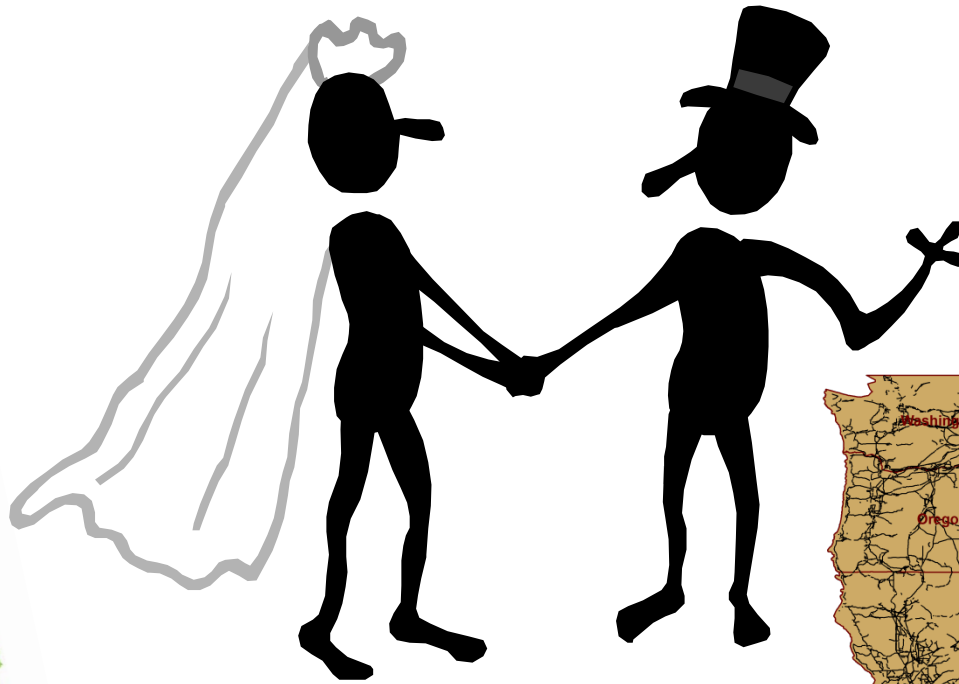


# Planned Improvements to MODSIM: Integrating River Basin Operations Modeling with Power System Economic Dispatch

Feb. 22, 2012

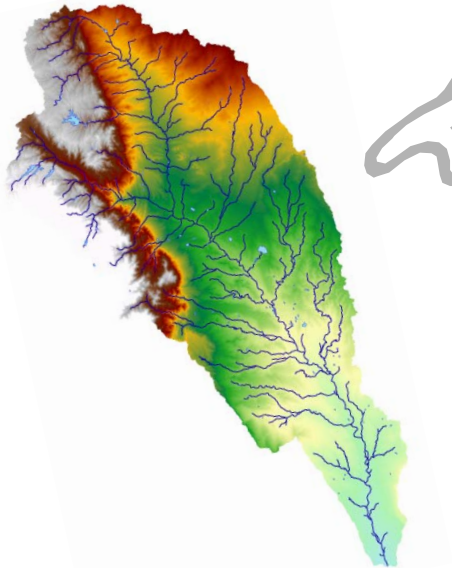
André Dozier\*, John Labadie, and Dan Zimmerle  
Colorado State University  
\*Hydro Research Fellow

# Introduction



**Water**

**Power**



# Introduction

- Presentation Outline
  - Operating challenges
  - Why integrate water and power models?
  - Objective of this work
  - Selected integrated model structure
  - Future work

# Introduction

- Water System Operational Challenges
  - Uncertain inflows
  - Conflicting Purposes
  - Time delay
  - Complex legal agreements
  - Interconnected reservoirs

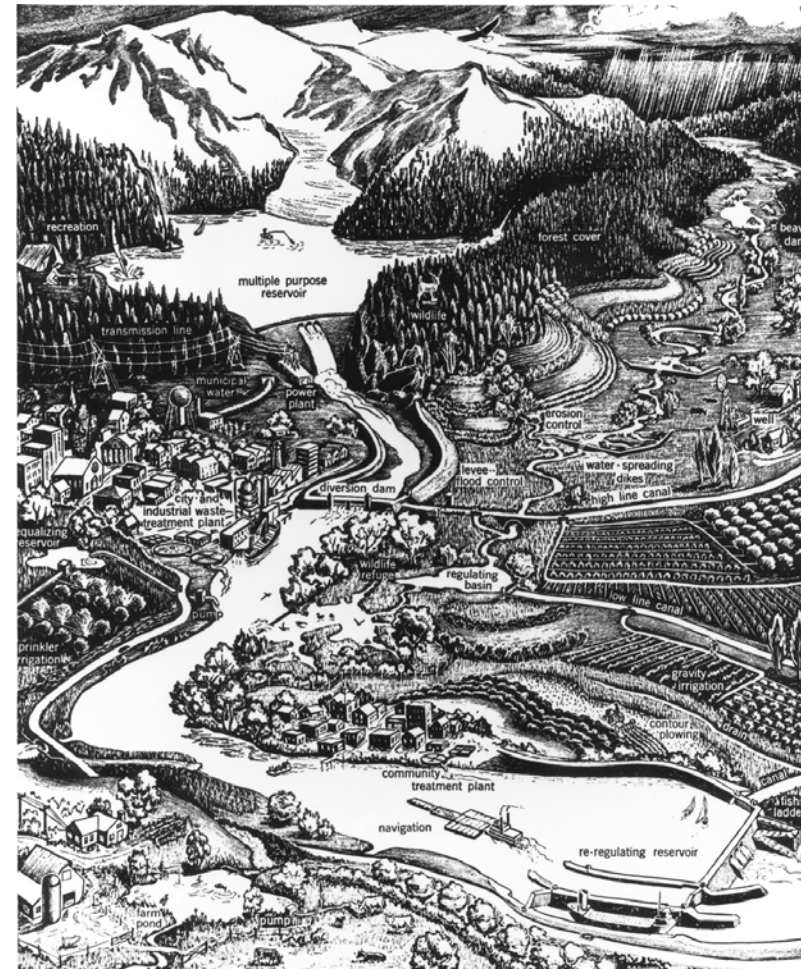
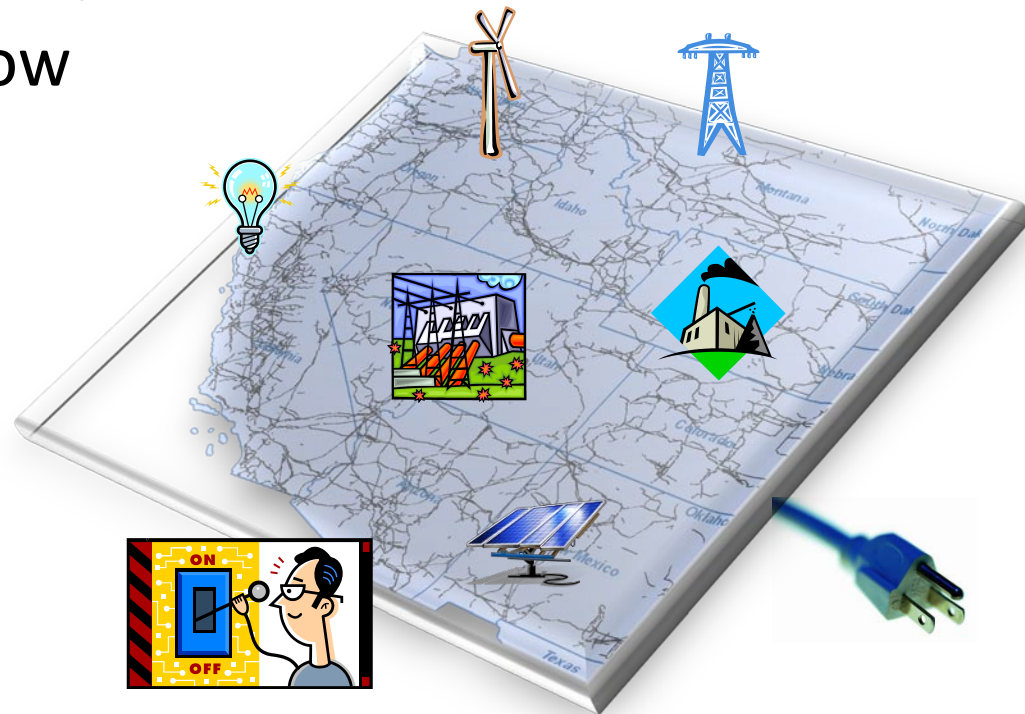


Figure source: President's Water Resources Policy Commission, 1950

# Introduction

- Power System Operational Challenges
  - Production = Consumption + Losses at all times
  - Contingencies → reserves and ramping rates
  - Uncertain renewables production
  - Multi-area power flow
  - Interconnections
  - Congestion



