
**LET'S BRING
SYSTEM DYNAMICS
BACK TO CS!**



YOLO!

ABOUT ME

MARIANNE BELLOTTI - @BELLMAR

- 15+ years as a software engineer
- Lover of complex systems:
 - Legacy Modernization
 - Hybrid intelligence in defense
- 3.5 years doing rescue work on critical systems



WHAT IS SYSTEM DYNAMICS?

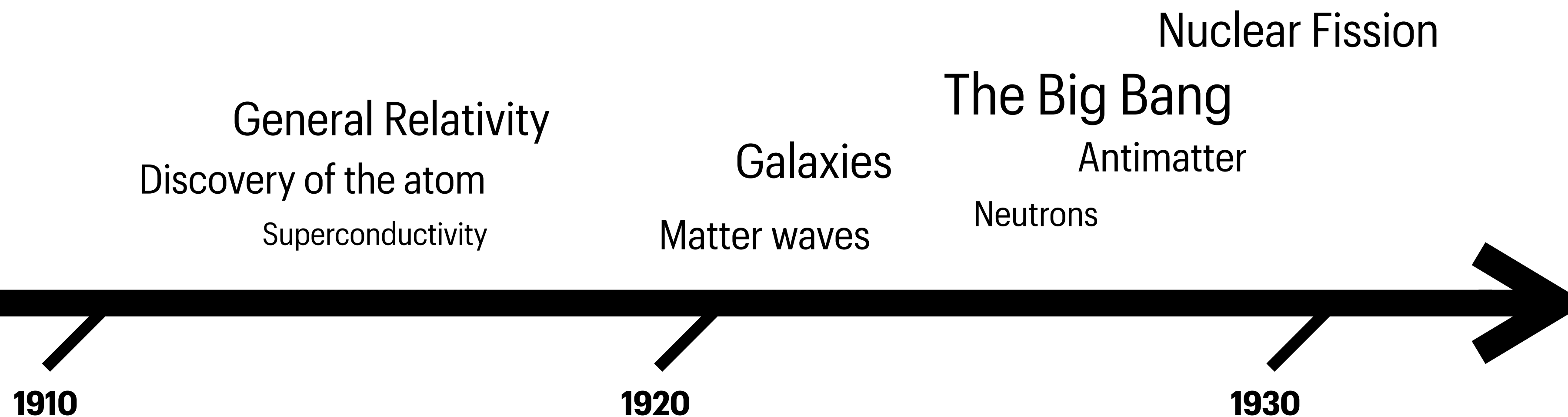
THE LOST MATHEMATICS OF PEOPLE

- **Form of modeling systems**
- **Expressing complex systems in feedback loops**
- **Versus other approaches that focus on logic based rules**
- **Popular in policy circles, but originated at MIT with early computer scientists**

THE MATHEMATICS OF PEOPLE

CYBERNETICS

- Emerged at a time when physics was making huge progress defining the natural world



WHAT IS SYSTEM DYNAMICS?

A Software Engineer's Guide to Cybernetics



Marianne Bellotti
Sep 13, 2020 · 7 min read ★

Before 'cyber' was a prefix for everything internet and computers, it was how mathematicians were going to conquer the world.



- **Computer scientists connected to cybernetics**
 - **John von Neumann: computer architecture**
 - **Warren McCulloch and Walter Pitt: neural networks**
 - **Claude Shannon: Boolean algebra on circuits**
 - **J.C.R. Licklider: ARPAnet**
 - **Alan Turing*: models for cell growth -> Turing machines**

LET'S BRING SYSTEM DYNAMICS BACK TO CS!

WHAT IS SYSTEM DYNAMICS?

FATHER OF SYSTEMS DYNAMICS, JAY WRIGHT FORRESTER

- Magnetic-core memory
- Developed forerunner of RAM
- CS Legend:
 - IEEE Medal of Honor (1972)
 - Howard N. Potts Medal
 - National Medal of Technology and Innovation (1989)
 - Computer History Museum Fellow



WHAT IS SYSTEM DYNAMICS?

THE LOST MATHEMATICS OF PEOPLE

- Involved in the cybernetics movement at MIT
- Moved to MIT Sloan in 1956
- Coined the term “system dynamics”
- Control theory for economics



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No hard problems
left in CS, peace out!



