

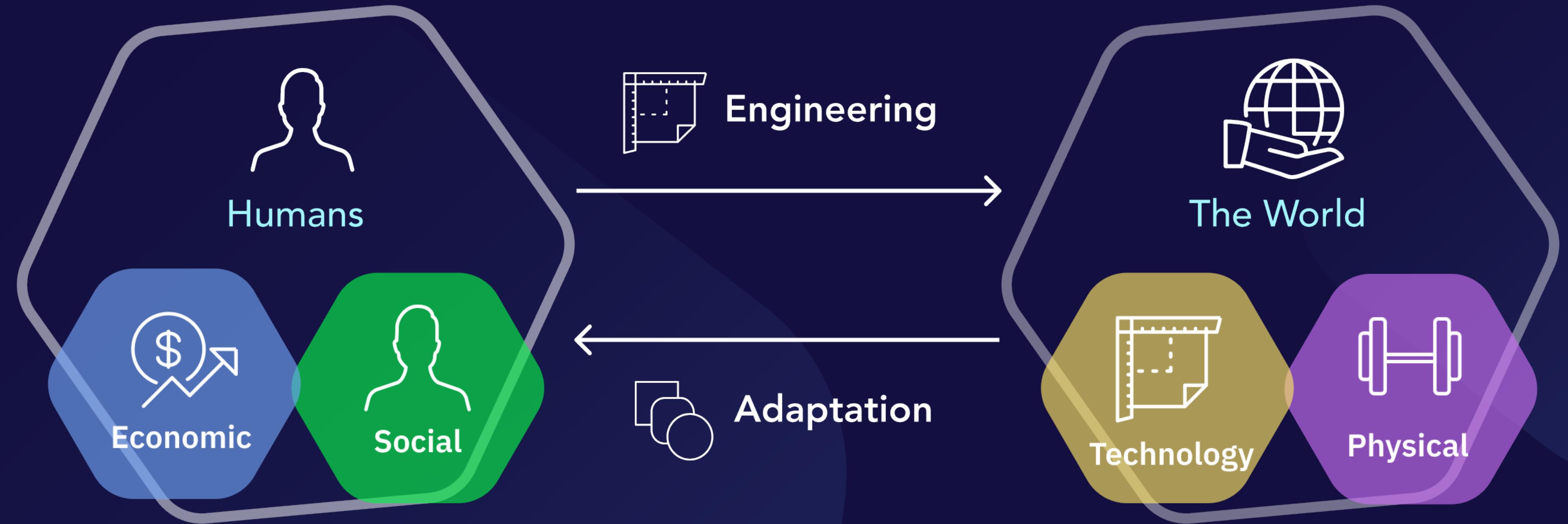
BLOCKSCIENCE

Scientific Approach to Token Systems Simulation

*Dynamic Stochastic **Non-Equilibrium** Models*

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@mZargham

April 11, 2019
Complex Systems Engineering Master Class
Groningen, Netherlands

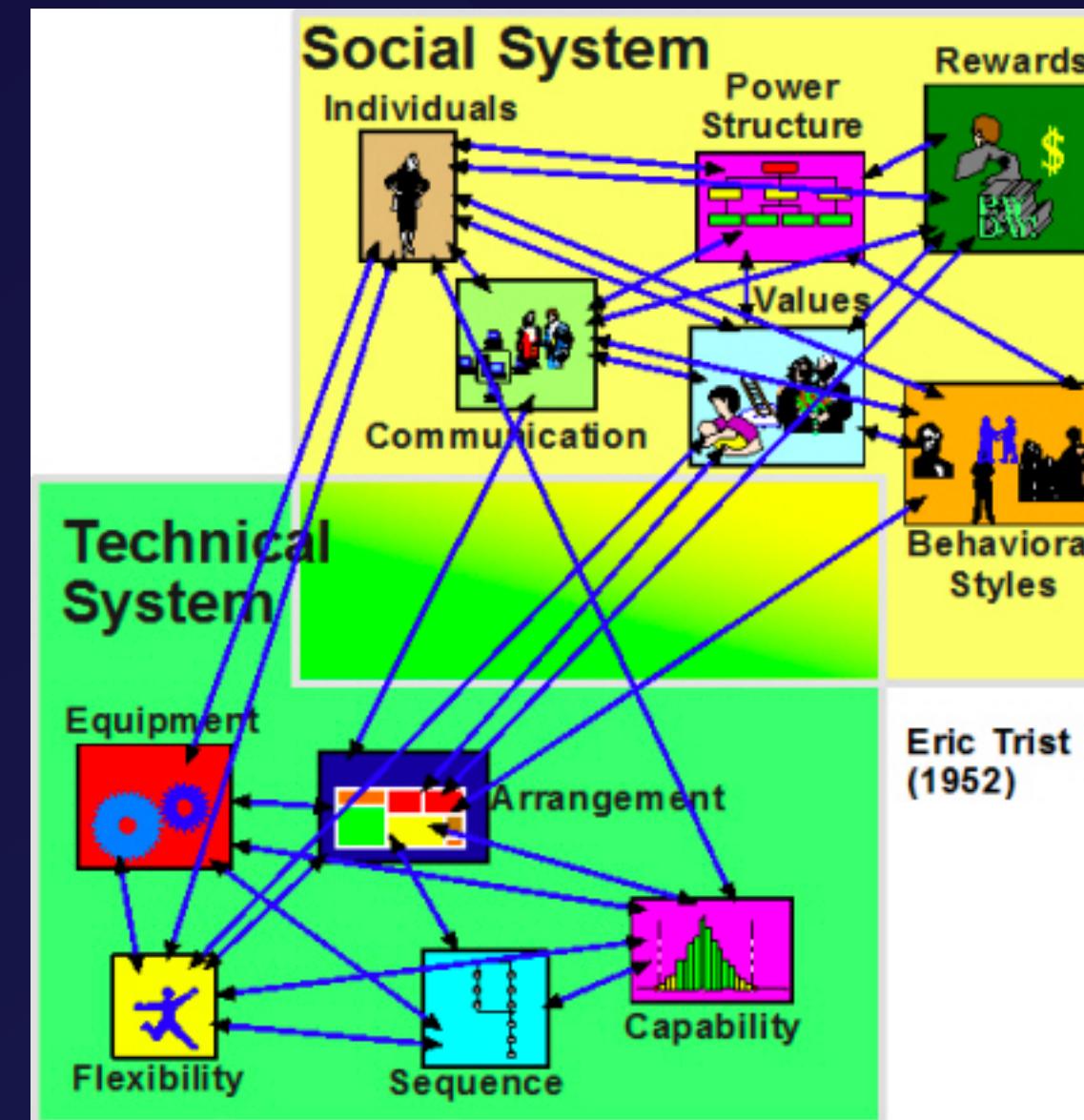


Complex Systems: Temporal Dynamics & Closure under Behavioral Adaptation

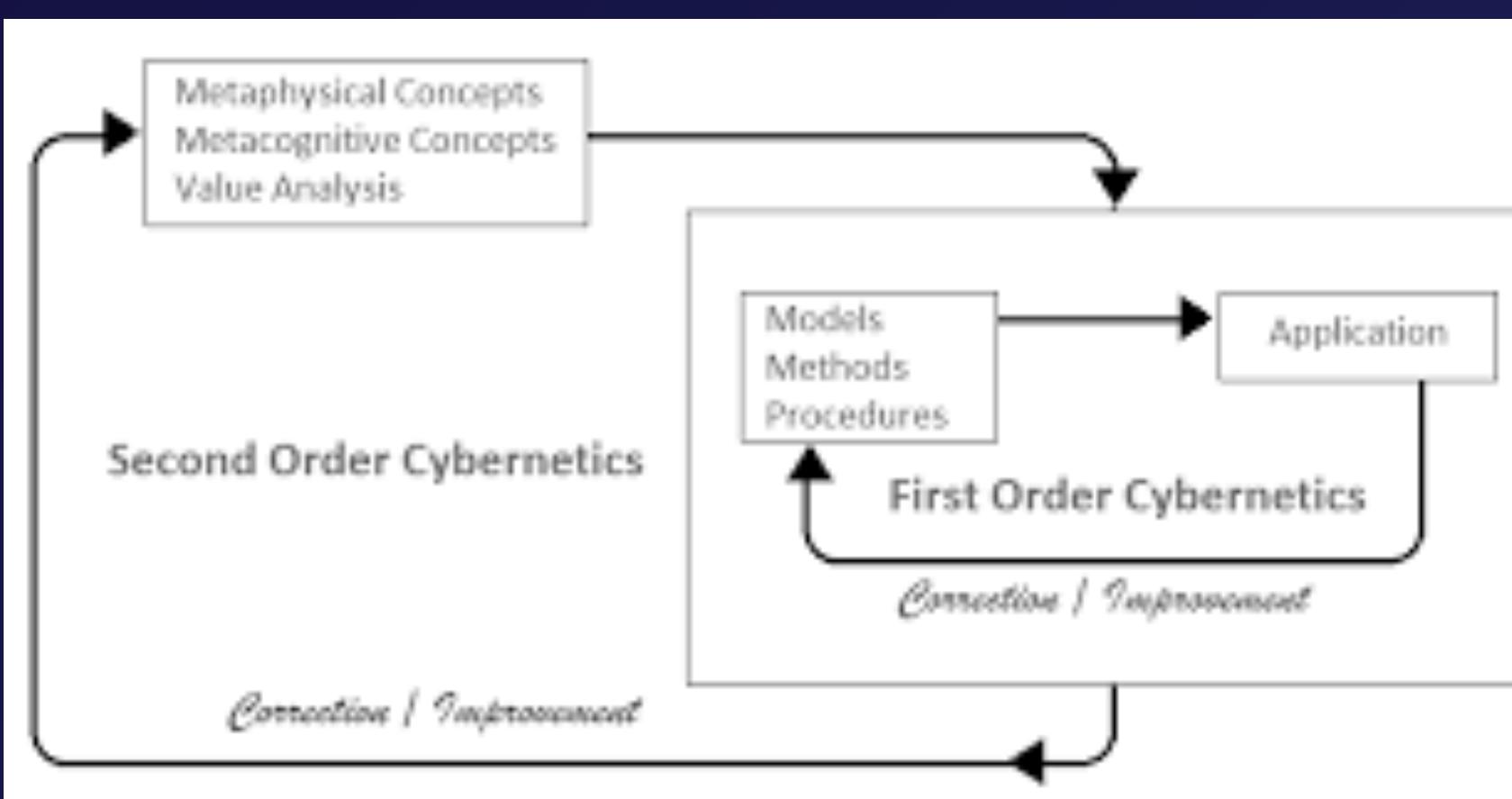
Tools, Skills, and Domains of knowledge are required for design and analysis come from a diverse set of fields

Paradigms for Complexity in Engineering

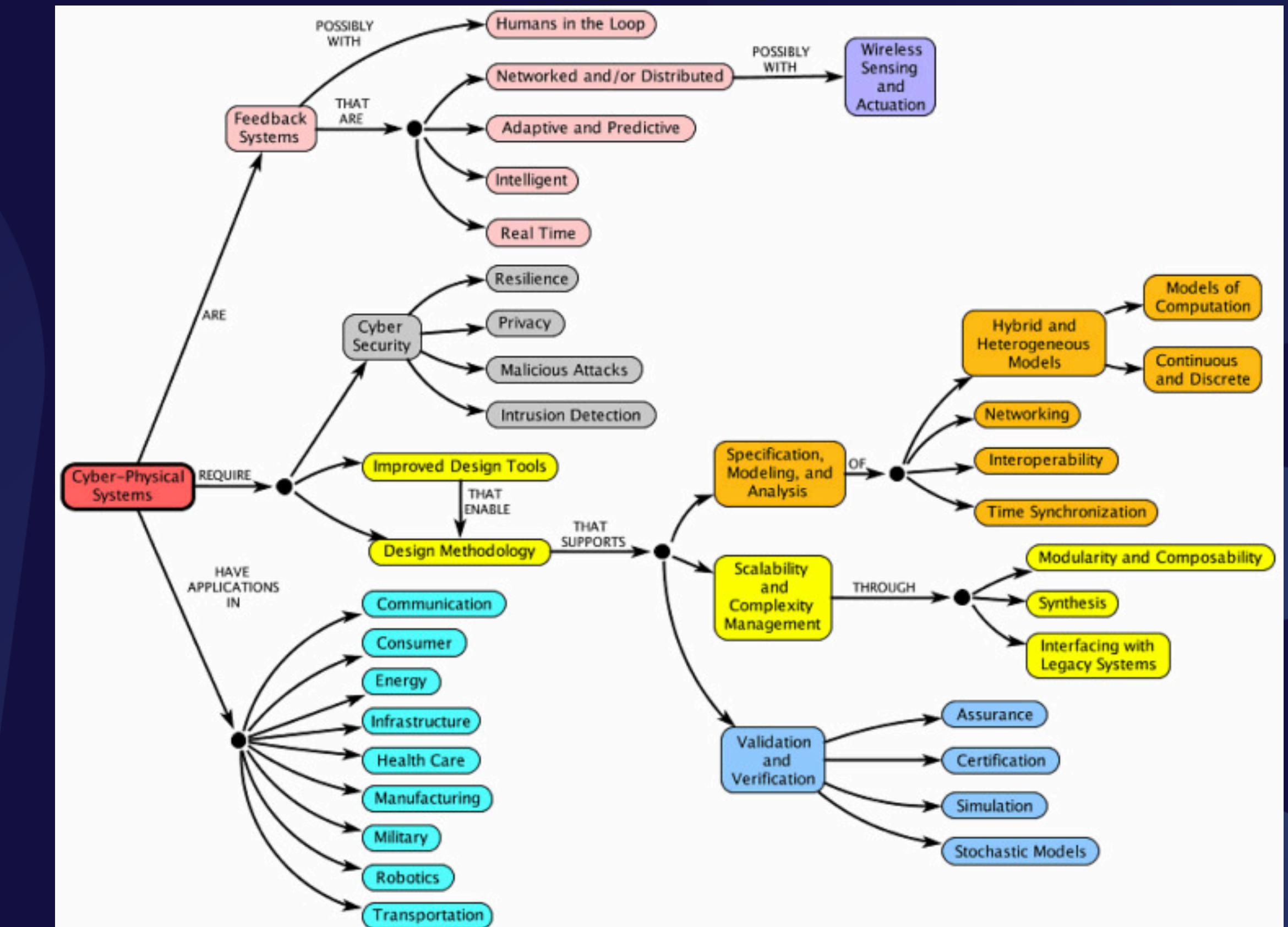
SocioTechnical Systems
Eric Trist, Ken Bamforth
and Fred Emery (1952)



Second Order Cybernetics
Wiener,
Bateson
& Mead
(1973)



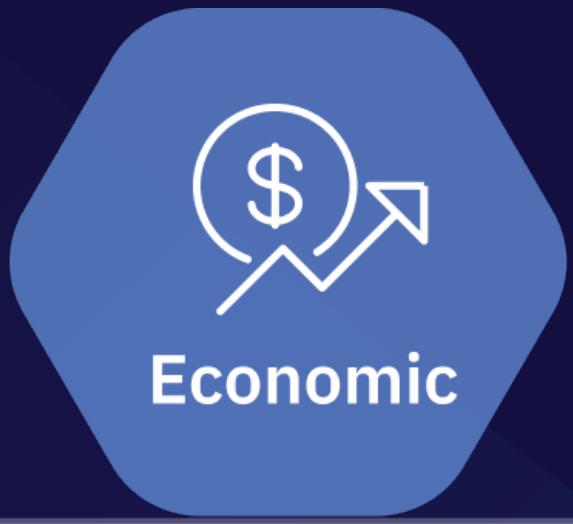
Cyberphysical Systems
Helen Gill (2006)



