



# Multiscale Simulation Framework for Personalized Pharmacology

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2019 ML-MSM Meeting, October 24-25 2019, Bethesda, MD

## Motivation

- Current models for PK and PD use simplistic mechanistic modeling approaches.
- Traditional PBPK approach lacks physiological input, with the exception of cardiac output, organ volumes & blood flow rates and neglects transport barriers.
- PD modeling approaches rely on even more simplistic dose-response correlations
- A **multiscale framework is needed** to integrate PBPK models, spatially resolved barrier models, and ML/AI supported mechanistic modeling approaches.

## Approach

- Combine fundamental mechanistic models with AI/ML models to determine model components that are otherwise difficult to obtain through mathematical description.
- We have established this approach on different applications including
  - a) Opioid and countermeasure test-case for determining PD physiology and effects,
  - b) Orally inhaled drugs (OIDP), and
  - c) Gastrointestinal tract (GIT) oral drugs.

## Inputs/Machine Learning Data

## Multiscale Framework

## Output

### Therapeutics

- Drug physicochemical prop.
  - Mol. Wt., LogP
  - Solubility, Partition Coeff...
- Drug formulation prop.
  - Carrier prop., PSD
  - Dry powder, solution, aerosol
- Quantitative ttr-activity (QSAR)
- Biomarkers/Metabolites