CONTROL THEORY

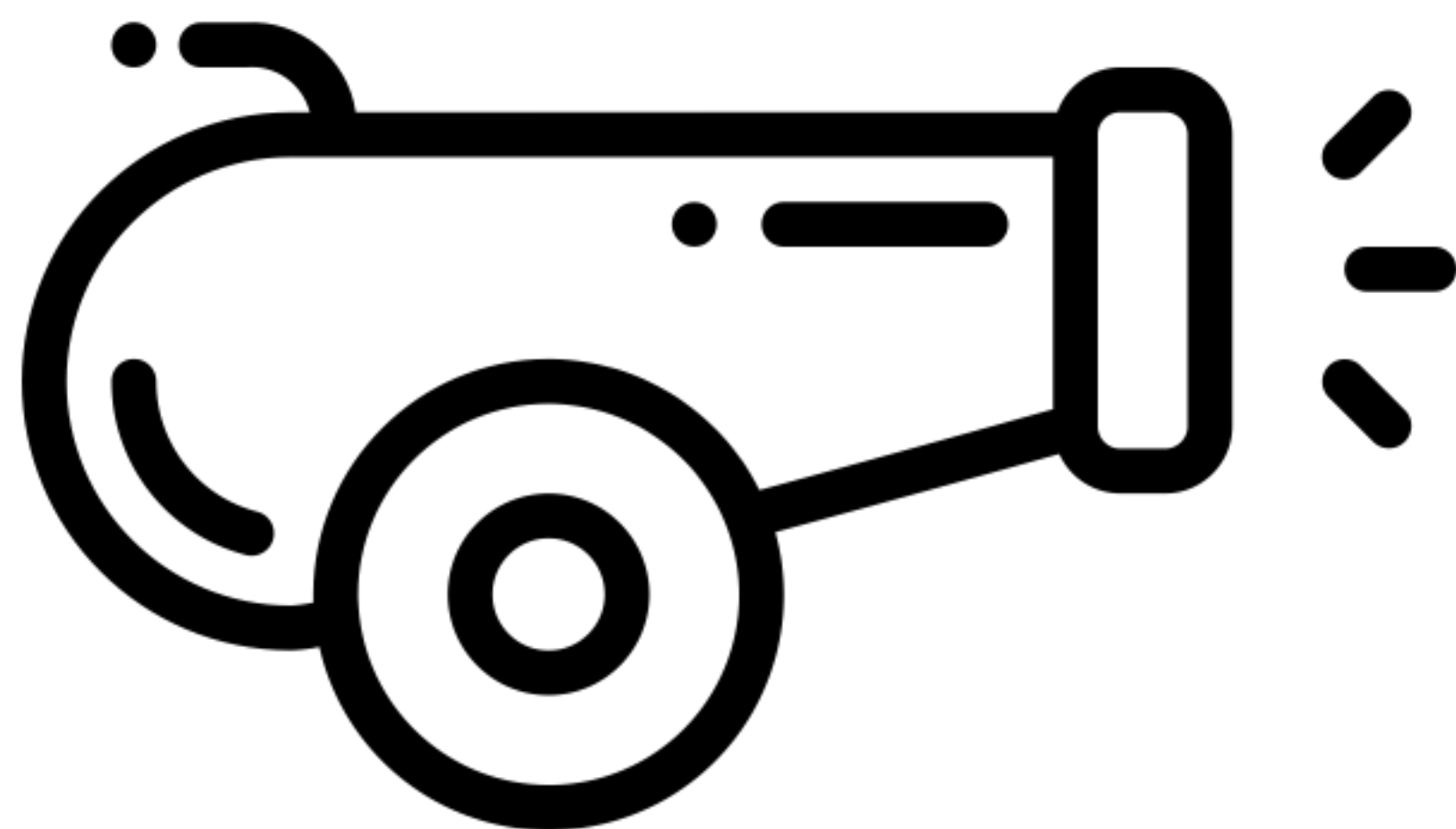
FEEDBACK LOOPS EVERYWHERE!

We always seem to have either too much or too little inventory! Build a computer to fix this please!

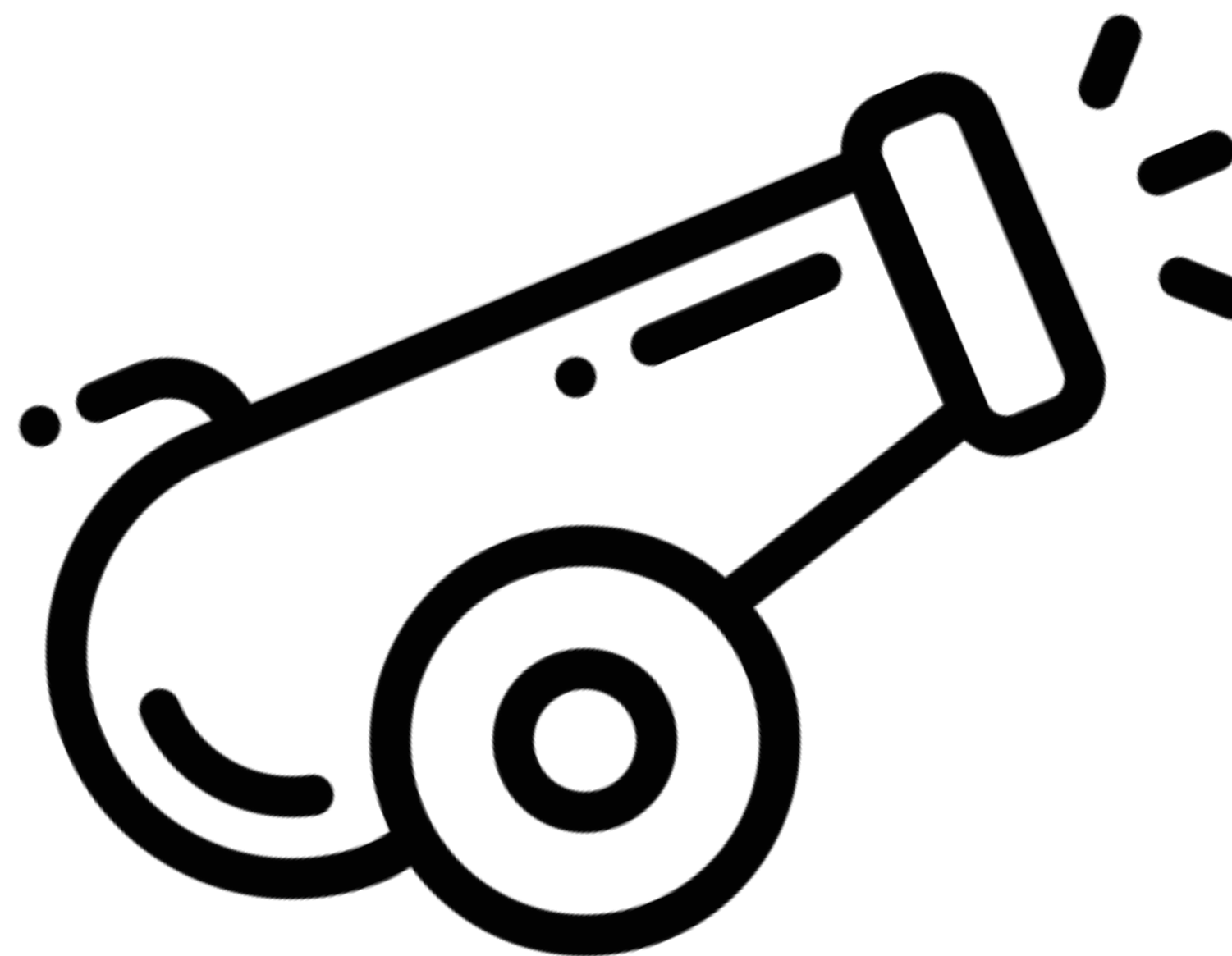


CONTROL THEORY

FEEDBACK LOOPS EVERYWHERE!