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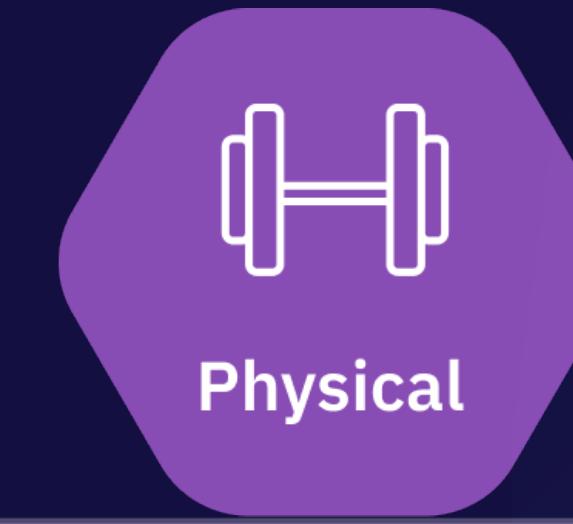
Social



Economic



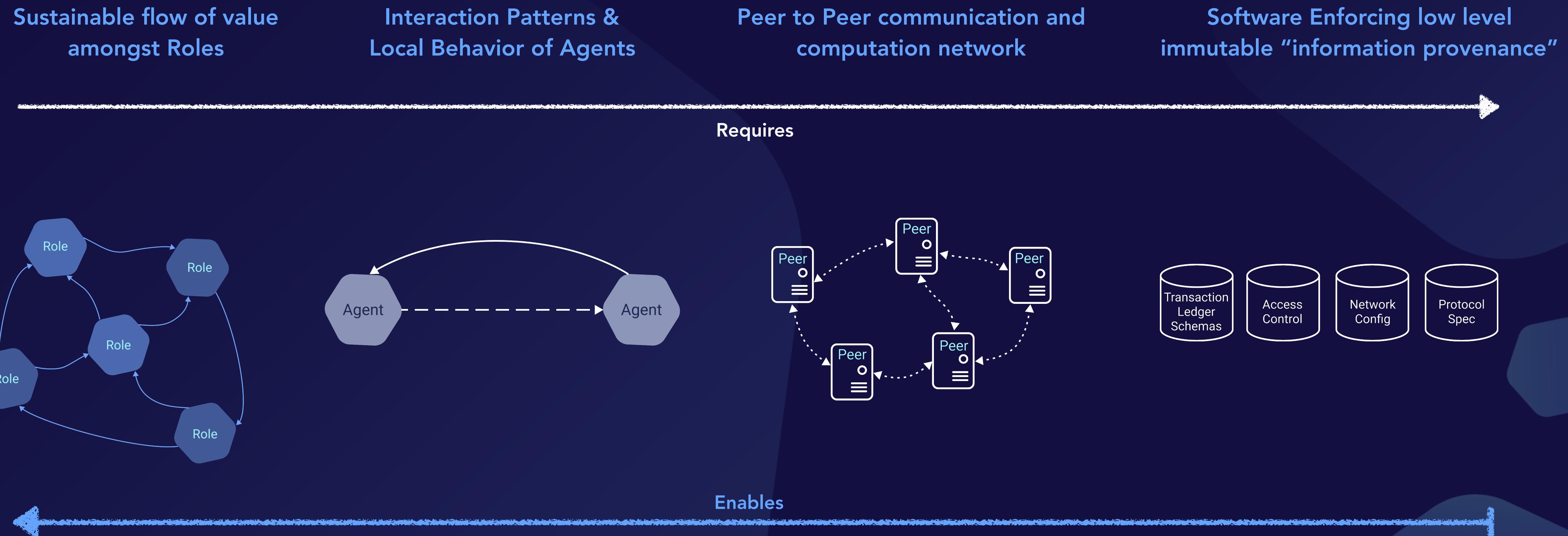
Technology



Physical



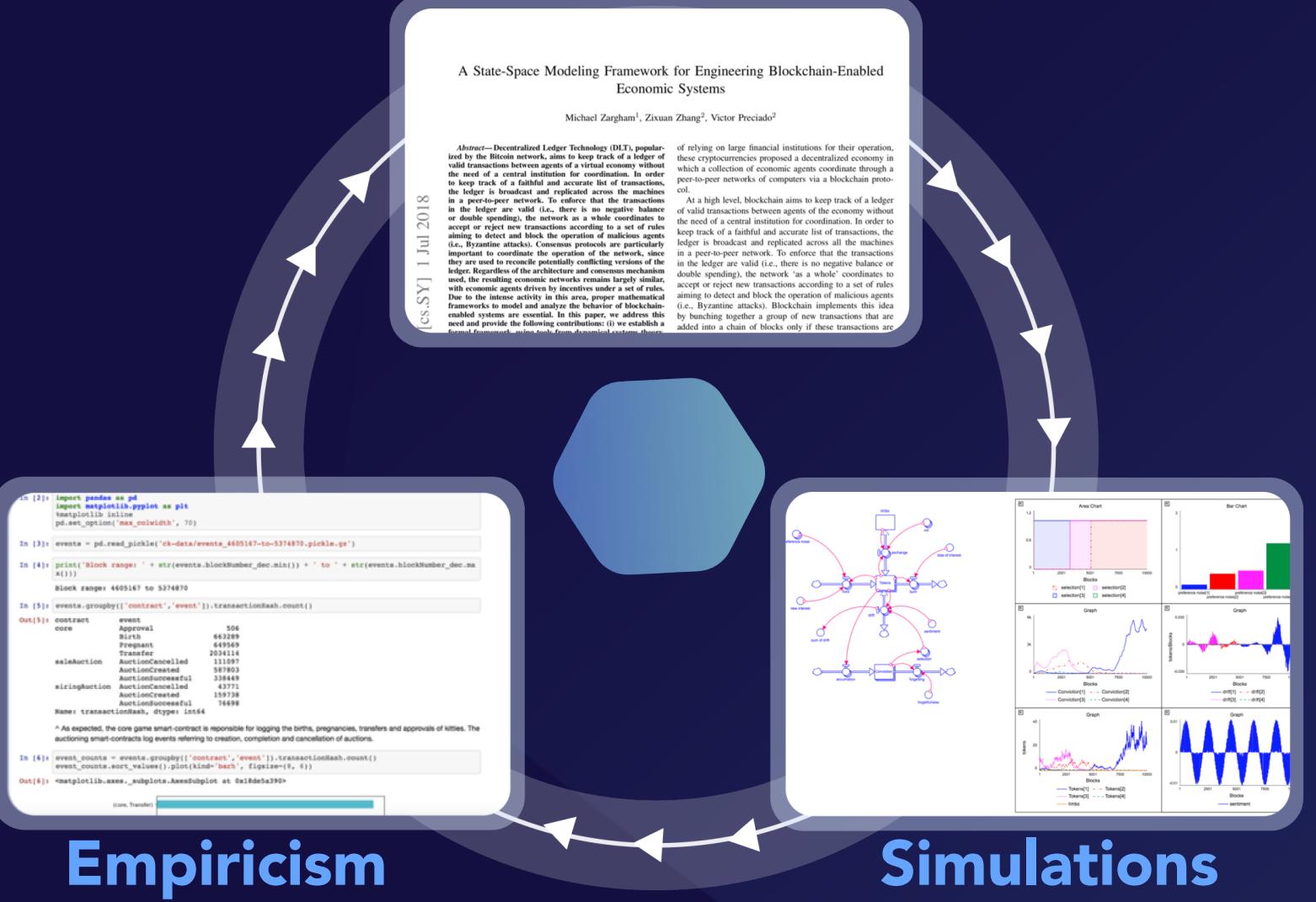
Interconnectedness of Technology and Behavior



Three Kinds of Scientific Results

- Analytical:

Formal Assumptions —> Formal Conclusions



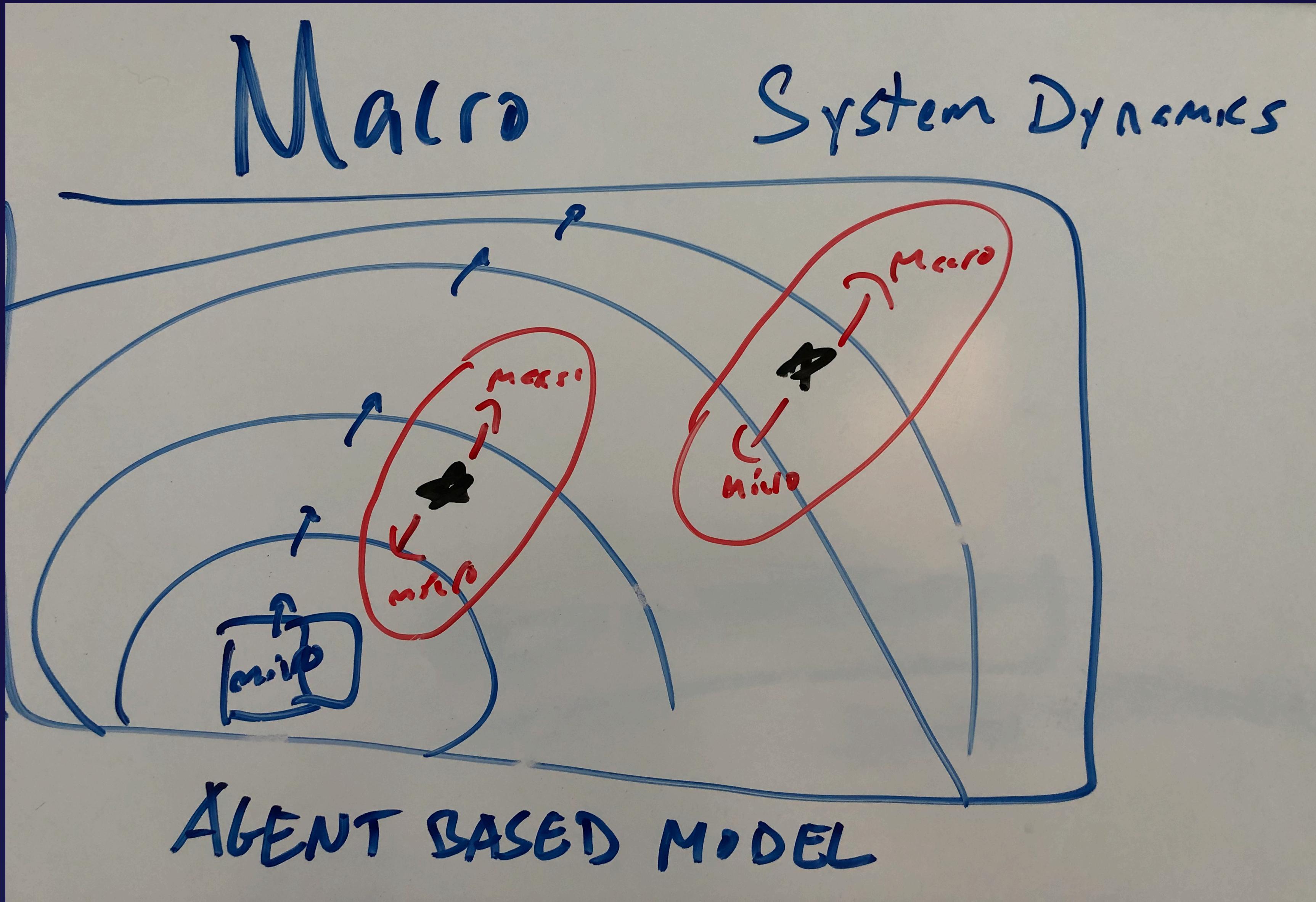
- Computational:

Formal Assumptions —> Data —> Analysis to Reach Conclusions

- Empirical:

Measurements & Observations —> Data —> Analysis to Reach Conclusions

An Decision Engineer's Perspective on Economic Modeling



Mechanisms as rules governing allowable actions

Definition 4. Consider the set of *Mechanisms* to be \mathcal{F} such that any $f \in \mathcal{F}$ is an operator

$$(1) \quad f : \mathcal{X} \times \mathcal{U} \longrightarrow \mathcal{X}$$

where \mathcal{X} is the space of all possible states \mathbf{X} and \mathcal{U} is a space of all legal actions associated with the particular mechanism f .

Definition 6. The set of all possible *transactions* is denoted $\mathcal{T} = \mathcal{A} \times \mathcal{F} \times \mathcal{U}$ where an element $t \in \mathcal{T}$ is defined $t = (a, f, u)$. In order for the transaction to be valid, agent a must have the right to perform the state update operation $\mathbf{X}^+ = f(\mathbf{X}, u)$ given the current state \mathbf{X} .

Blocks are Batches of 'local' economic activity

An atomic update is defined

$$(2) \quad \mathbf{X}^+ = f_t(\mathbf{X}, u_t) \text{ for any valid } (a_t, f_t, u_t) \text{ given } \mathbf{X}$$

where f_t is the mechanism used in transaction t and u_t is the action taken for transaction t . For a block defined by sequence of transactions \mathbf{T} , the state update is

$$(3) \quad \mathbf{X}^+ = f_N(f_{N-1}(\cdots f_1(f_0(\mathbf{X}, u_0), u_1) \cdots, u_{N-1}), u_N)$$

any valid sequence of transactions $\mathbf{T} = [\dots, t, \dots]$, where $t = (a, f, u)$ is valid given \mathbf{X}

$$(5) \quad \mathbf{X}(k+1) = \mathbf{F}_k(X(k))$$

denoting the closed loop state update accounting implicitly for the actions $u = P((X))$.

