

Without Resilience
Nothing Else Matters

JONAS BONÉR

CTO TYPESAFE

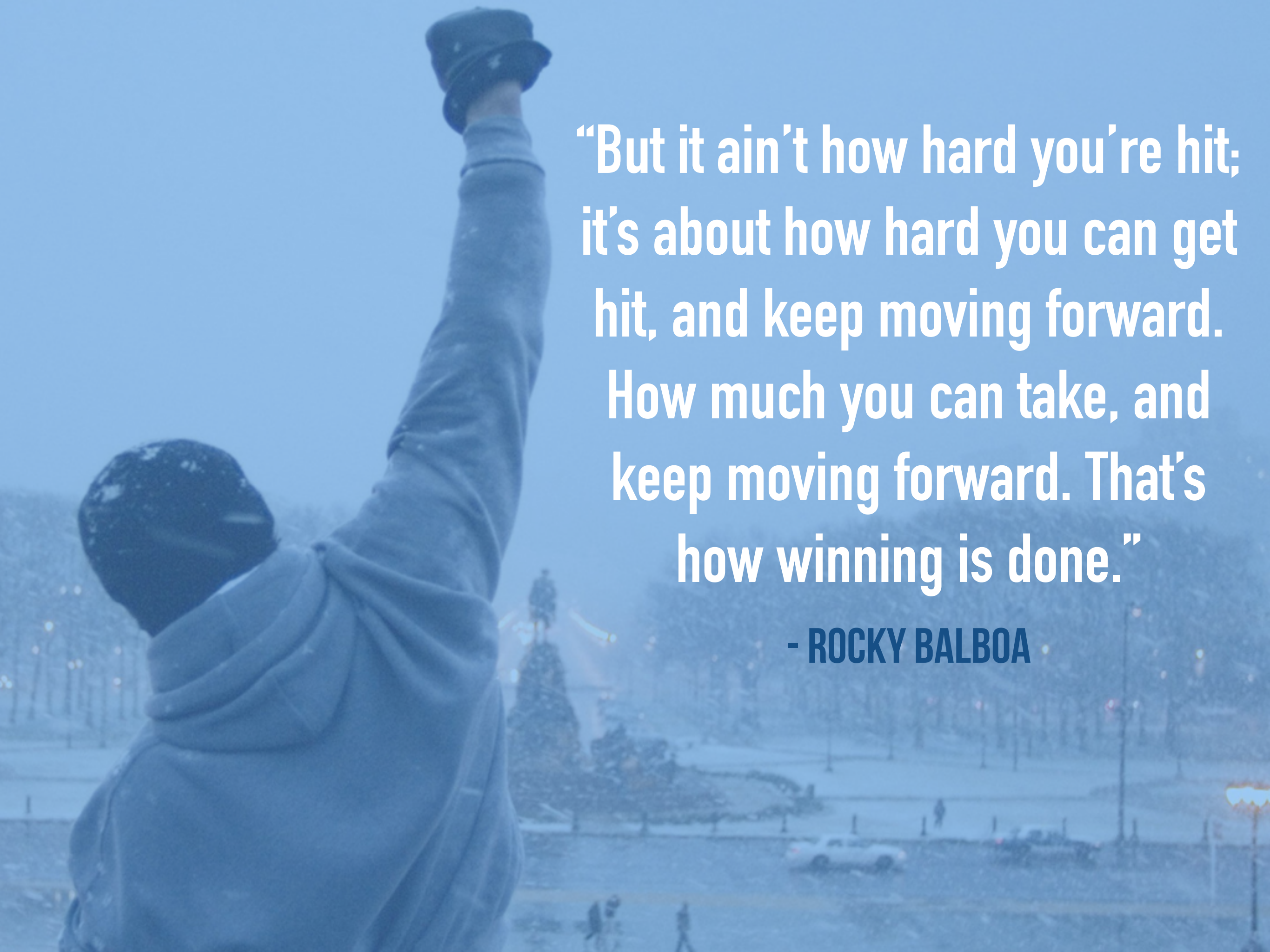
@JBONER

Without Resilience
Nothing Else Matters

JONAS BONÉR

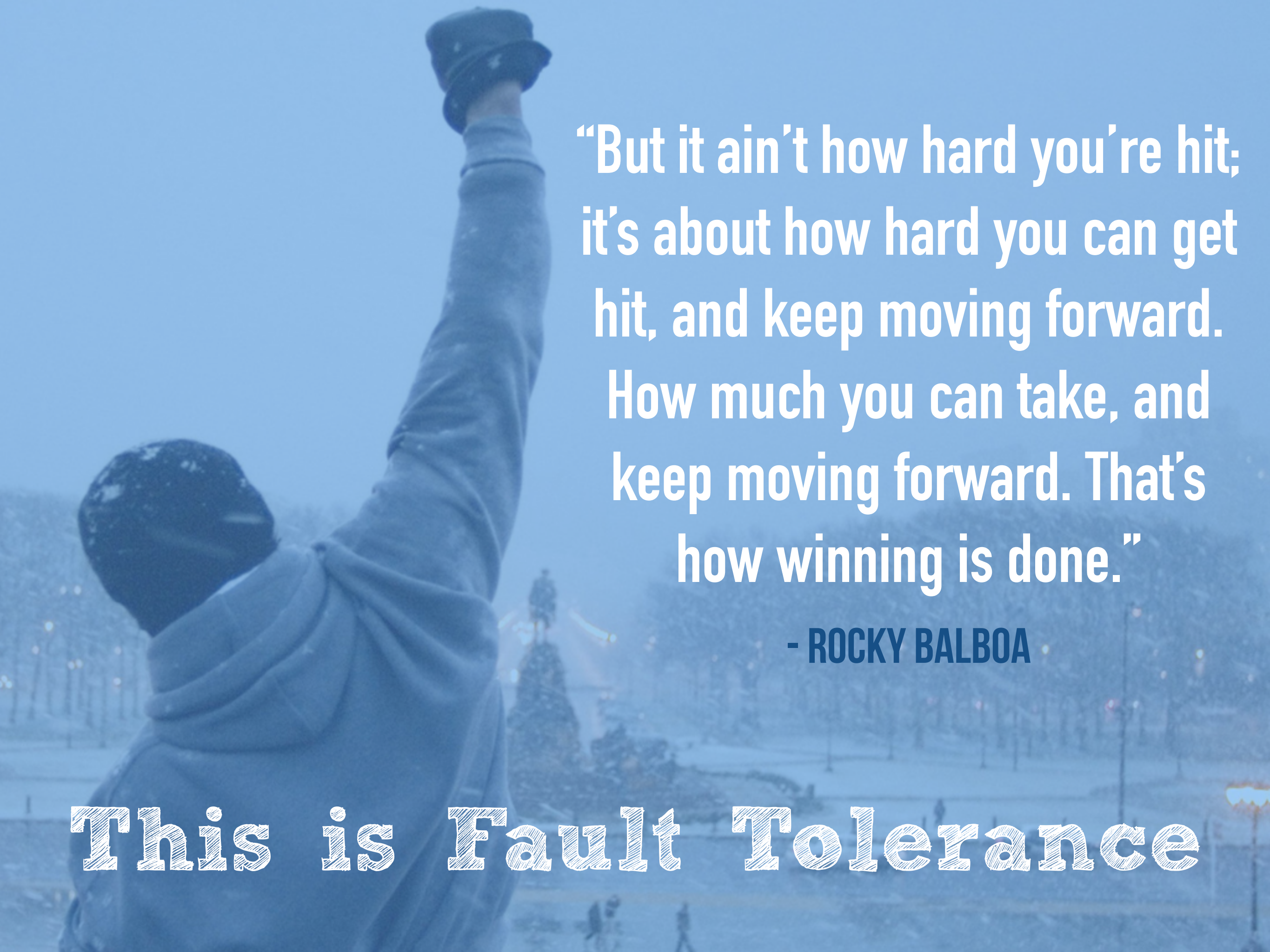
CTO TYPESAFE

@JBONER

A person in a grey hoodie and a black beanie with a white star on the side is seen from the back, raising their right arm in a victory gesture. The background is a snowy city street at night, with a large, brightly lit Christmas tree in the distance and other city lights visible through the falling snow.

“But it ain’t how hard you’re hit;
it’s about how hard you can get
hit, and keep moving forward.
How much you can take, and
keep moving forward. That’s
how winning is done.”

- ROCKY BALBOA

A blue-tinted photograph of Rocky Balboa from the movie 'Rocky'. He is seen from the back, wearing a dark beanie and a dark hoodie, with his right arm raised high, fist clenched. He is standing in a snowy field with trees and a small Christmas tree in the background. The sky is overcast.

“But it ain’t how hard you’re hit;
it’s about how hard you can get
hit, and keep moving forward.
How much you can take, and
keep moving forward. That’s
how winning is done.”

- ROCKY BALBOA

This is Fault Tolerance

Resilience
is Beyond
Fault Tolerance

Resilience

**“The ability of a substance or object to spring back into shape.
The capacity to recover quickly
from difficulties.”**

-MERRIAM WEBSTER

Antifragility

“Antifragility is beyond resilience and robustness. The resilient resists shock and stays the same; the antifragile gets better.”

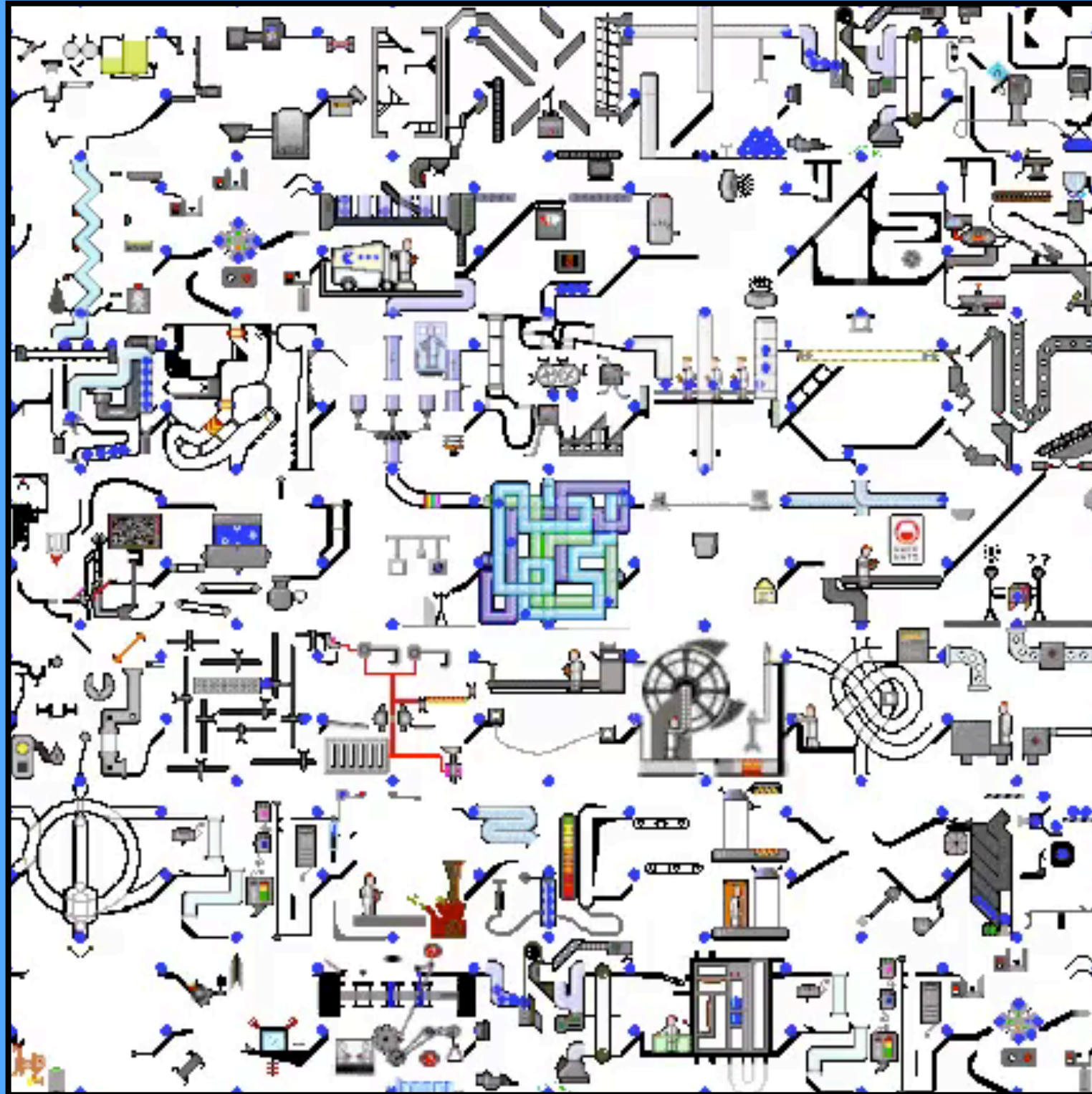
- NASSEM NICHOLAS TALEB

**“We can model and understand in isolation.
But, when released into competitive nominally
regulated societies, their connections proliferate,
their interactions and interdependencies multiply,
their complexities mushroom.
And we are caught short.”**