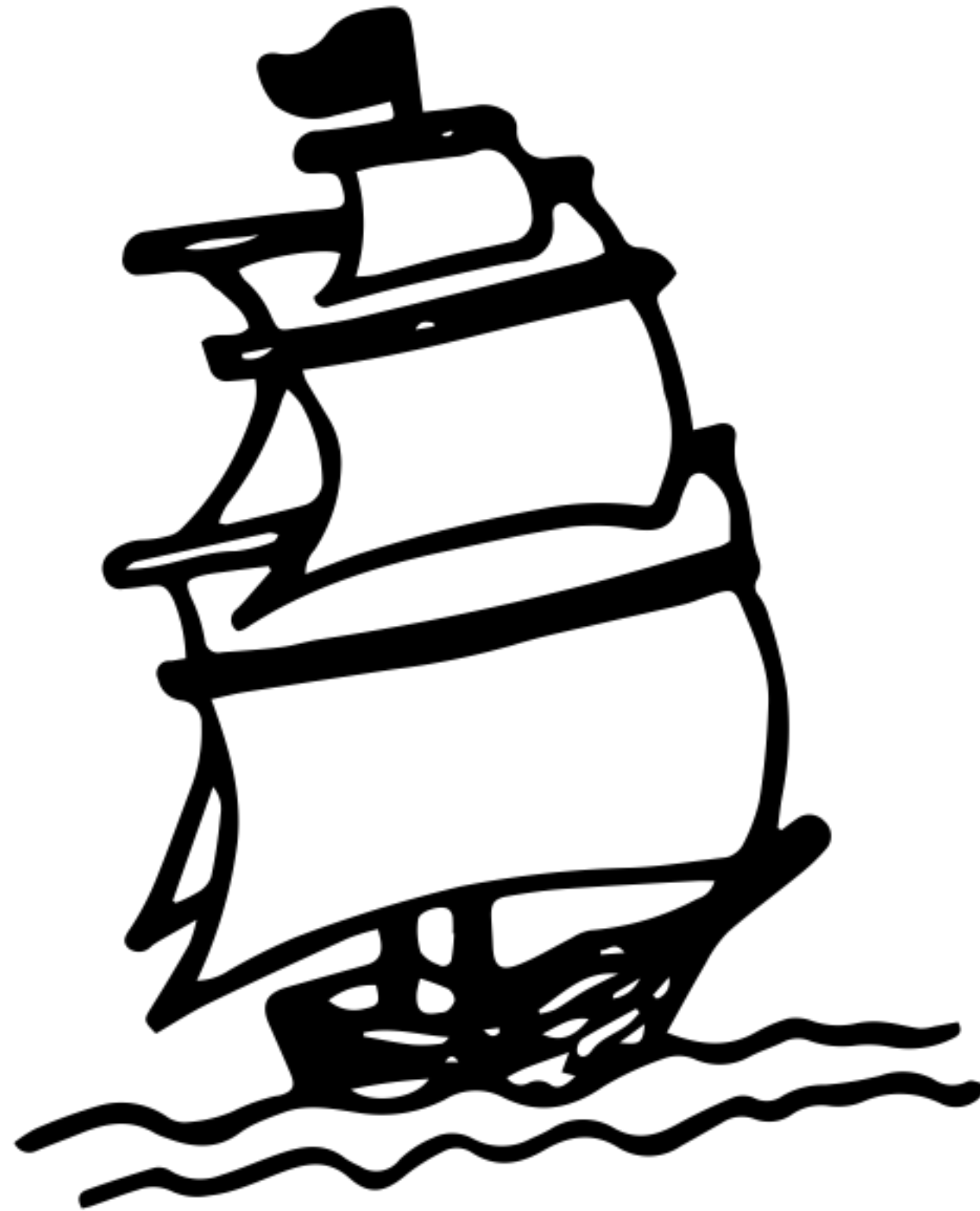


Missed Shot



Overcorrection

CONTROL THEORY

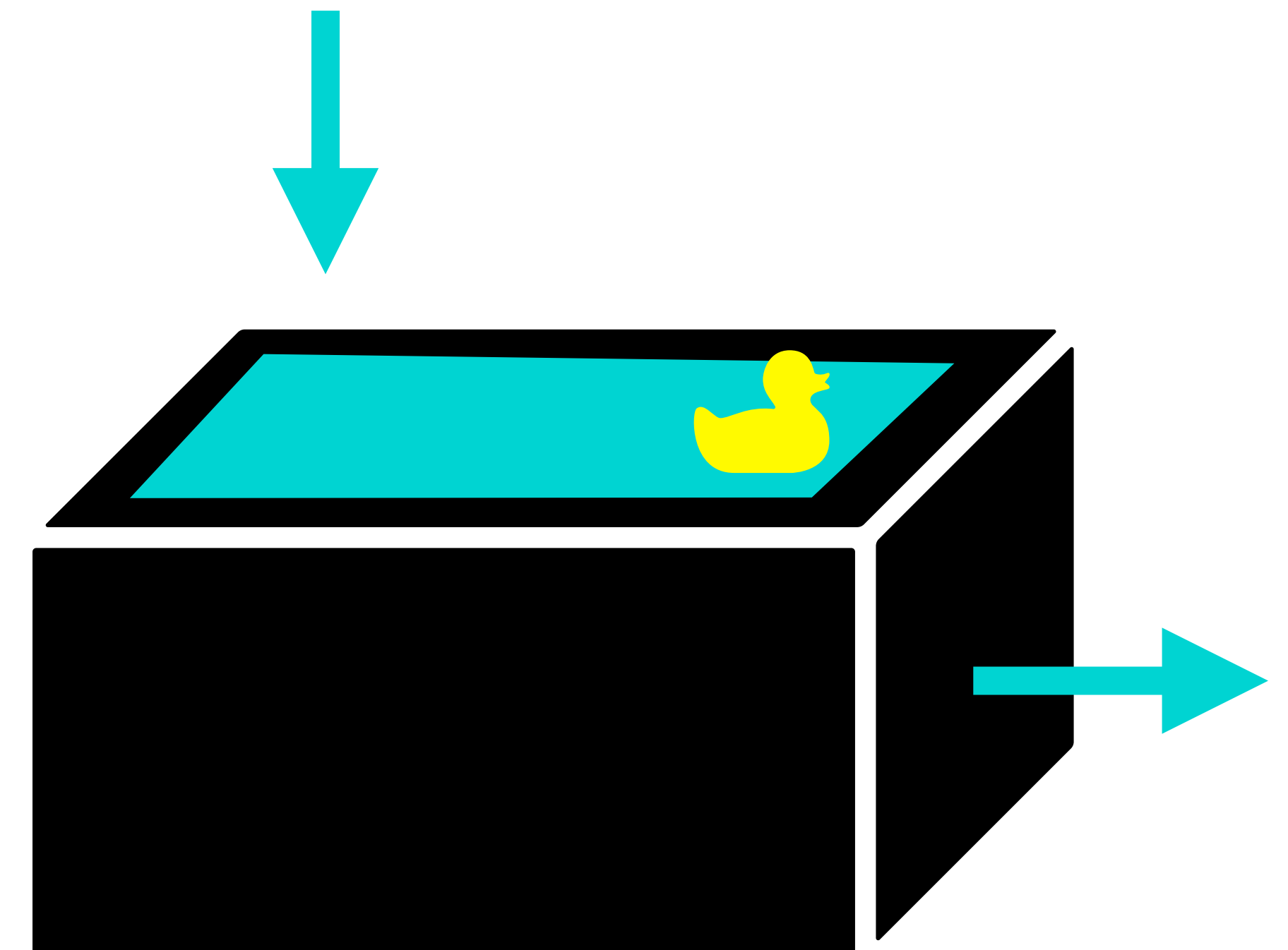


- **Environmental forces respond to changes and need to be factored in:**
- **Counteracting: limit, restrict the change**
- **Intensifying: amplify the change**

WHAT IS SYSTEM DYNAMICS?

STOCKS AND FLOWS

- Two primary abstractions
 - Stocks: pools of resources
 - Flows: rates of change on those resources