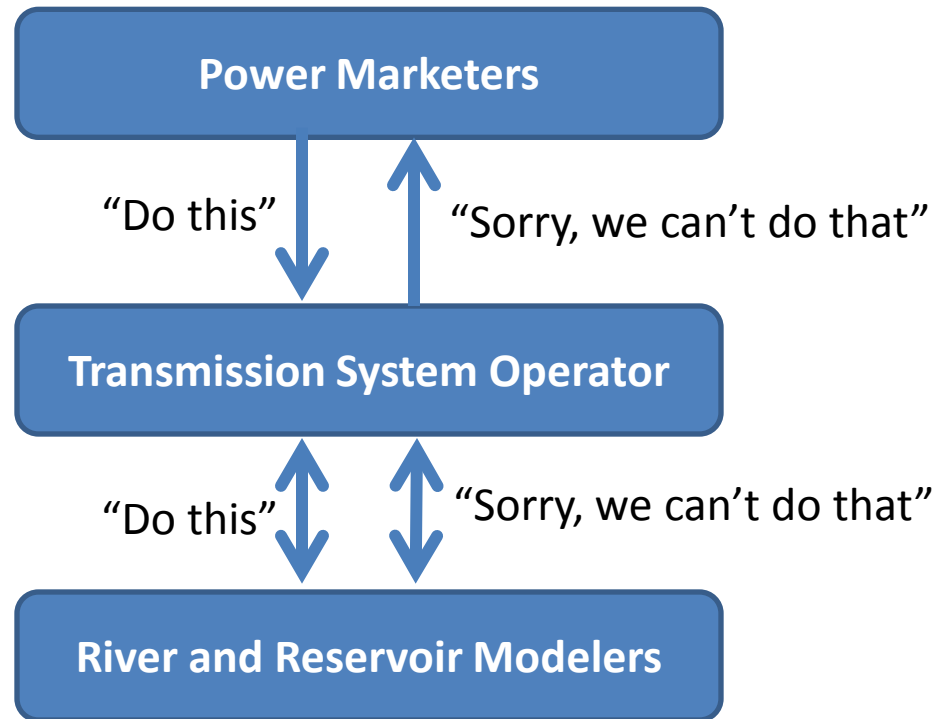
# Introduction

- Why Operations Modeling and Optimization?
  - Infrastructure = Money + Time
    - Critical operations for critical infrastructure
    - Improved efficiency = more revenue
    - Accidents are too costly
  - Computers are needed
    - Large systems
    - Repeated tasks



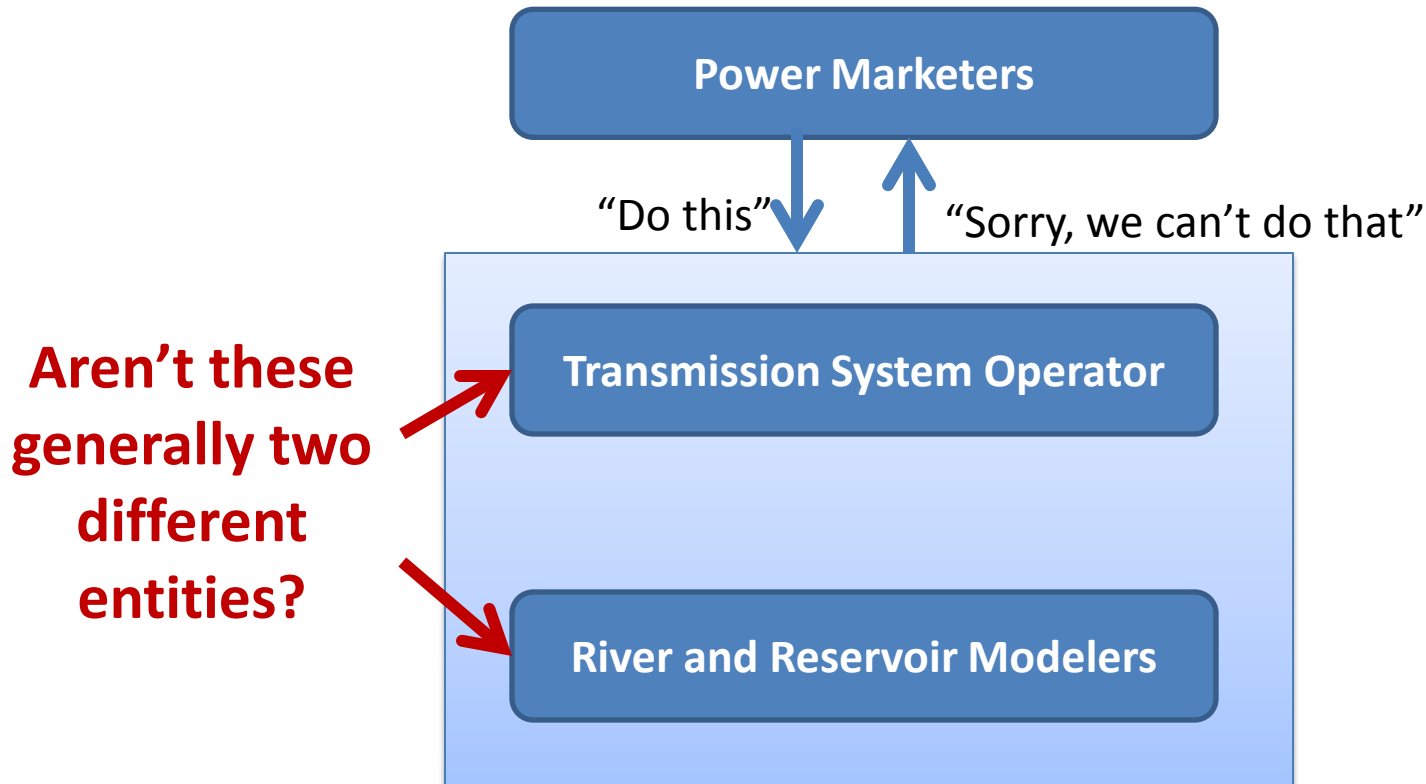
# Introduction

- Why Integrate Water and Power System Operations Modeling?
  - Segregated modeling framework



# Introduction

- Why Integrate Water and Power System Operations Modeling?
  - Integrated modeling framework





# Introduction

- Why Integrate Water and Power System Operations Modeling?
  - Unrealistic modeling in current renewable integration studies [1]-[4]
    - Transmission constraints (and other security issues)
    - Non-power water system constraints and objectives
    - Interrelated nature of multi-reservoir operations
  - Energy storage is essential
    - Hydropower provides large and long-term energy storage
    - Reduce uncertainty in renewable energy production



# Introduction

- Why Integrate Water and Power System Operations Modeling?
  - Climate change impacts on operations
  - Emergency response plans
  - National economic security
  - Interdisciplinary analysis of economic and environmental tradeoffs



# Introduction

- Hasn't integrated water and power systems modeling already been done?
  - Previous models generally do not include ramping rate constraints and increased reserve capacity requirements
  - To our knowledge, no **freely available**, generalized model currently exists



# Introduction

- How did Colorado State University (CSU) get involved in this project?
  - Fellowship from the Hydro Research Foundation
  - CSU has a customizable water operations model (called MODSIM)
  - CSU is a major research center for power system controls



# Introduction

- Objective
  - Realize the full potential for both conventional and pumped storage hydropower to aid renewable energy integration with sufficient accuracy
    - Build model
      - Handles water AND power constraints adequately
      - Incorporates uncertainty
      - Multiple objectives
    - Apply the model to a test system
    - Examine operational improvements

# Model Structure

- What type of model do we need to build?
  - Spatial and temporal scales

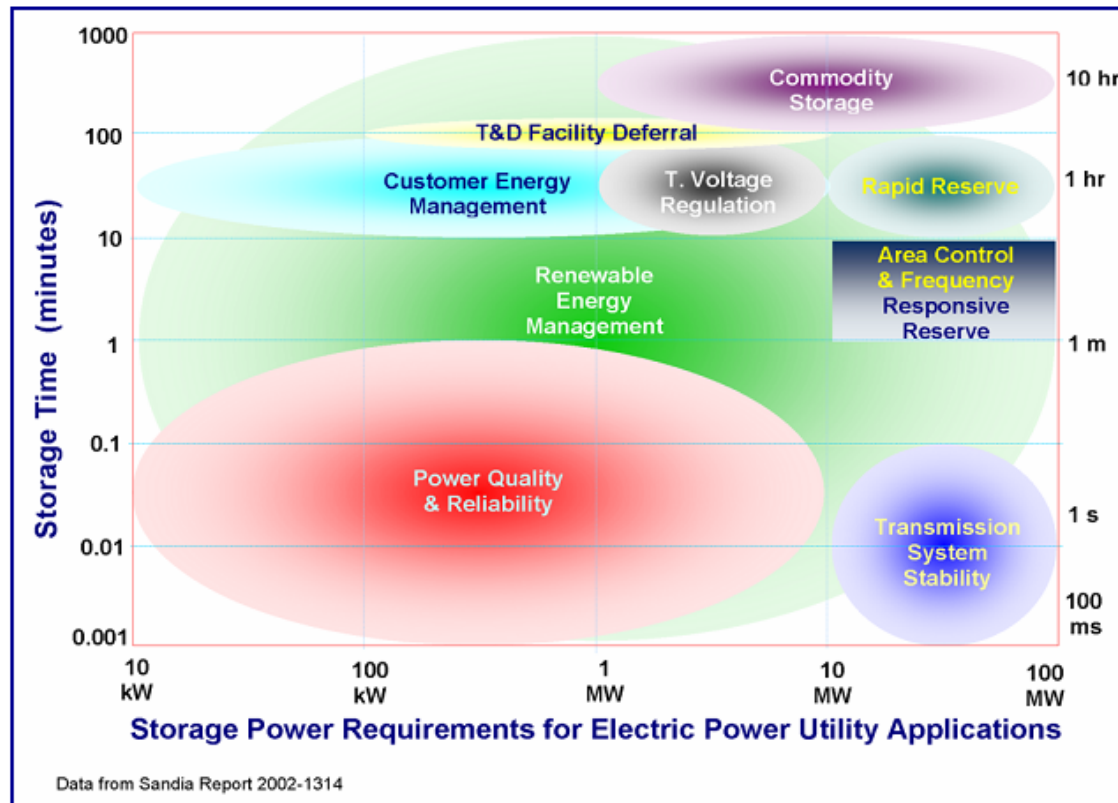


Figure taken directly from [10]