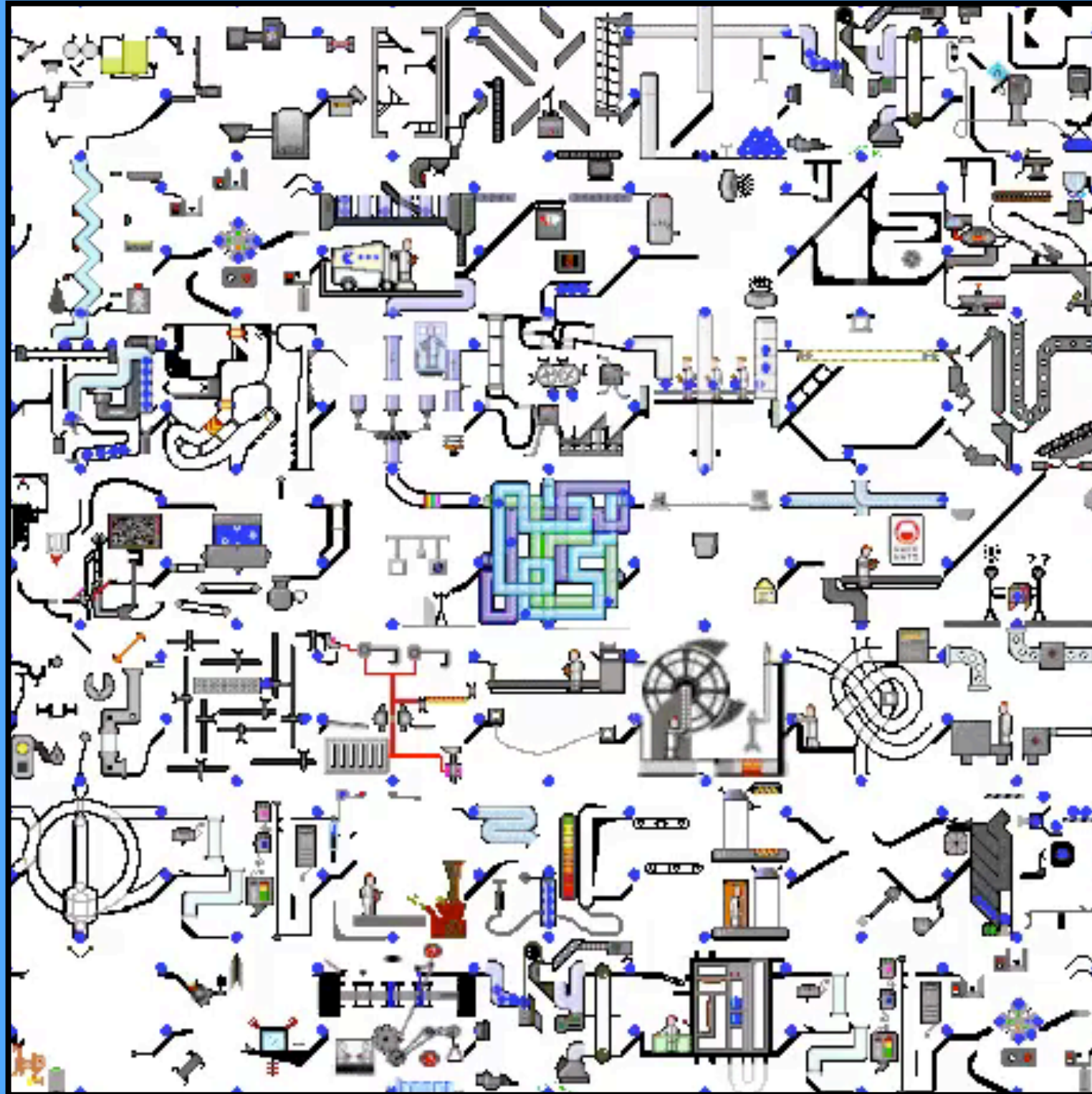
- SIDNEY DEKKER

**We Need to Study
Resilience in
Complex Systems**

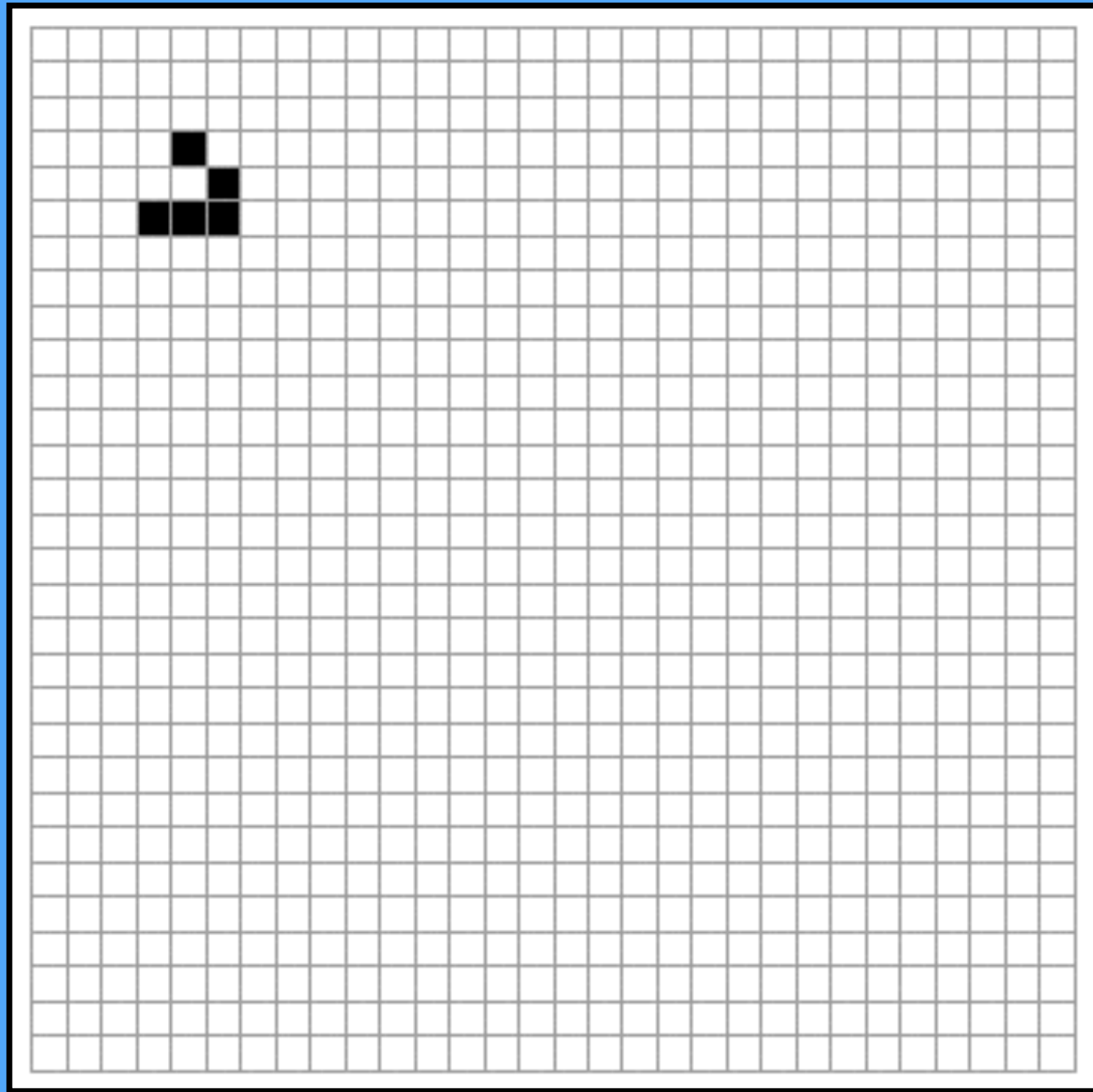
Complicated System



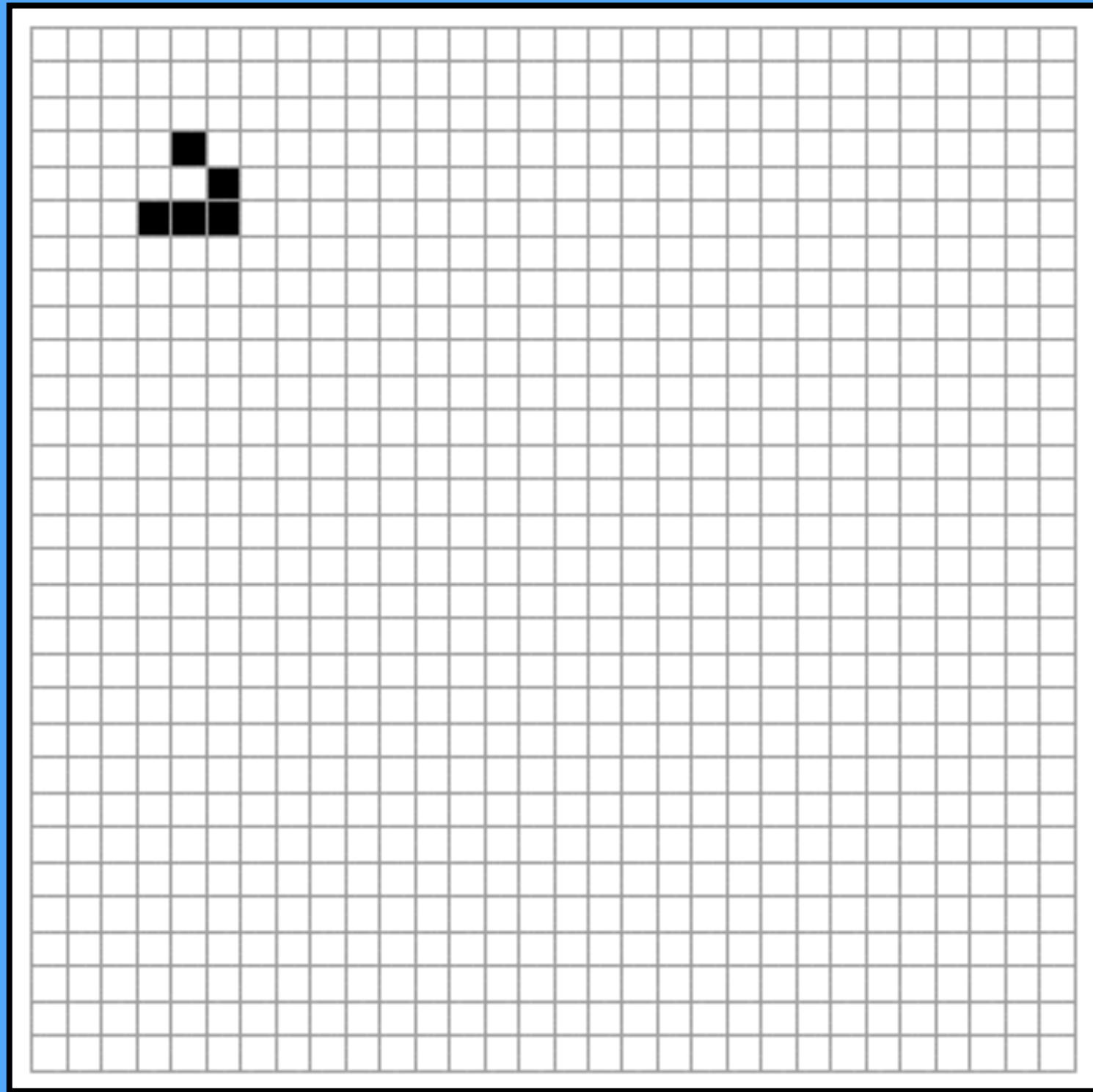
Complicated System



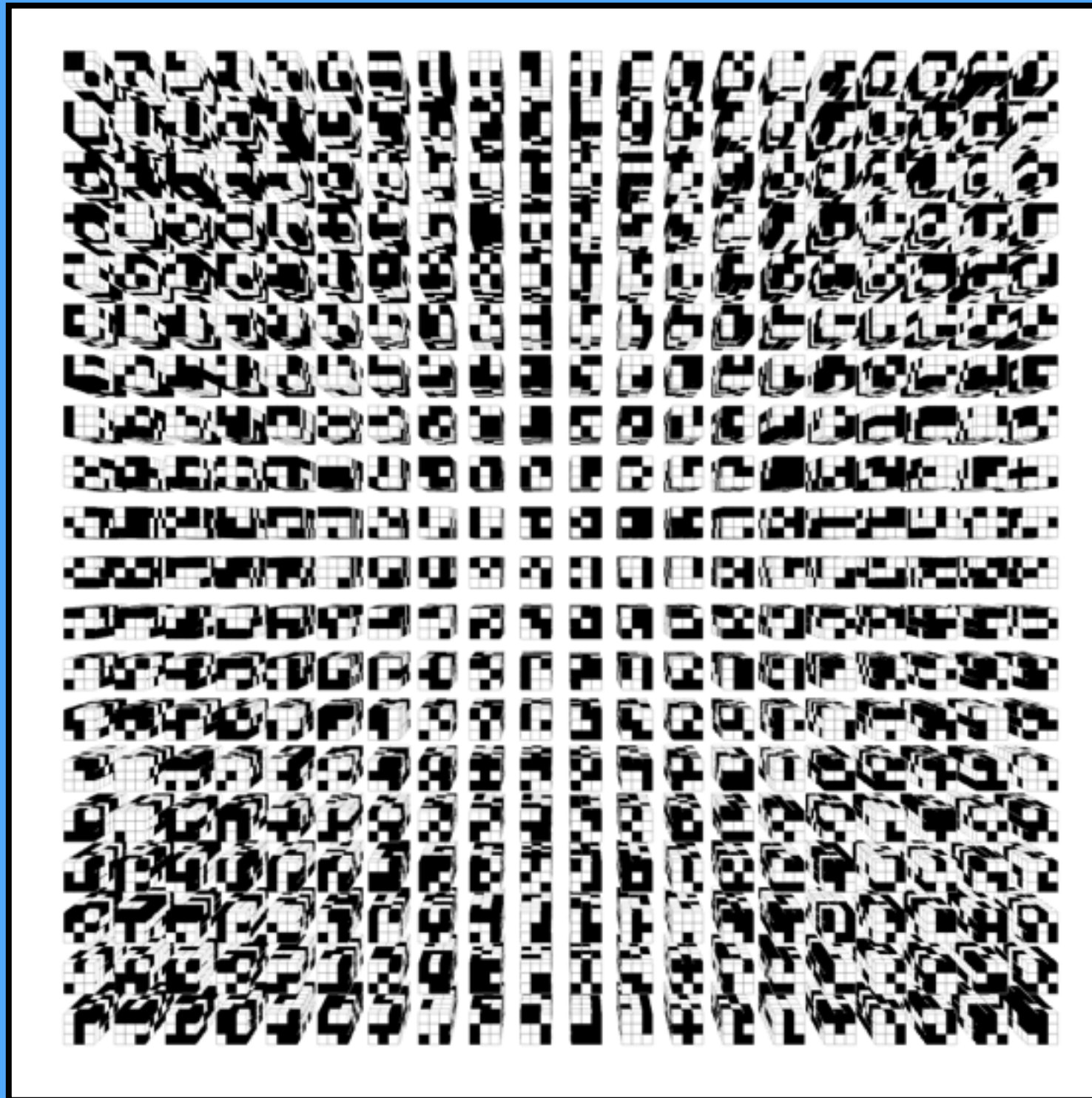
Complex System



Complex System



Complex System



COMPLICATED \neq COMPLEX

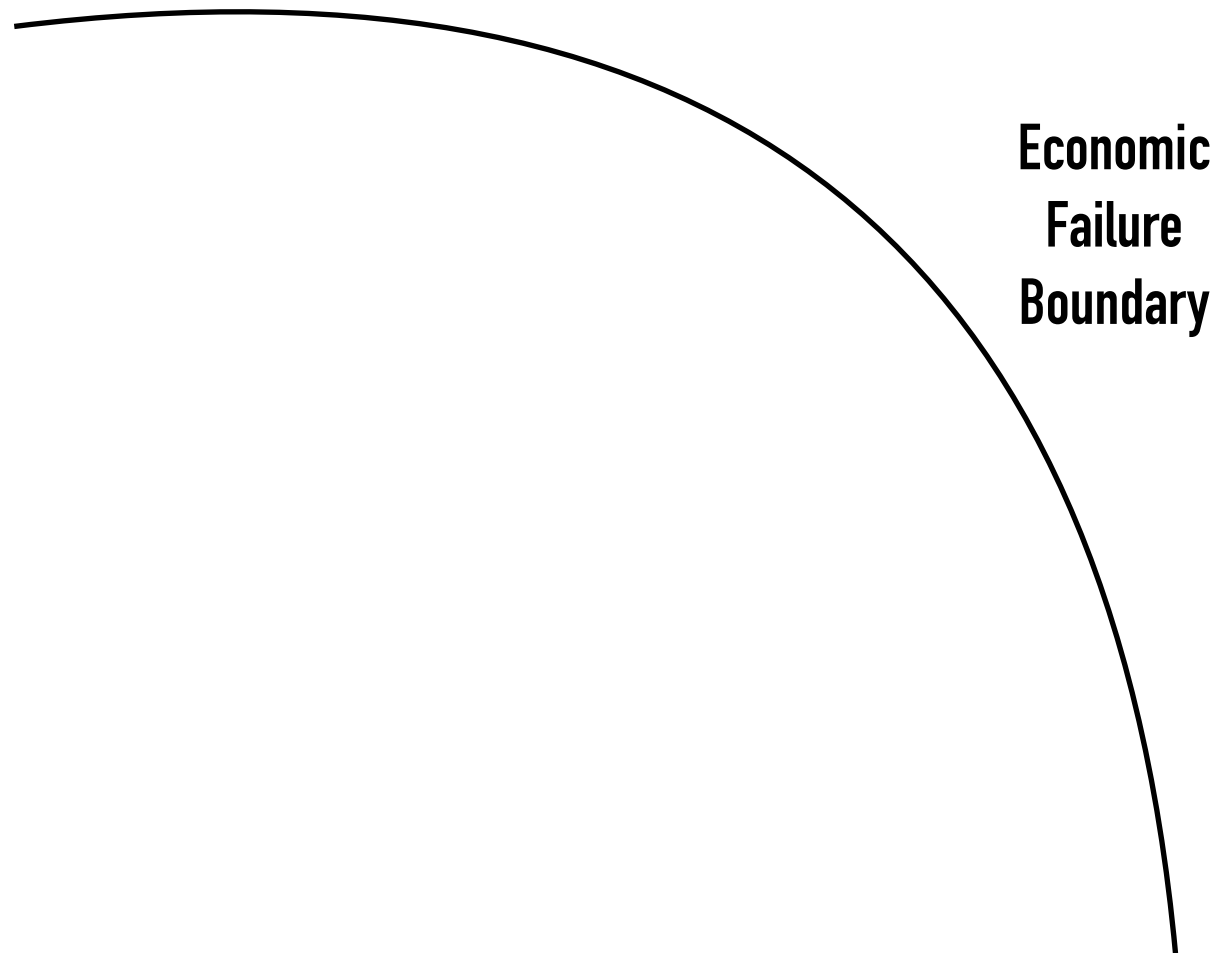
“Counterintuitive. That’s [Jay] Forrester’s word to describe complex systems. Leverage points are not intuitive. Or if they are, we intuitively use them backward, systematically worsening whatever problems we are trying to solve.”

- DONELLA MEADOWS

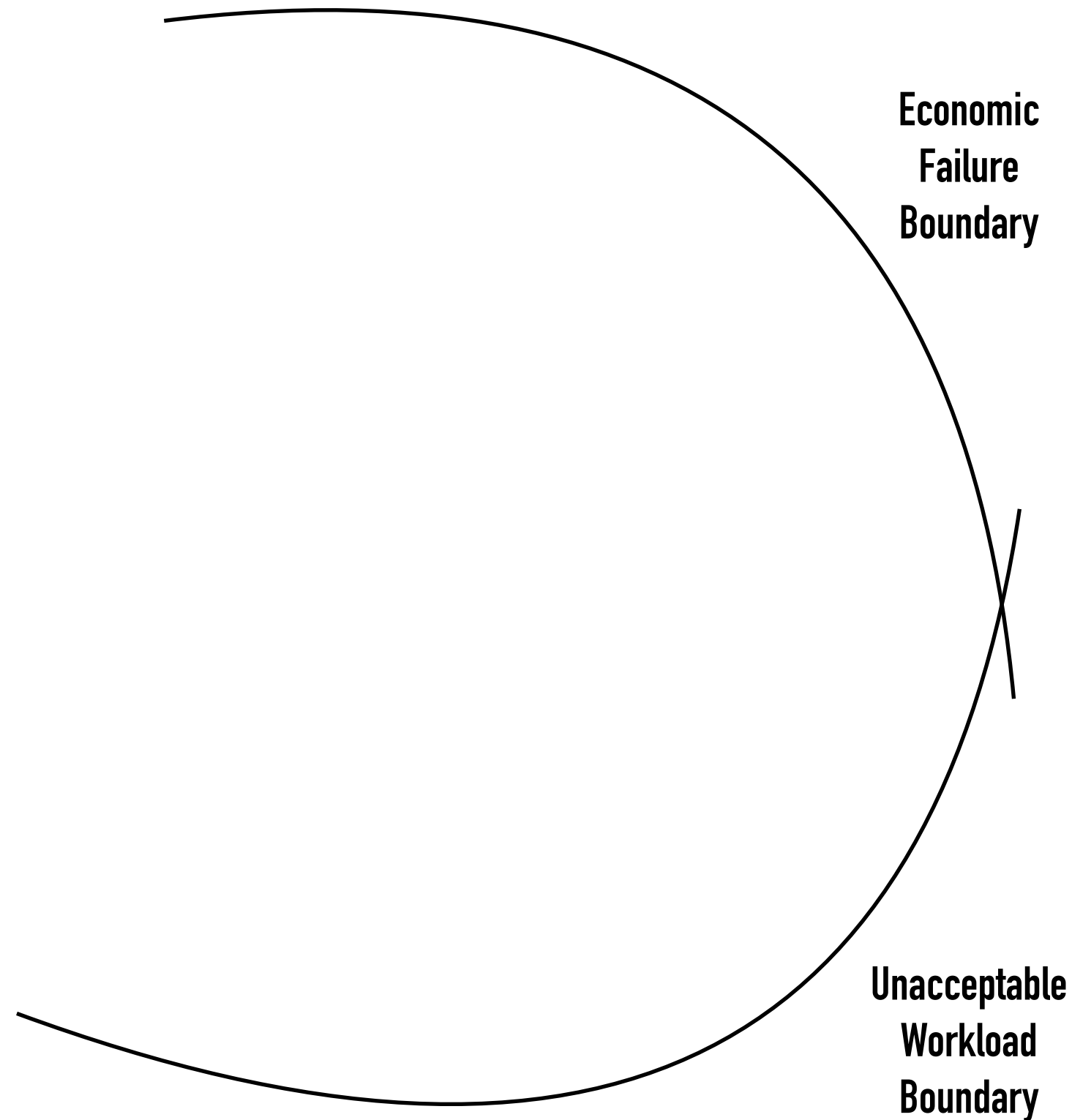
Operating at the Edge of Failure

“Going solid”: a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure

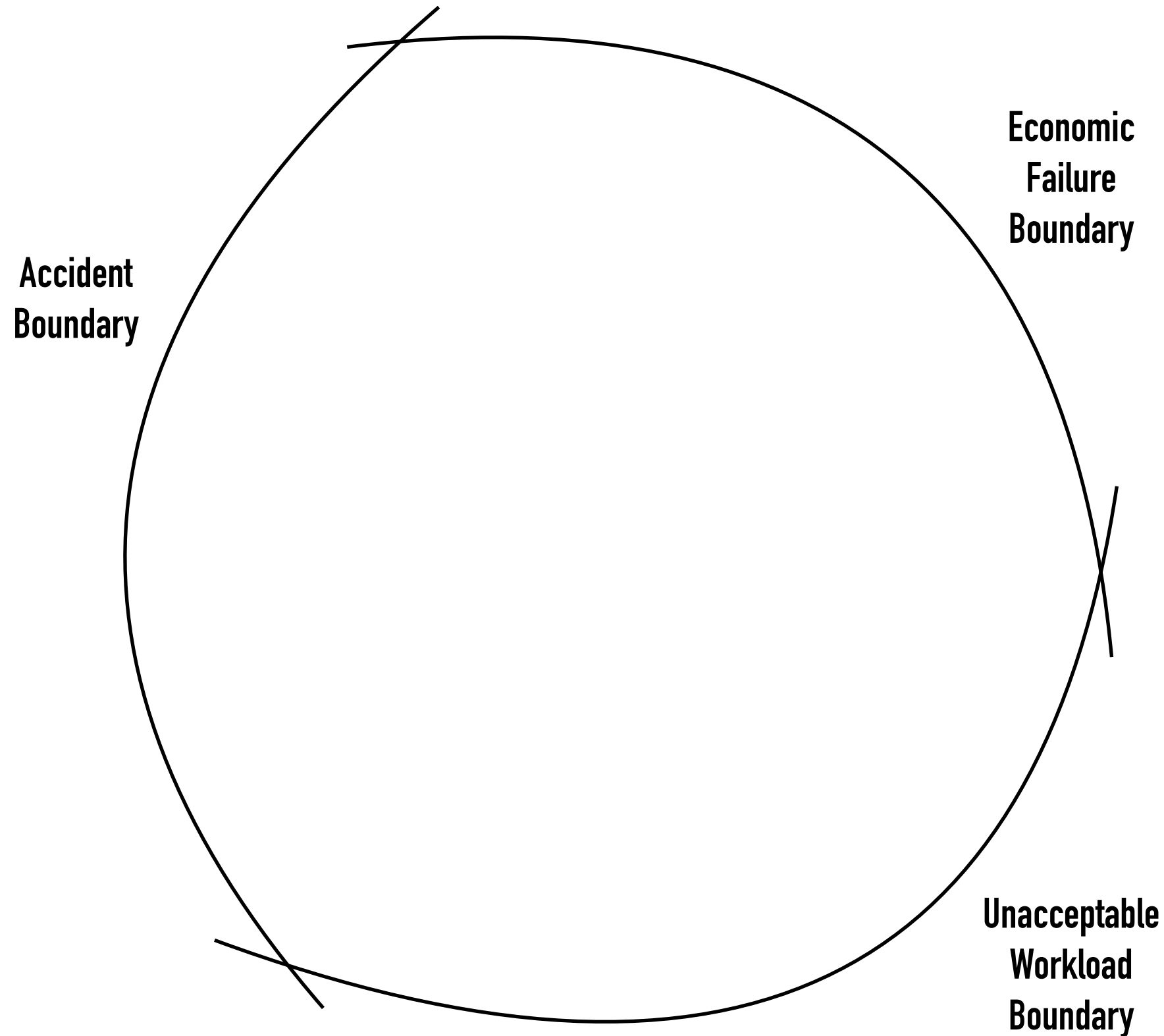


Operating at the Edge of Failure



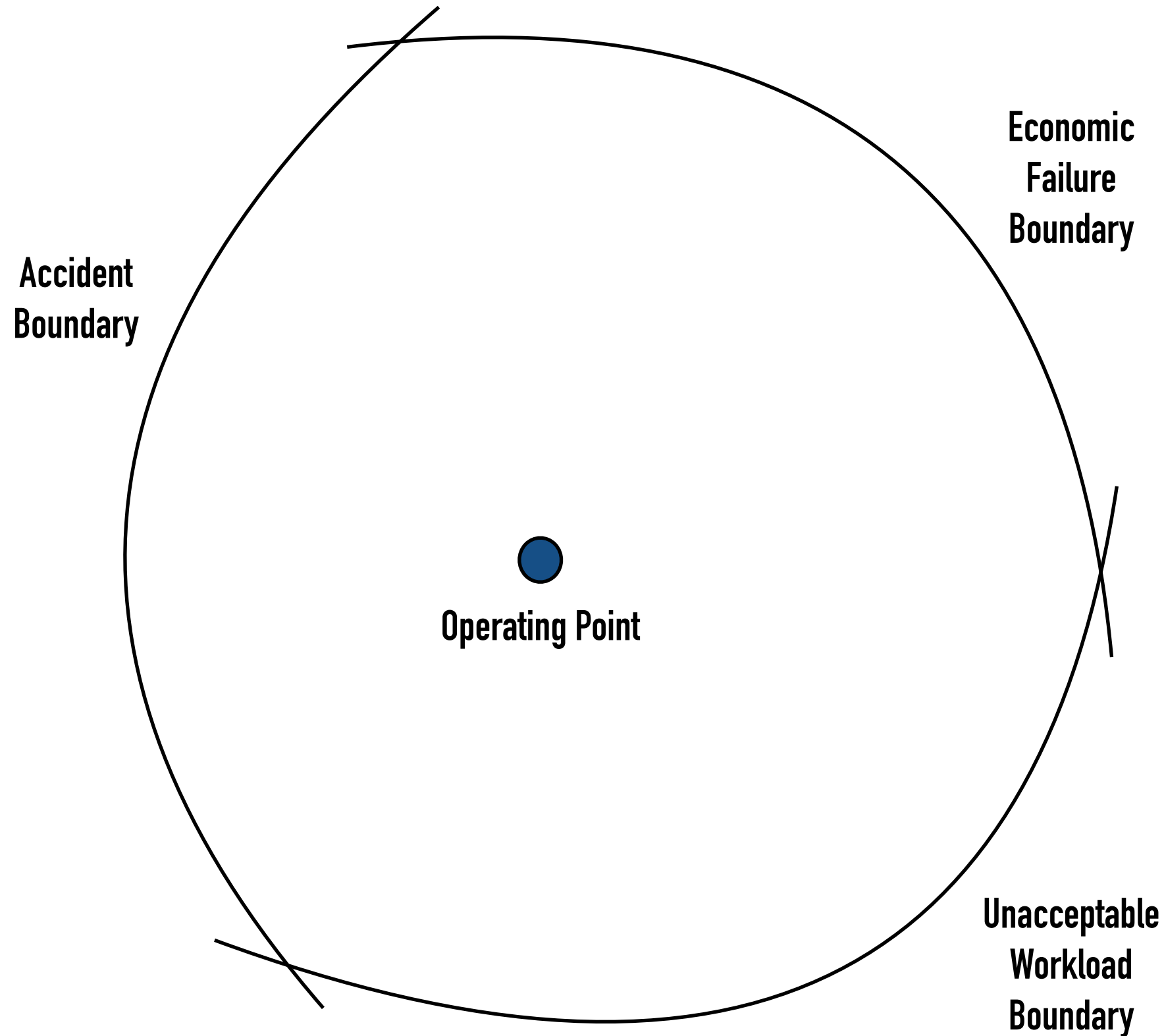
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