Modeling Uncertain or Uncontrolled Behavior

Definition 7. A *policy* $P : \mathcal{X} \rightarrow \mathcal{U}$ is a state dependent strategy over a particular mechanism $f \in \mathcal{F}$. An agent $a \in \mathcal{A}$ is said to be using policy P over mechanism $f \in \mathcal{F}$ if it monitors the state \mathcal{X} and broadcasts transaction $t = (a, f, u)$ associated with action $u = P(x) \in \mathcal{U}$.

| | Possible Outcome | Actually Occurs |
|-------------|------------------|-----------------|
| Micro Scale | Action Space | Action |
| Macro Scale | Reachable Space | Realization |

Invariant Properties: Designing the Reachable Space

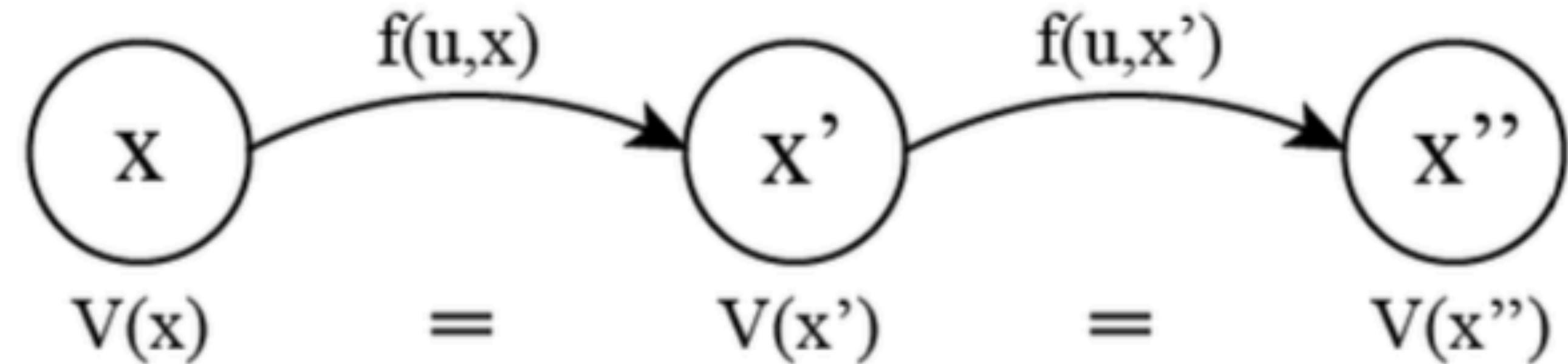
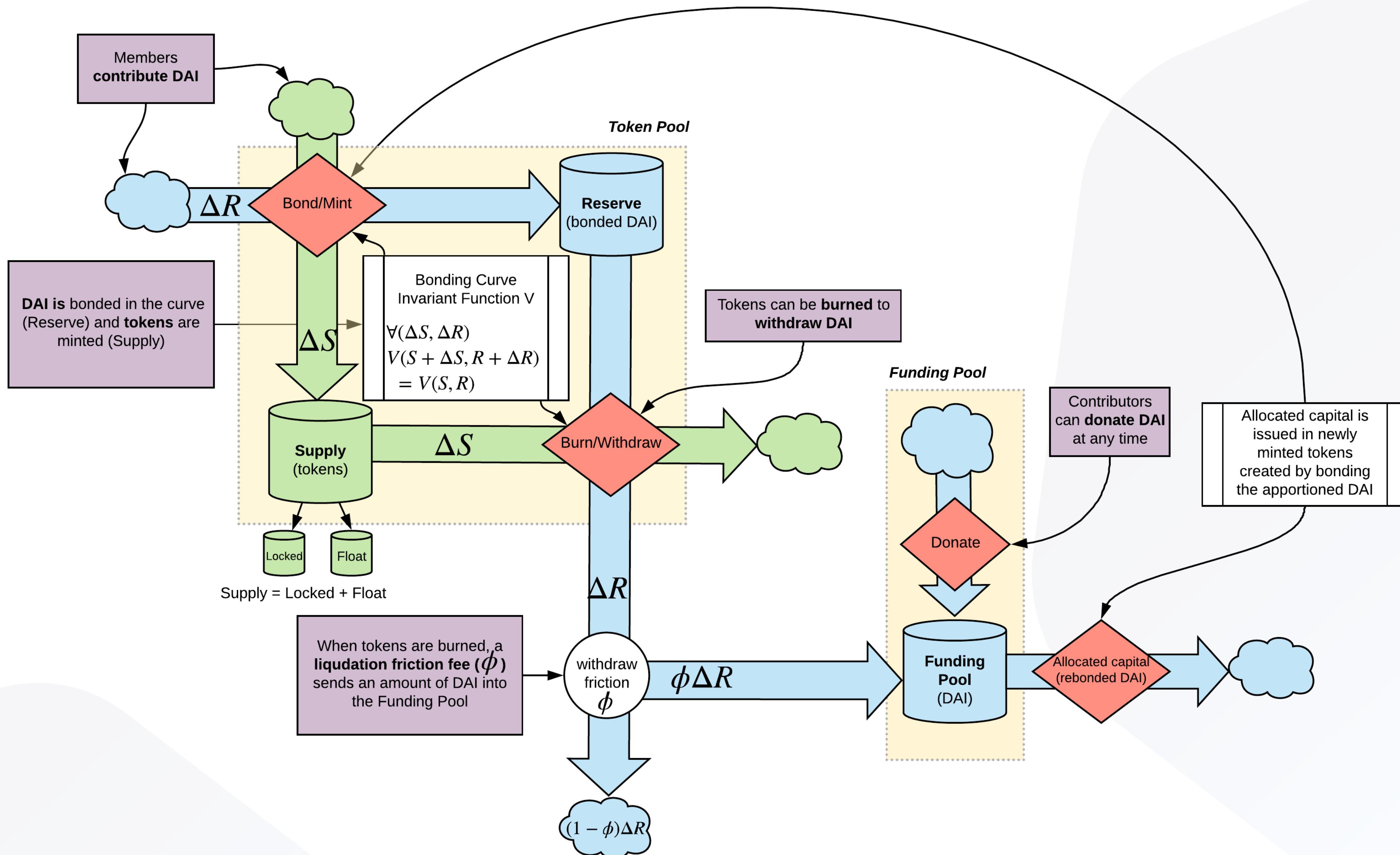
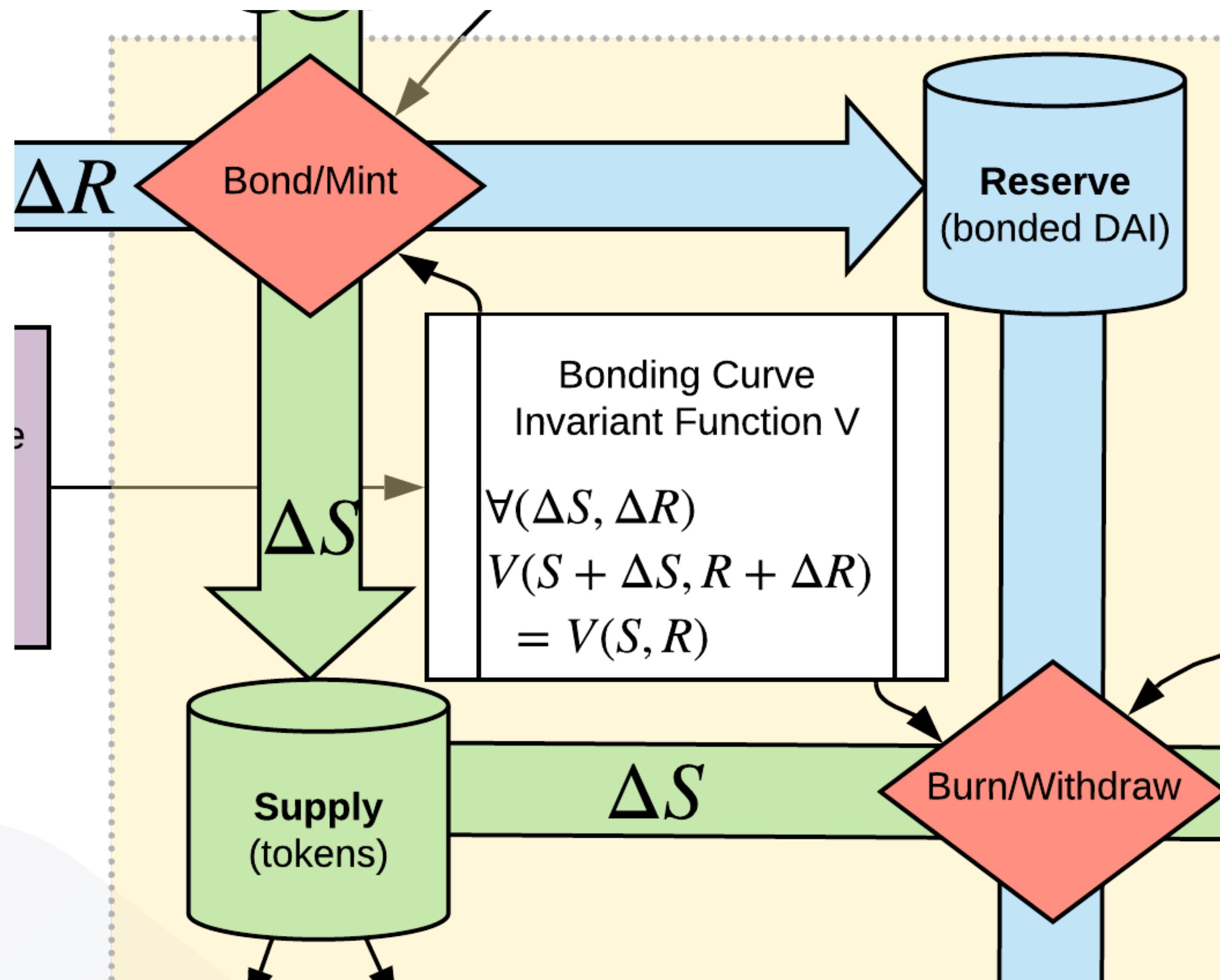


Fig. 2. Illustration of invariant properties. V is invariant under all $f(u, x)$ for all valid actions u .

Augmented Bonding Curve for Community Tokens



Augmented Bonding Curve for Community Tokens



Augmented bonding Curve is defined by an Invariant Property

Invariant Preserving Deposit-to-Mint

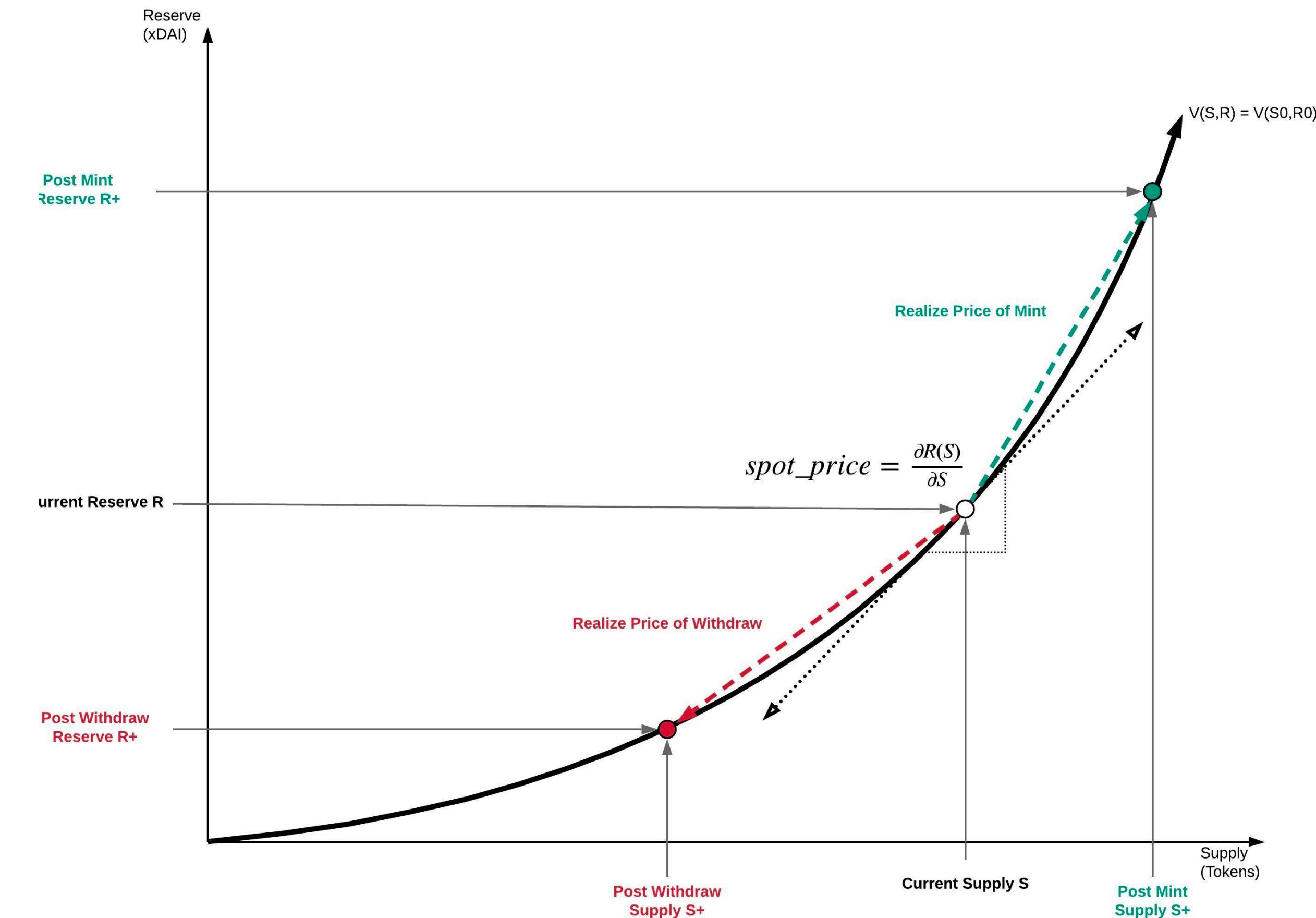
- Deposit ΔR xdai
- Conservation equation: $V(R + \Delta R, S + \Delta S) = \frac{(S + \Delta S)^\kappa}{R + \Delta R} = V_0$
- Derived Mint equation: $\Delta S = \text{mint}(\Delta R; (R, S)) = \sqrt[\kappa]{V_0(R + \Delta R)} - S$
- Realized Price is: $\bar{P}(\Delta R) = \frac{\Delta R}{\Delta S} = \frac{\Delta R}{\sqrt[\kappa]{V_0(R + \Delta R)} - \sqrt[\kappa]{V_0(R)}} \rightarrow \left(\frac{\partial S(R)}{\partial R} \right)^{-1}$ as $\Delta R \rightarrow 0$
- The limiting price is the spot price:

$$\lim_{\Delta R \rightarrow 0} \bar{P}(\Delta R) = \left(\frac{\partial S(R)}{\partial R} \right)^{-1} = \left(\frac{V_0^{1/\kappa} \cdot R^{1/\kappa-1}}{\kappa} \right)^{-1} = \frac{\kappa R^{1-1/\kappa}}{V_0^{1/\kappa}} = \frac{\kappa R^{(\kappa-1)/\kappa}}{V_0^{1/\kappa}} = P(R)$$