MODELING IN SOFTWARE

PROOFS & OTHER FORMAL METHODS

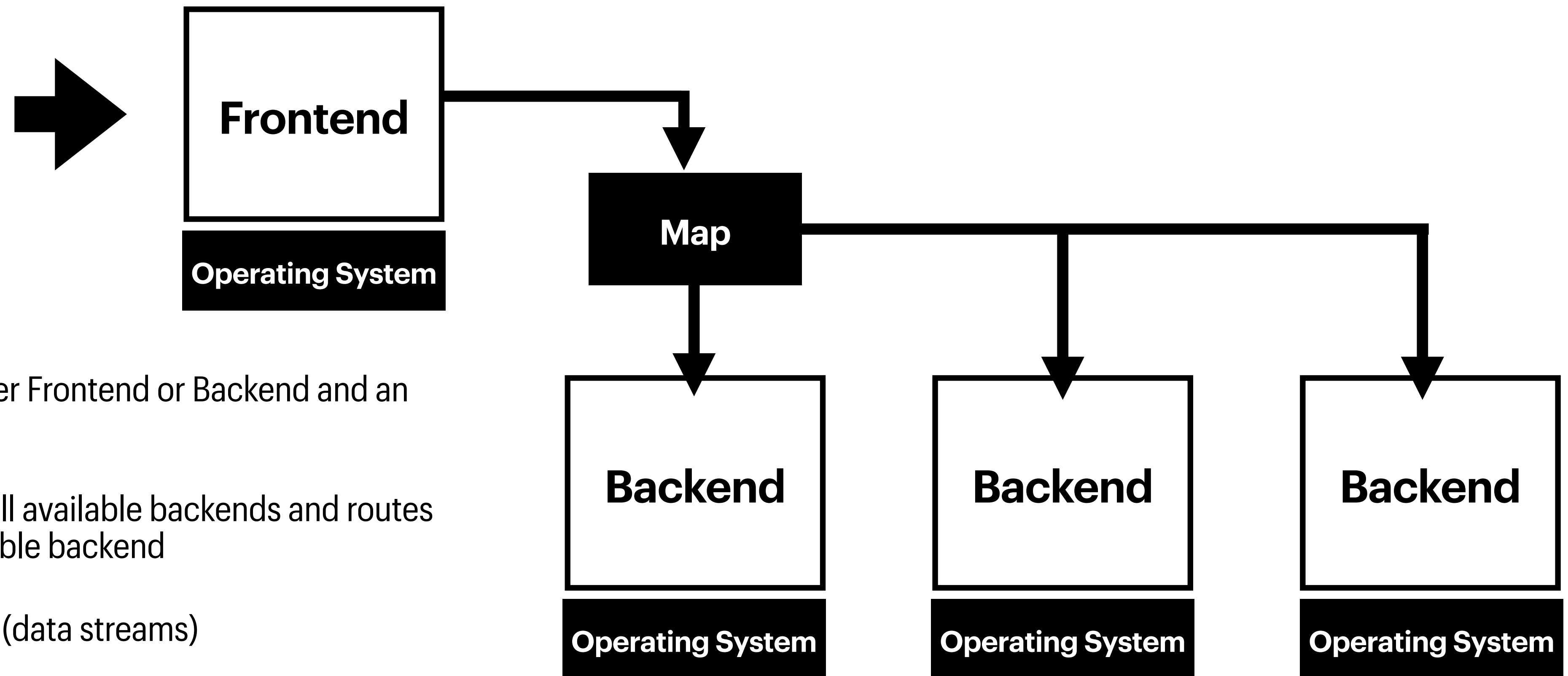
- **Despite realizing huge benefits from system dynamics type modeling and research, this is not how computer scientists think about systems today.**
- **Purely anecdotal, i.e. threat modeling**
- **Formal Methods:**
 - **Mathematical correctness**
 - **Coq (proofs), TLA+ (concurrency), Alloy (relational)**