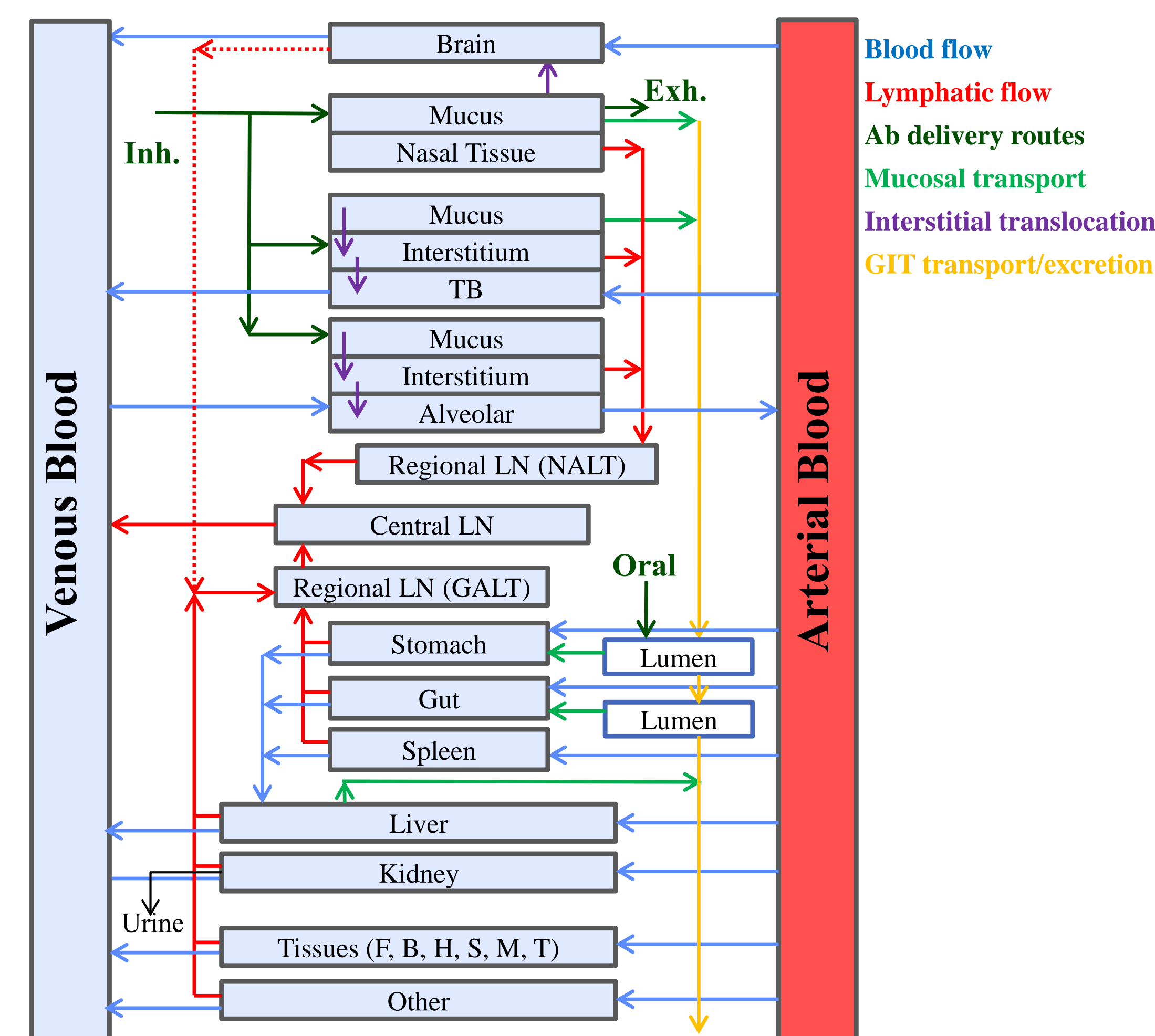
### Population & Genetics

- Genetic predisposition
  - Gene mutations
  - Disease resistance
- Population variance
  - Anthropometric measures