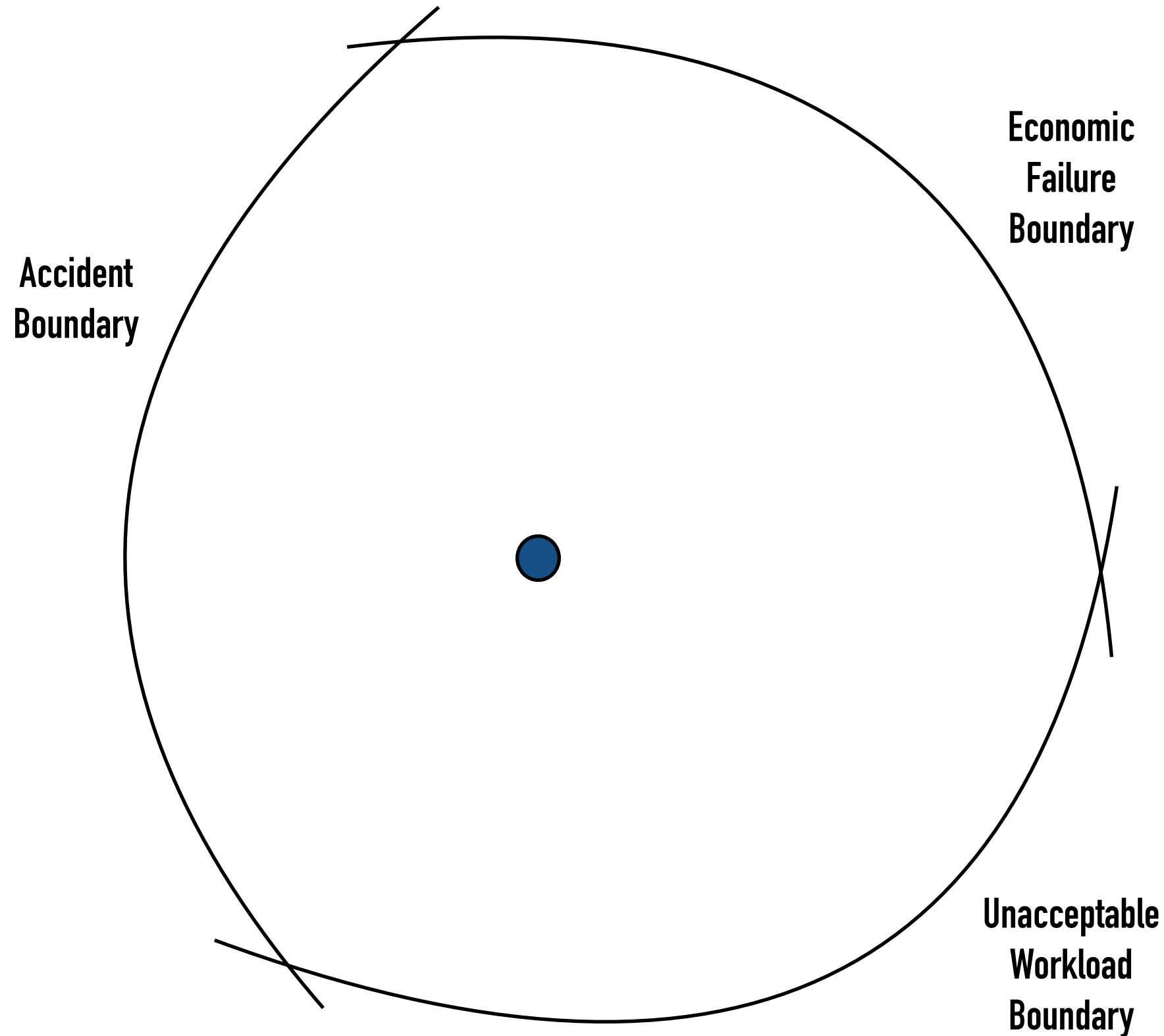
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



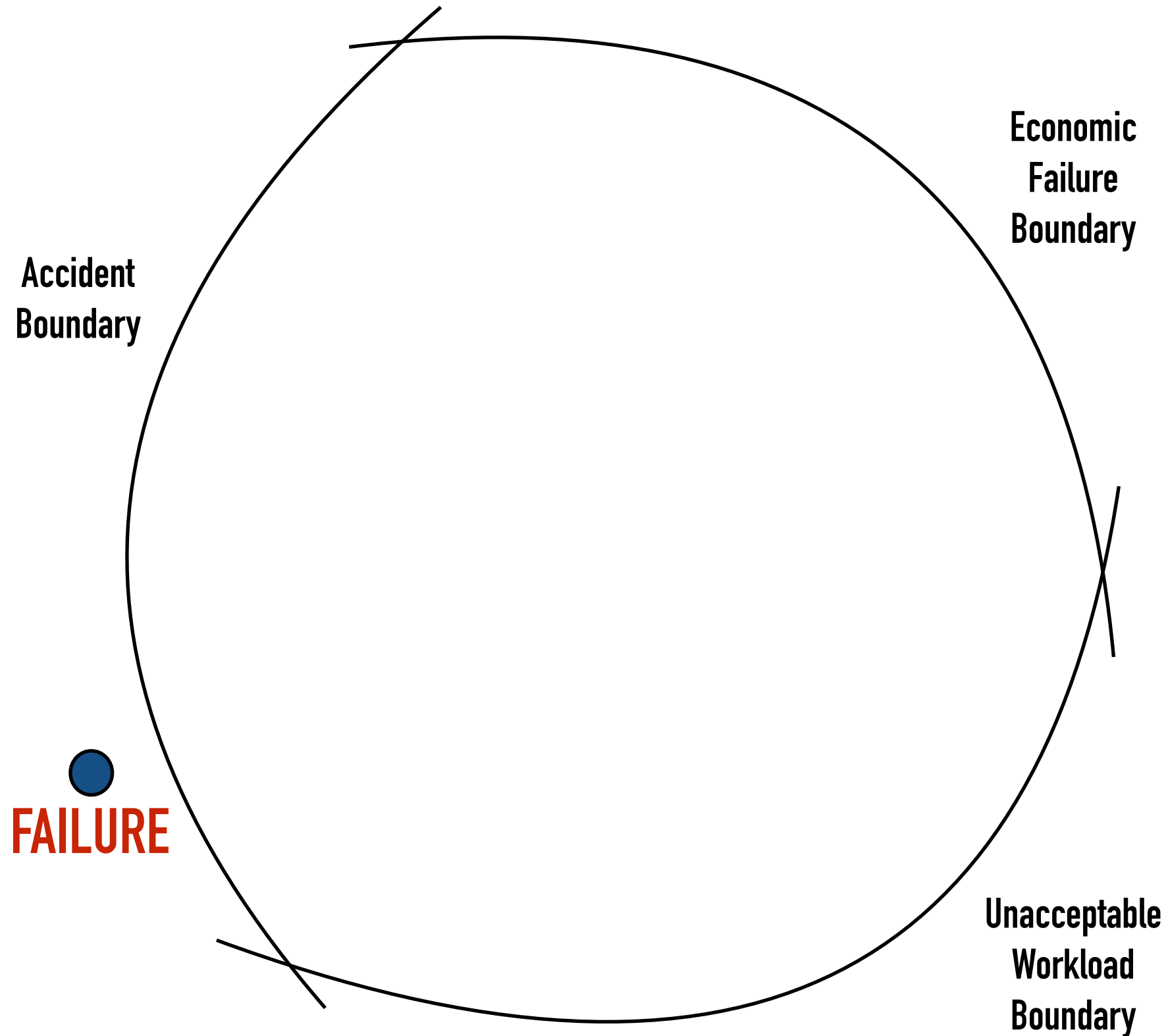
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



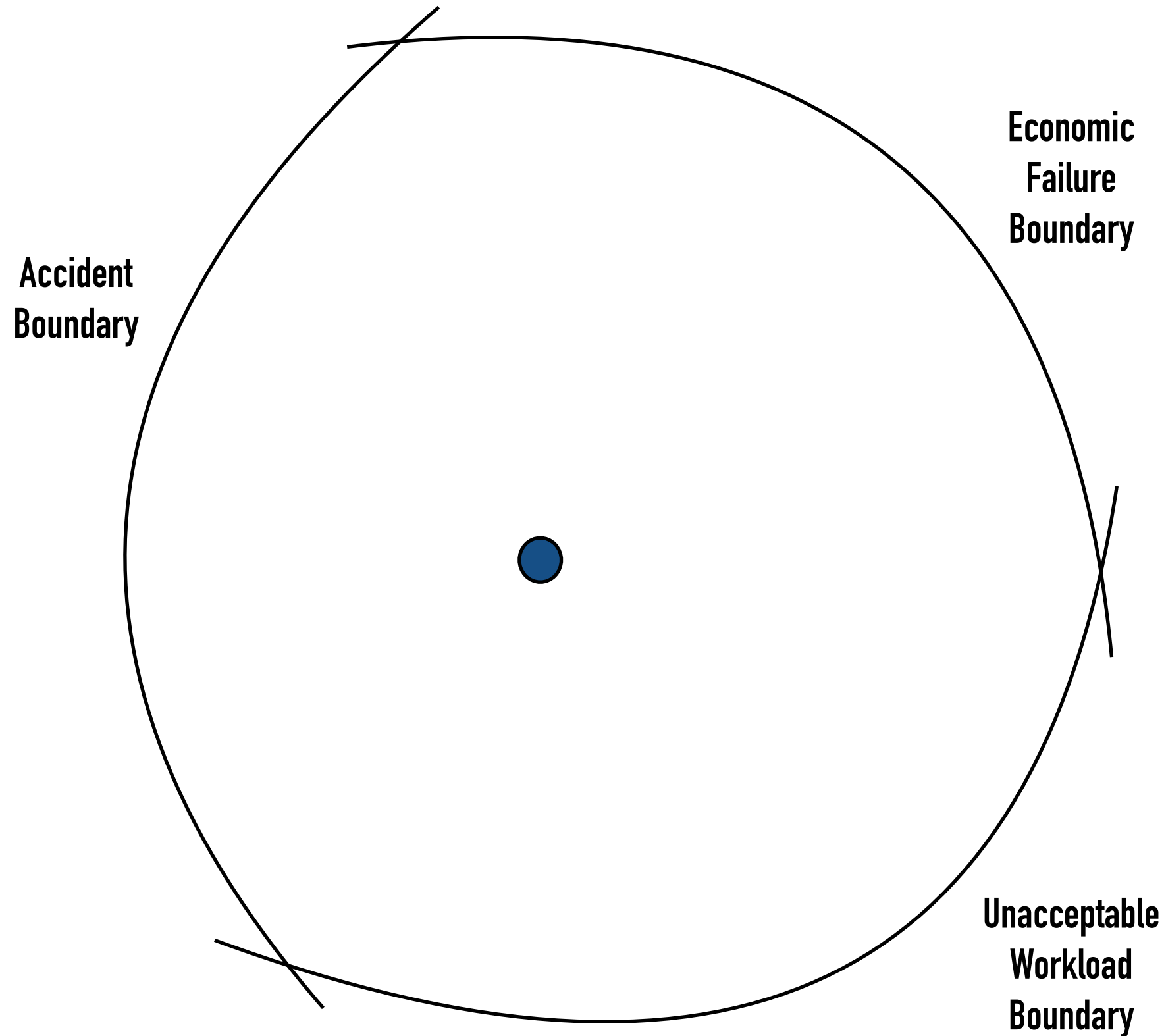
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



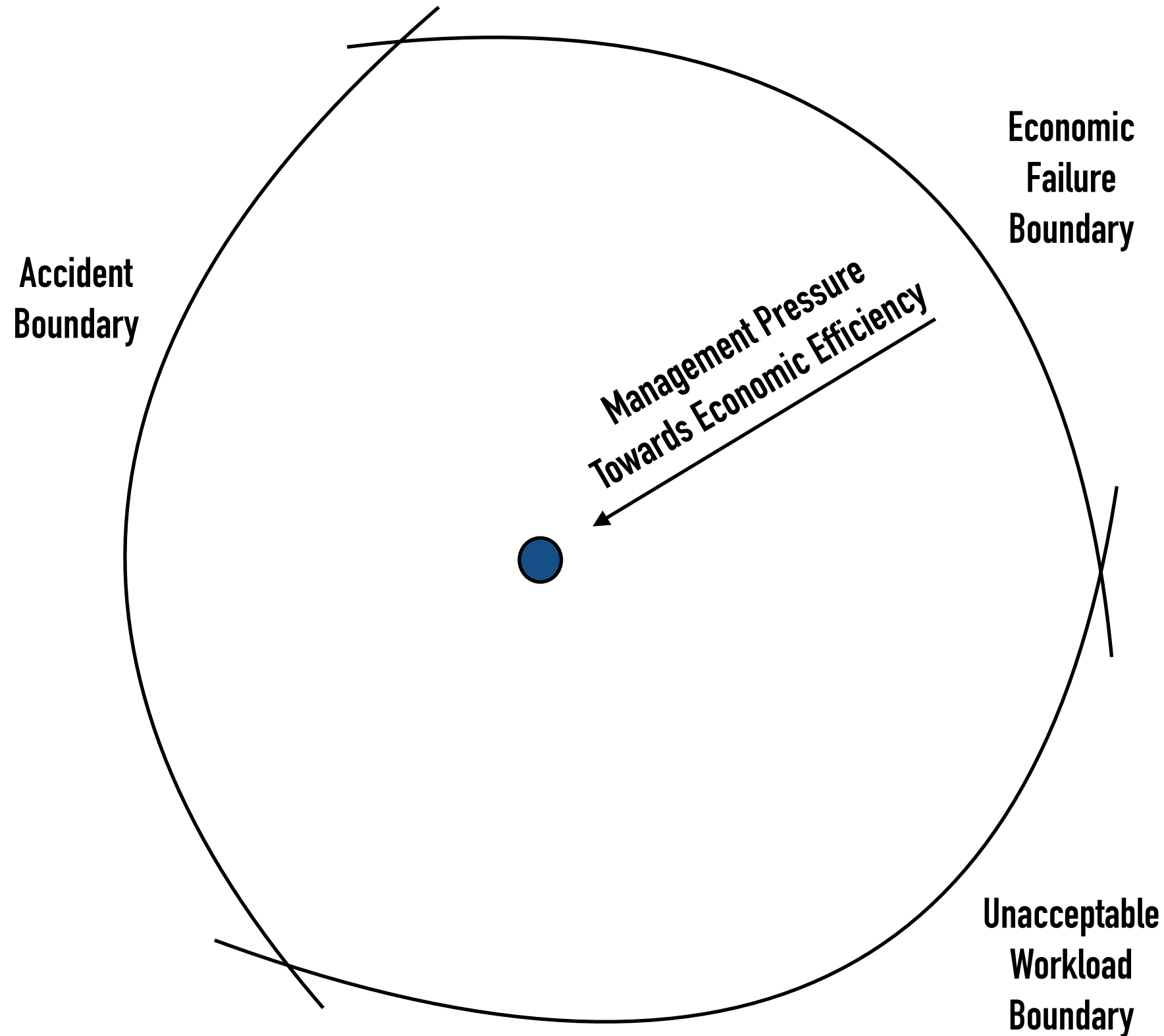
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



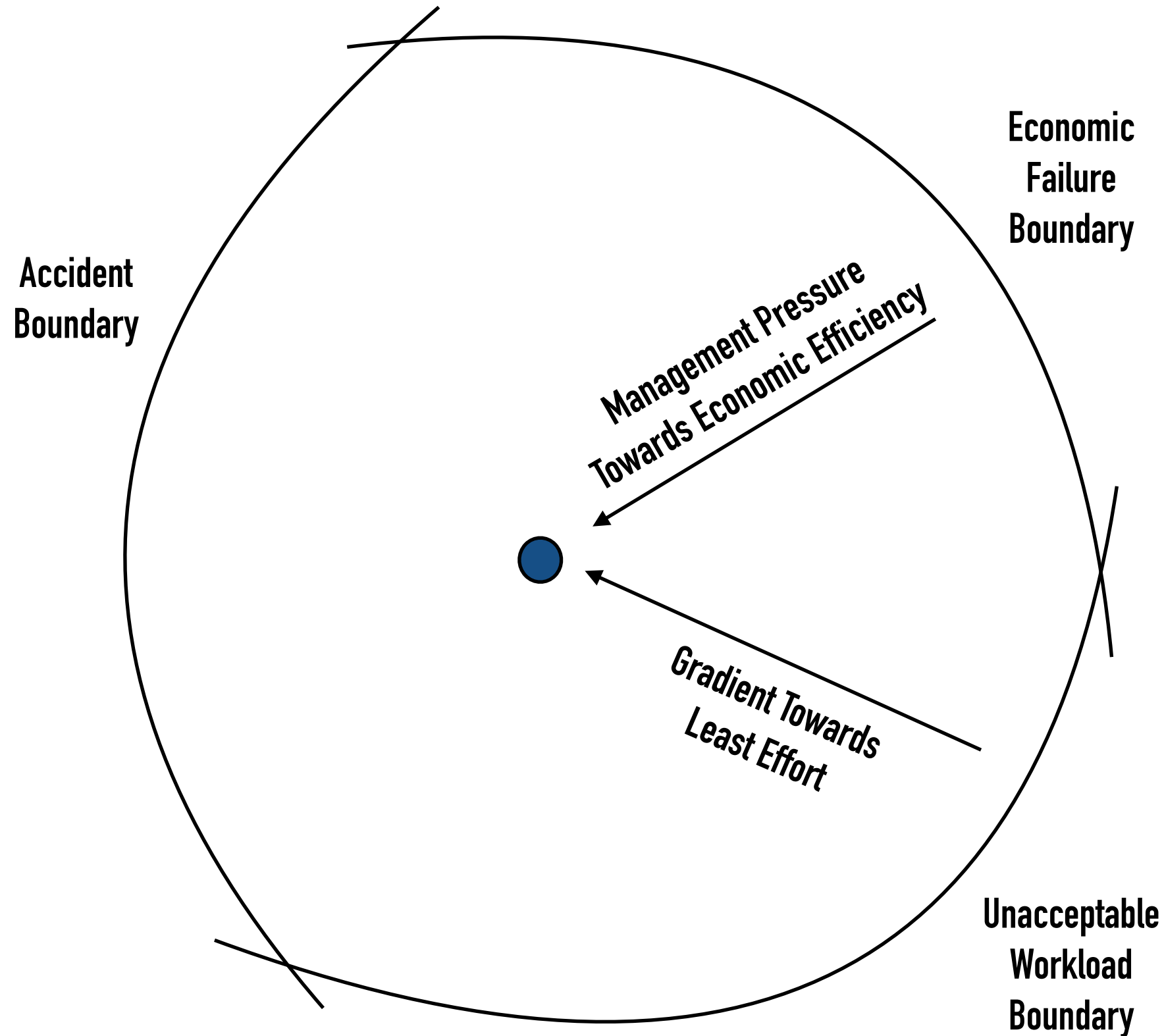
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