Invariant Preserving Burn-to-Withdraw

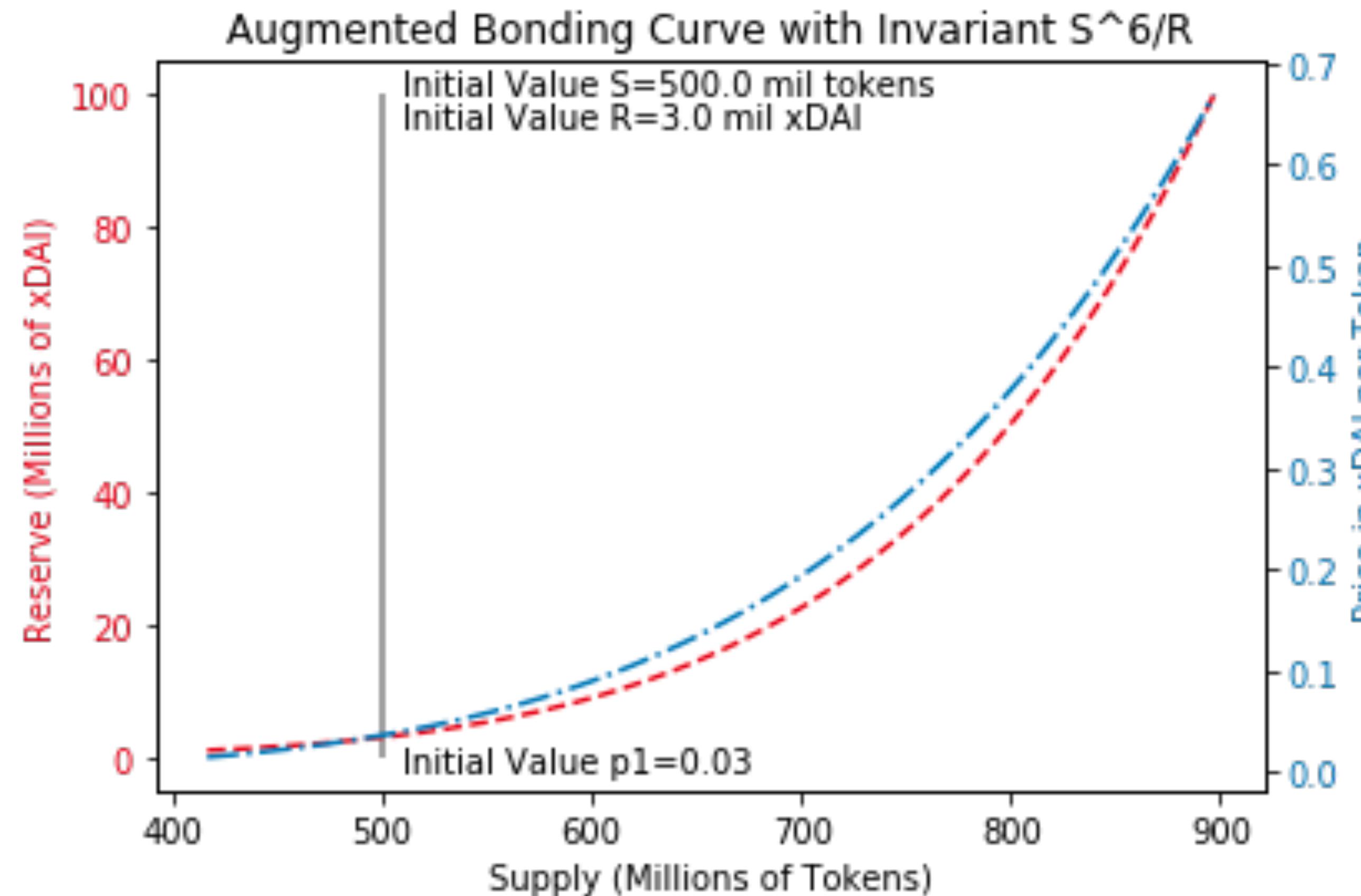
- Burn ΔS tokens
- Conservation equation: $V(R - \Delta R, S - \Delta S) = \frac{(S - \Delta S)^\kappa}{R - \Delta R} = V_0$
- Derived Withdraw equation: $\Delta R = \text{withdraw}(\Delta S; (R, S)) = R - \frac{(S - \Delta S)^\kappa}{V_0}$
- Realized Price is: $\bar{P}(\Delta S) = \frac{\Delta R}{\Delta S} = \frac{\frac{S^\kappa}{V_0} - \frac{(S - \Delta S)^\kappa}{V_0}}{\Delta S} \rightarrow \frac{\partial R(S)}{\partial S}$ as $\Delta S \rightarrow 0$
- The limiting price is the spot price:

$$\lim_{\Delta S \rightarrow 0} \bar{P}(\Delta S) = \frac{\partial R(S)}{\partial S} = \frac{\kappa S^{\kappa-1}}{V_0} = \frac{\kappa \cdot (\sqrt[\kappa]{V_0 R})^{\kappa-1}}{V_0} = \frac{\kappa R^{(\kappa-1)/\kappa}}{V_0^{1/\kappa}} = P(R)$$



Take a deep breathe; this about the same difficulty level as high school physics

Invariant Property Simulation: Validation by Direct Method



Detailed Example:

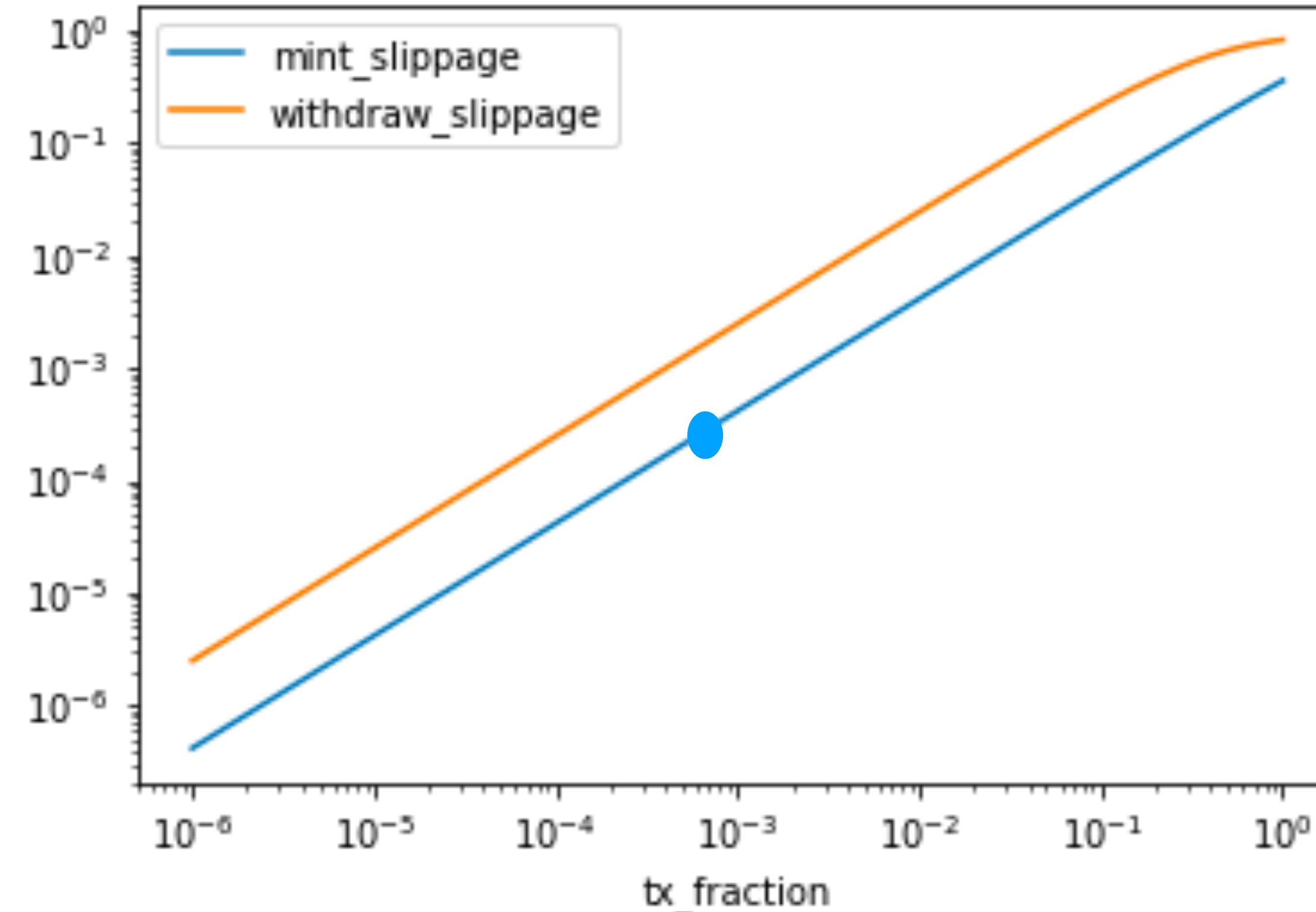
Initial Supply = 500 Million tokens
Initial Reserve = 3 Million xDAI

Bonding Curve Invariant:

$$V(S,R) = S^6/R = 1.3 \times 10^{21}$$

Initial Price = 0.03 xDAI per Token

Implications of Invariant Preserving Mechanisms



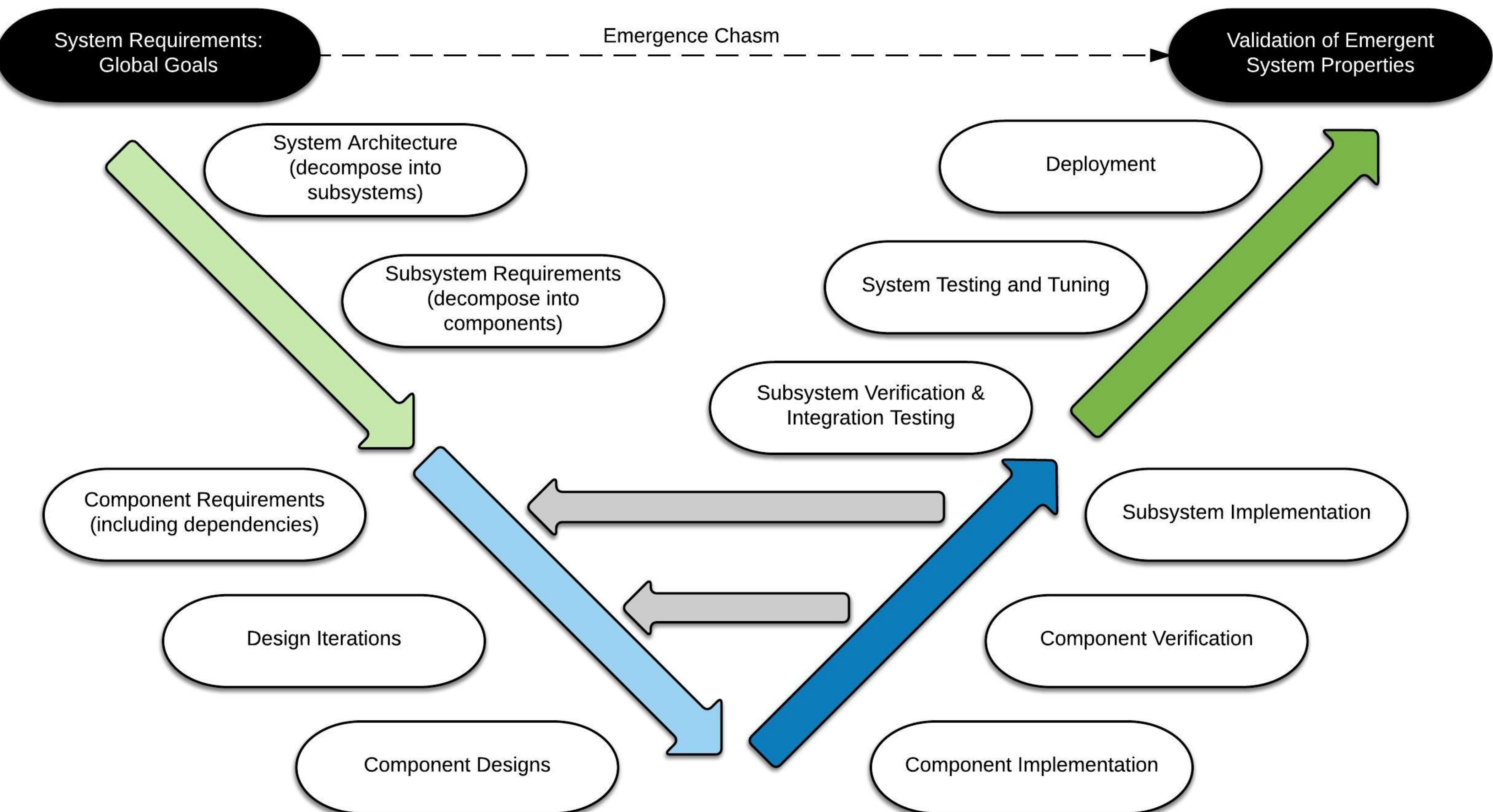
Detailed Example:

Suppose I “Deposit to Mint”
an amount of xDAI that increases
the reserve by a “tx_fraction” 0.1%

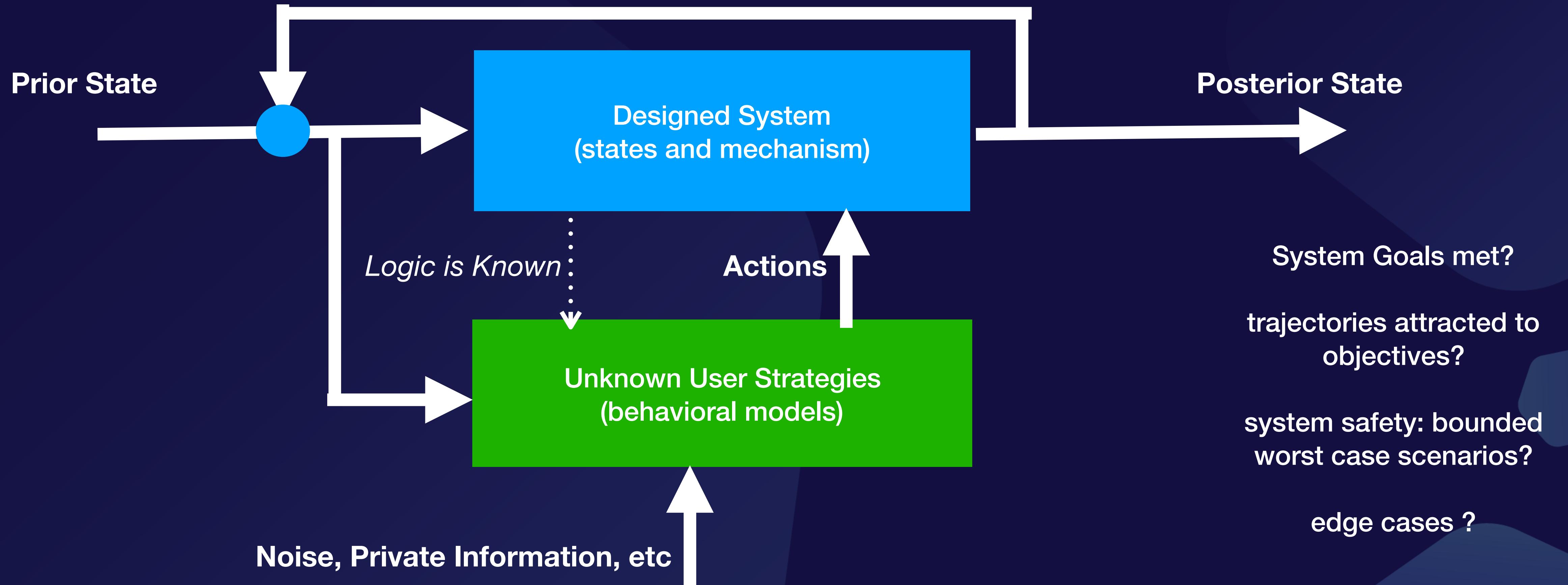
Then “realize” a price slippage of
approximately
0.01%

That is to say the effective price of
my new tokens is 1 Basis Point
greater than the spot price

More context on question being asked



Closing the Gap: Generalized Differential Equations



Formalization of design space allows explicit consideration of both **Objectives** and **Constraints** under temporal dynamics and uncertainty