DISTRIBUTED SYSTEMS

PROBLEMS IN THE CLOUD

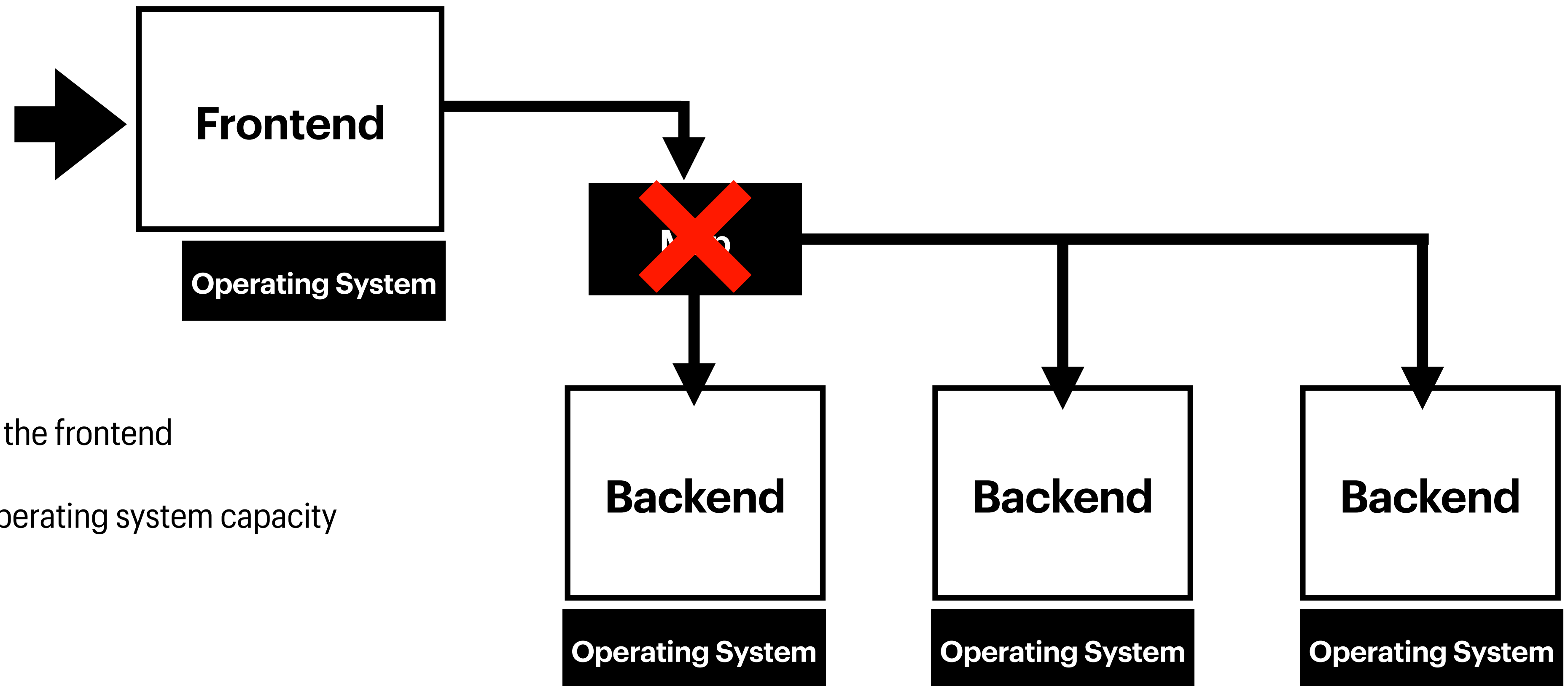
- **Mathematical correctness focuses on impossible states**
- **But distributed systems tend to fail due to *undesirable* states.**
 - **Feedback loops create a context that triggers unexpected behavior**

AWS KINESIS (2019)



- Servers have applications either Frontend or Backend and an operating system
- Frontend generates a map of all available backends and routes incoming requests to an available backend
- Backends process the request (data streams)

AWS KINESIS (2019)



- AWS increases the memory of the frontend
- Frontend now overloads the operating system capacity
- Frontend crash corrupts map

AWS KINESIS

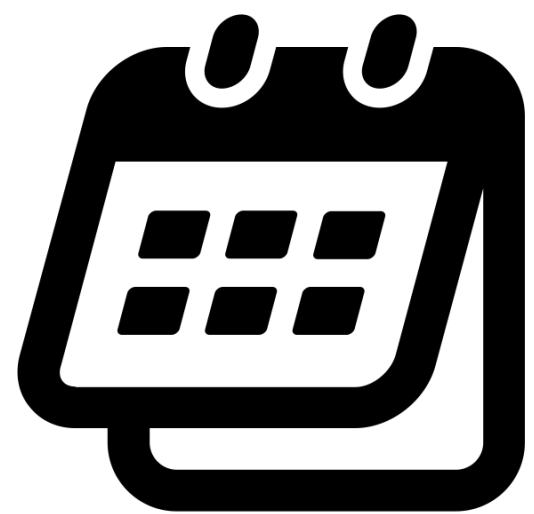
COULD WE HAVE FOUND THIS PROBLEM WITH FORMAL VERIFICATION?