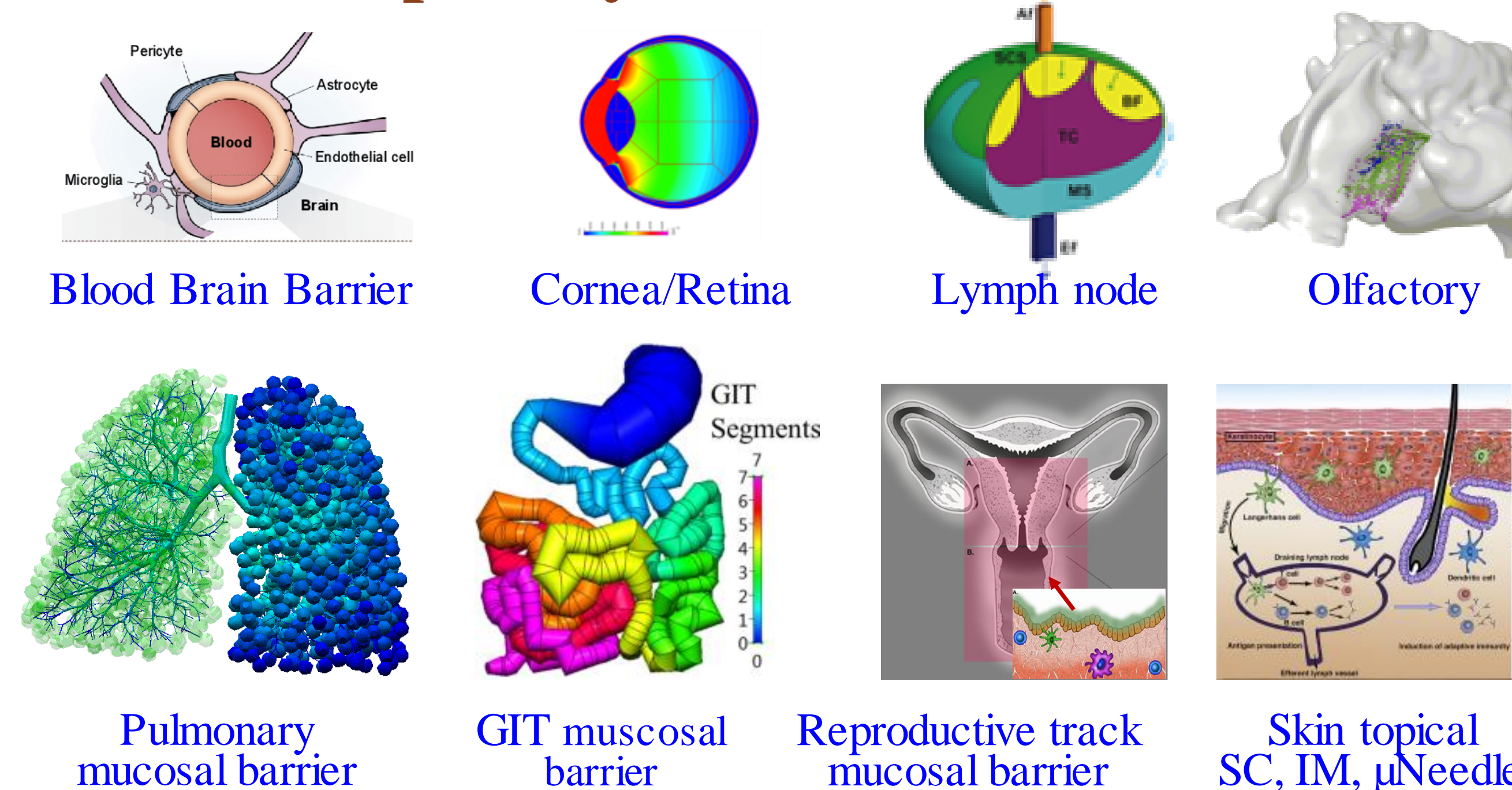
### Wearable Sensors

- Physical signals (Biomechanics)
  - Pressure, motion,...
- Thermal signals
  - Fever, hypothermia,...
- Electrophysiological signals
  - ECG, EEG,...
- Biomarkers/Metabolites