# Model Structure

- What type of model do we need to build?
  - Spatial and temporal scales

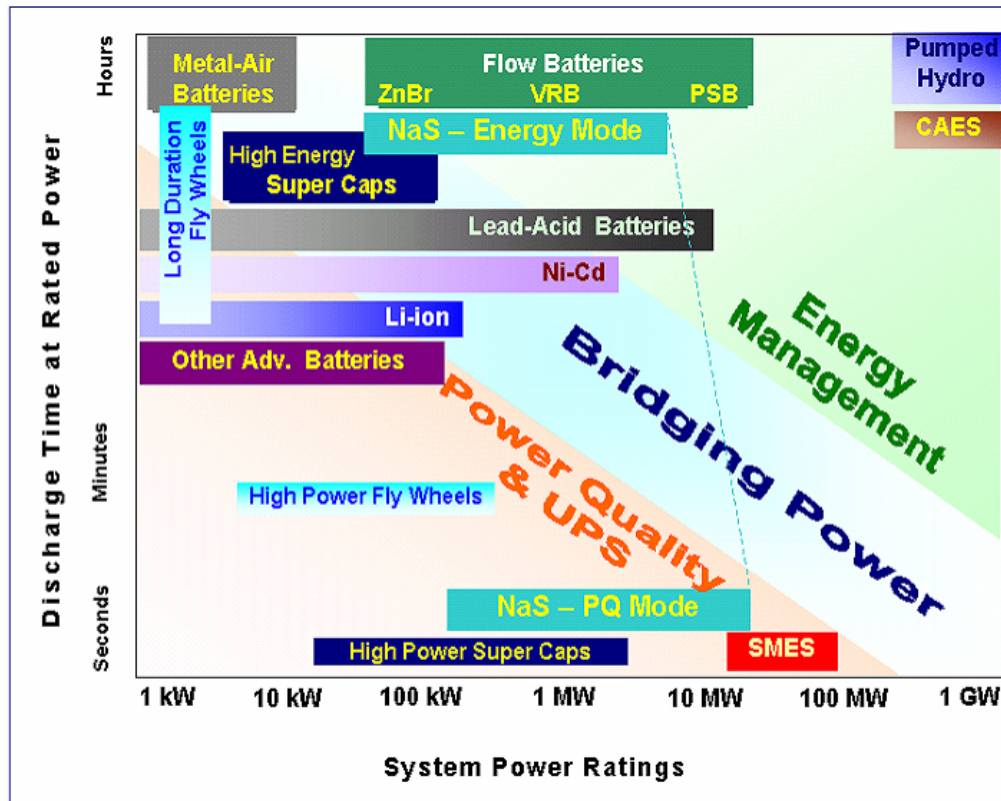


Figure taken directly from [10]

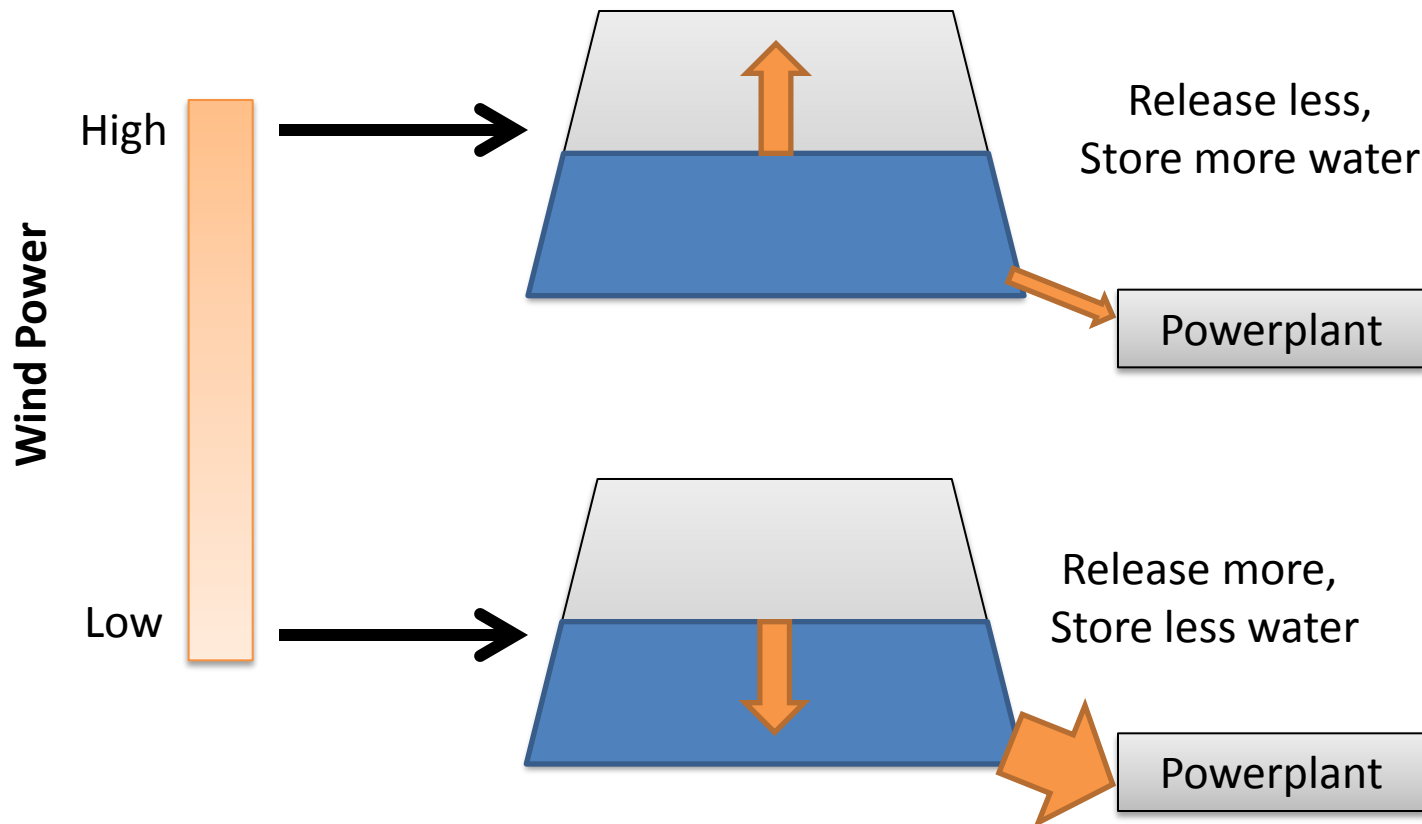
# Model Structure

- What type of model do we need to build?
  - Stochastic, dynamic optimization method
  - Incorporates energy storage
    - Introduces dispatchability