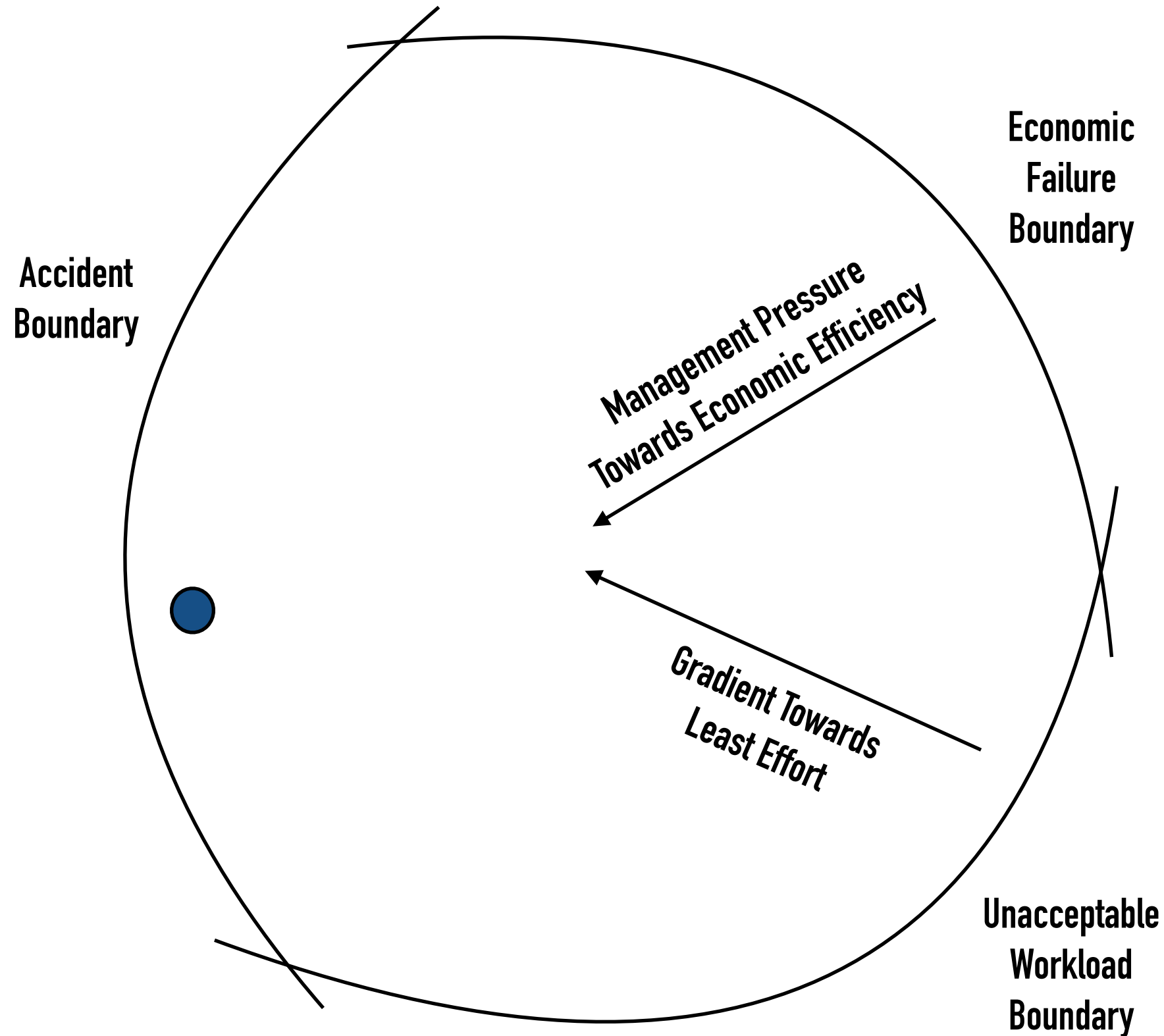
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



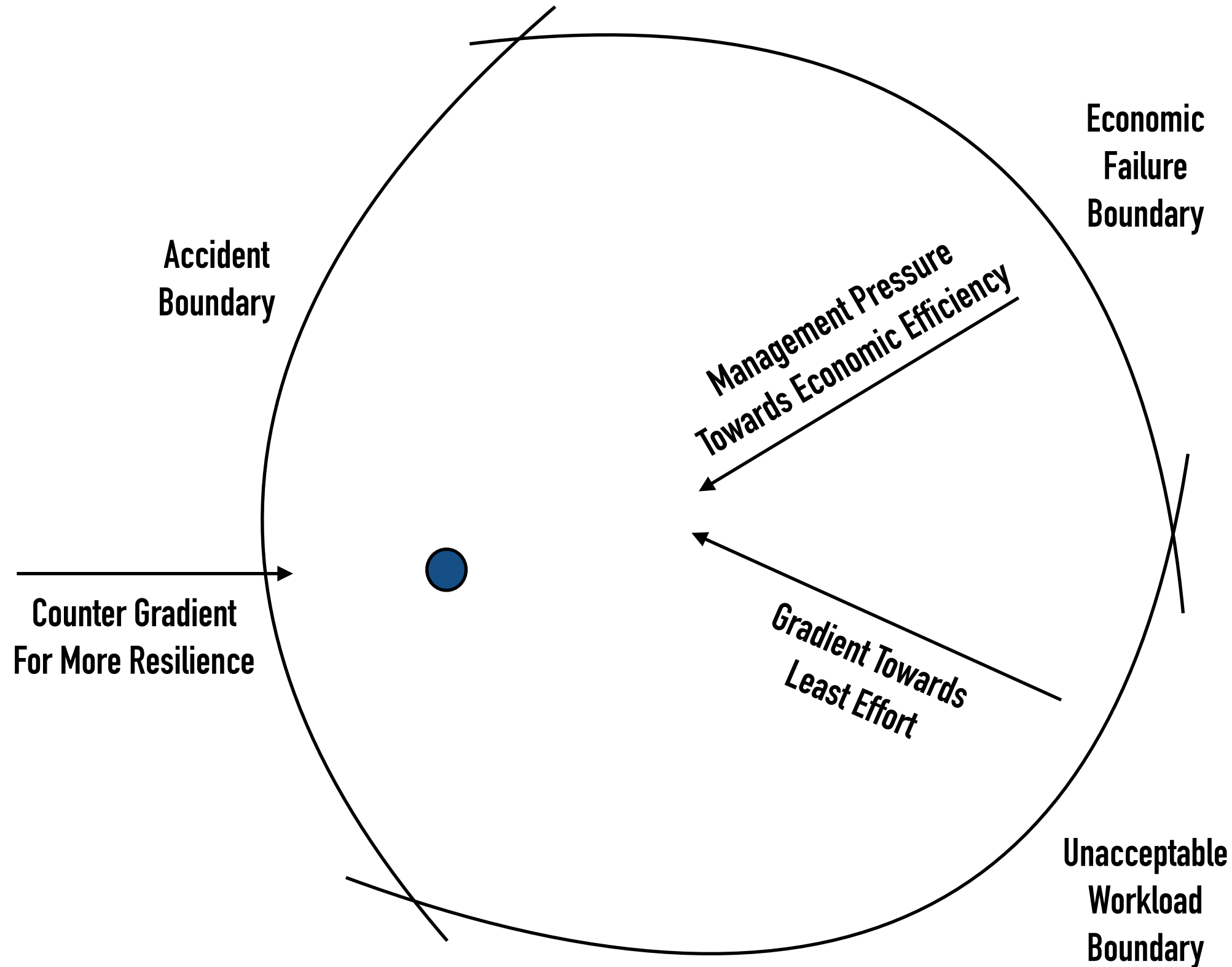
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



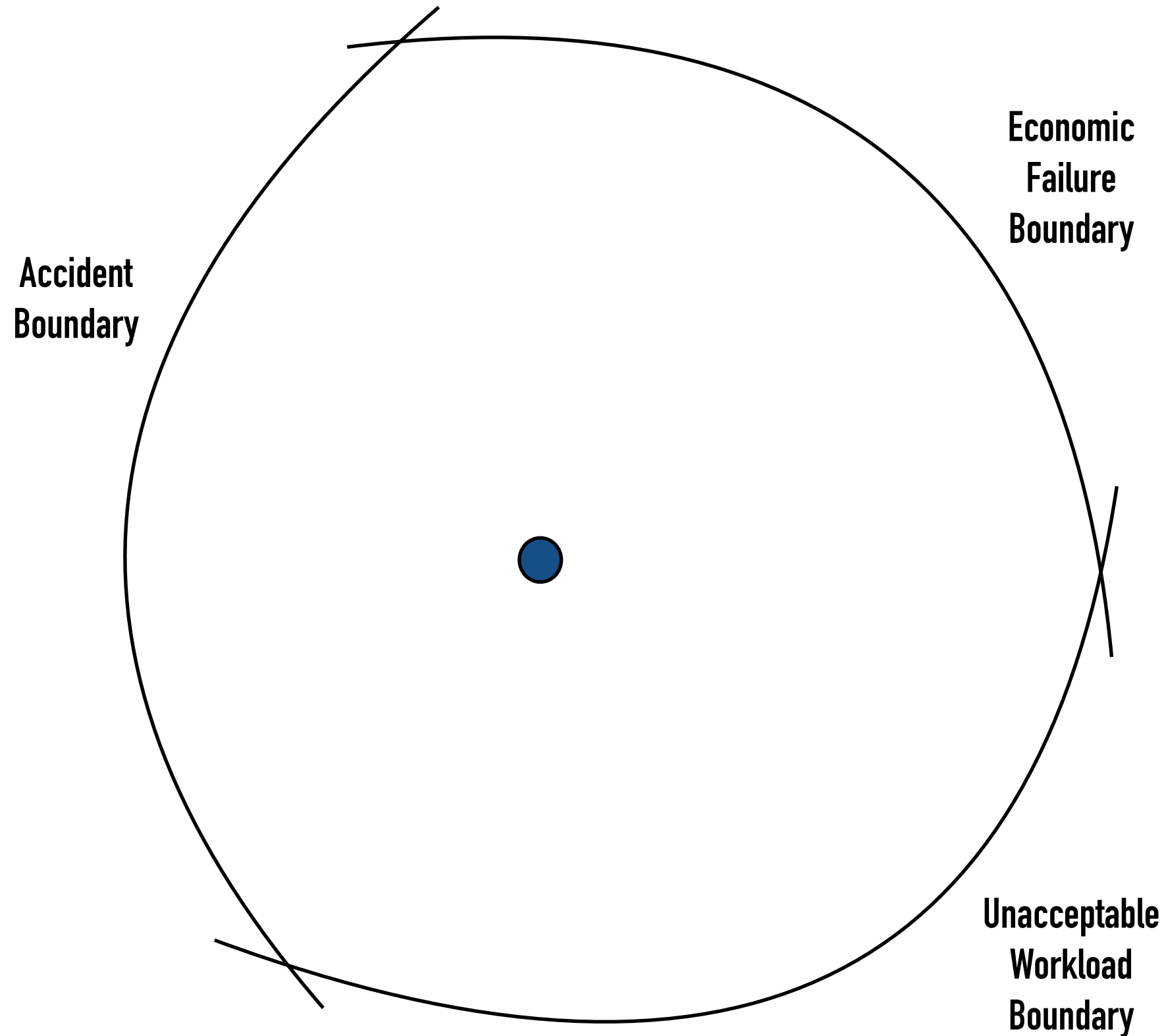
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



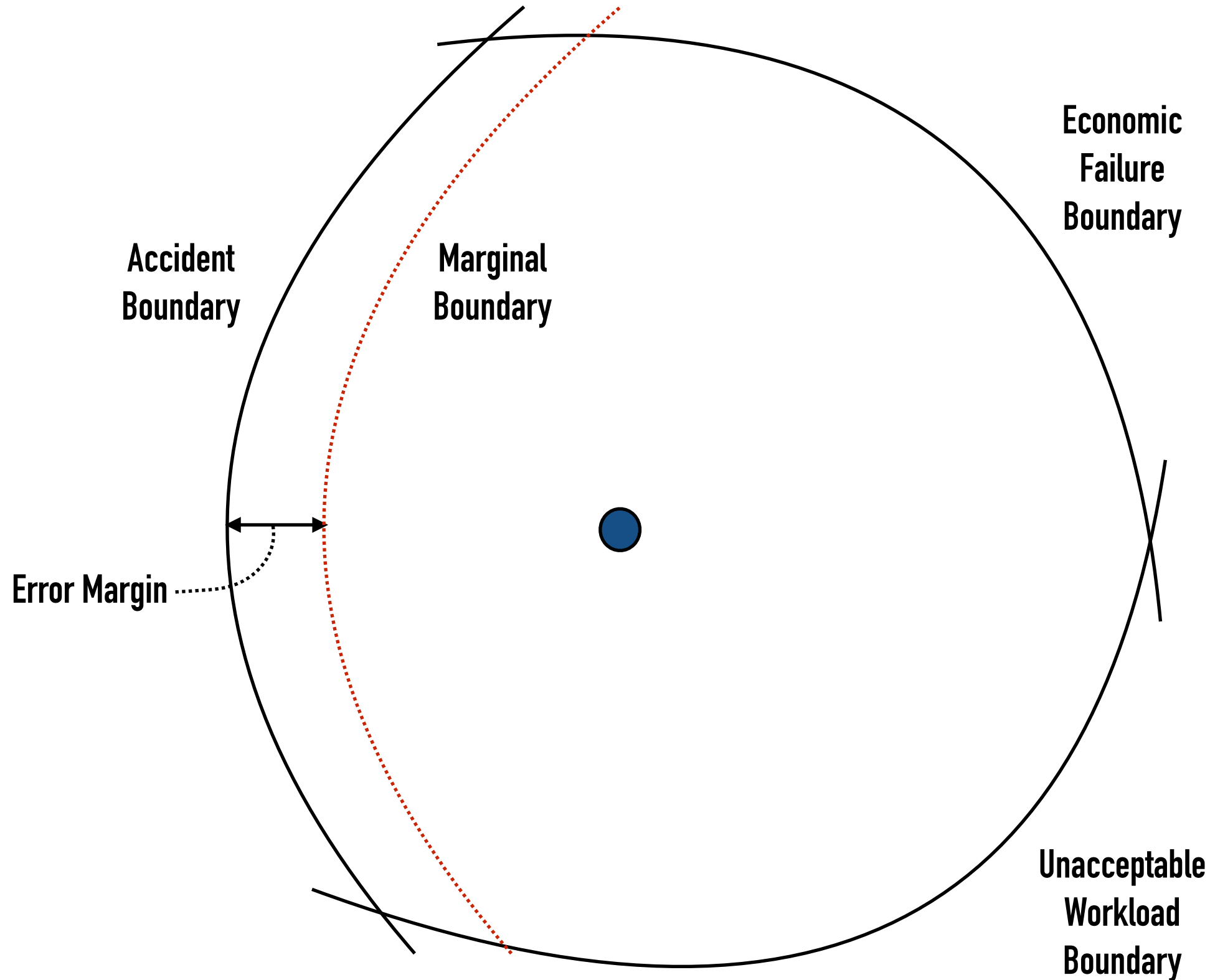
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



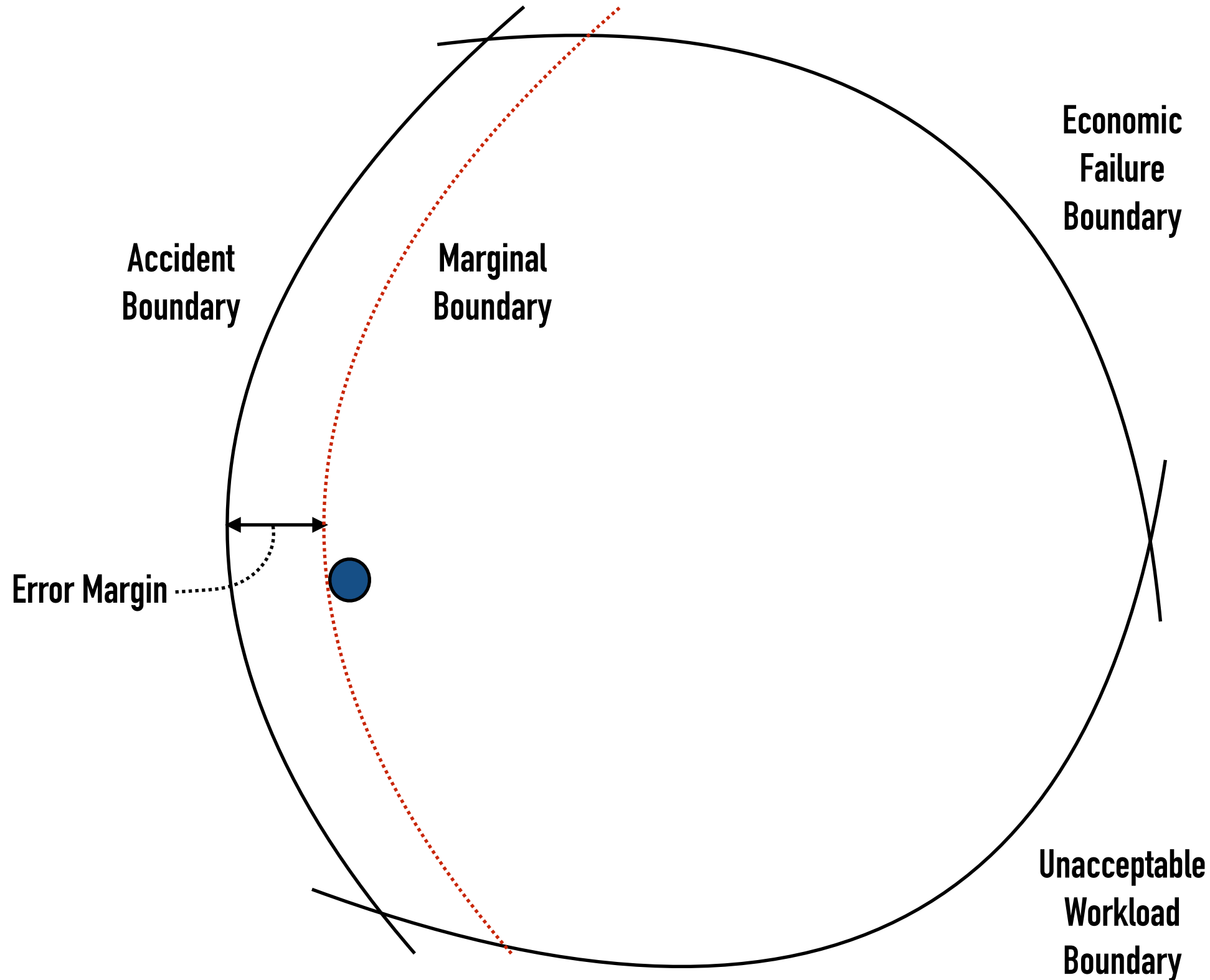
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