Bitcoin as a Networked Dynamical System

$$x(k+1) = A_k x(k) + B_k u(k) + \mu_k v(k).$$

Dimension of x is all “Accounts” – balances, positive real

Discrete time system, k is block height

The A matrix is Identity

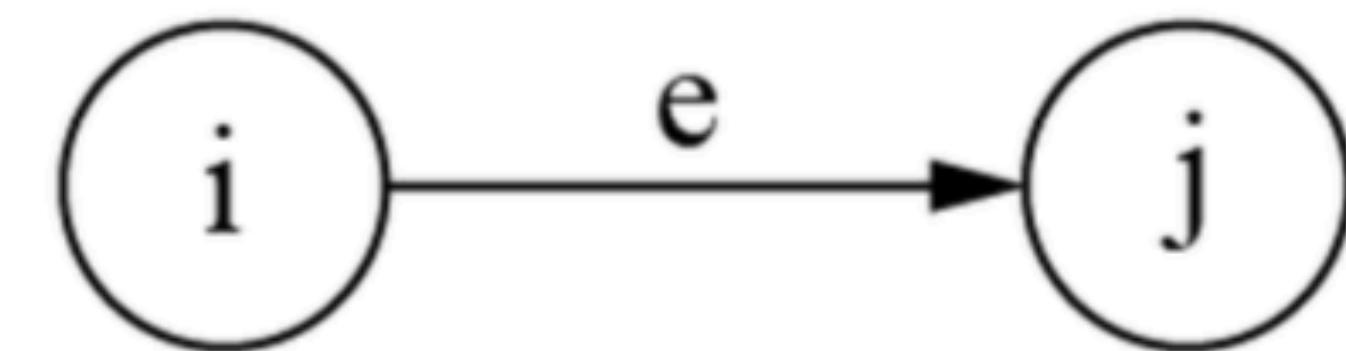
The B matrix is an Incidence Matrix

The Input u is the amount sent, (i,j)

The inflationary mining rewards μ

Stochastic vector v defining which accounts get the reward

$$[B_k]_{ie} = \begin{cases} 1 & \text{if } e = (j, i) \text{ for any } j \\ -1 & \text{if } e = (i, j) \text{ for any } j \\ 0 & \text{otherwise} \end{cases}$$



Bitcoin Conservation and Systemic Property

No Double Spend rule is a local conserved flow constraint

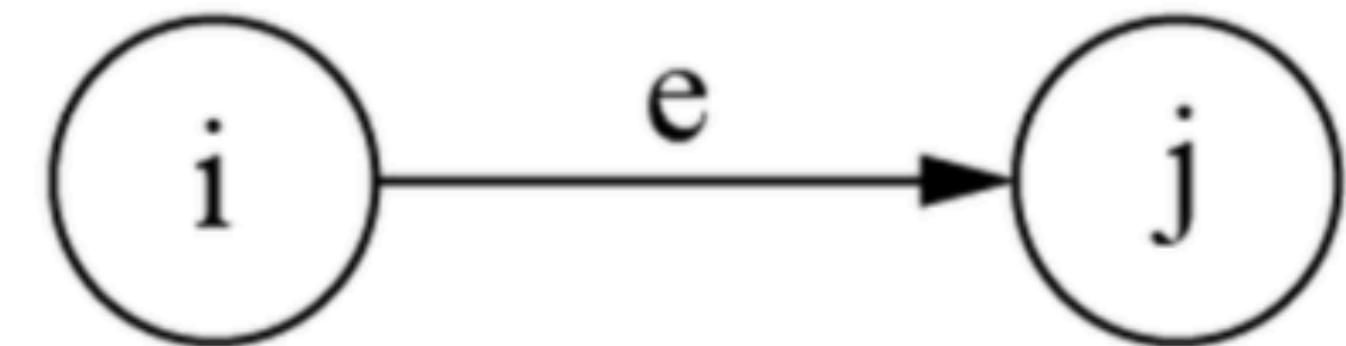
during block k . Viewed from the perspective of account i the local constraint a flow balance

$$x_i(k) + \sum_j u_{(j,i)}(k) - u_{(i,j)}(k) \geq 0. \quad (19)$$

In the practice, the transactions encoded by the inputs u are processed with a strict ordering that can be enforced with only the sender's state

$$u_{(i,j)} \leq x_i \quad (20)$$

$$[B_k]_{ie} = \begin{cases} 1 & \text{if } e = (j, i) \text{ for any } j \\ -1 & \text{if } e = (i, j) \text{ for any } j \\ 0 & \text{otherwise} \end{cases}$$

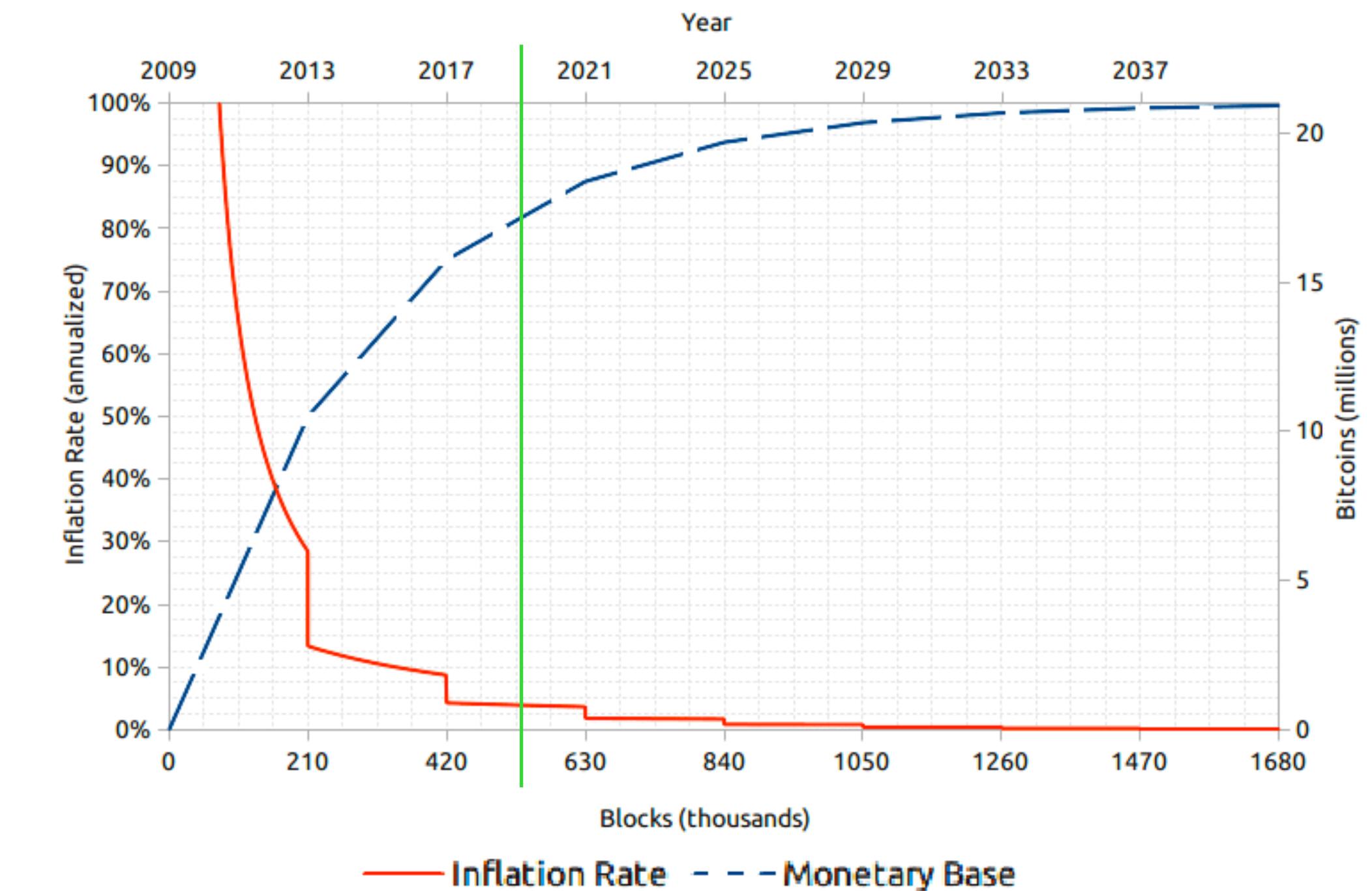


Comparing Analytical Results to a live Economic System

The local conservation Law
guarantees a global conservation property!

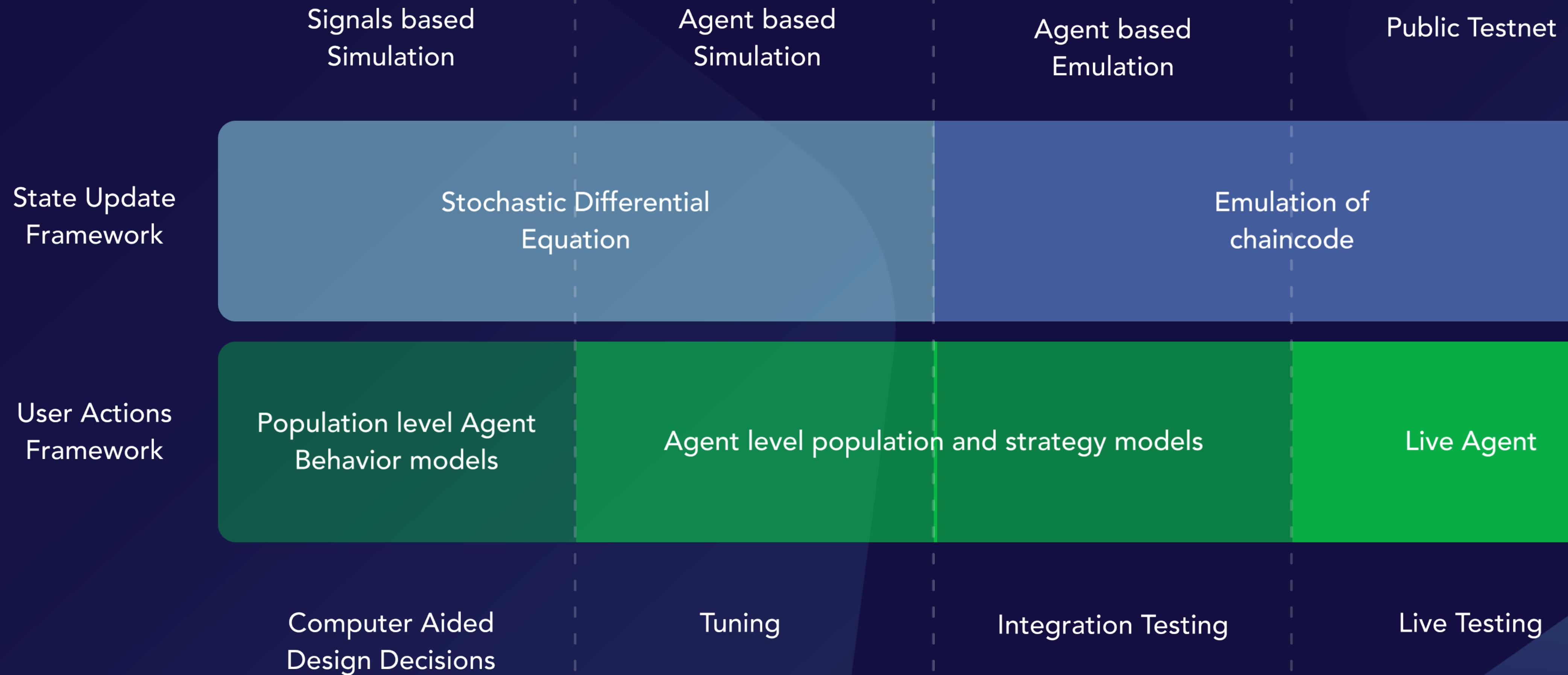
$$y(k) = \mathbf{1}'x(k) = \sum_i x_i(k). \quad \rightarrow \quad y(K) = \sum_{k=1}^{\infty} \mu_k$$

$$\mu_k = \left\lfloor \frac{\frac{50 \cdot 10^8}{2^i}}{10^8} \right\rfloor \text{ where } k \in r_i \quad \rightarrow \quad y_{\infty} = \lim_{k \rightarrow \infty} y(k) = \sum_{k=1}^{\infty} \mu_k$$

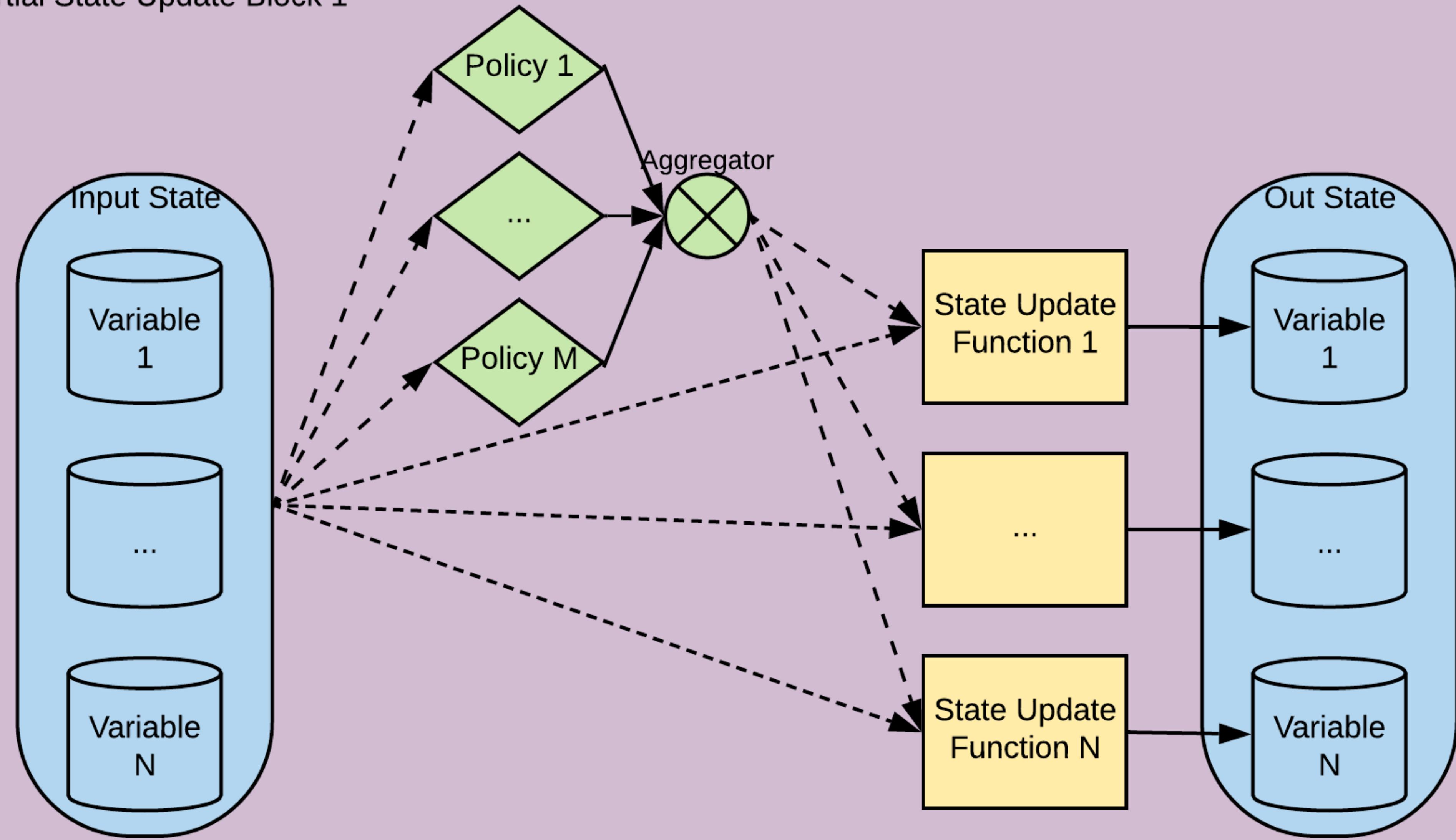


$$y_{\infty} = \lim_{k \rightarrow \infty} y(k) = \sum_{k=1}^{\infty} \mu_k = 20999999.9769 \sim 21 \text{ Million BTC}$$