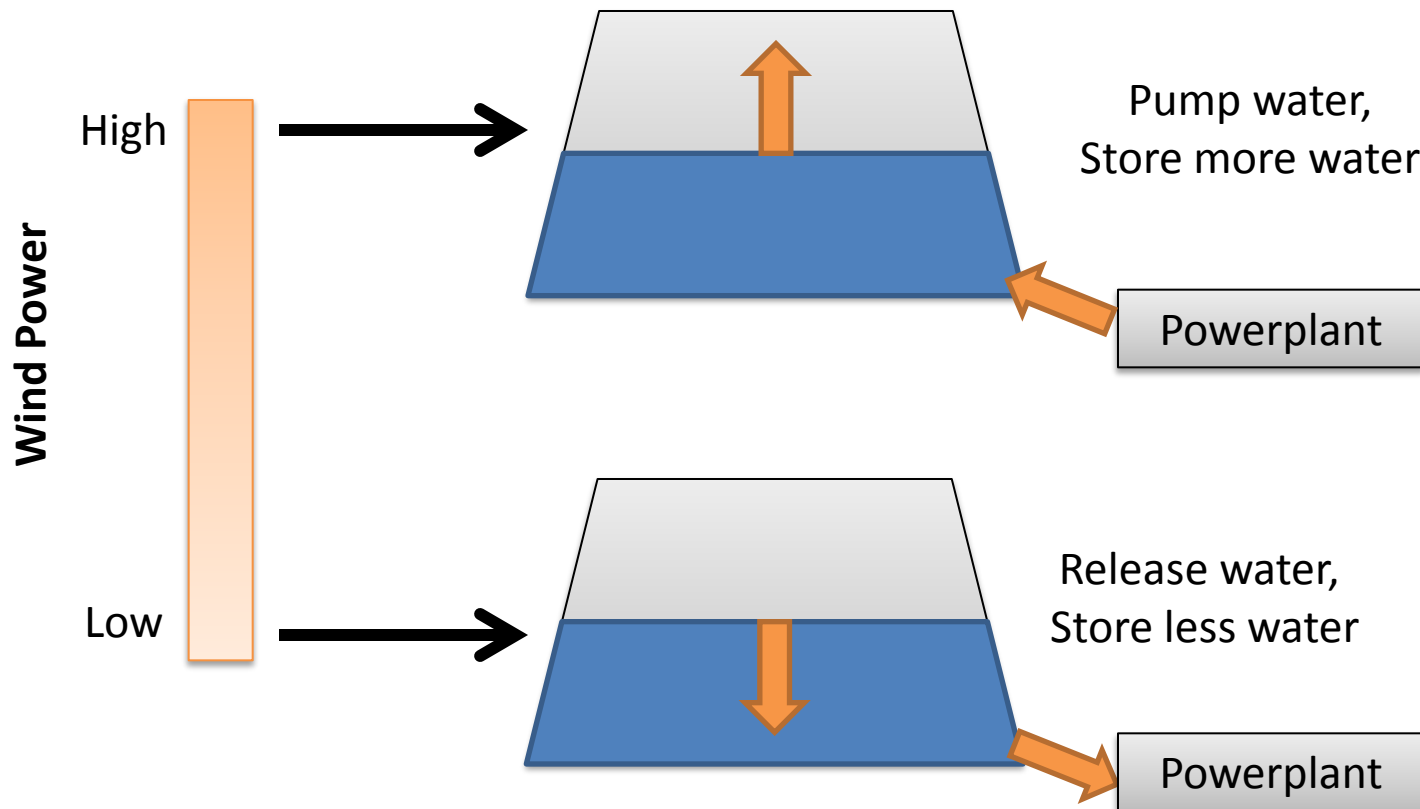
# Model Structure

- What type of model do we need to build?
  - Conventional hydropower

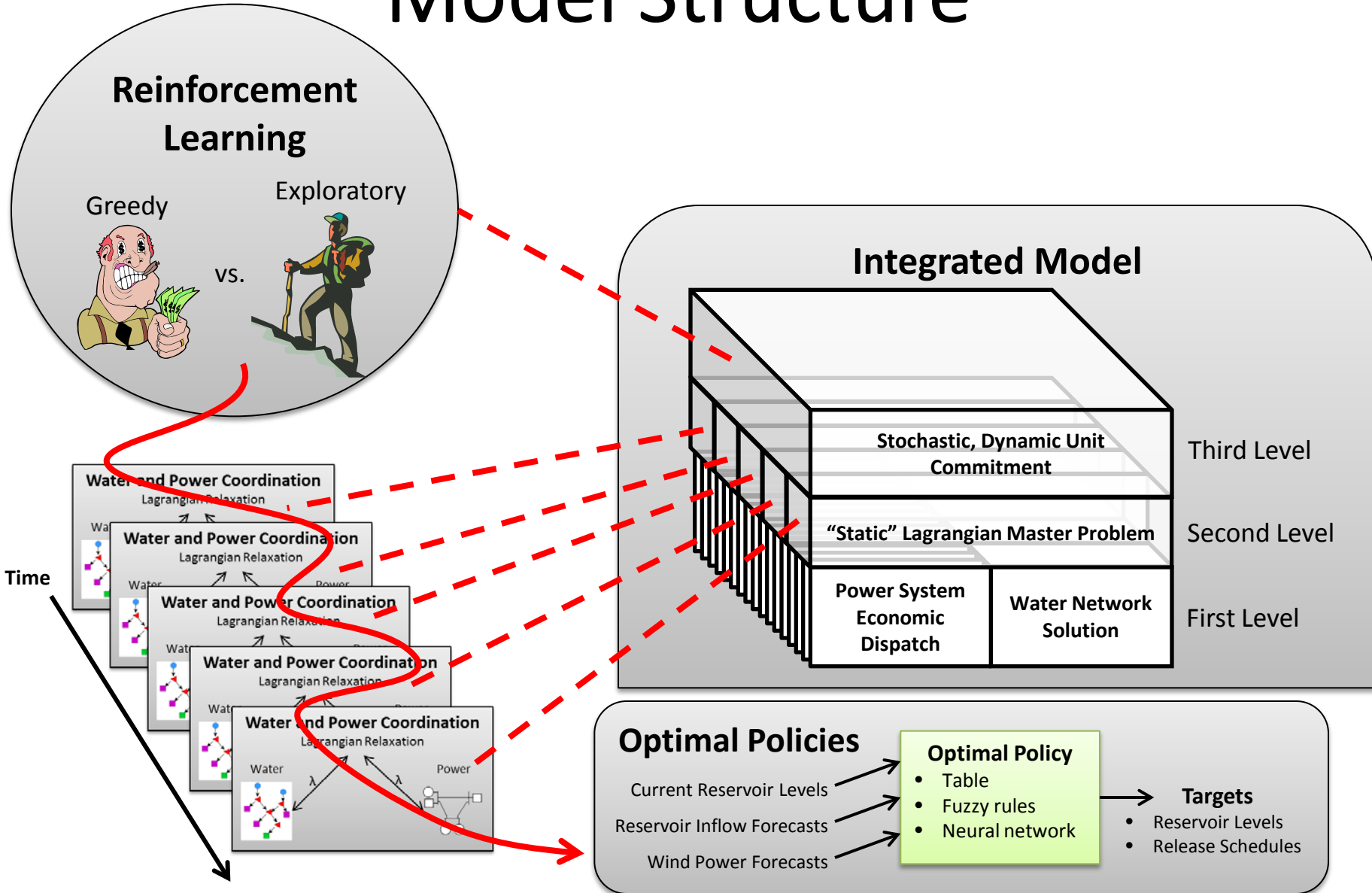


# Model Structure

- What type of model do we need to build?
  - Pumped storage hydropower (e.g., peak shaving)



# Model Structure



# Model Structure

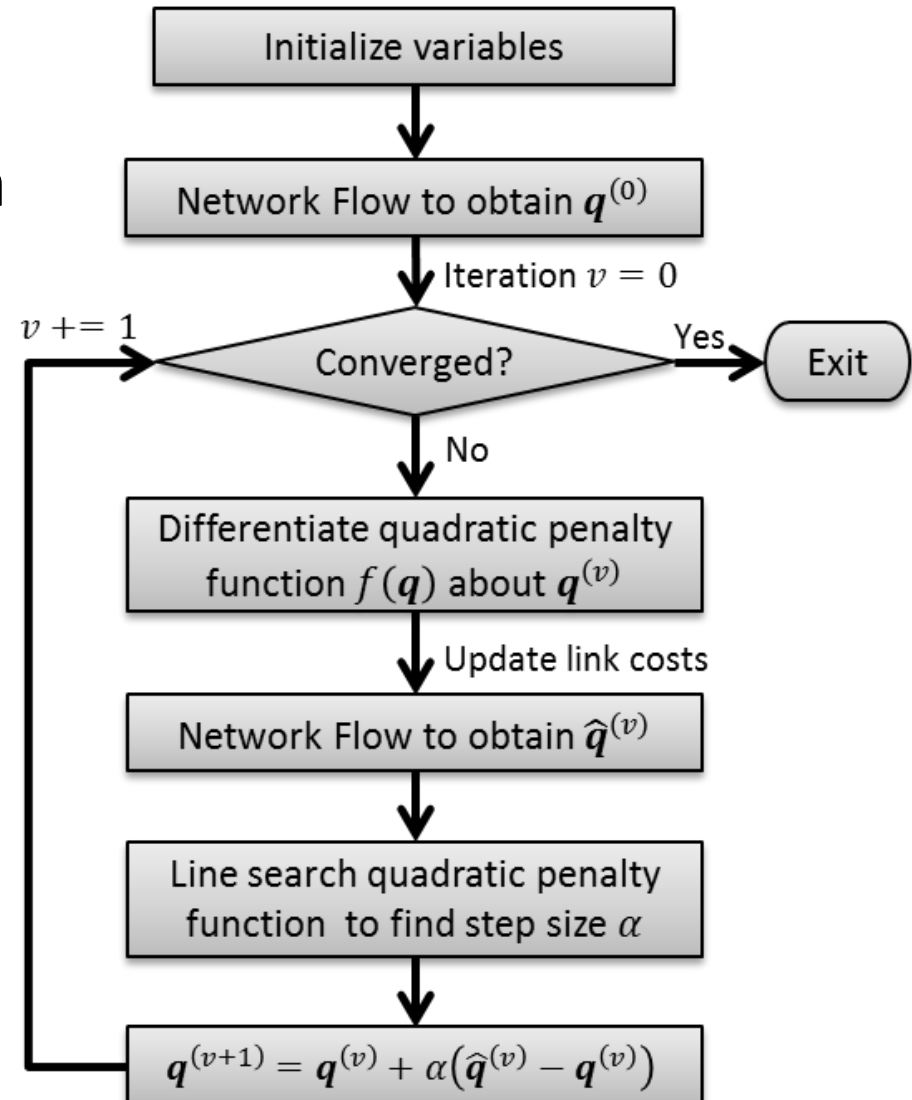
- First Level
  - Water network solution
    - MODSIM
      - Iterative network flow algorithm & Frank-Wolfe algorithm
  - Constrained Economic Dispatch
    - Open-ended design that allows for both:
      - Programmatic (or tightly coupled) interface
      - Loosely coupled interface (I/O to disk)
    - Light-weight addition to MODSIM
      - “Direct search” method seems promising [5]-[8] for active power dispatch problem

# Model Structure

- First Level
  - Water network solution
    - Network flow algorithm
      - Solve mass balance
      - Distribute water according to priority
    - Successive approximations
      - Solve for evaporation, reservoir levels, lags, any nonlinear customized changes
    - Frank-Wolfe method
      - Solve quadratic formulations (power demand)