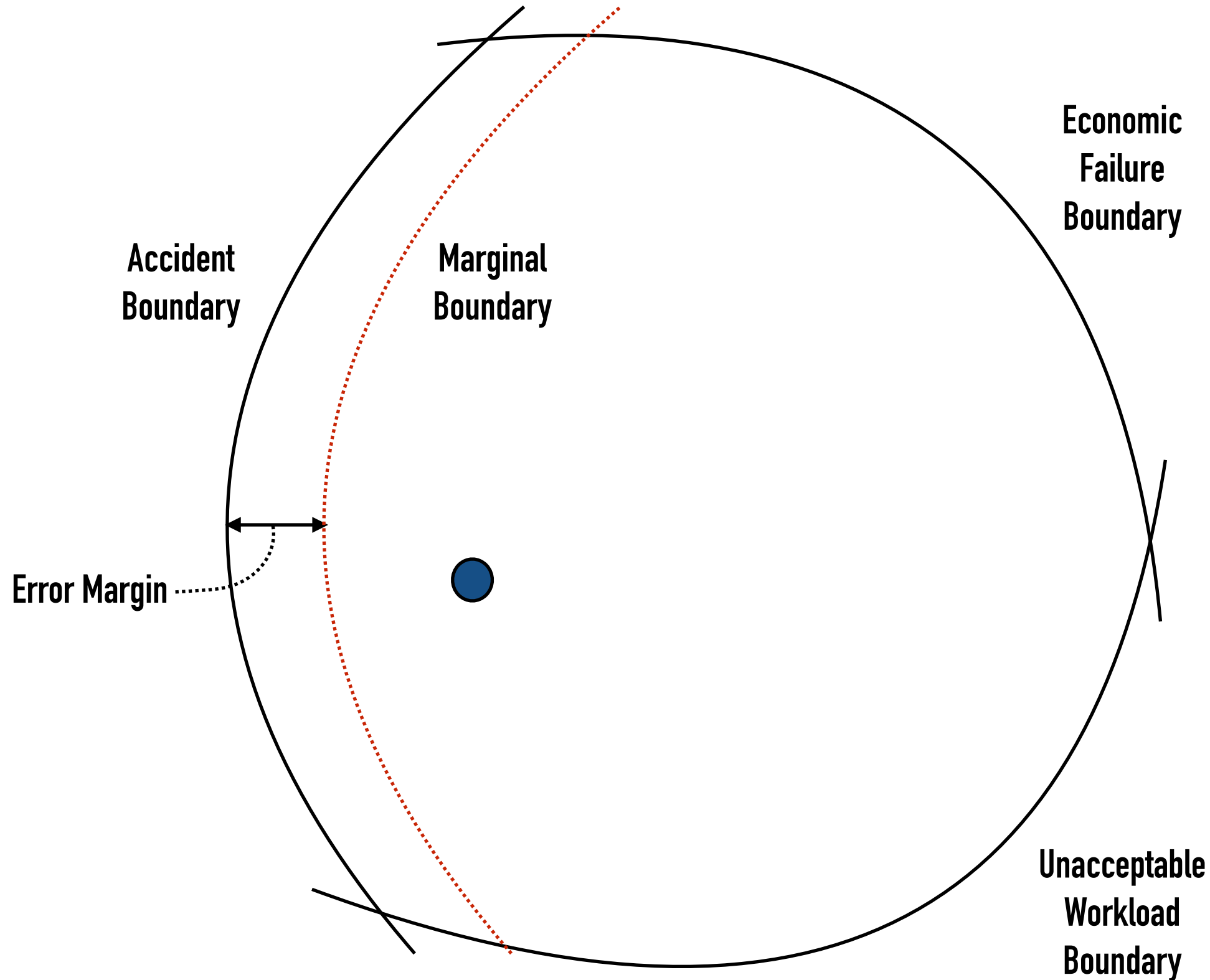
“Going solid”: a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



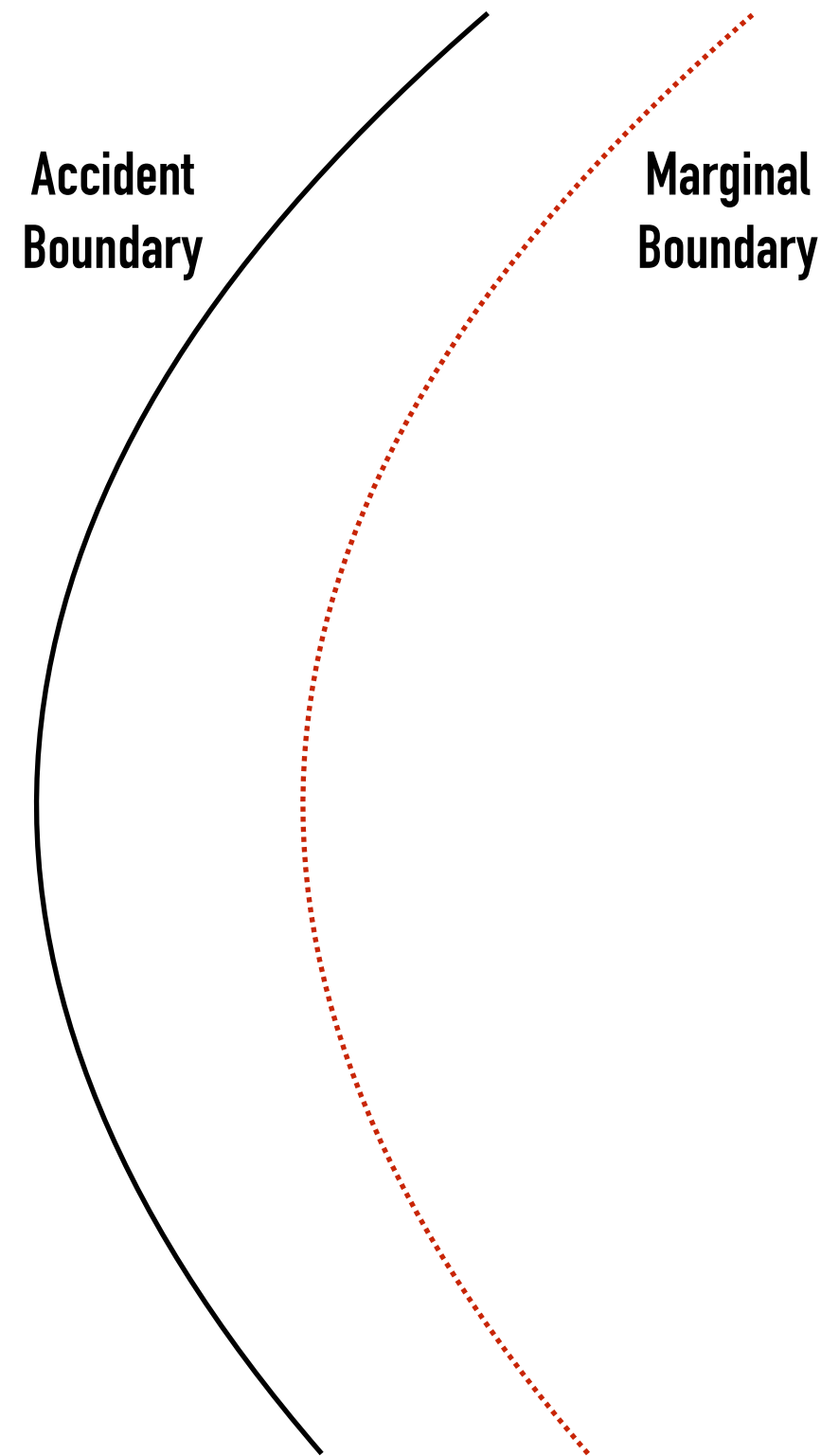
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



“Going solid”: a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



“Going solid”: a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

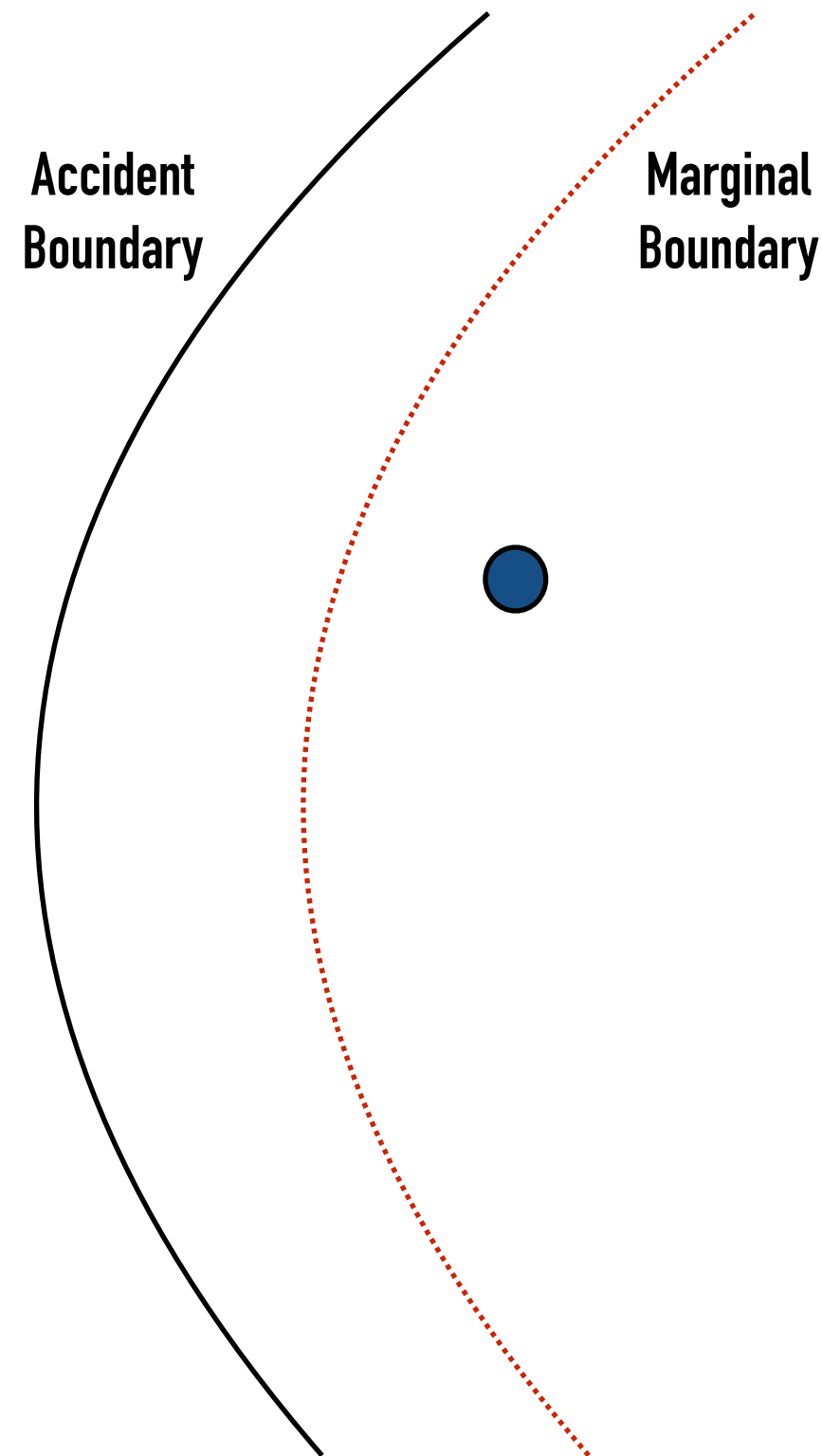
Operating at the Edge of Failure

?

Marginal
Boundary

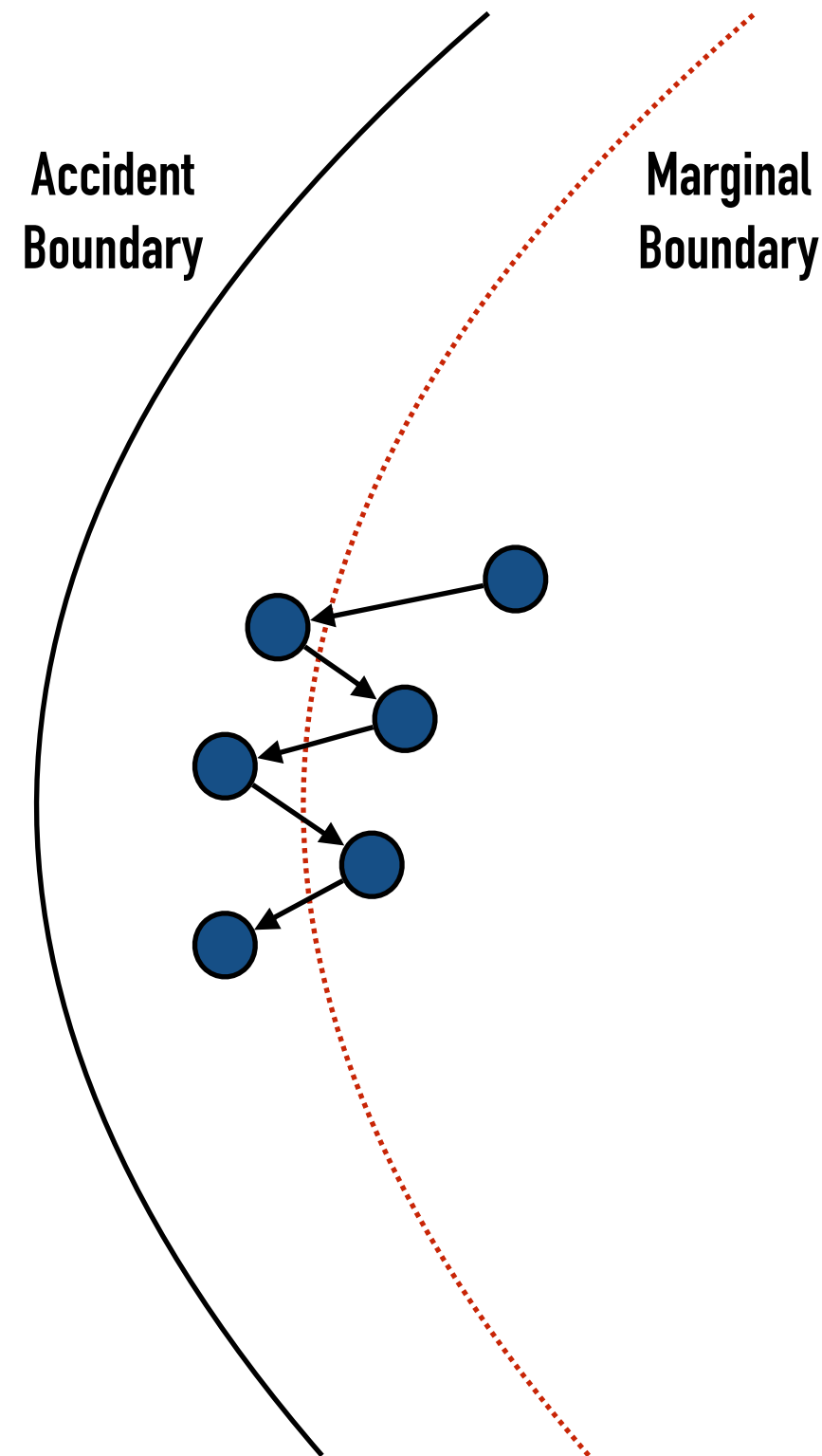
A diagram consisting of a large red question mark on the left side of the slide. To its right is a curved dotted red line that starts near the top right and curves downwards towards the bottom center. The text 'Marginal Boundary' is positioned to the right of the upper part of this curve.

Operating at the Edge of Failure



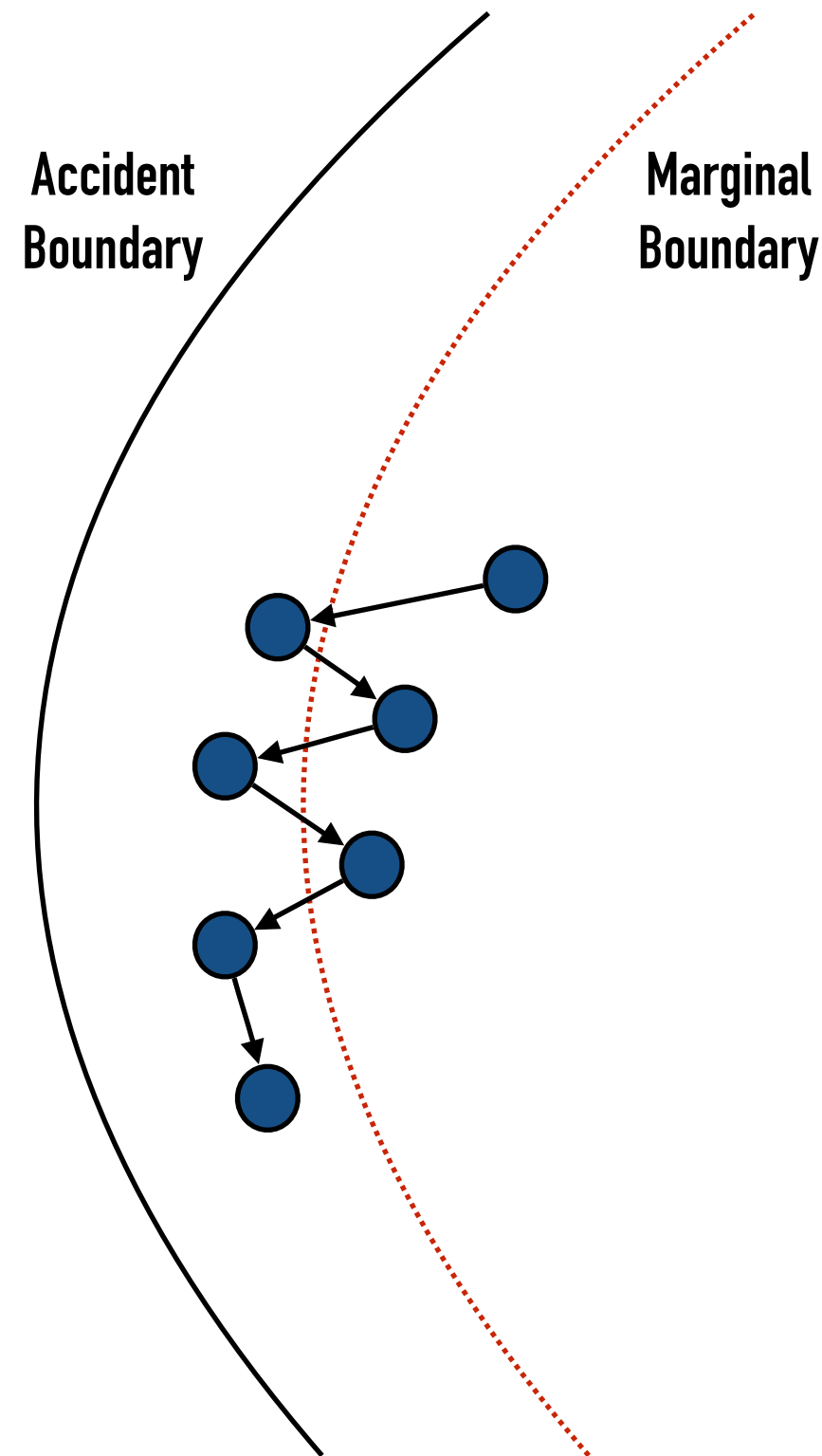
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