- **In theory: Yes, we can write a proof that shows the frontend can exhaust the capacity of the underlining operating system.**
- **In practice: why would we consider the operating system in scope?**
- **The real problem is feedback loops between operating system state, frontend state and backend state**

OTHER EXAMPLES

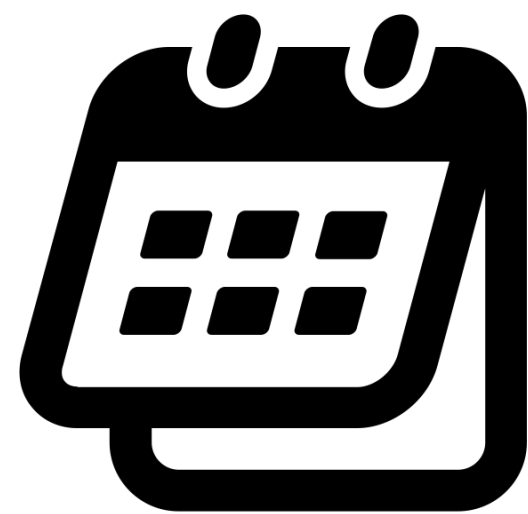
SOME BAD QUARTERS IN 2019

MARCH



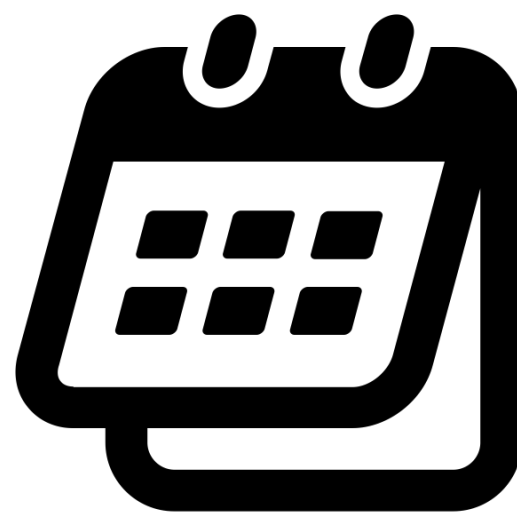
- Facebook
- Instagram

APRIL



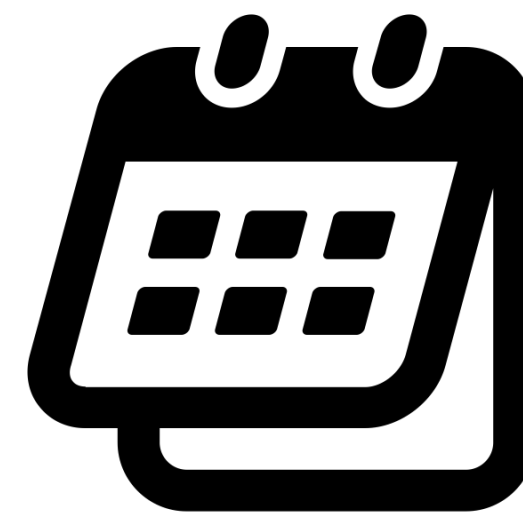
- AeroData

MAY



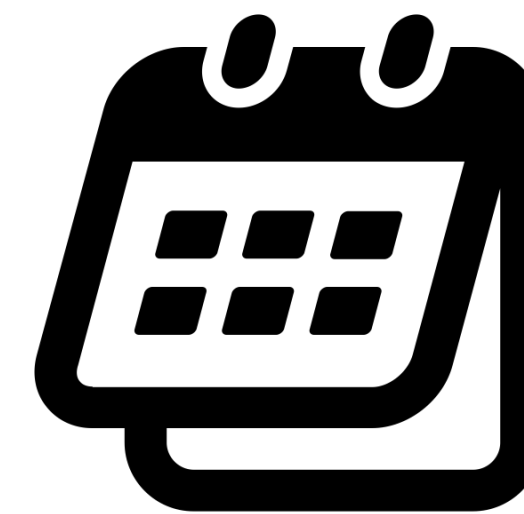
- Microsoft
- Salesforce

JUNE



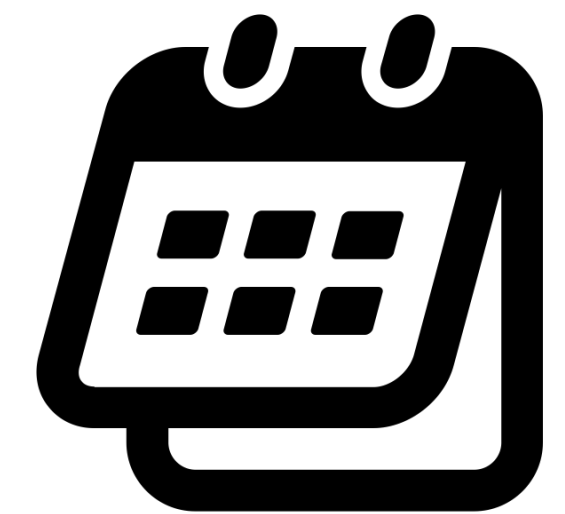
- Google
- Verizon
- Slack

JULY



- Cloudflare
- Facebook
- Twitter
- Apple
- Twitter again!

AUGUST



- Comcast

SYSTEMS OF SYSTEMS

NOT "HUMAN ERROR"

- The largest cause of these types of failures is "configuration change"
- But these changes are stable within their subsystem
- Modern computer systems chain several systems together, creating feedback loops
- Tight coupling makes it difficult to stop failure from cascading through the system