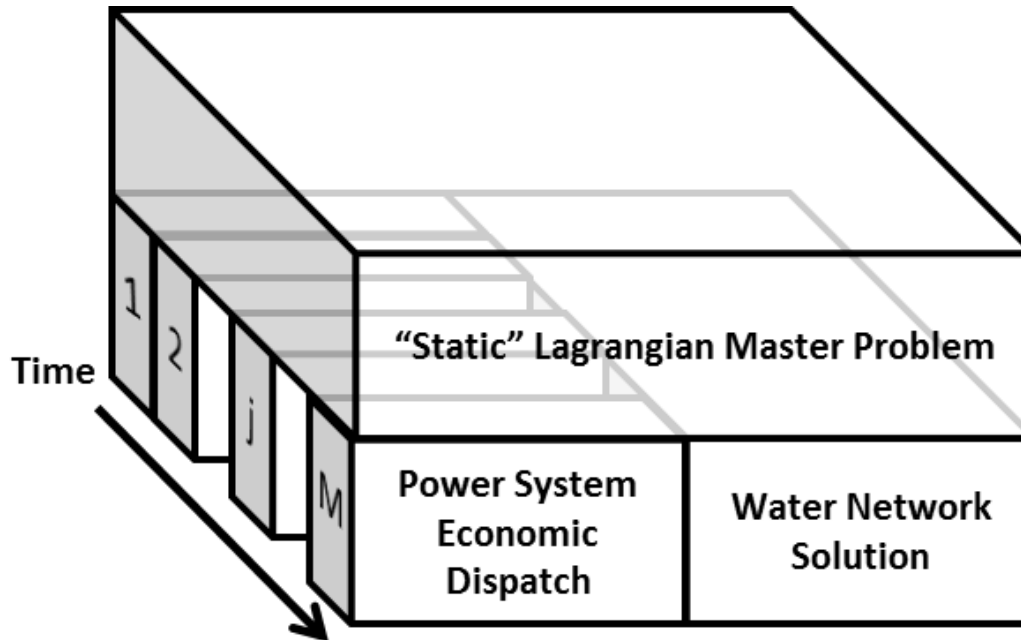
# Model Structure

- First Level
  - Water network solution
    - Frank-Wolfe method



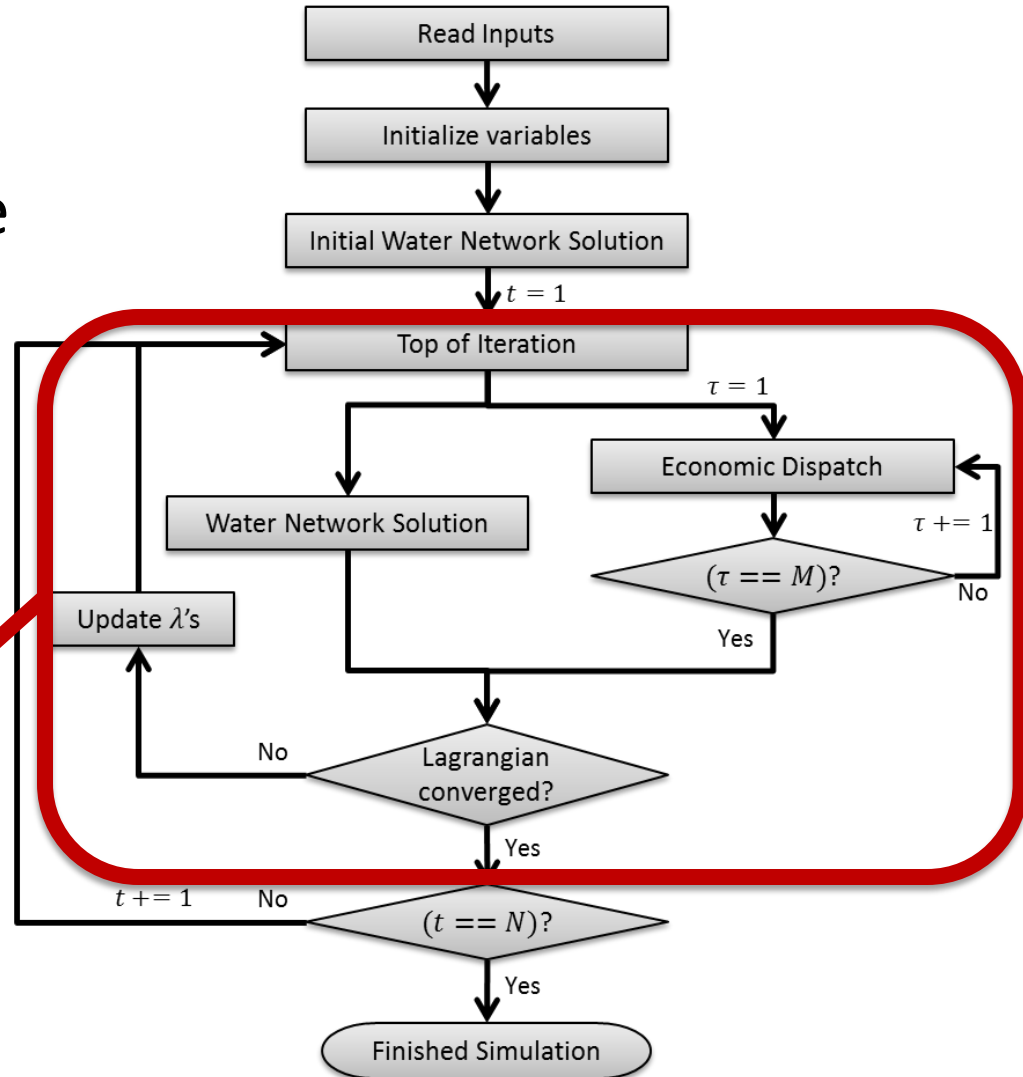
# Model Structure

- Second Level
  - Lagrangian Relaxation Master Problem
    - Optimality Condition Decomposition [9]