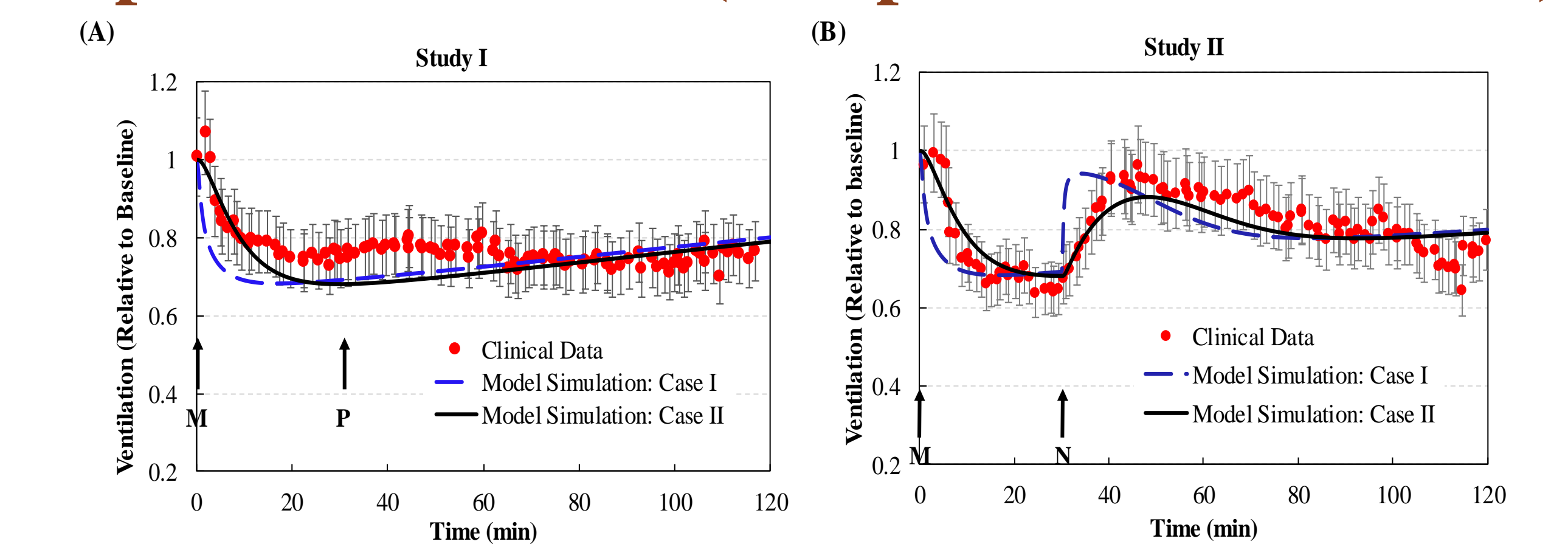
### Compartmental PBPK



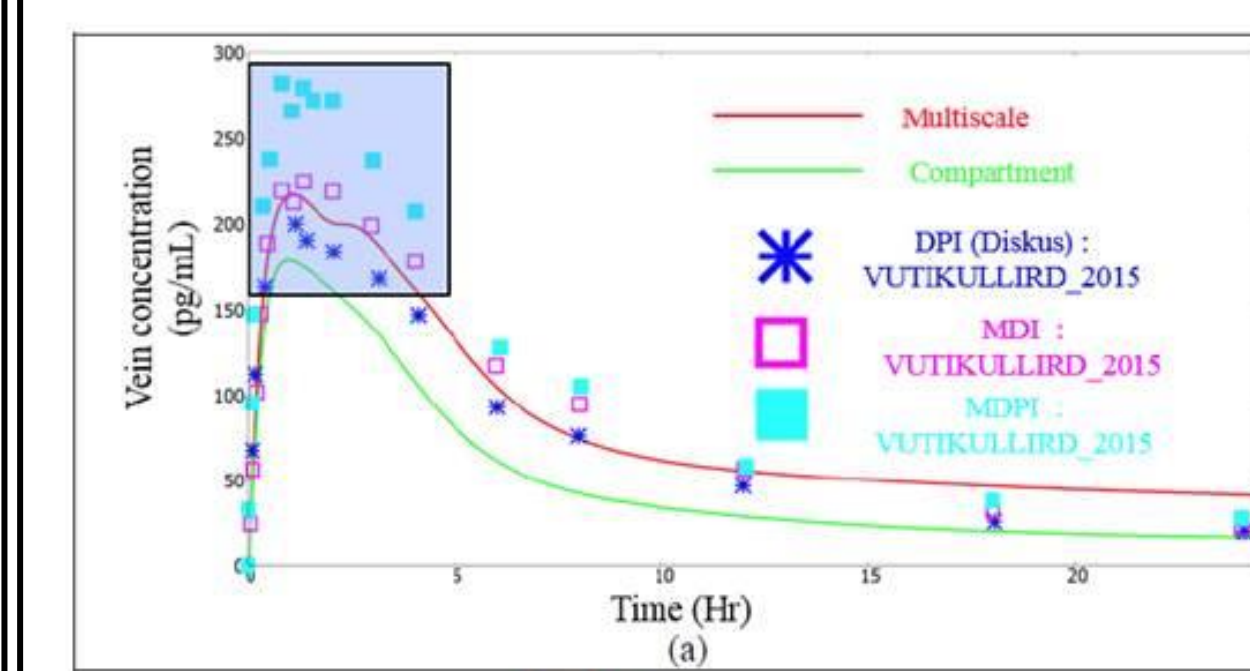
### Spatially Resolved Models



### Opioid simulations (Morphine and Naloxone)

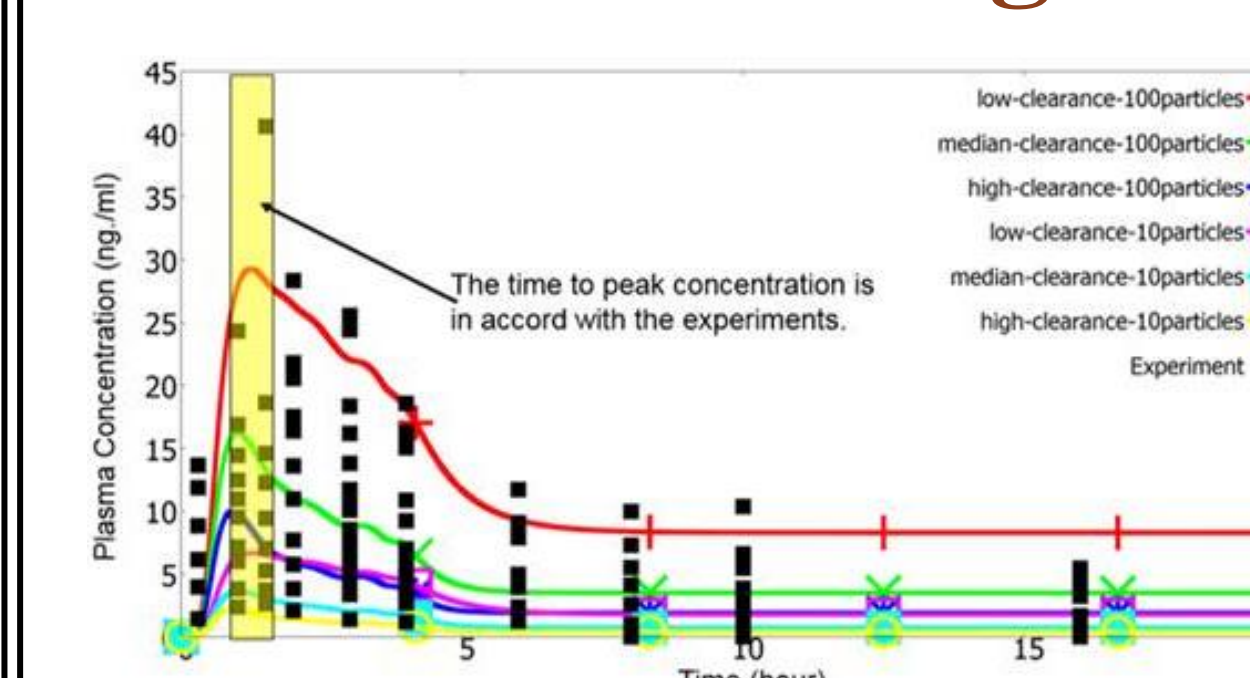


### Lung/Inhalation drug simulations (FP)



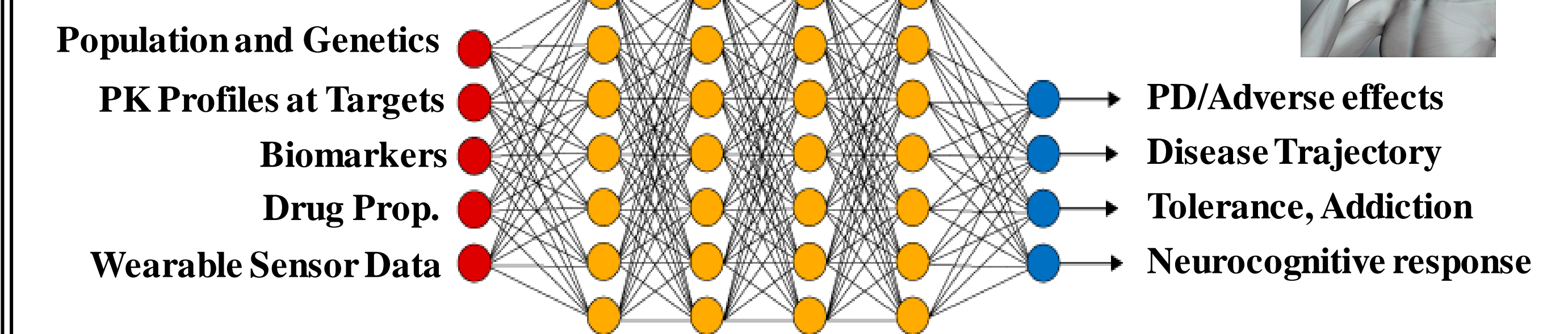
- ODIP Fluticasone (FP)
- Multiscale : 0D-3D-Q3D
- Can match the dip and bounce shown in exp's

### GIT oral drug simulations (Mebendazole)



- Mebendazole in chewable tablet form
- Multiscale 0D-Q3D model
- Inter-subject variation accounted in model

### ML/AI Tools



## Selected References

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## Acknowledgements

- FDA (HHSF223201810182C): Bioequivalence of orally inhaled drugs
- FDA (HHSF223201810151C): MSMP modeling framework for of generic ophthalmic drugs products
- NIH (R43GM133232): MS computational tool to simulate PK of oral drugs in the human GIT
- NIH (1R43GM108380-01) Mechanism-based computational tool to optimize pulmonary drug delivery