FORMAL METHODS

PROBLEMS IN THE CLOUD

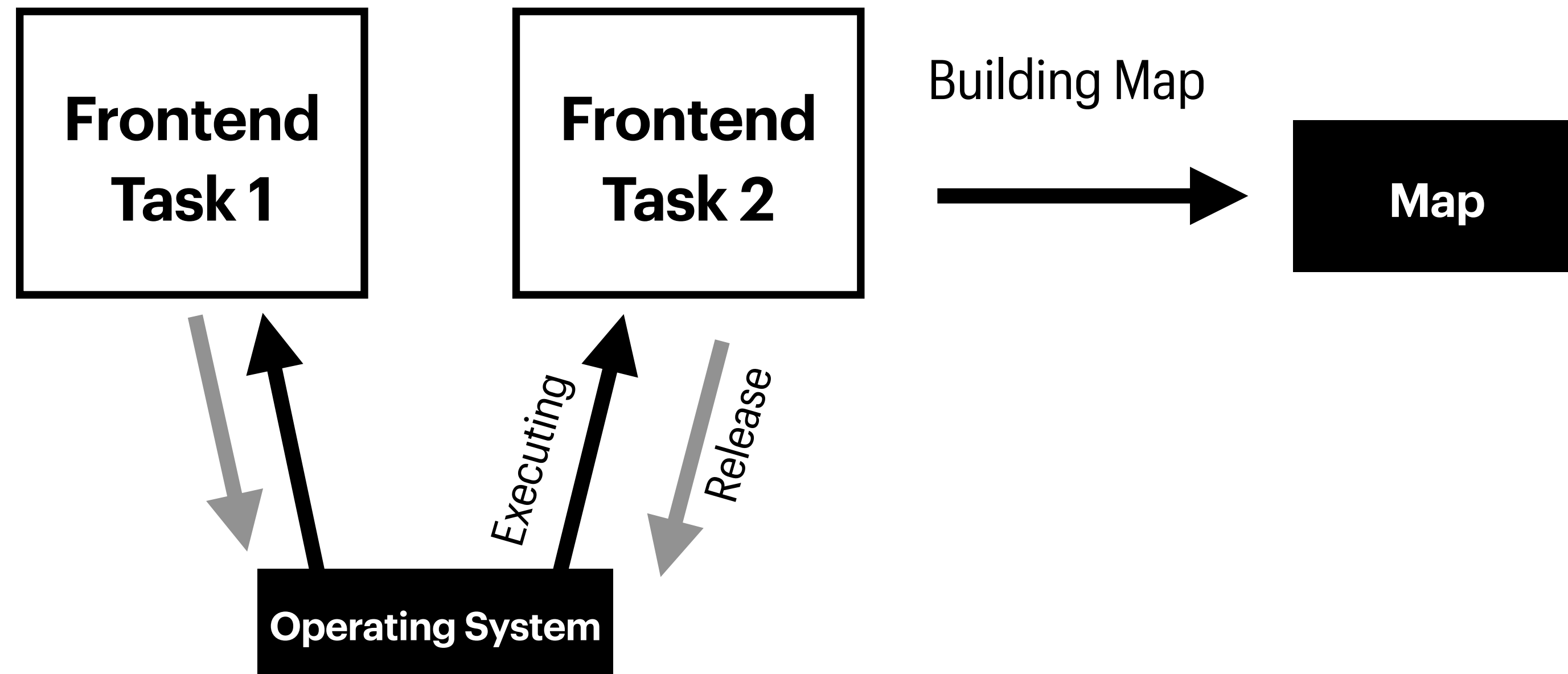
- **Mathematical correctness focuses on impossible states**
- **But distributed systems tend to fail due to *undesirable* states.**
 - **Feedback loops create a context that triggers unexpected behavior**
 - **Ratio of complexity to tight coupling**