# Model Structure

- Second Level
  - Simulation Structure

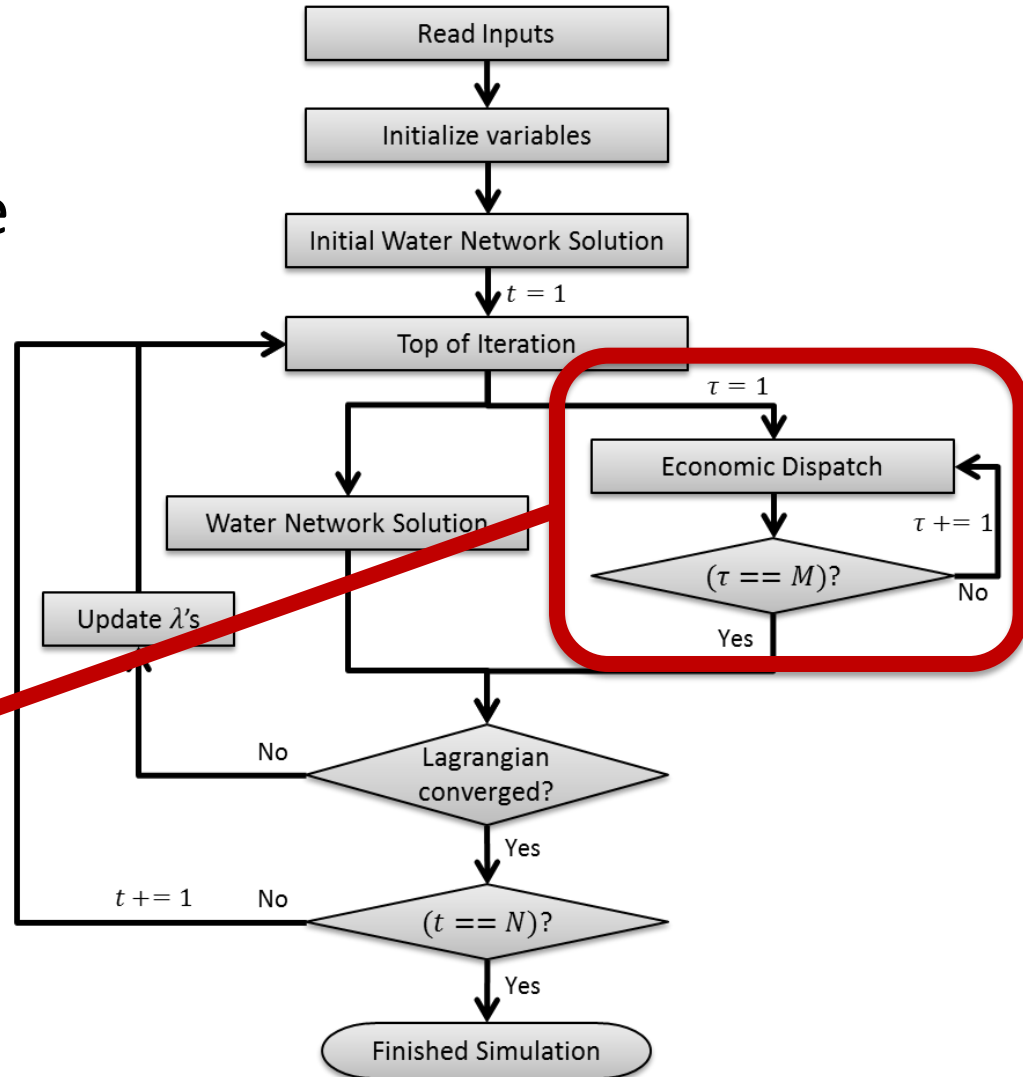


**Static Second-Level Optimization**



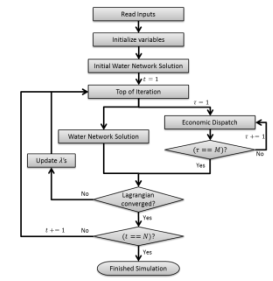
# Model Structure

- Second Level
  - Simulation Structure

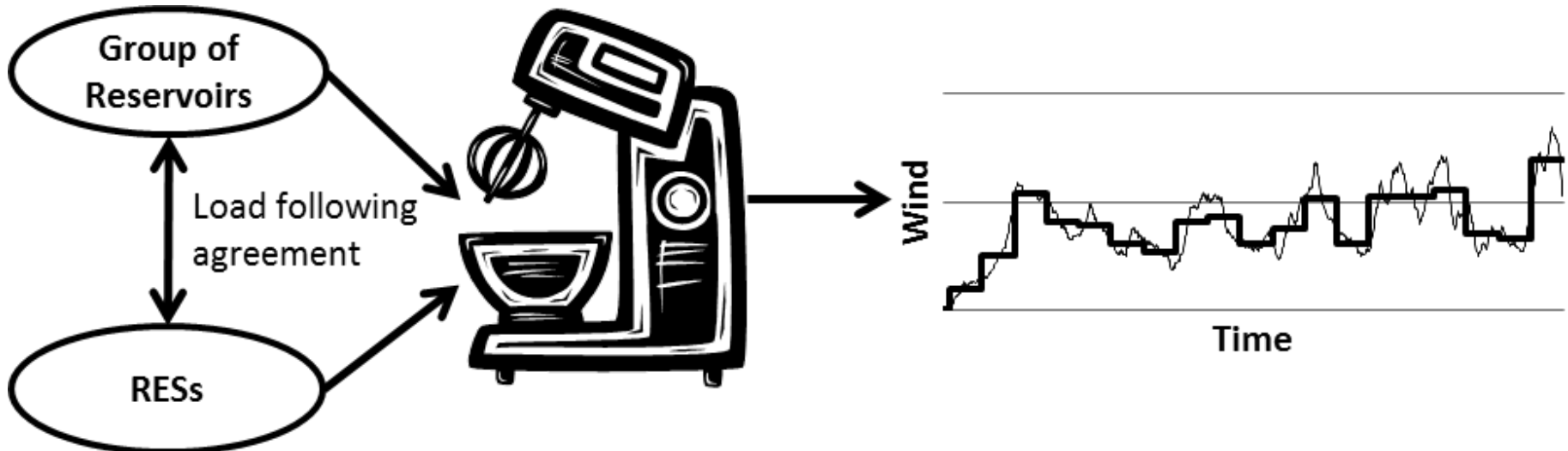


**Smaller timestep**

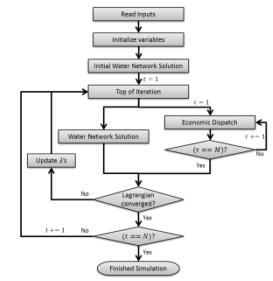
# Model Structure



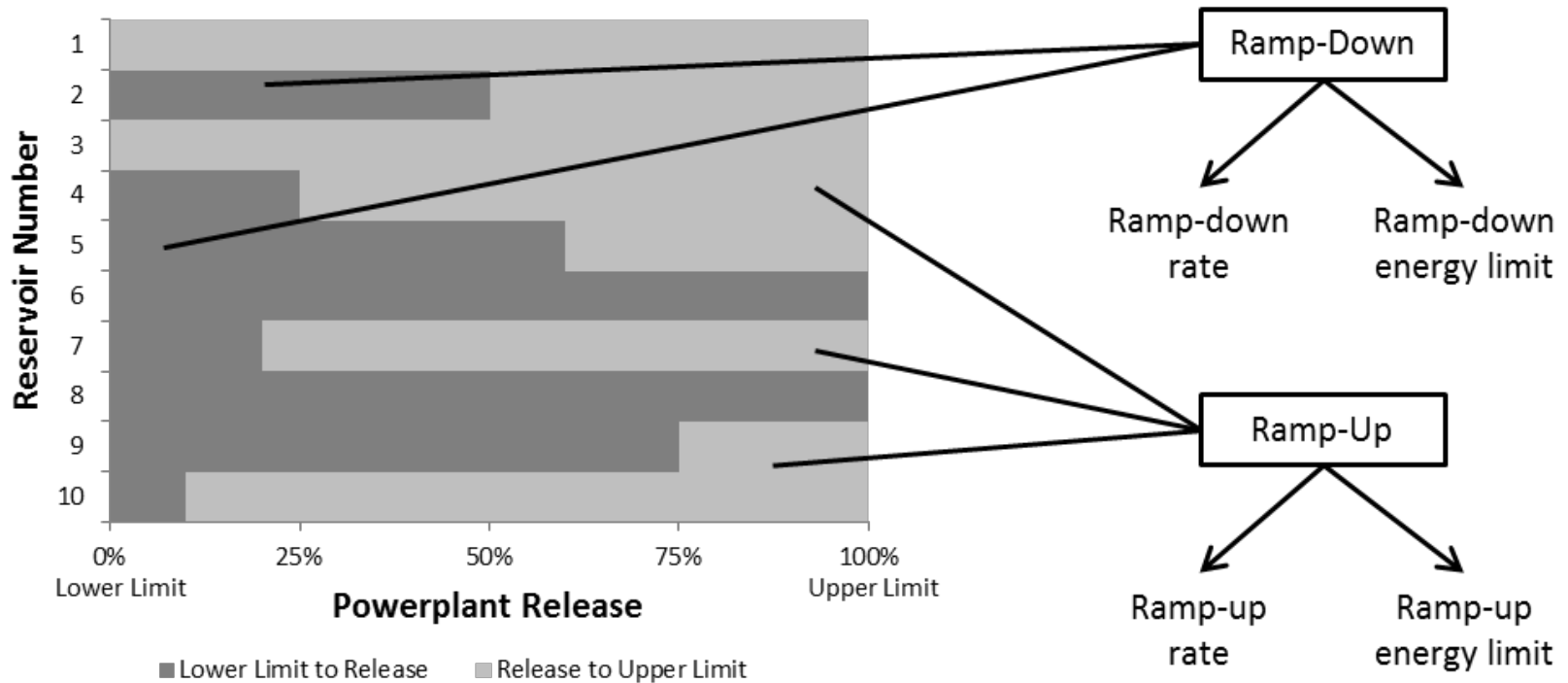
- Second Level
  - Simulation Structure
    - Allows system approach



# Model Structure

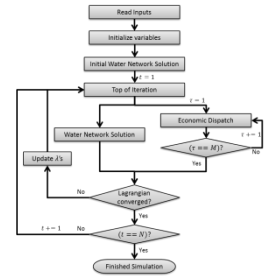
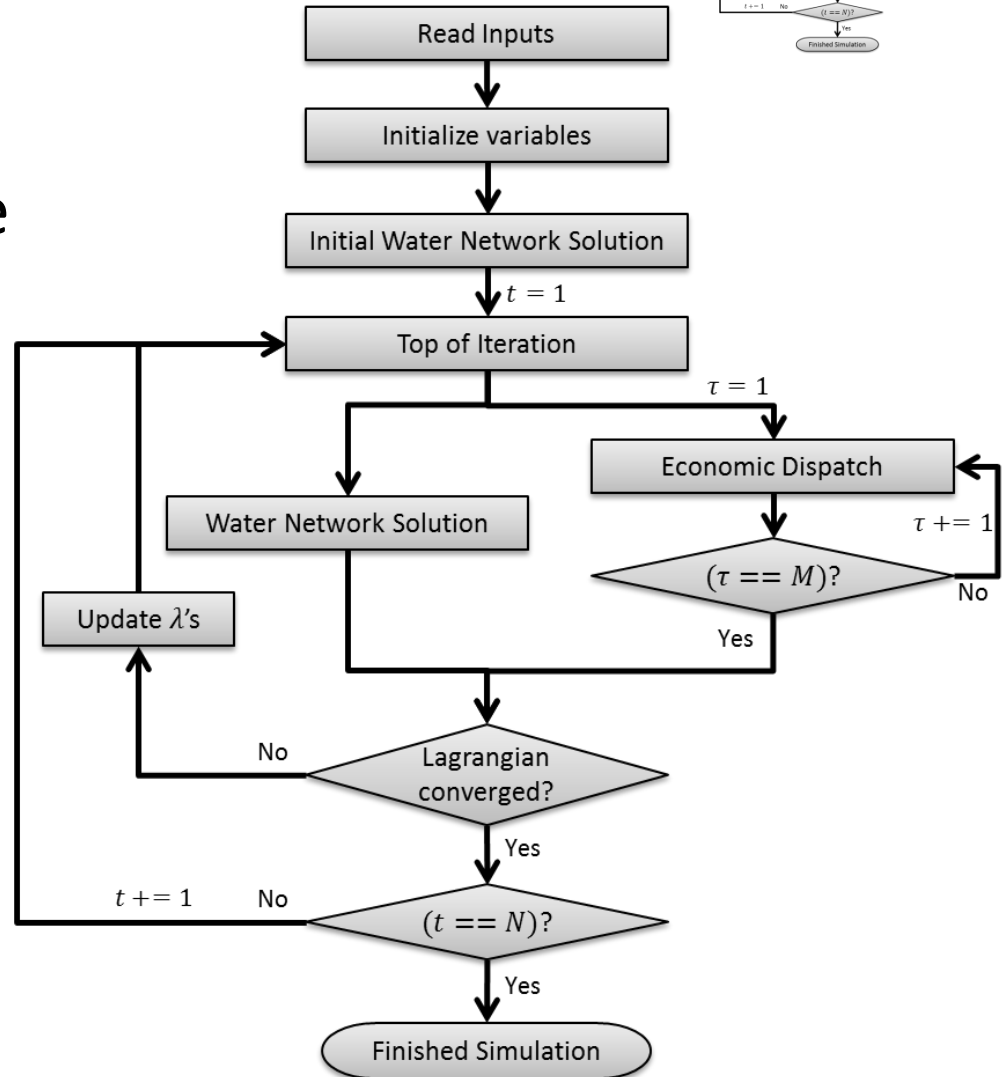


- Second Level
  - Simulation Structure
    - Dynamically updated ramping rate & reserve constraints