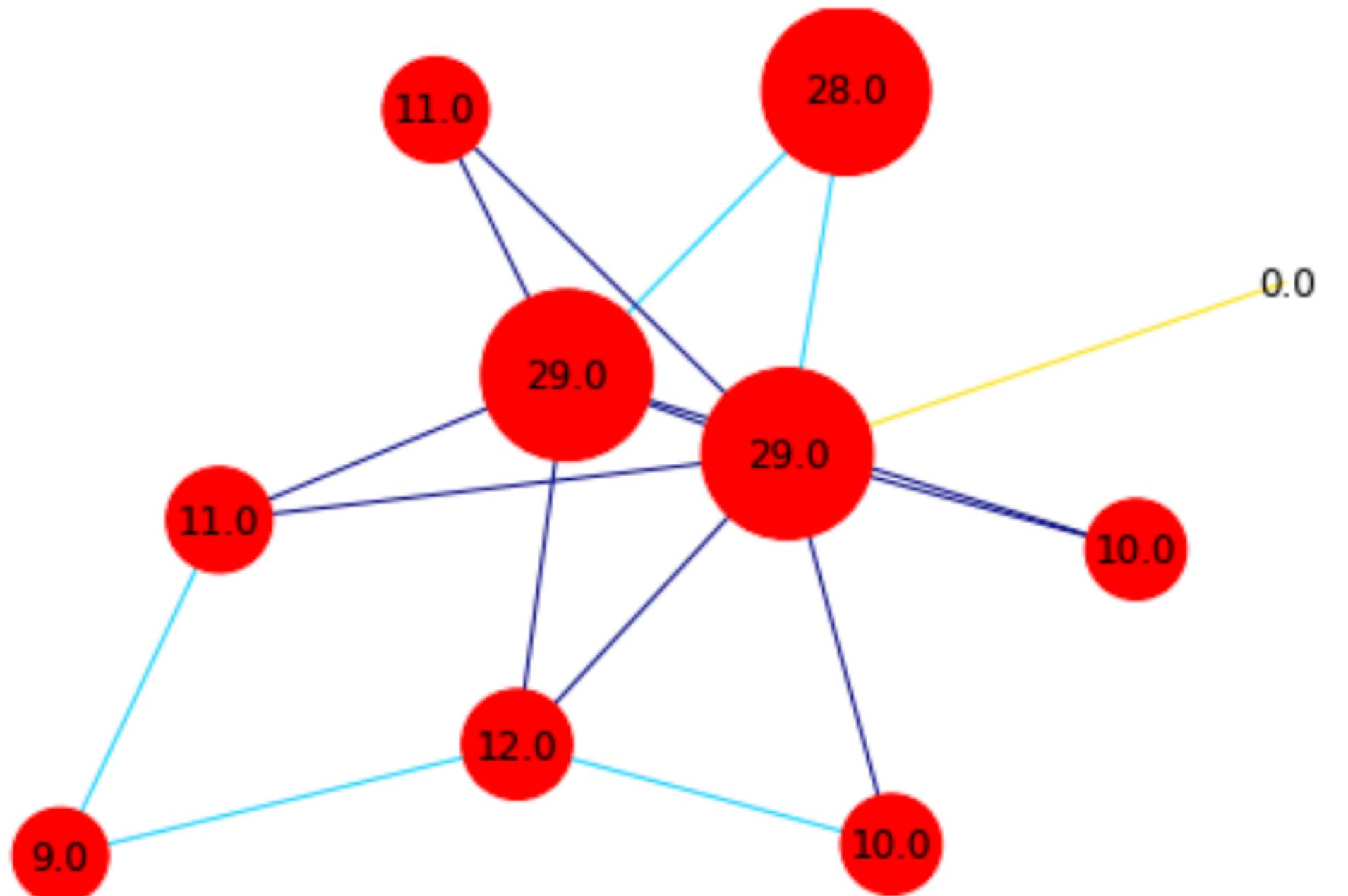
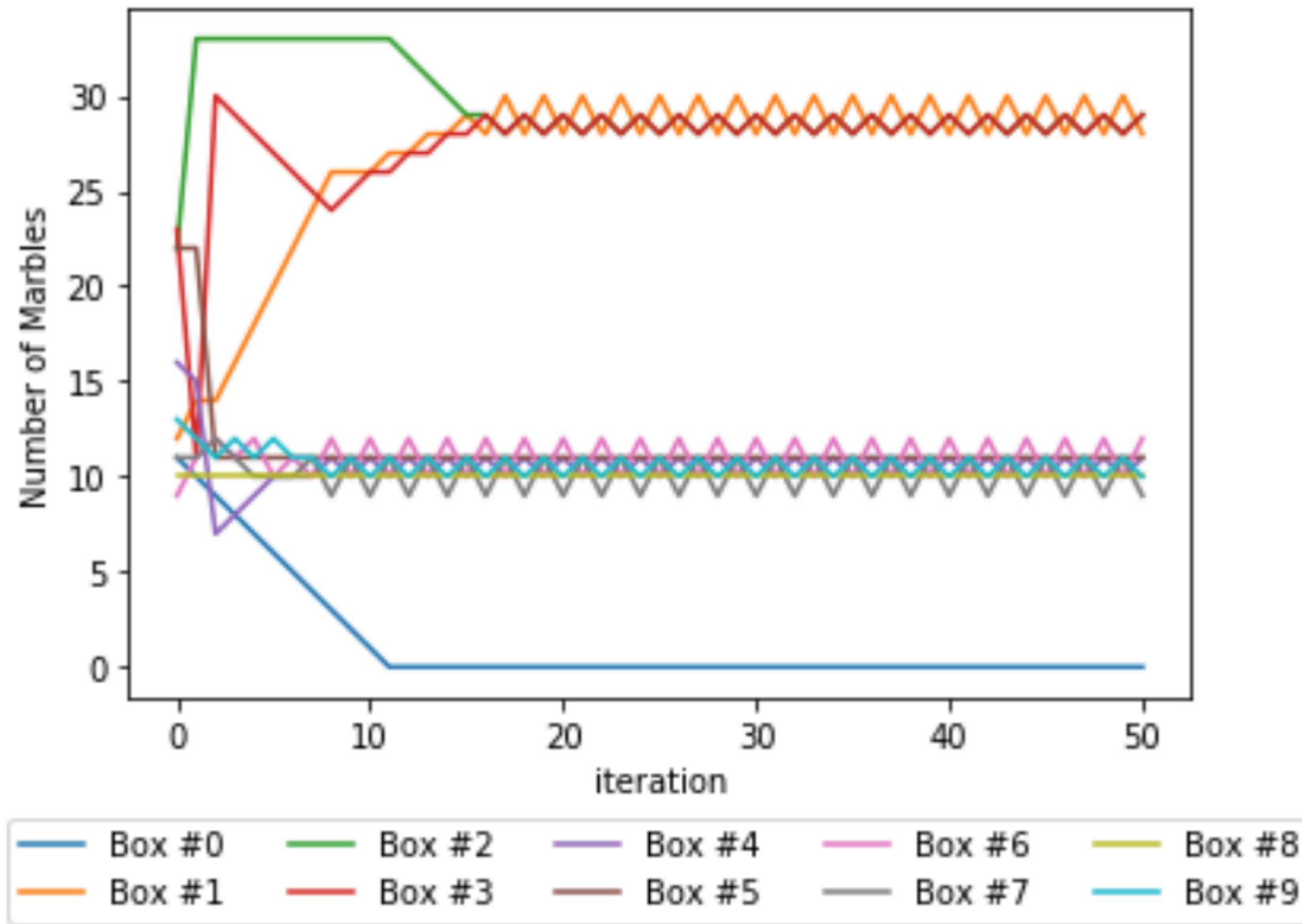
Modeling & Testing Systems with Agents in the Loop



Partial State Update Block 1



Marbles in each box



```
In [6]: # this time lets make three kinds of robots
def greedy_robot(src_balls, dst_balls):

    #robot wishes to accumulate balls at its source
    #takes half of its neighbors balls
    if src_balls < dst_balls:
        delta = -np.floor(dst_balls/2)
    else:
        delta = 0

    return delta

def fair_robot(src_balls, dst_balls):

    #robot follows the simple balancing rule
    delta = np.sign(src_balls-dst_balls)

    return delta
```

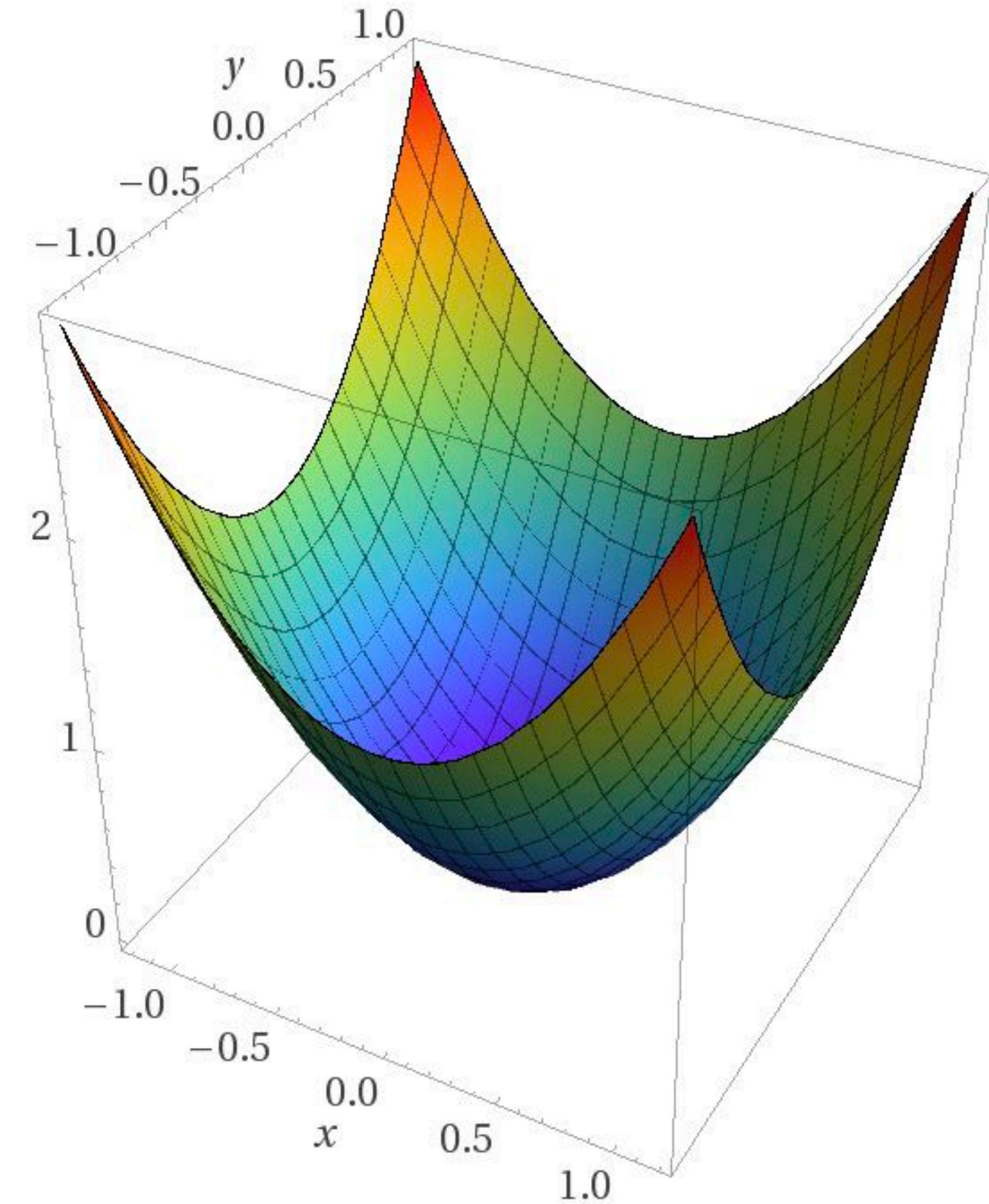
```
def giving_robot(src_balls, dst_balls):

    #robot wishes to give away balls one at a time
    if src_balls > 0:
        delta = 1
    else:
        delta = 0

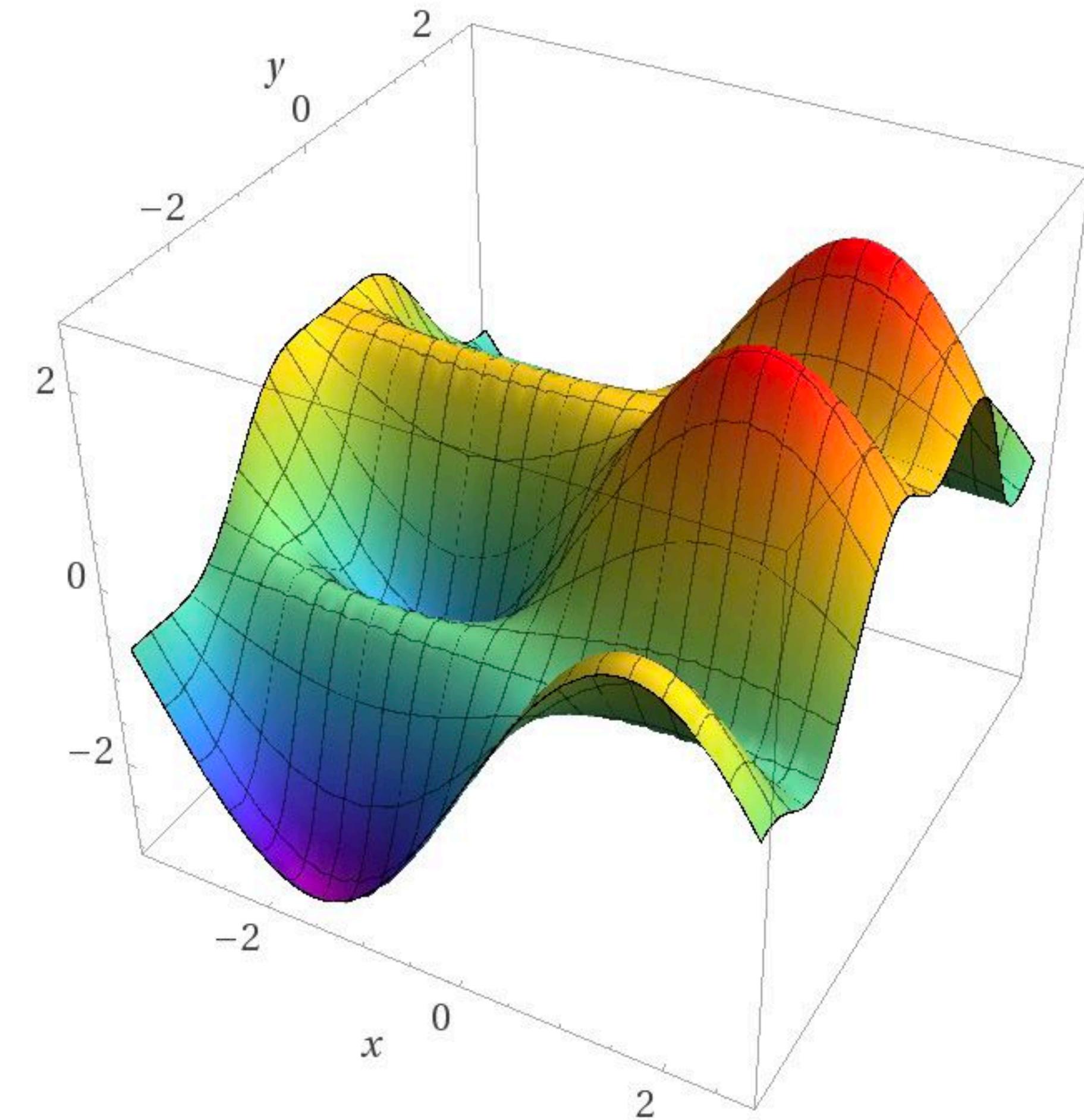
    return delta
```

<https://github.com/BlockScience/SimCAD-Tutorials/tree/master/demos/robot-marbles-network>

Potential Fields = Incentive Fields?



