

## Solution:

### ○ Instance-wise Feature Acquisition in Multi-view Settings

- Different sensors (e.g., IMU, ECG) produce **multiple distinct data**
- Prediction of class of data instance (e.g., physical activity) can be improved by **acquiring the most "useful" features** extracted from such data
- Improvement both in **accuracy** and **energy efficiency**
- "Easy" data instances are classified using very few features/views



Graphical representation of CPHS stochastic system model

### ○ Instance-wise Classifier/Ensemble Selection

- If acquiring additional features does not improve accuracy, **instance-wise selection of one or more classifiers improves performance** w/o additional cost
- "Difficult" data instances are classified using this mechanism
- **Instance-wise Feature Acquisition is interpretable**

## Impact on Society:

### ○ Societal impact

- Help engineers optimize CPS/CPHS operation
- Enable scientists to objectively study human behaviors
- Provide individuals with means to self-monitor and improve their behavior
- **Who will care/benefit from project outcomes?**
  - CPS/CPHS engineers and system designers
  - Scientists in medicine, education, and psychology
  - General public

## Education and Outreach:

- Training of undergraduate/graduate students in both theory and practice of CPHS
  - Freshmen worked on K-12 hands-on projects (e.g., touch sensor, muscle sensor) and presentation materials that illustrate basic sensing principles
  - PhD students trained on machine learning for enhancing CPHS operation

## Broader Impact:

- **Unveil important factors related to CPHS operation**
  - Identify key variables that affect CPHS operation
  - Uncover fundamental limits of estimation process
  - Understand inherent trade-offs in optimization of CPHS processes
- **Estimation and control methods for CPHS**
- **CPHS Education/Outreach**