# Model Structure

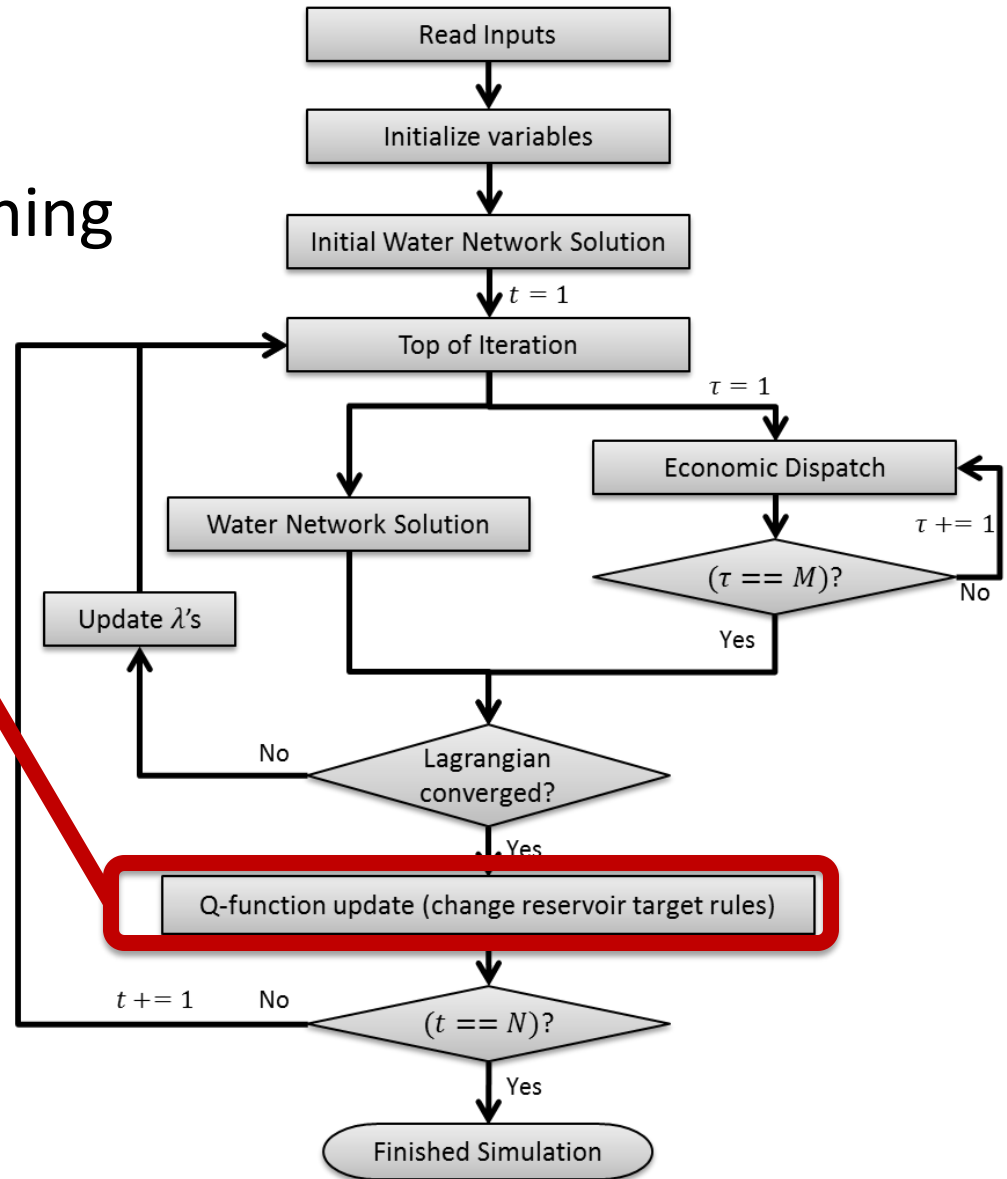
- Second Level
  - Simulation Structure



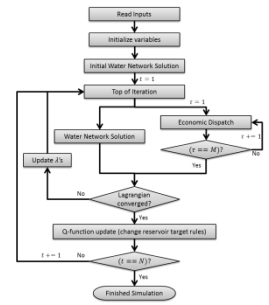
# Model Structure

- Third Level
  - Reinforcement Learning

**Dynamic Optimization**

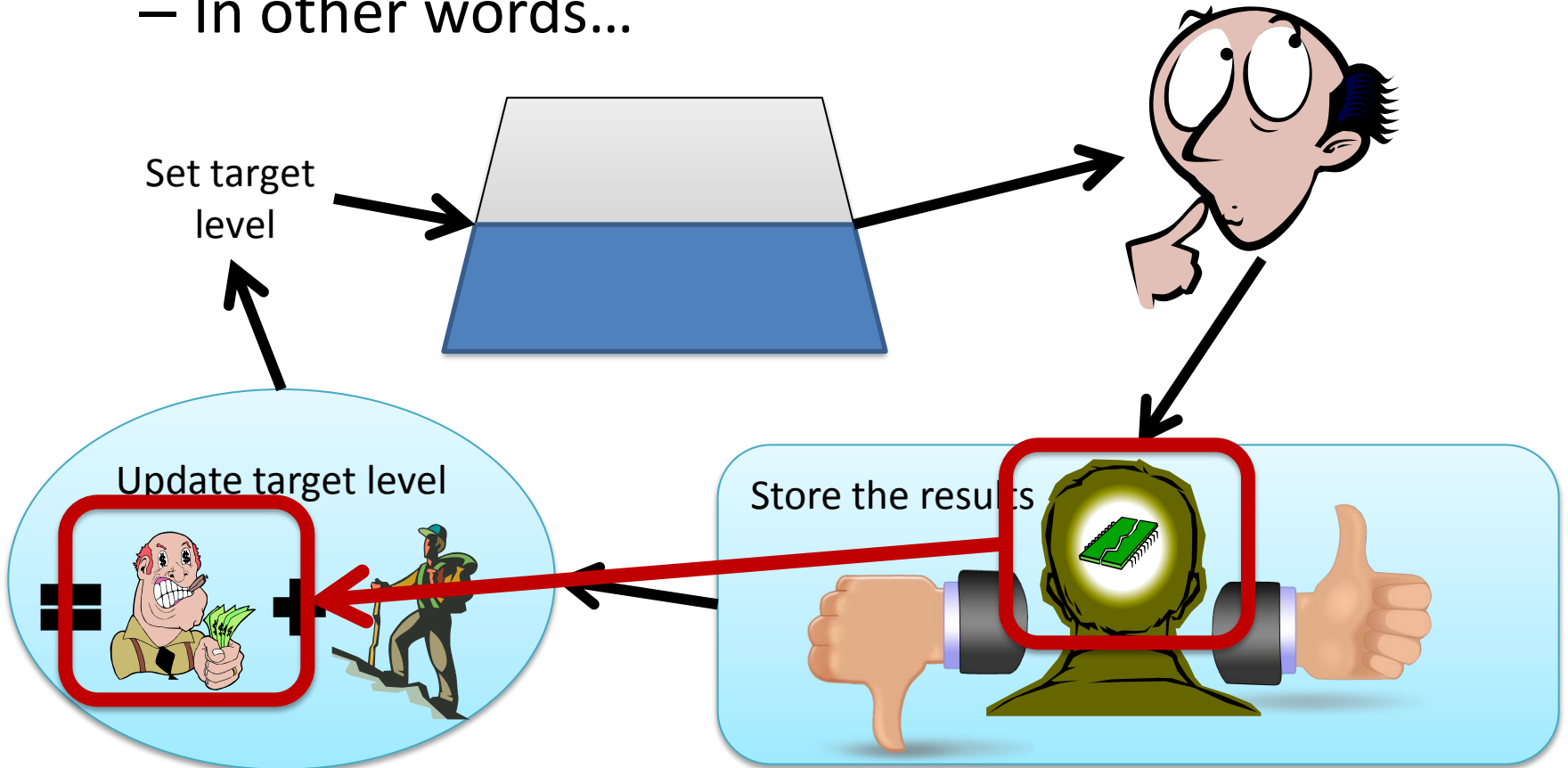


# Model Structure



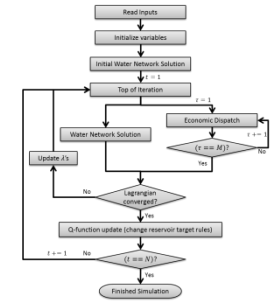
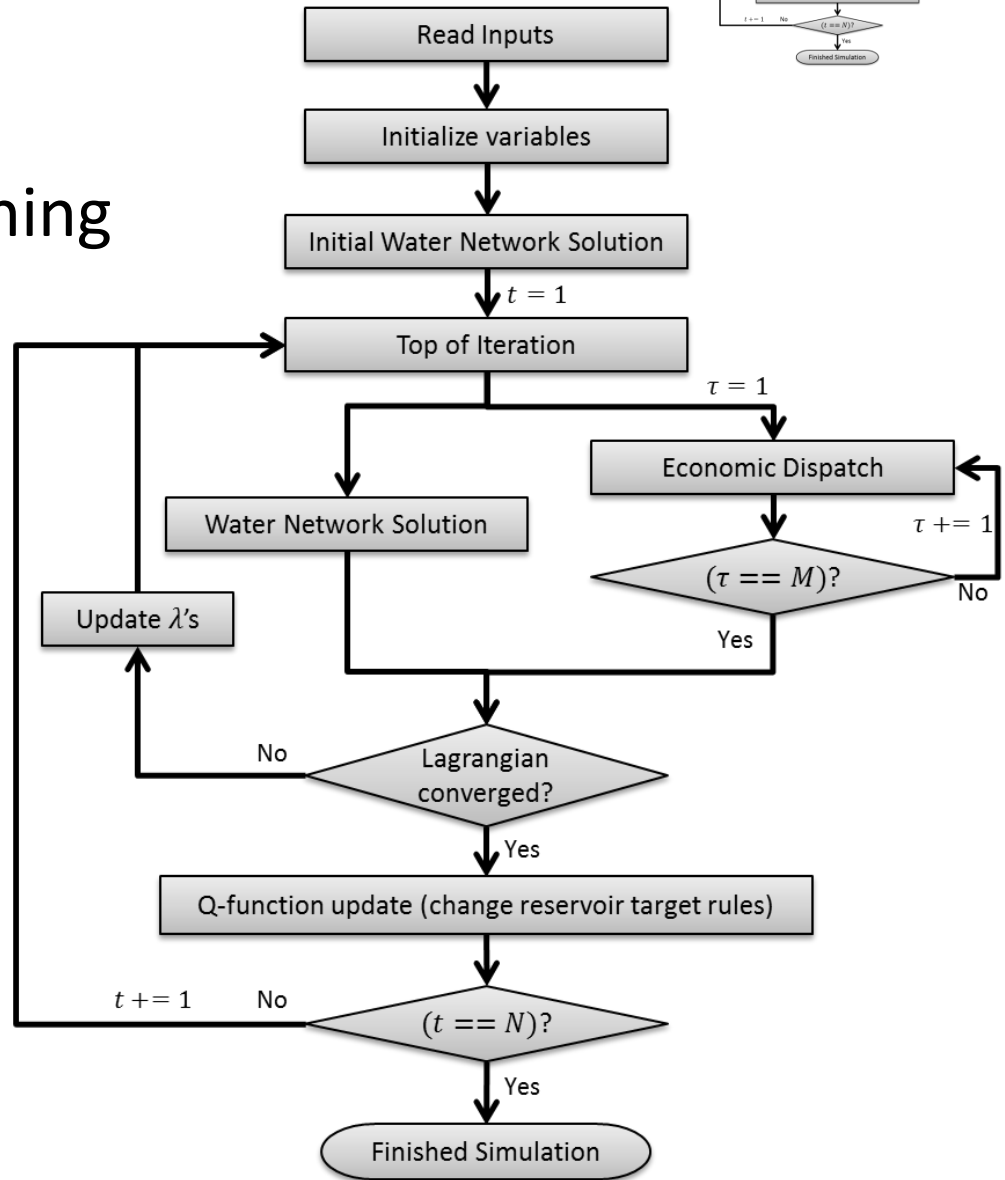
- Third Level
  - Reinforcement Learning
  - In other words...