BENEFITS

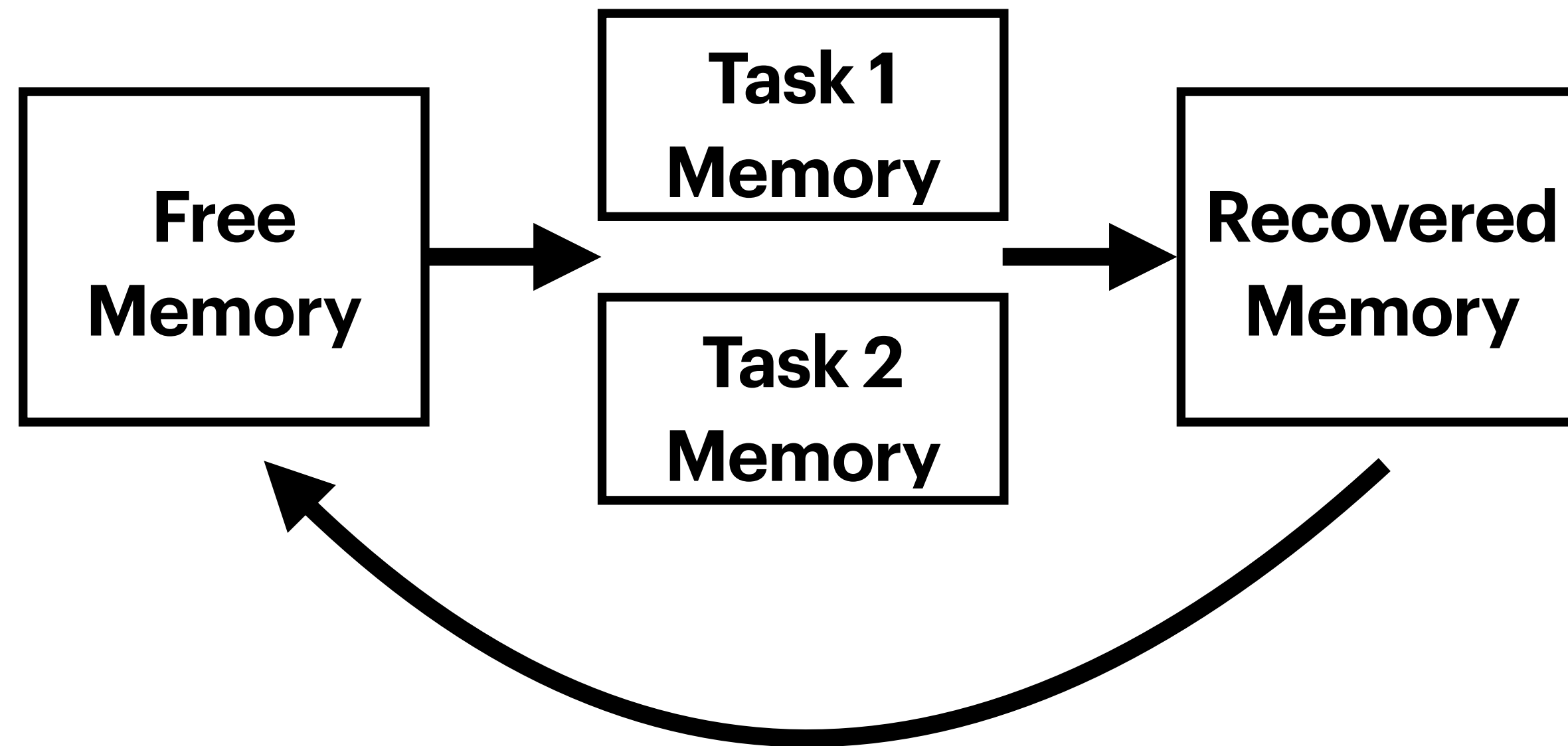
SPECS FOR DISTRIBUTIVE SYSTEMS

- **Stock/Flow models are good at expressing coupling**
 - **Changes within a single flow → tightly coupled**
 - **Flows separated by a stock → loosely coupled**
- **Like threat modeling, system dynamics can help us reason about risks**

FLOW OF RESOURCES



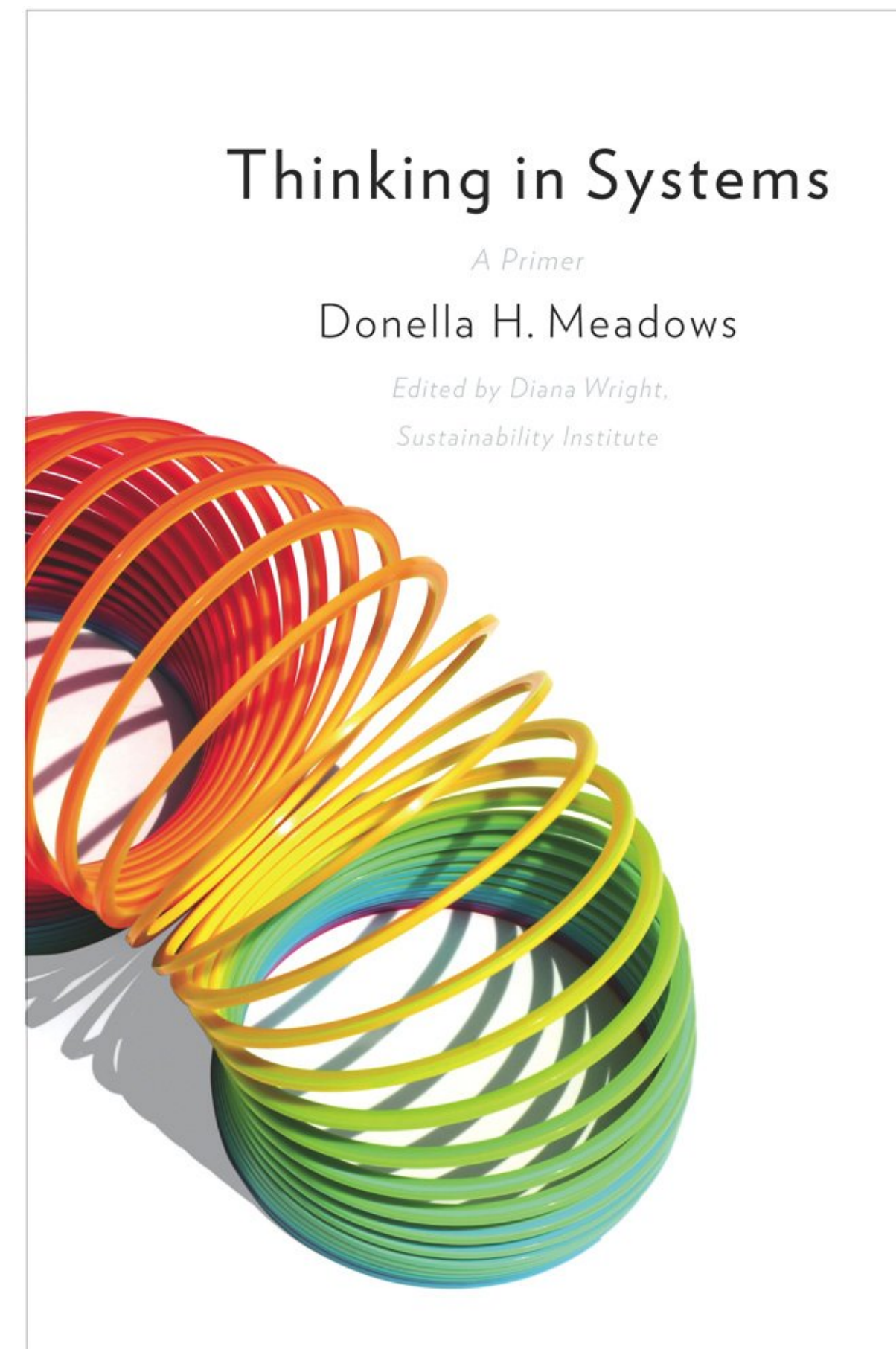
FLOW OF RESOURCES



LEARN

APPLYING SYSTEM DYNAMIC MODELS TO COMPUTER SYSTEMS

- ***Thinking in Systems, Donella Meadows***
- **System Dynamics Society**
(systemdynamics.org)
- **Loopy (ncase.me/loopy) simulations of simple models**



TOOLS

APPLYING SYSTEM DYNAMIC MODELS TO COMPUTER SYSTEMS

- Insight Maker (insightmaker.com)
- Simlin (simlin.com)
- PySD (pysd.readthedocs.io)
- PowerSim, Vensim, iThink and STELLA

FAULT

APPLYING SYSTEM DYNAMIC MODELS TO COMPUTER SYSTEMS

- Model checking for system dynamic models
- SMT solver under the hood
- Uses types to eliminate common model mistakes
- Doing a podcast about my experiences—>



Let's demo!



Keep in touch @bellmar



THANK YOU!

[HTTPS://WWW.GITHUB.COM/FAULT-LANG](https://www.github.com/fault-lang)