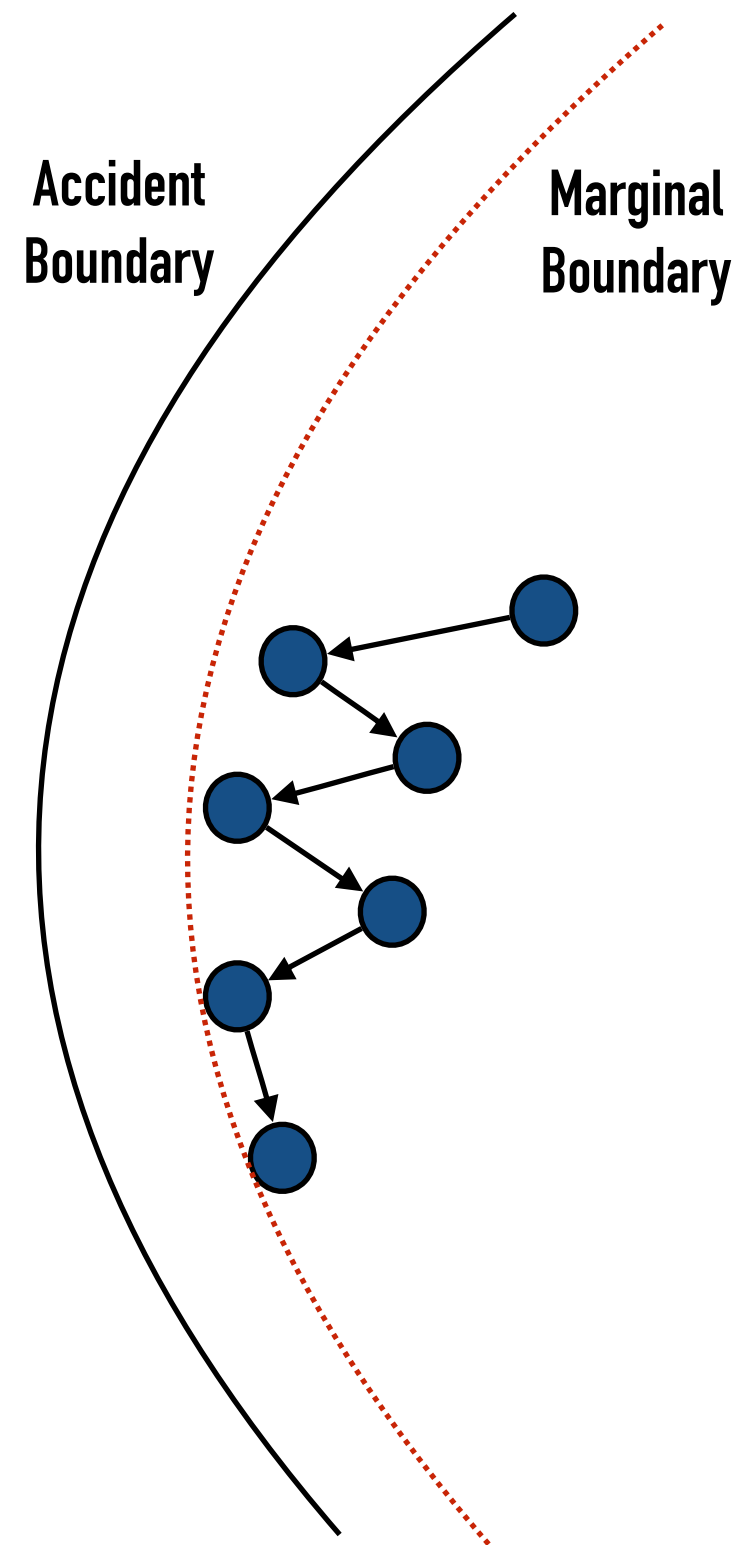
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Operating at the Edge of Failure



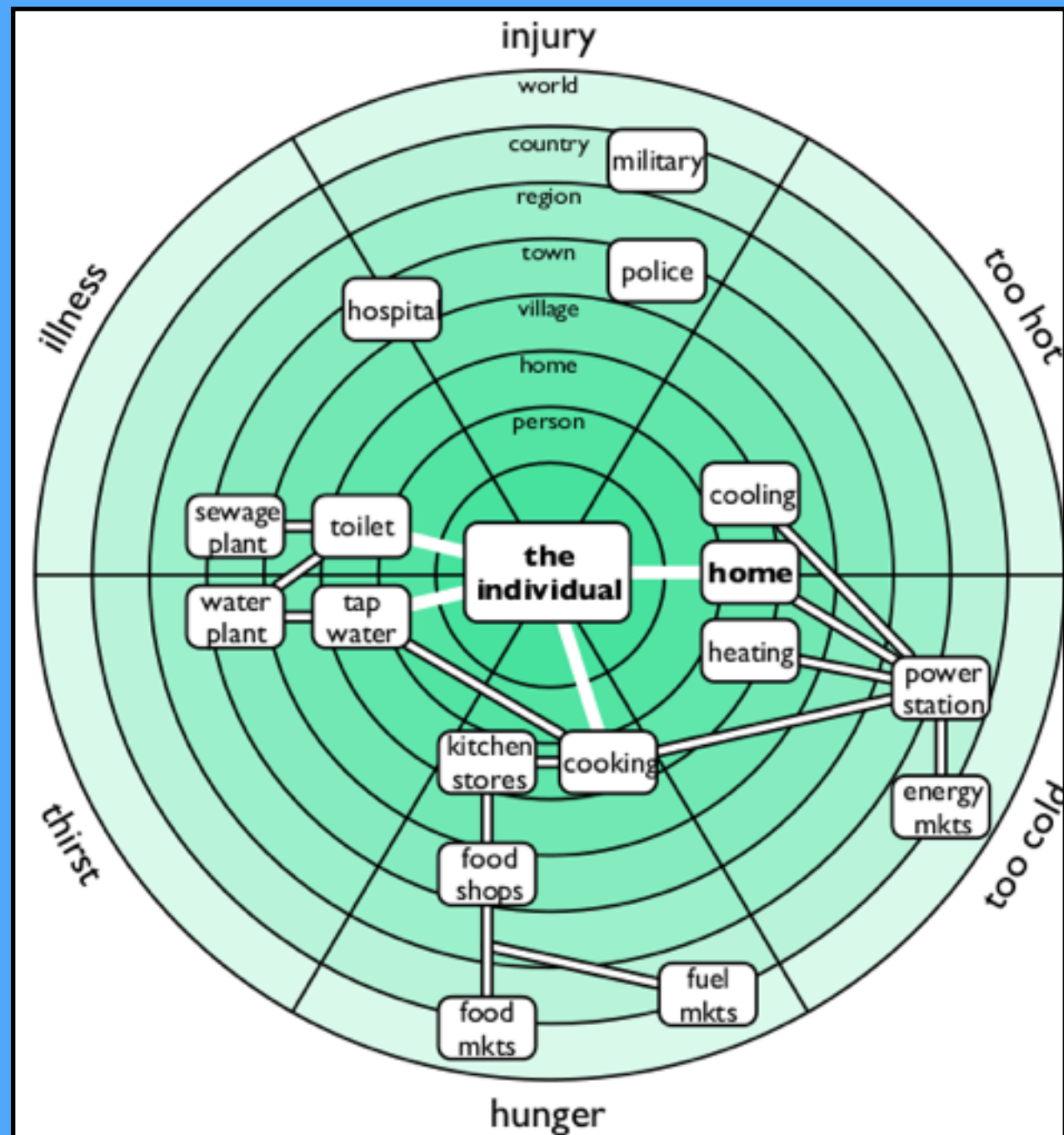
"Going solid": a model of system dynamics and consequences for patient safety - R Cook, J Rasmussen
Resilience in complex adaptive systems: Operating at the Edge of Failure - Richard Cook - Talk at Velocity NY 2013

Embrace Failure

Resilience in Social Systems

Dealing in Security

UNDERSTANDING VITAL SERVICES, AND HOW THEY KEEP YOU SAFE



1 INDIVIDUAL

6 WAYS TO DIE

3 SETS OF ESSENTIAL SERVICES

7 LAYERS OF PROTECTION

7 Principles for Building Resilience in Social Systems

- 1. MAINTAIN DIVERSITY & REDUNDANCY**
- 2. MANAGE CONNECTIVITY**
- 3. MANAGE SLOW VARIABLES & FEEDBACK**
- 4. FOSTER COMPLEX ADAPTIVE SYSTEMS THINKING**
- 5. ENCOURAGE LEARNING**
- 6. BROADEN PARTICIPATION**
- 7. PROMOTE POLYCENTRIC GOVERNANCE**

Resilience in Biological Systems



Meerkats

Puppies! Now that I've got your attention, complexity theory - Nicolas Perony, TED talk

What We Can Learn From Biological Systems

1. FEATURE DIVERSITY AND REDUNDANCY
2. INTER-CONNECTED NETWORK STRUCTURE
3. WIDE DISTRIBUTION ACROSS ALL SCALES
4. CAPACITY TO SELF-ADAPT & SELF-ORGANIZE

**“Animals show extraordinary social complexity,
and this allows them to adapt and
respond to changes in their environment.
In three words, in the animal kingdom,
simplicity leads to complexity
which leads to resilience.”**

- NICOLAS PERONY

Resilience in Computer Systems

Our Disaster Recovery Plan Goes Something Like This...



DILBERT
By Scott Adams

“Complex systems run in degraded mode.”
“Complex systems run as broken systems.”

- RICHARD COOK

Resilience is by Design



Photo courtesy of FEMA/Joselyne Augustino

We Need to
Manage Failure

**“Post-accident attribution to a
‘root cause’ is fundamentally wrong:
Because overt failure requires multiple faults,
there is no isolated ‘cause’ of an accident.”**

- RICHARD COOK

**There is No
Root Cause**

Crash Only Software

STOP = CRASH SAFELY

START = RECOVER FAST

Recursive Restartability

TURNING THE CRASH-ONLY SLEDGEHAMMER INTO A SCALPEL



Recursive Restartability: Turning the Reboot Sledgehammer into a Scalpel - George Candea, Armando Fox

Services need to accept
NO for an answer



KEEP
CALM
AND
SAY
NO

Classification of State

- **STATIC DATA**
- **SCRATCH DATA**
- **DYNAMIC DATA**
 - **RECOMPUTABLE**
 - **NOT RECOMPUTABLE**

Classification of State

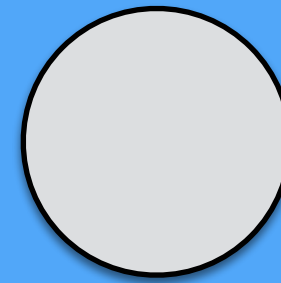
- **STATIC DATA**
- **SCRATCH DATA**
- **DYNAMIC DATA**
 - **RECOMPUTABLE**
 - **NOT RECOMPUTABLE**