Computed by Wolfram|Alpha



Computed by Wolfram|Alpha

Potential Based Pricing

$$V(S, R, P, \tilde{P}) = \left[\gamma(P - \tilde{P})^2 - \log\left(\frac{R}{S}\right) \right]_+$$

State Space:

$$(S, R, P, \tilde{P}, \hat{P})$$

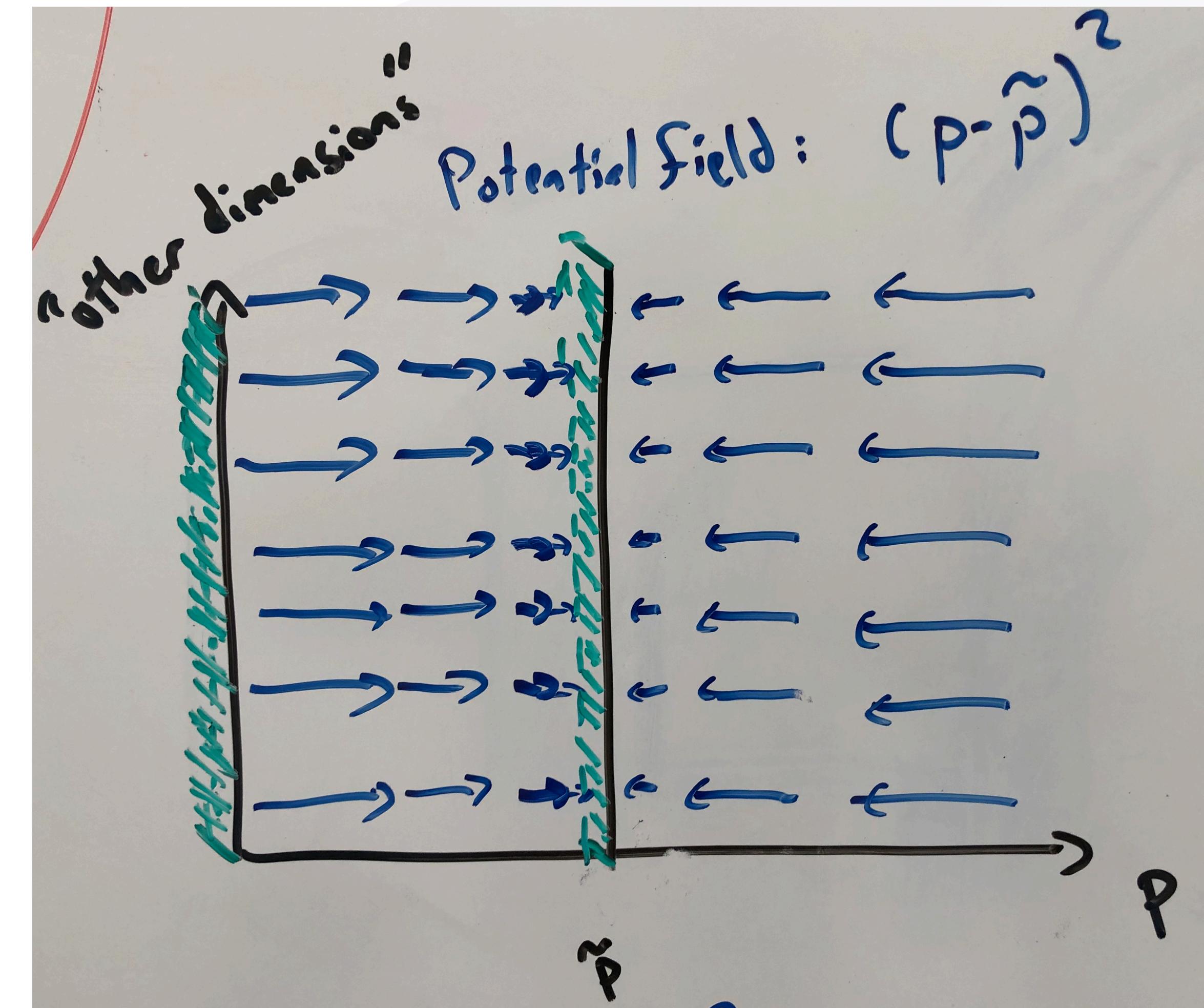
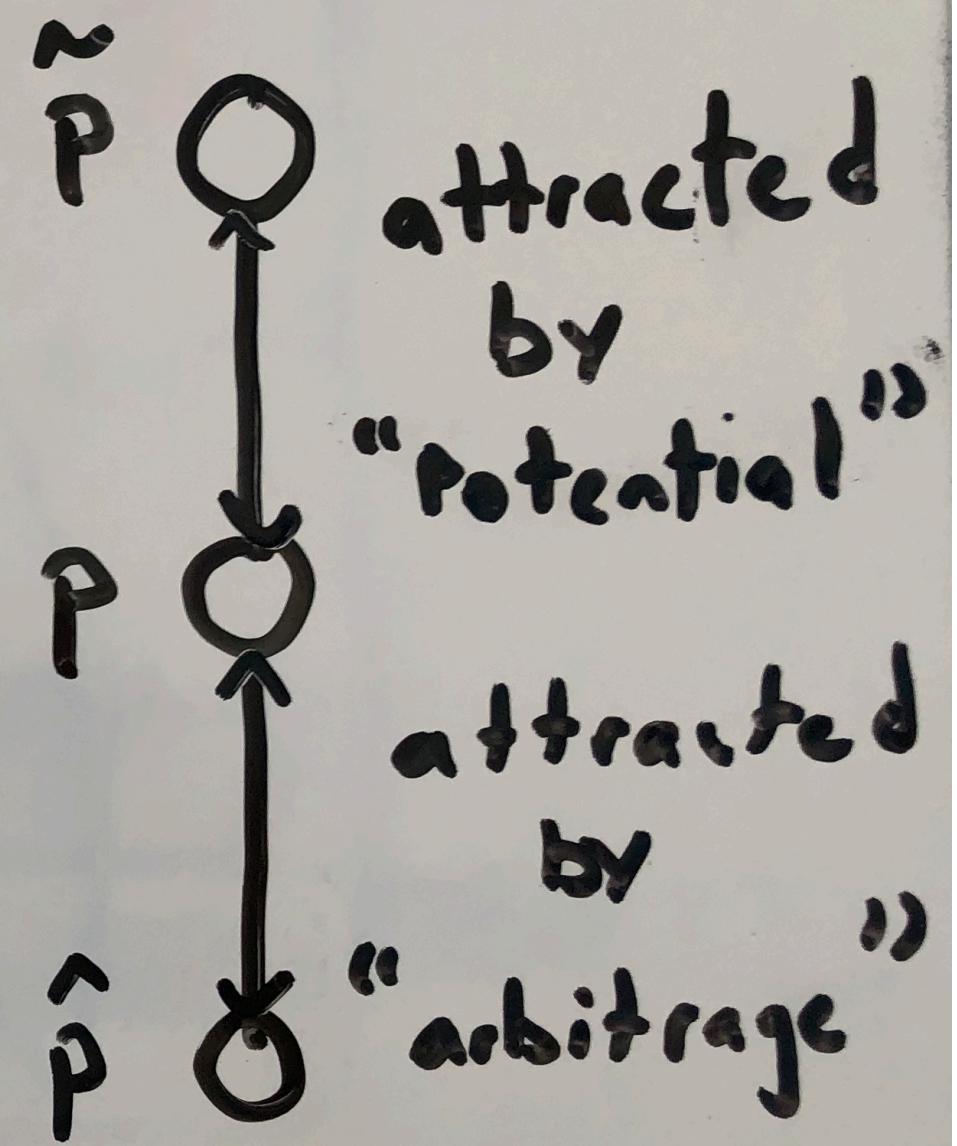
Supply S

Reserve R

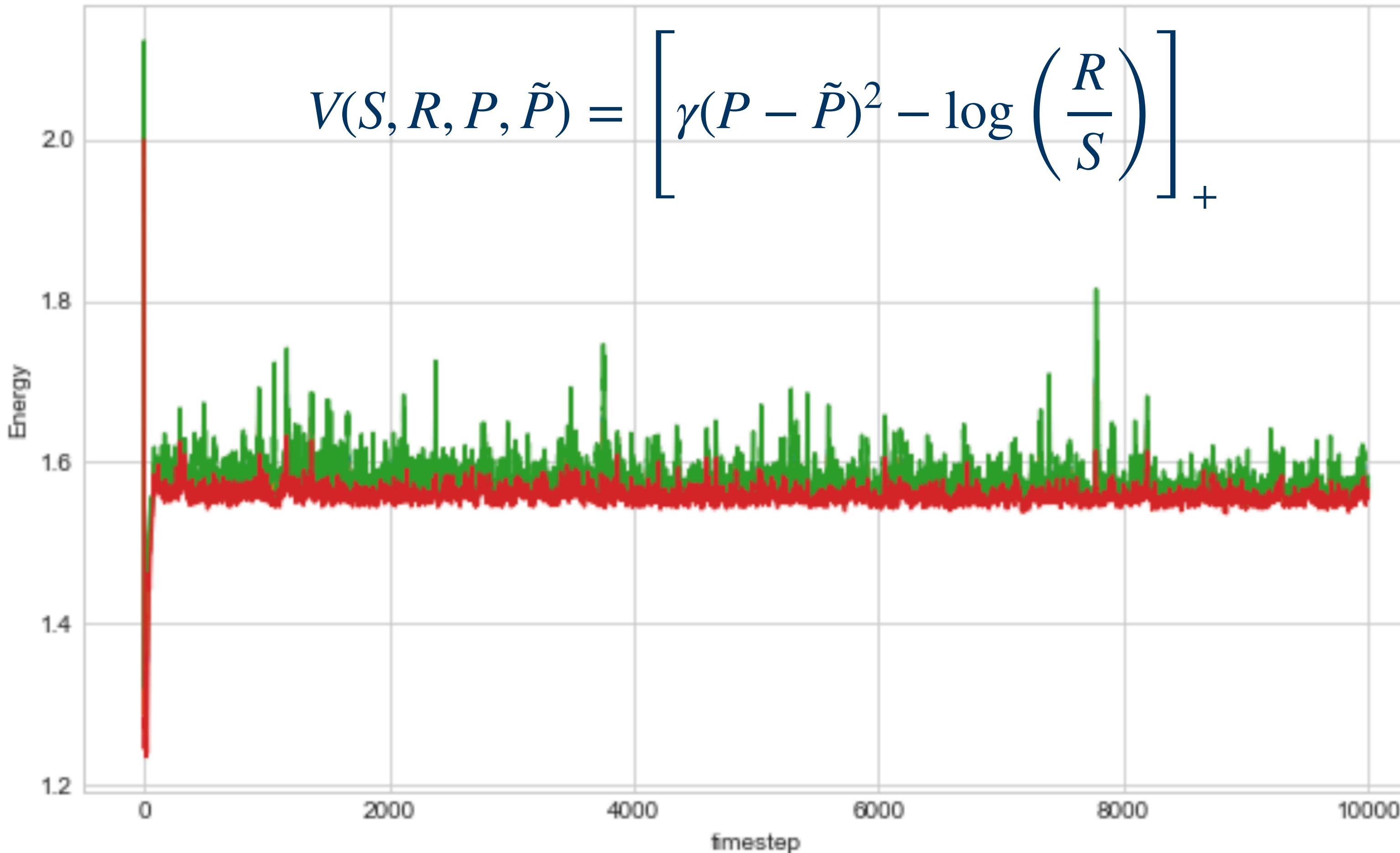
Spot Price P

Smooth Avg Price \tilde{P}

Ext. Market Price \hat{P}



Stabilization through Energy Dissipation



Detailed Example:

System Initialized

Price $P = 1$

Attractor $\tilde{P} = 0.01$

Behavior is randomized
but is distributed around
the belief

$$\mathbb{E}[\hat{P}_k] = 1$$

New Price is determined by action

$$P^+ = P + \Delta P(\text{action}, \text{state}) = \frac{\Delta R}{\Delta S}$$



Average is updated atomically

$$\tilde{P}^+ = (1 - \alpha)P^+ + \alpha\tilde{P}$$

New State becomes the state:

$$S \leftarrow S + \Delta S$$

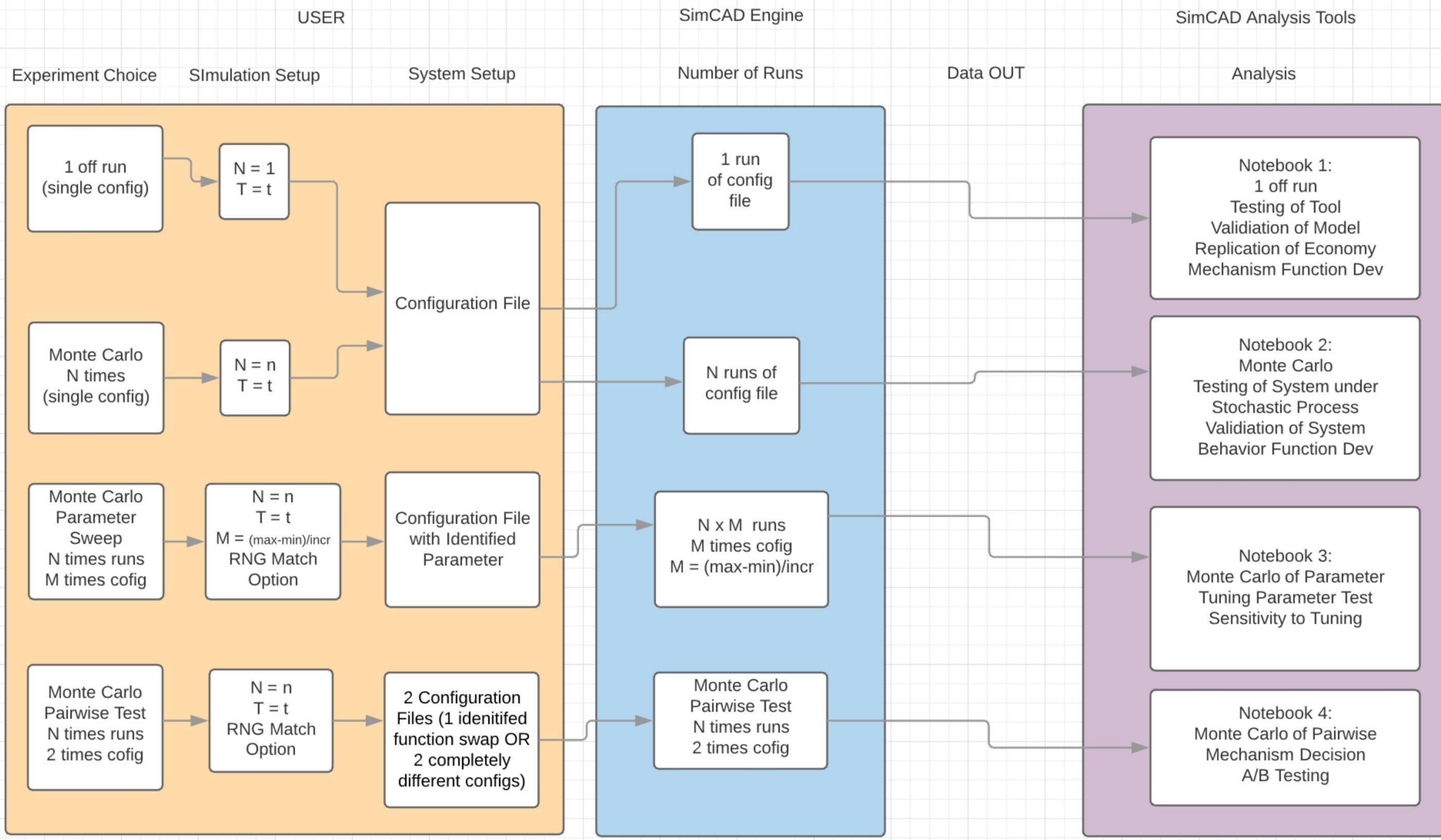
$$R \leftarrow R + \Delta R$$

$$P \leftarrow P^+$$

$$\tilde{P} \leftarrow \tilde{P}^+$$

USER-ENGINE-OUTPUT

Matt Barlin



Impositions and Consequences of Potential Field Designs?