See how well the system performs



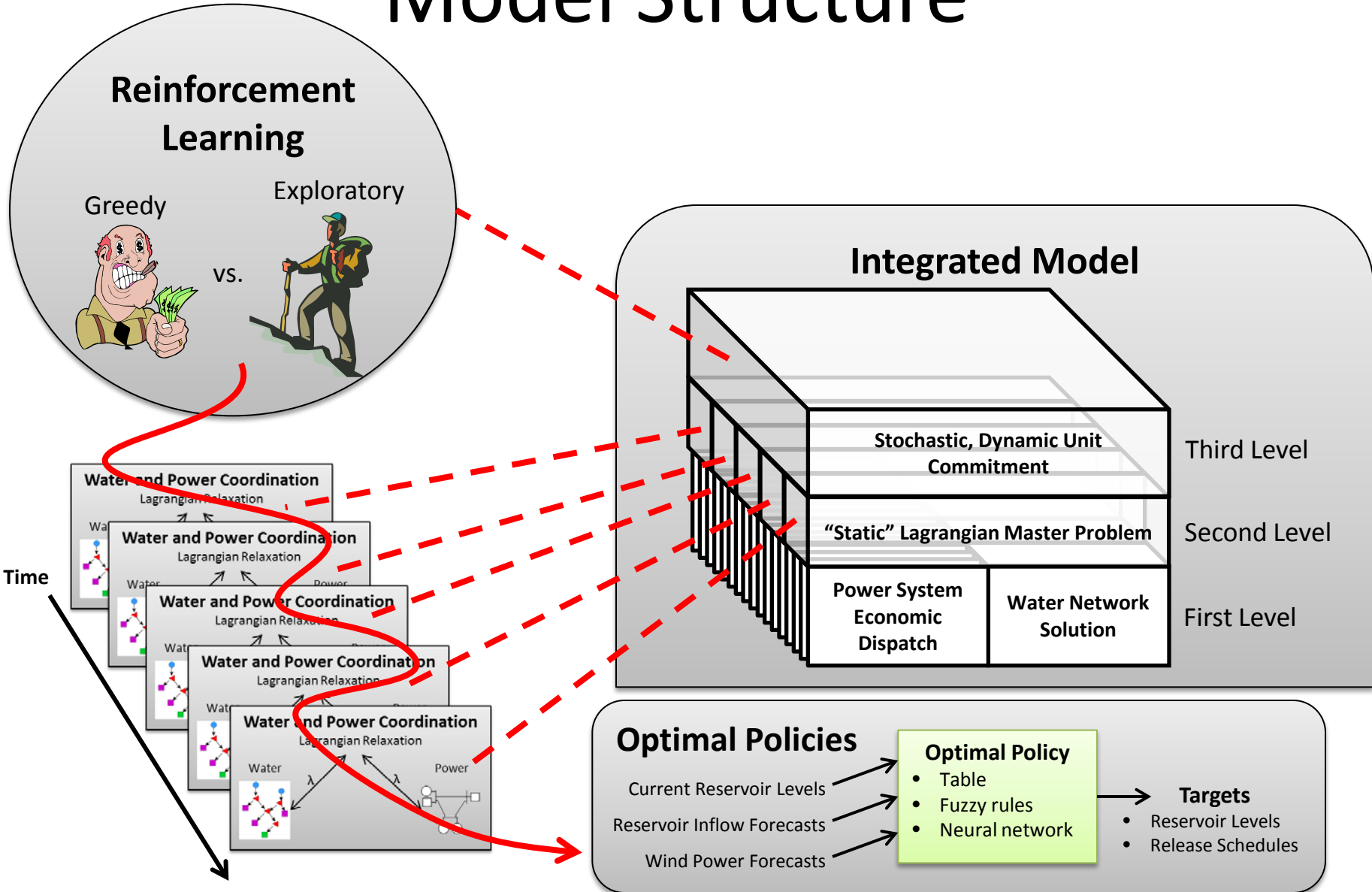
# Model Structure

- Third Level
  - Reinforcement Learning



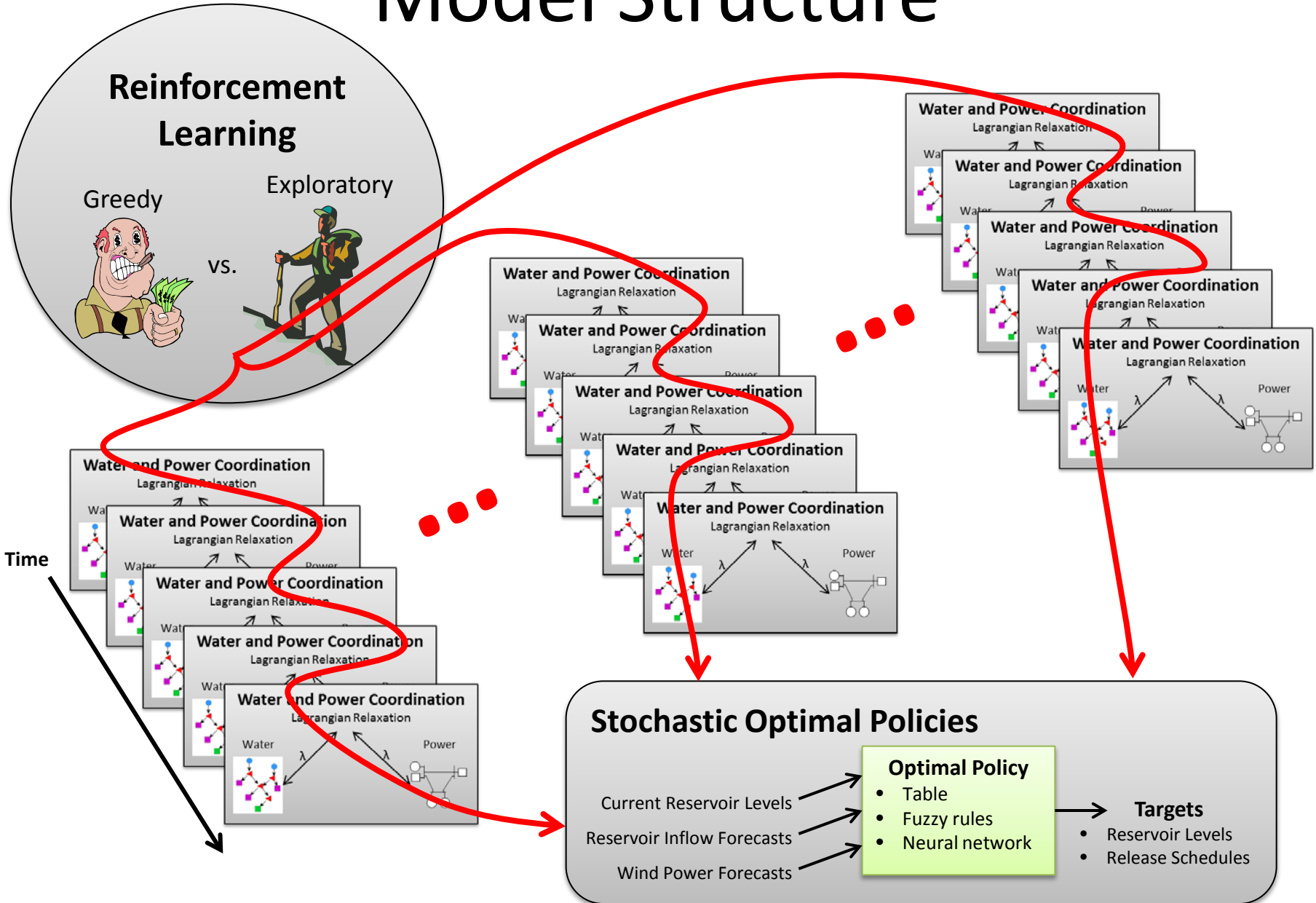
**What about uncertainty?**

# Model Structure





# Model Structure



# Model Structure

- Benefits to this approach
  - Incorporate uncertainty easily
    - No need to estimate explicit transition probabilities!
    - Optimal policies are inferred
    - Ensemble prediction  
(streamflow & renewables)
  - Parallel processing
  - Multiobjective analysis
  - System approach to firming renewables
  - Algorithms are similar to operators' way of thinking



# Test Systems

- Does anybody want to partner with CSU to provide actual test systems?
  - Wind-hydro-thermal mix
    - Wind power forecasts and actual production
    - Pumped and conventional hydropower
  - Transmission system constraints
    - Transmission data (under NDA perhaps)
  - Water system constraints
    - Legal/environmental agreements
    - Operating criteria

# Future Work

- Parallelization & high-performance computing
- Interdisciplinary analysis of:
  - Climate change
  - Emergency response plans
  - Economic and environmental tradeoffs
- Integration with other critical infrastructure models
  - Natural gas and oil
  - Water and power distribution
  - Crop production and irrigation
  - Weather forecasting and climate change models

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- [2] GE Energy, "Western wind and solar integration study," *Integration Studies & Operational Impacts*, 2010. [Online]. Available: [http://www.nrel.gov/wind/systemsintegration/pdfs/2010/wwsis\\_final\\_report.pdf](http://www.nrel.gov/wind/systemsintegration/pdfs/2010/wwsis_final_report.pdf). [Accessed: 06-Oct-2011].
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