Critical

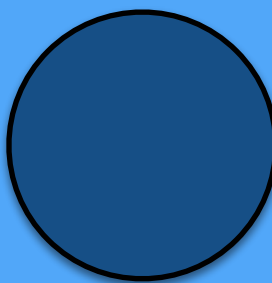


Traditional State Management

Client



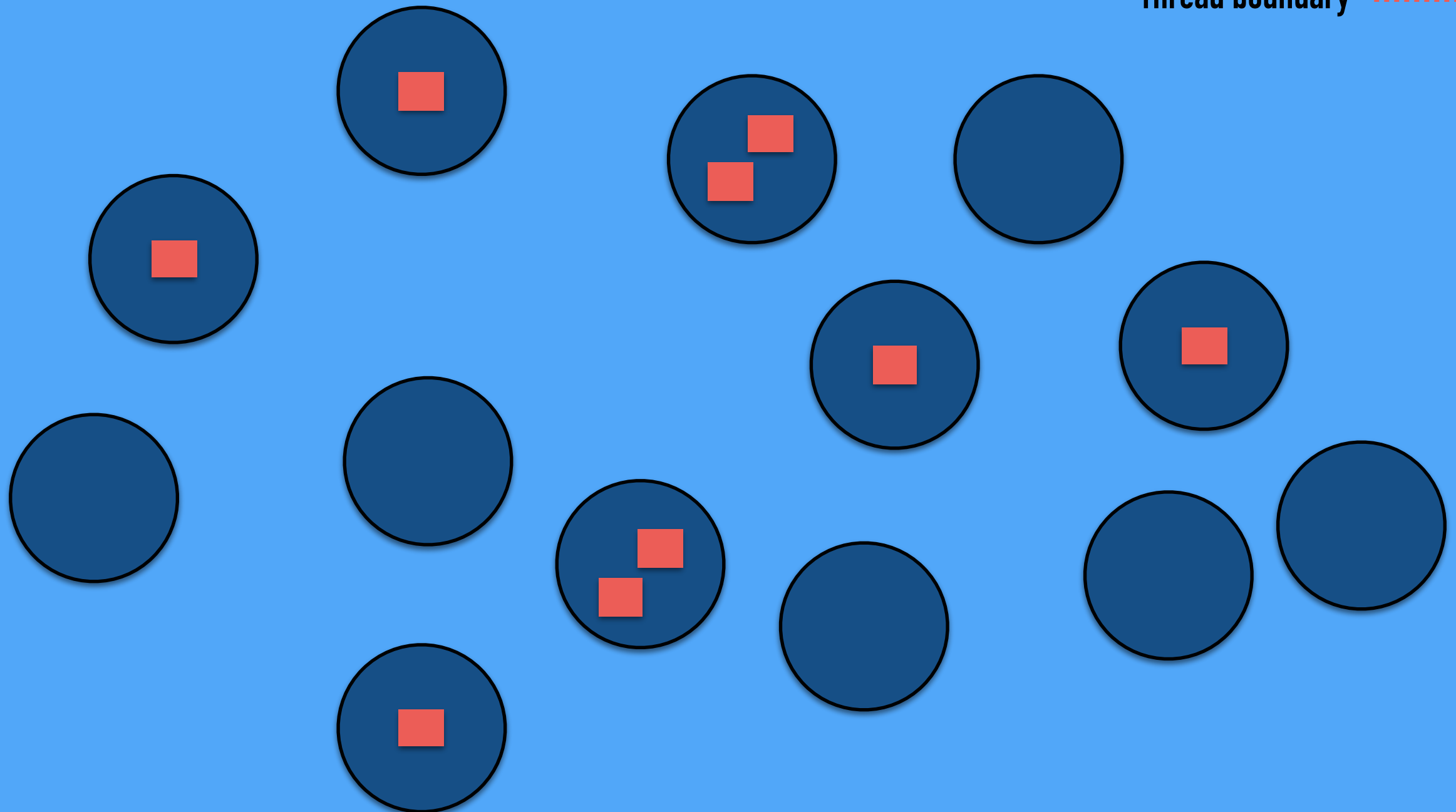
Object



Critical state
that needs protection

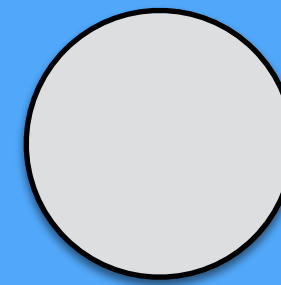


Thread boundary

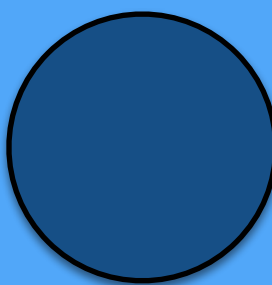


Traditional State Management

Client



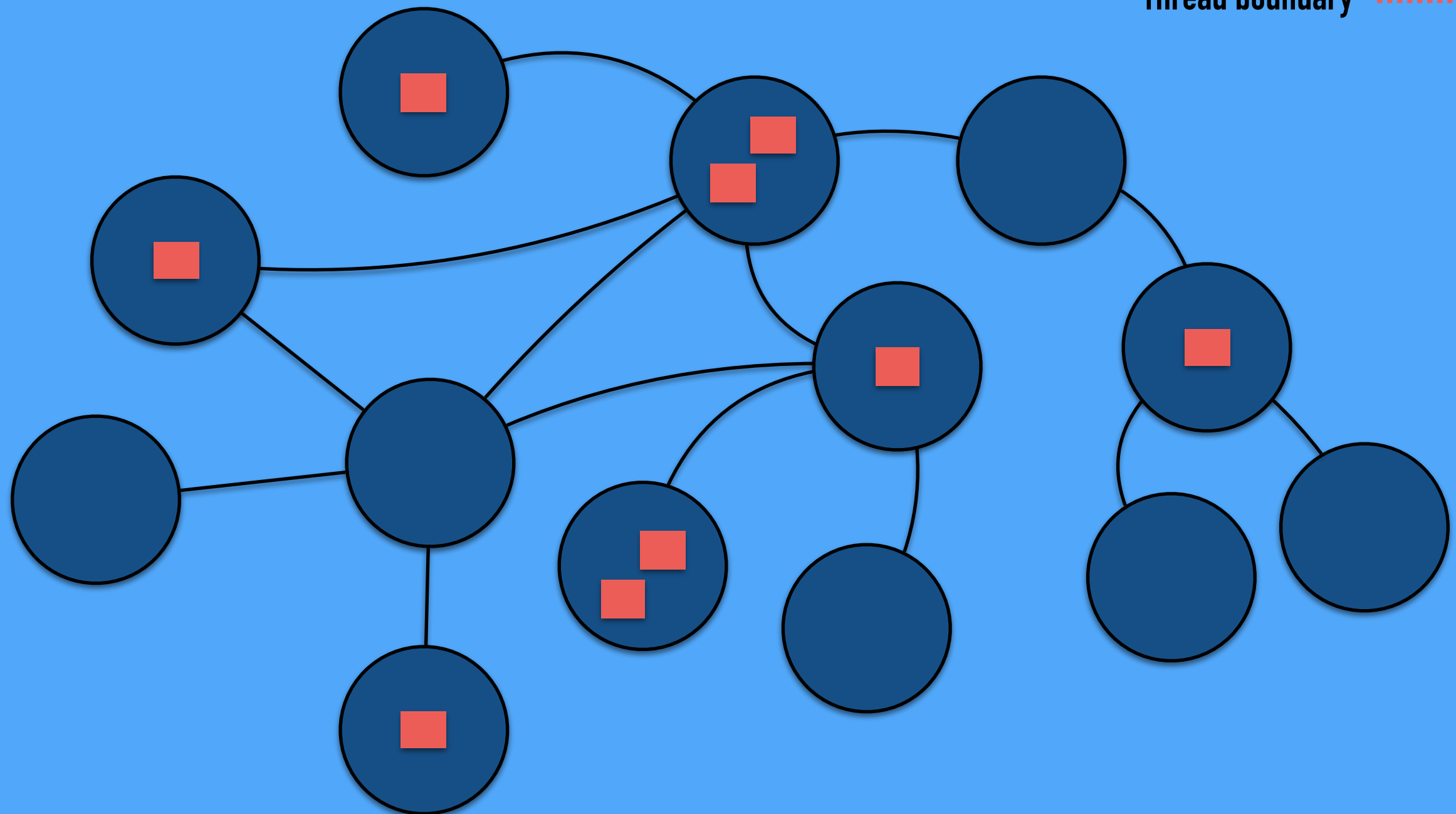
Object



Critical state
that needs protection

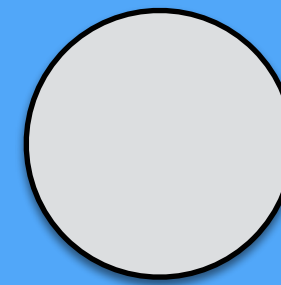


Thread boundary

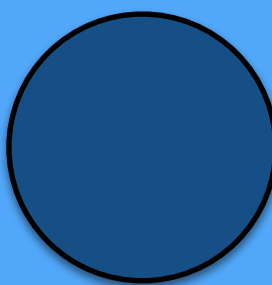


Traditional State Management

Client



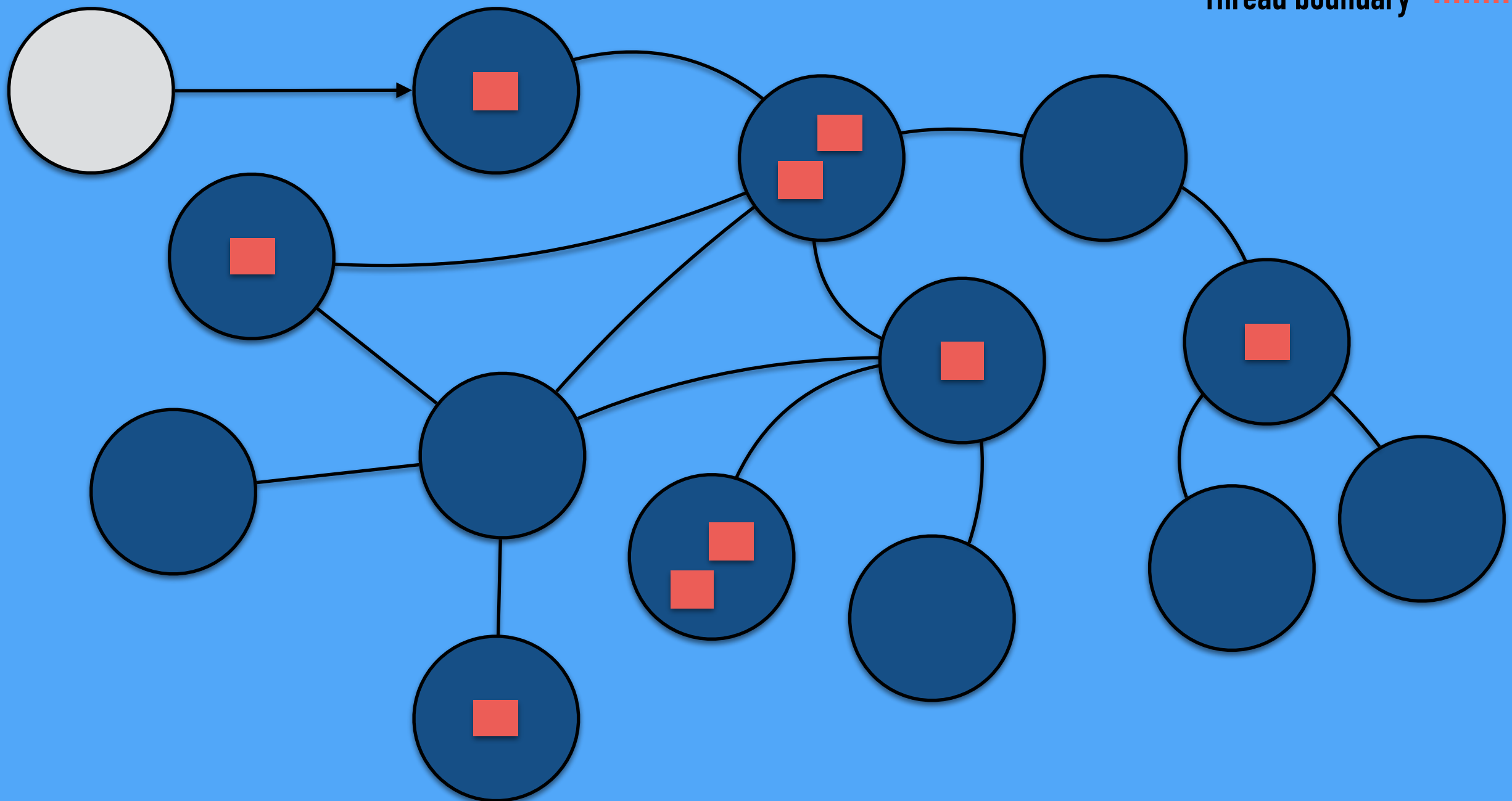
Object



Critical state
that needs protection

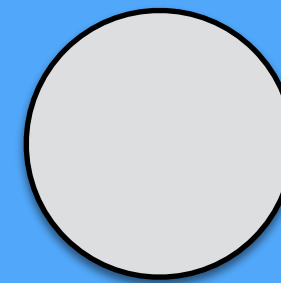


Thread boundary

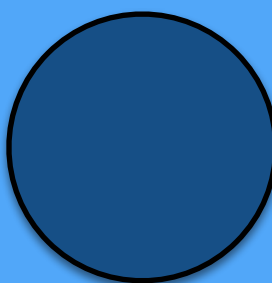


Traditional State Management

Client



Object



Critical state
that needs protection

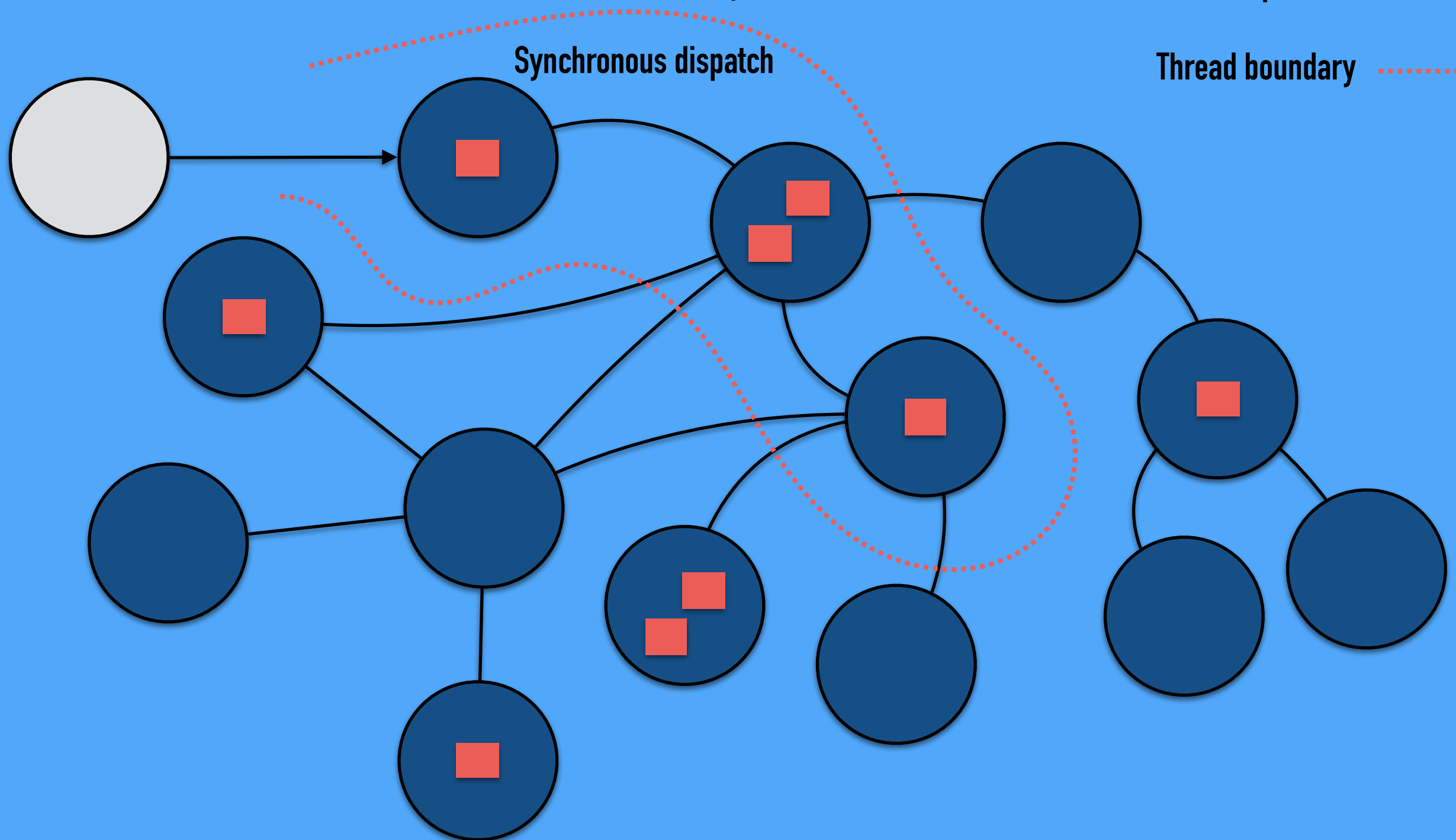


Thread boundary



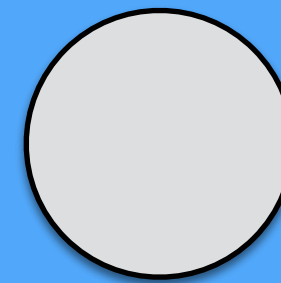
Thread boundary

Synchronous dispatch

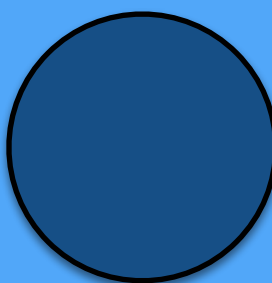


Traditional State Management

Client



Object



Critical state
that needs protection

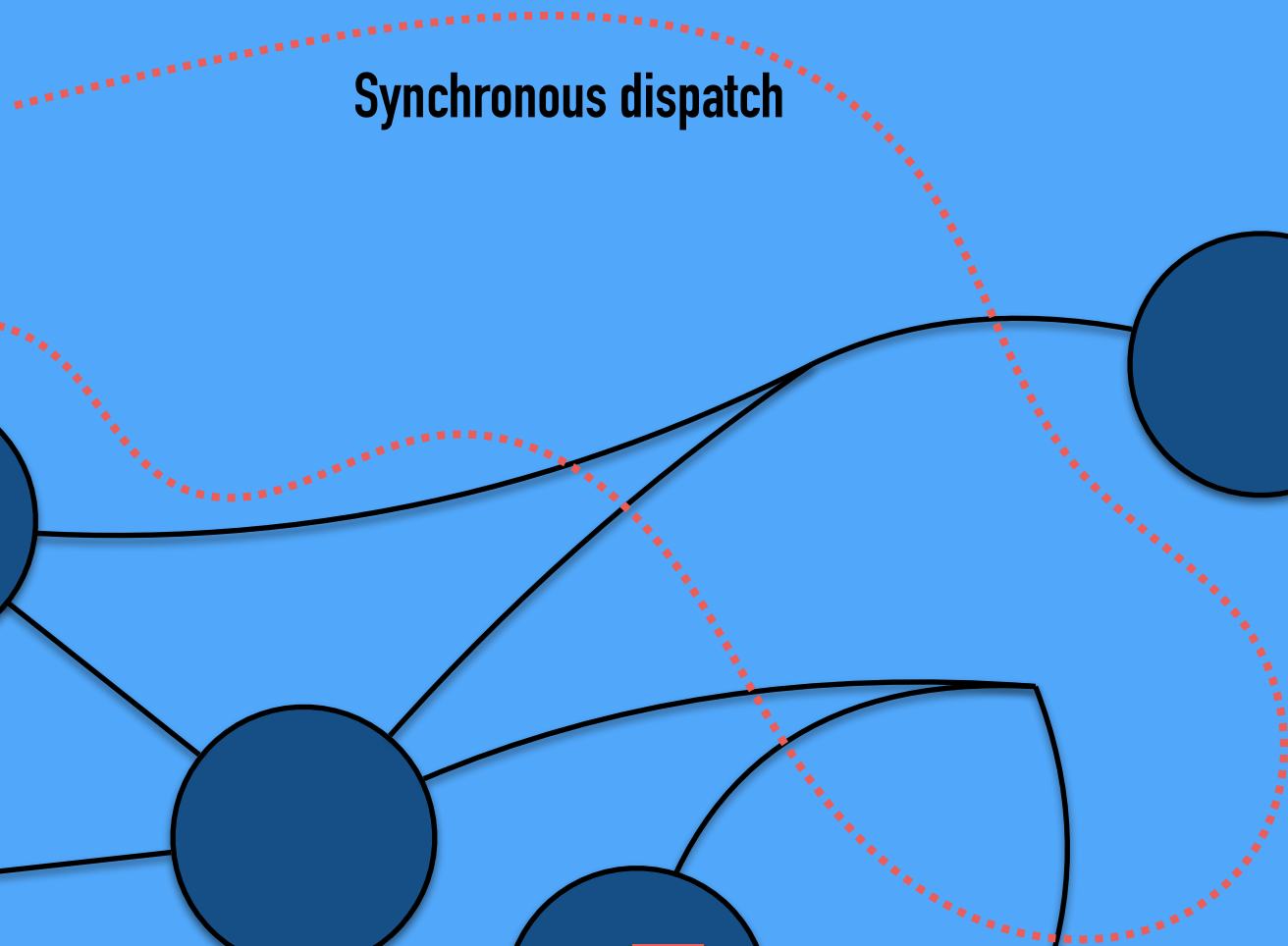
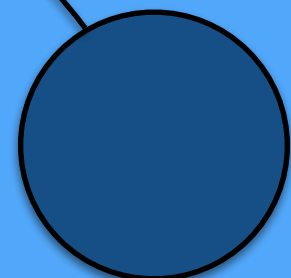
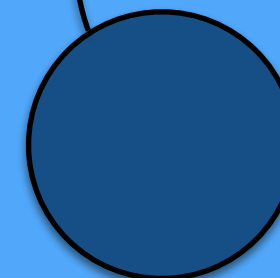
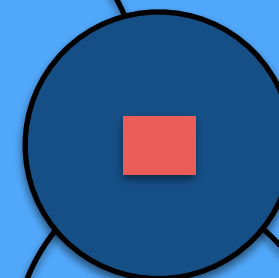
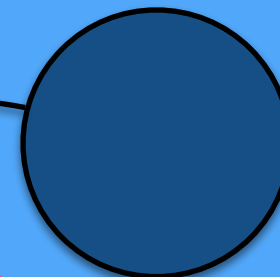
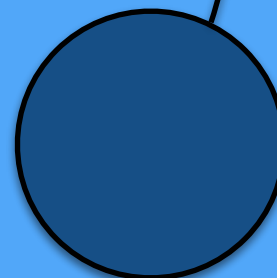
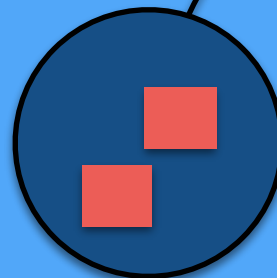
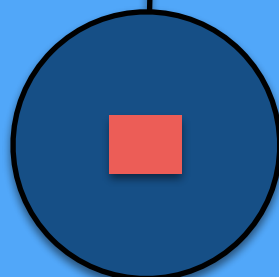
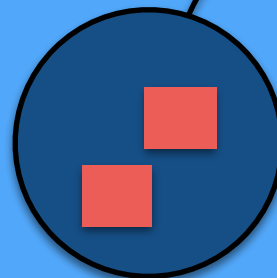
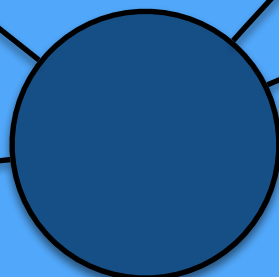
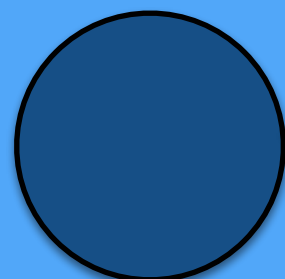
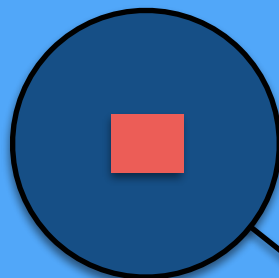
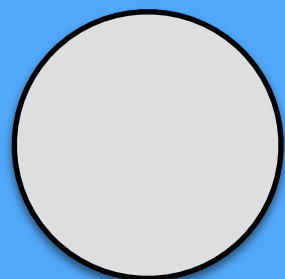


Thread boundary



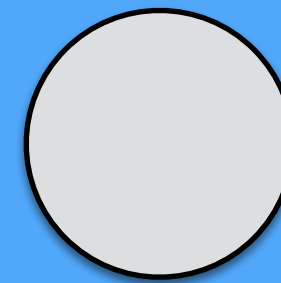
Thread boundary

Synchronous dispatch

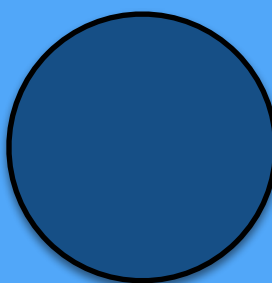


Traditional State Management

Client



Object



Critical state
that needs protection

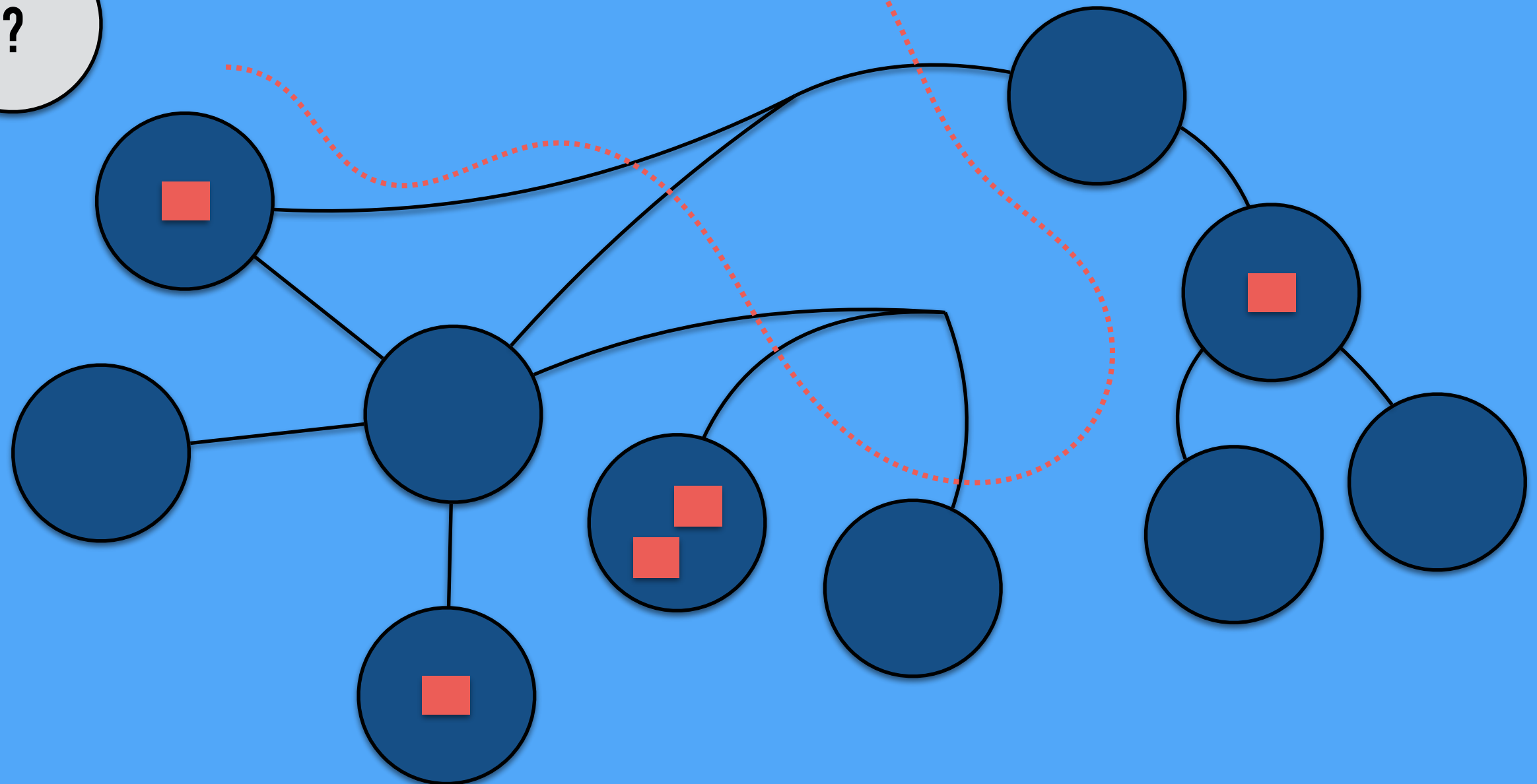
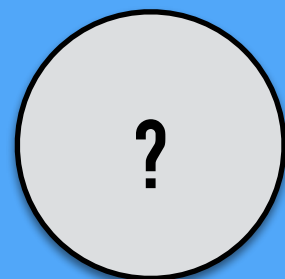