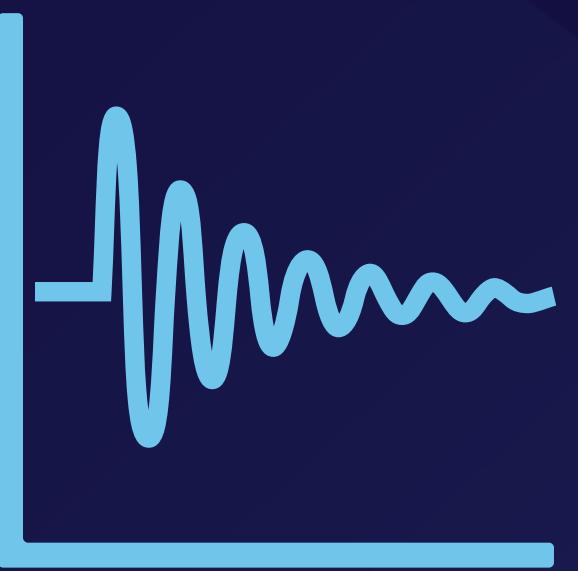
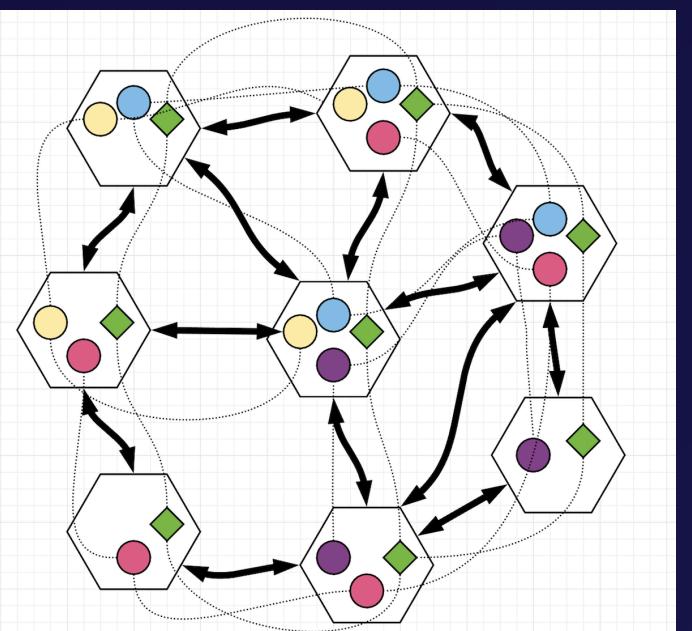
Engineering = {

Capability

Responsibility

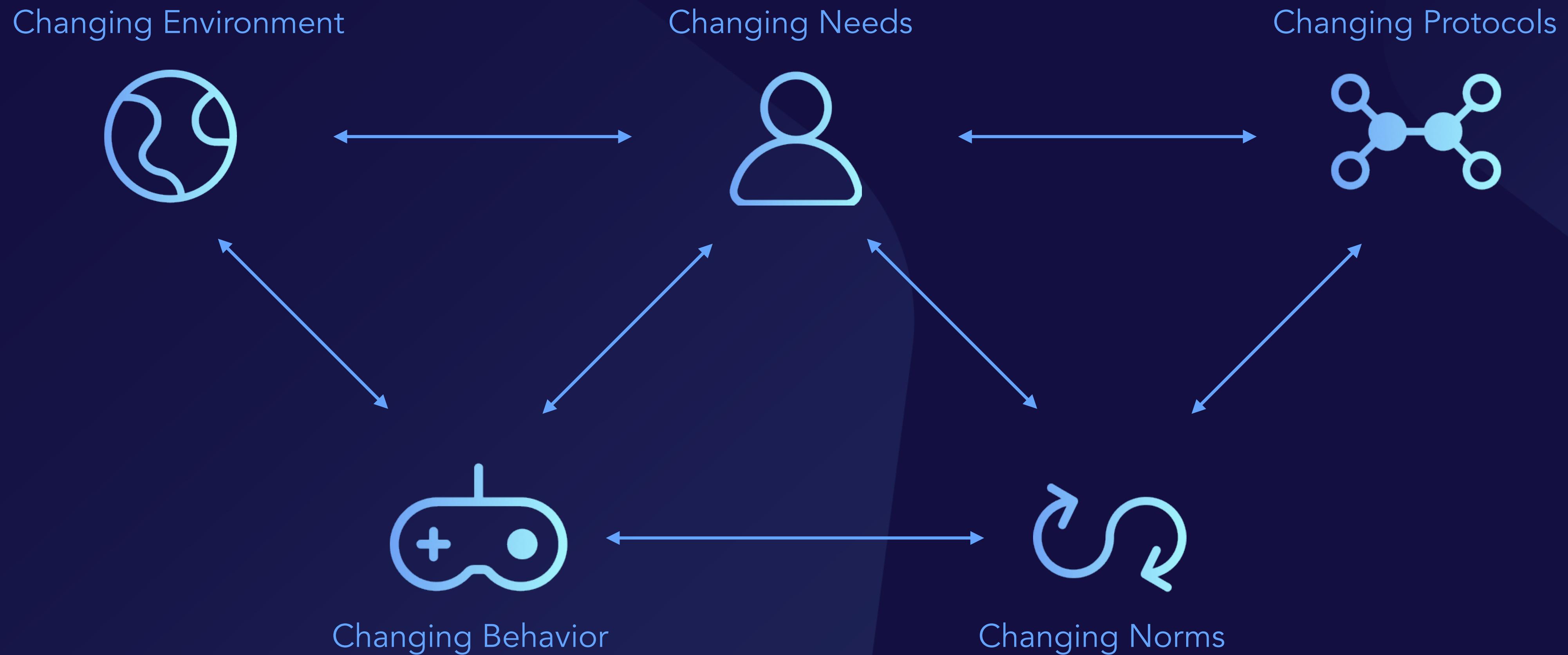
Mindful of "Subjective" Choice of "Objective" Measures

Systems

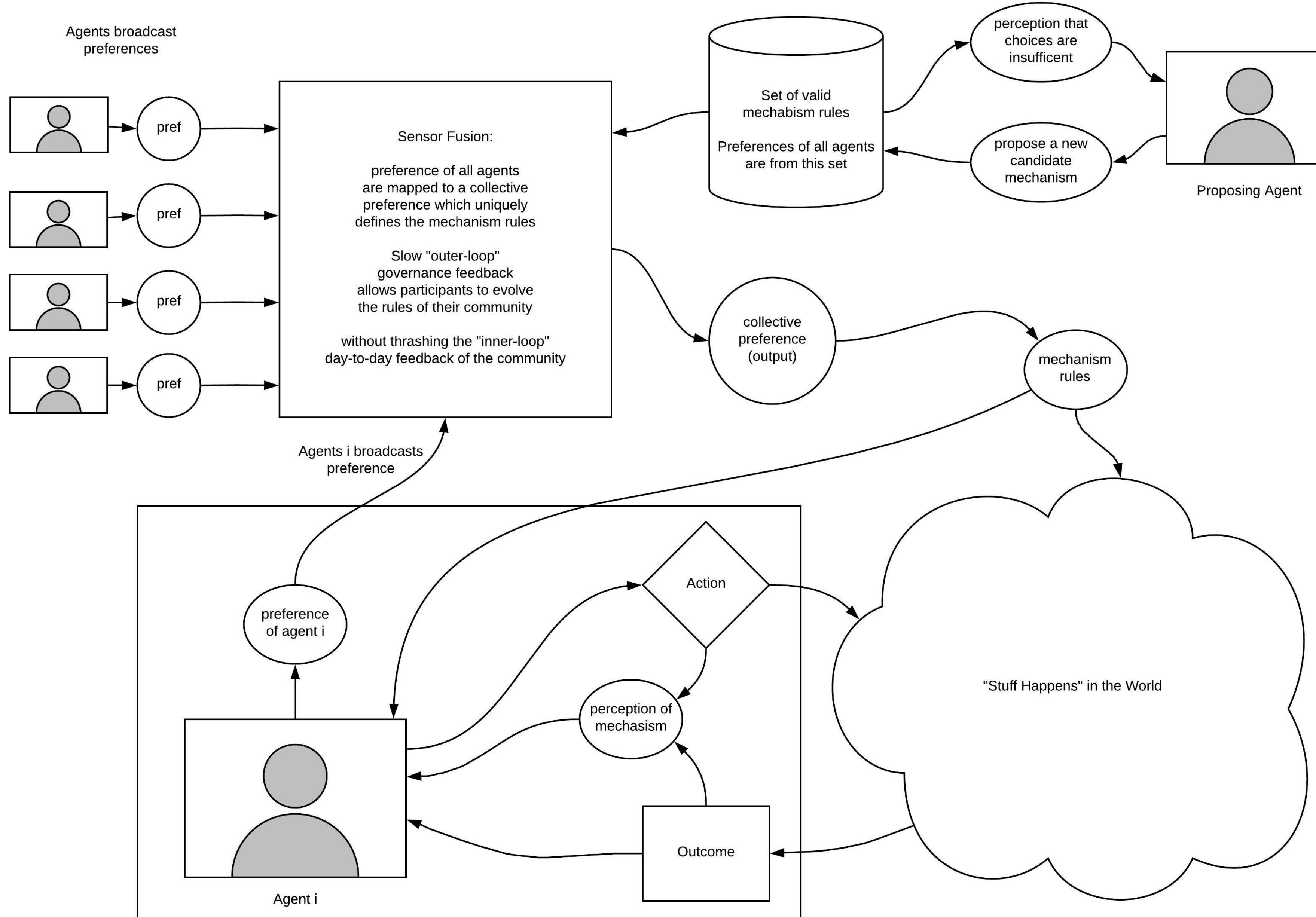


**Choice of Measure is inseparable
from the system itself and its outcomes**

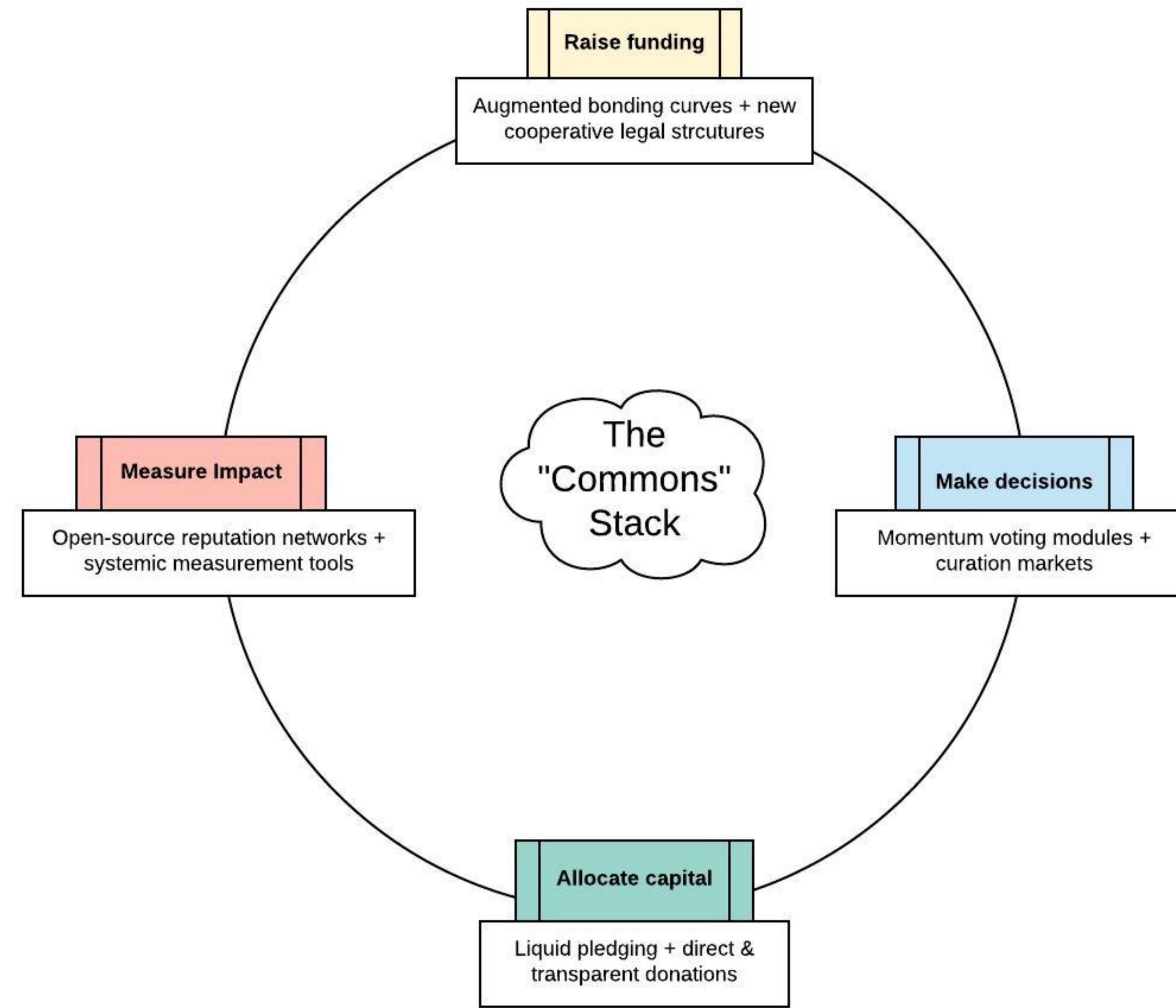
Protocol Governance as Adaptive Maintenance

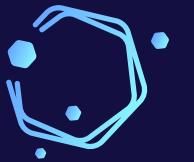


Governance as Multi-scale Adaptation



Autonomous Vs Automated





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Thank you

Web page: <https://block.science/>
Twitter: @mZargham