Thread boundary



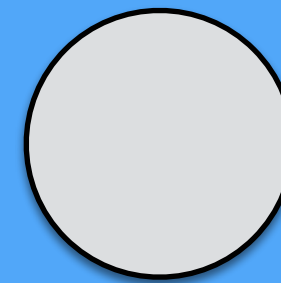
Thread boundary

Synchronous dispatch

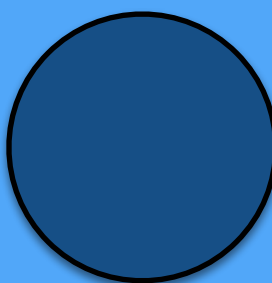


Traditional State Management

Client



Object



Critical state
that needs protection



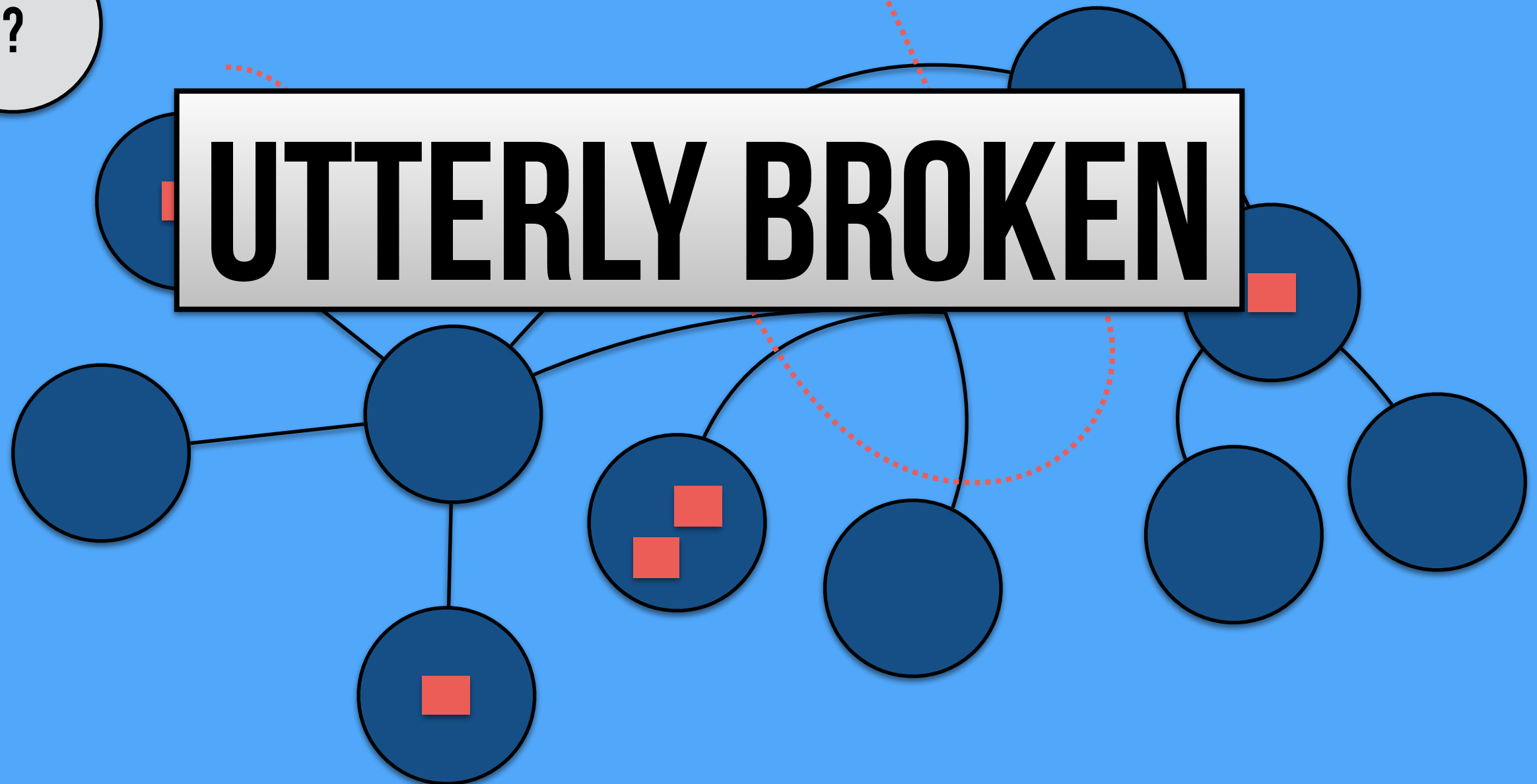
Thread boundary

Synchronous dispatch

Thread boundary



UTTERLY BROKEN



**“Accidents come from relationships
not broken parts.”**

- SIDNEY DEKKER

Requirements for a Sane Failure Mode

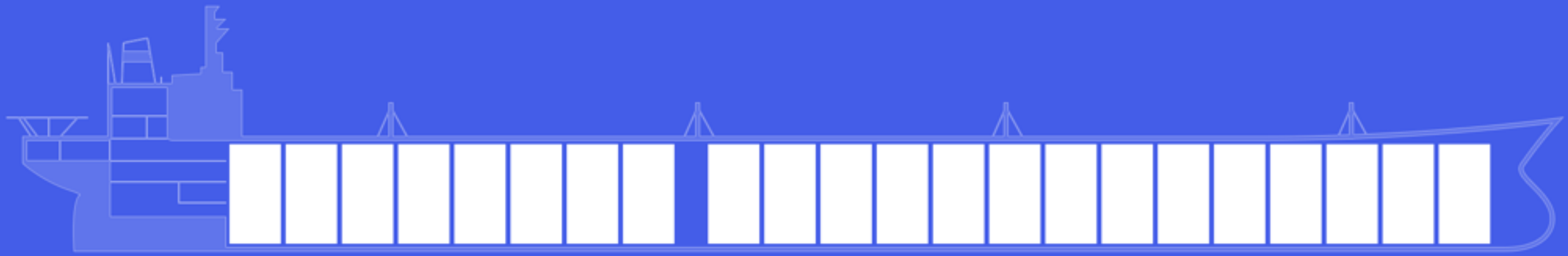
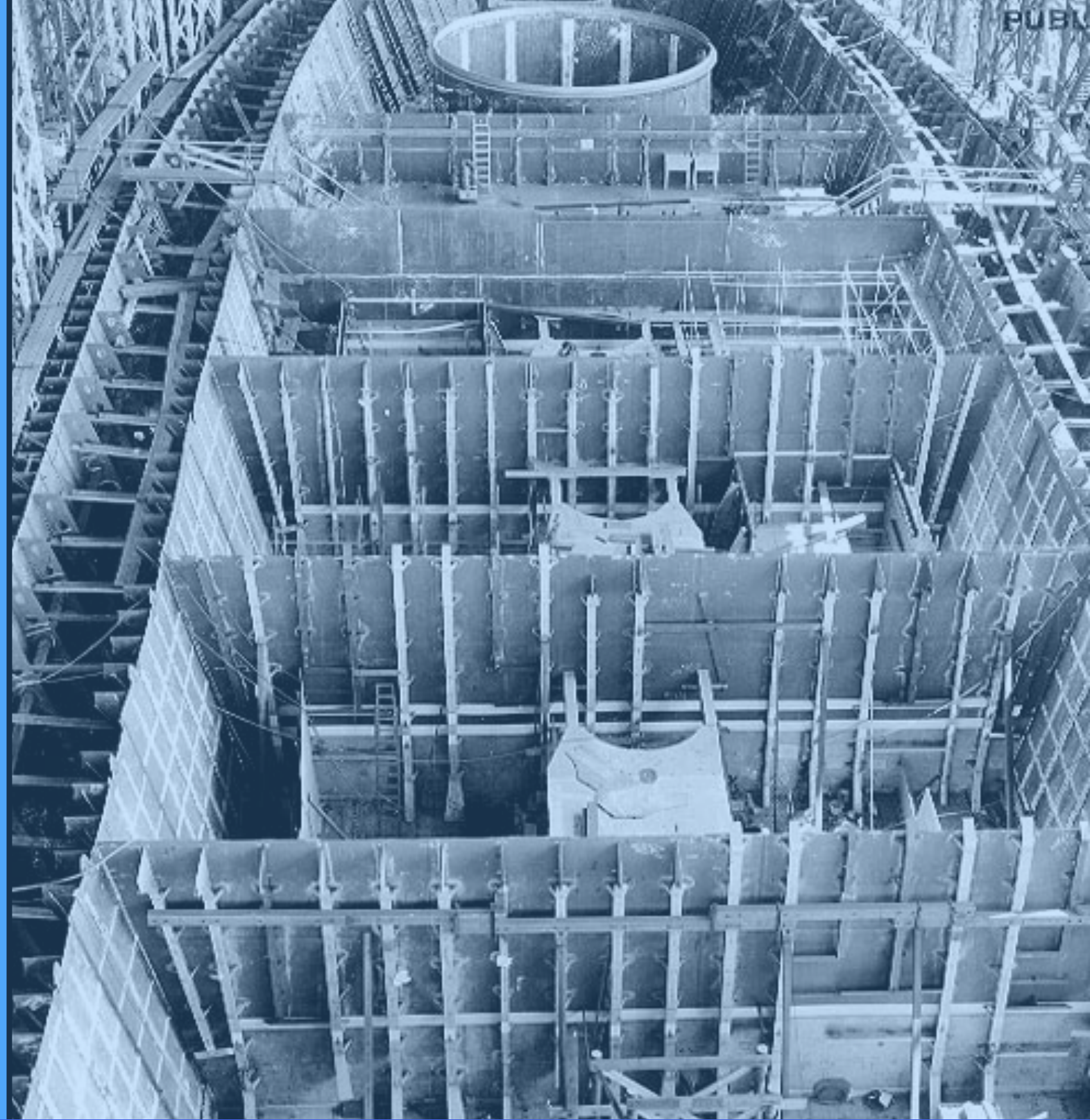
FAILURES NEED TO BE

1. CONTAINED
2. REIFIED—AS MESSAGES
3. SIGNALLED—ASYNCHRONOUSLY
4. OBSERVED—BY 1-N
5. MANAGED

Bulkhead Pattern



Bulkhead Pattern



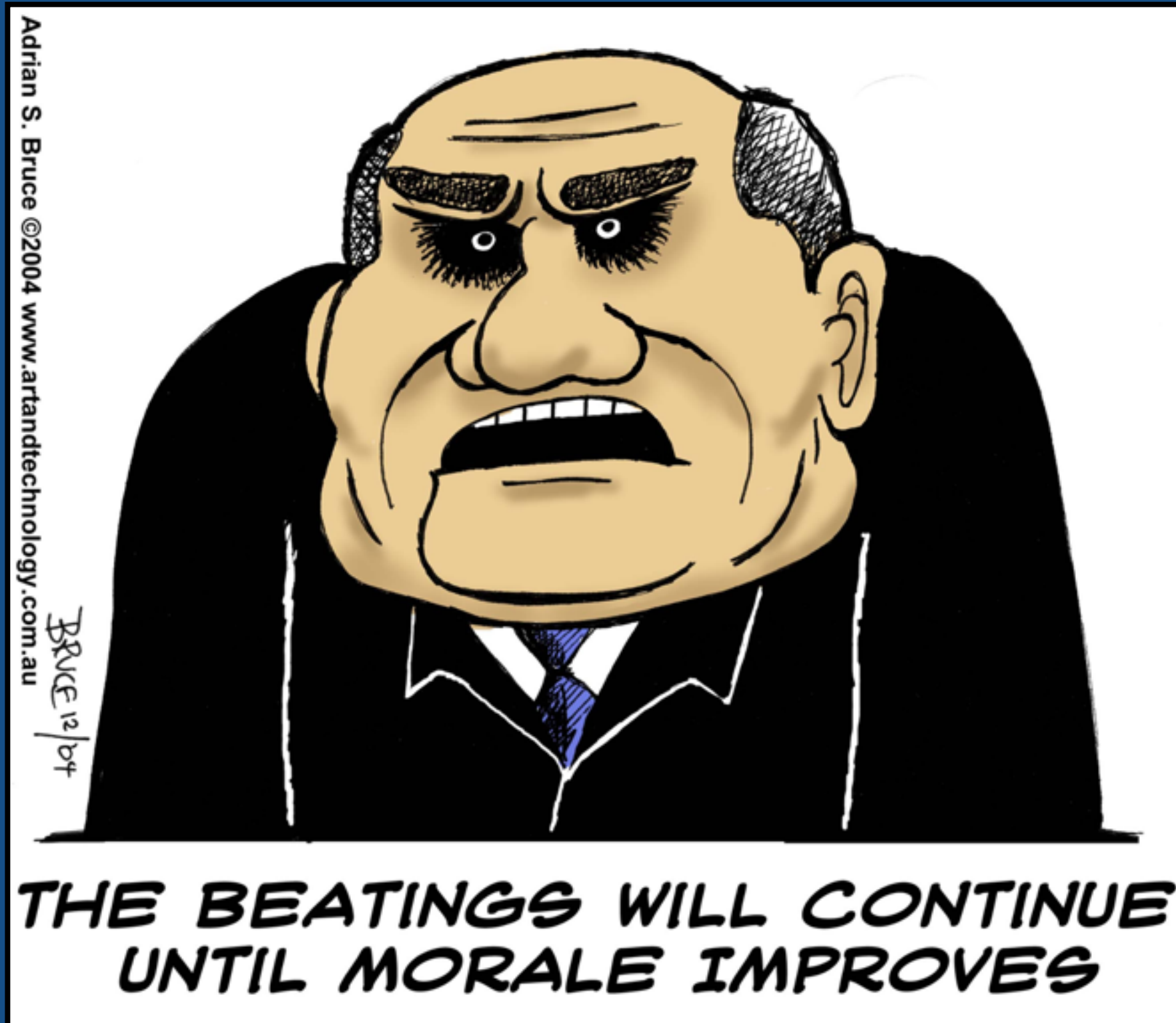
Bulkhead Pattern



Enter Supervision

Enter Supervision

Enter Supervision





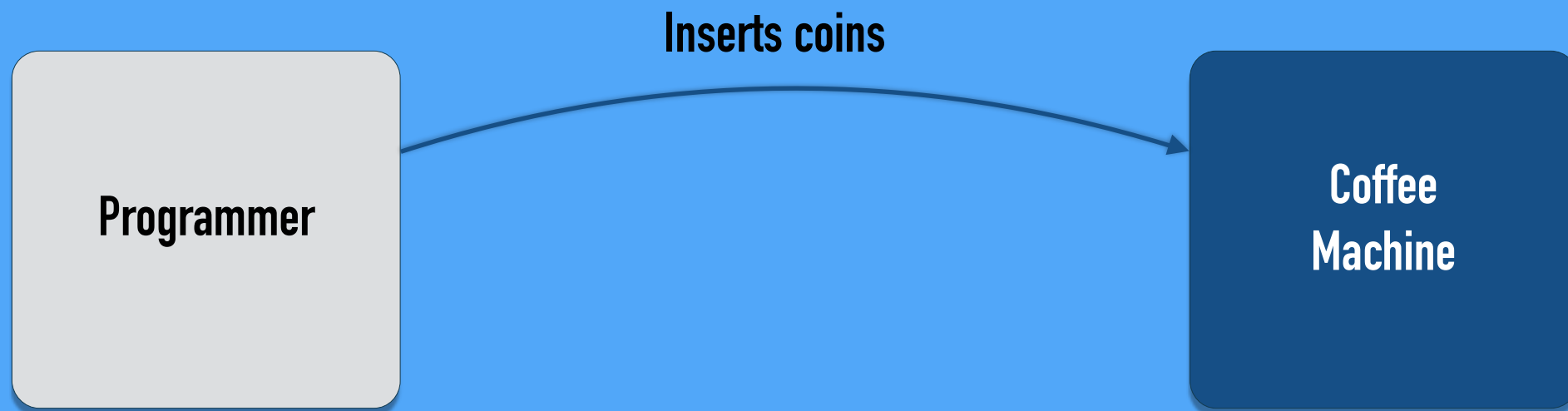
The Vending Machine Pattern

Think Vending Machine

Programmer

**Coffee
Machine**

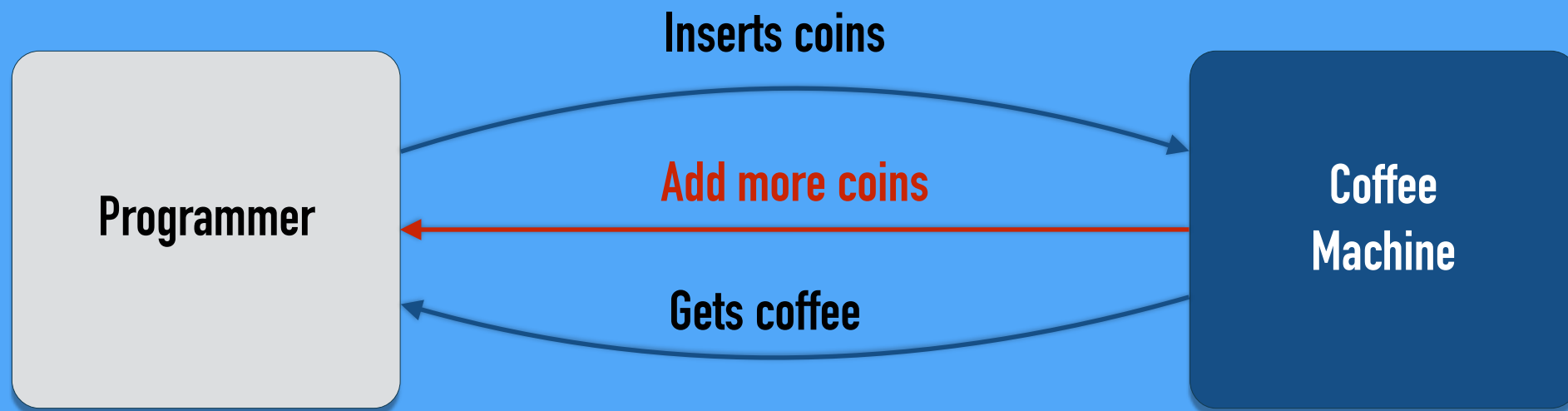
Think Vending Machine



Think Vending Machine



Think Vending Machine

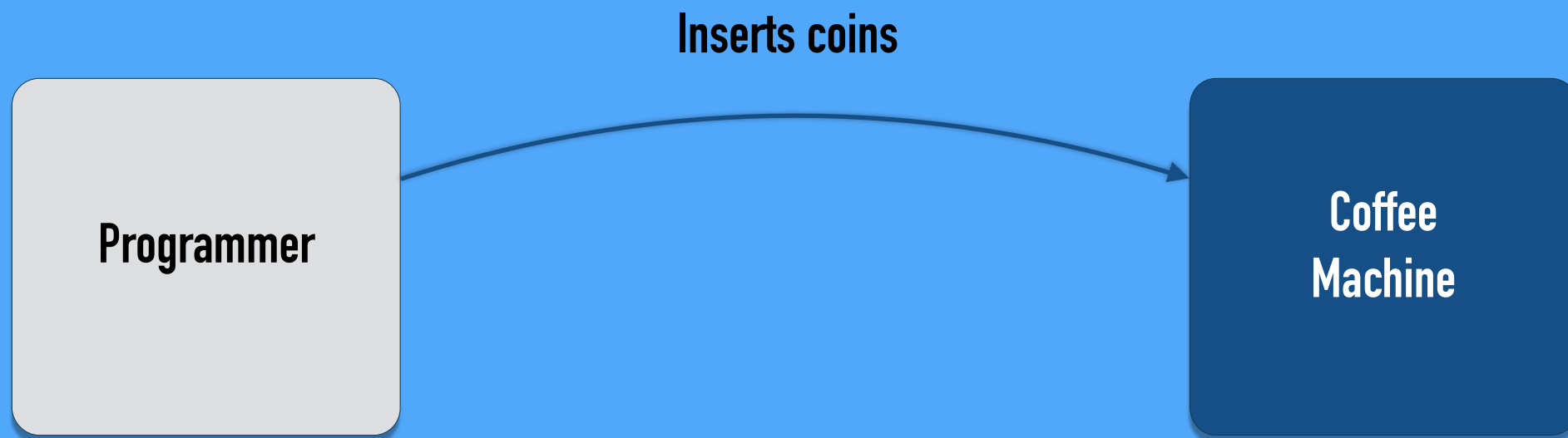


Think Vending Machine

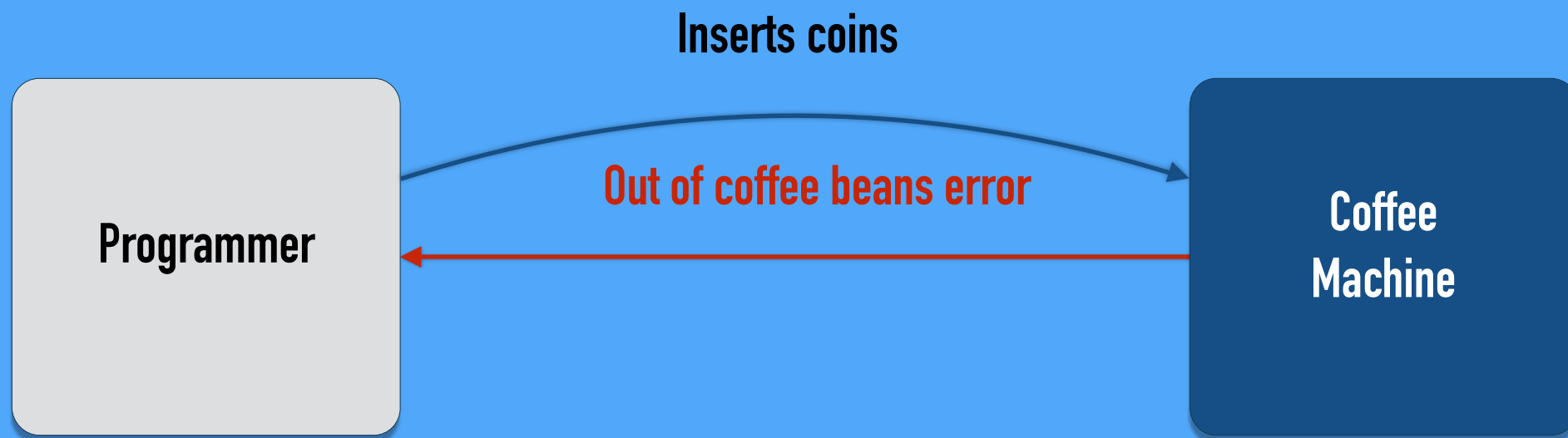
Programmer

**Coffee
Machine**

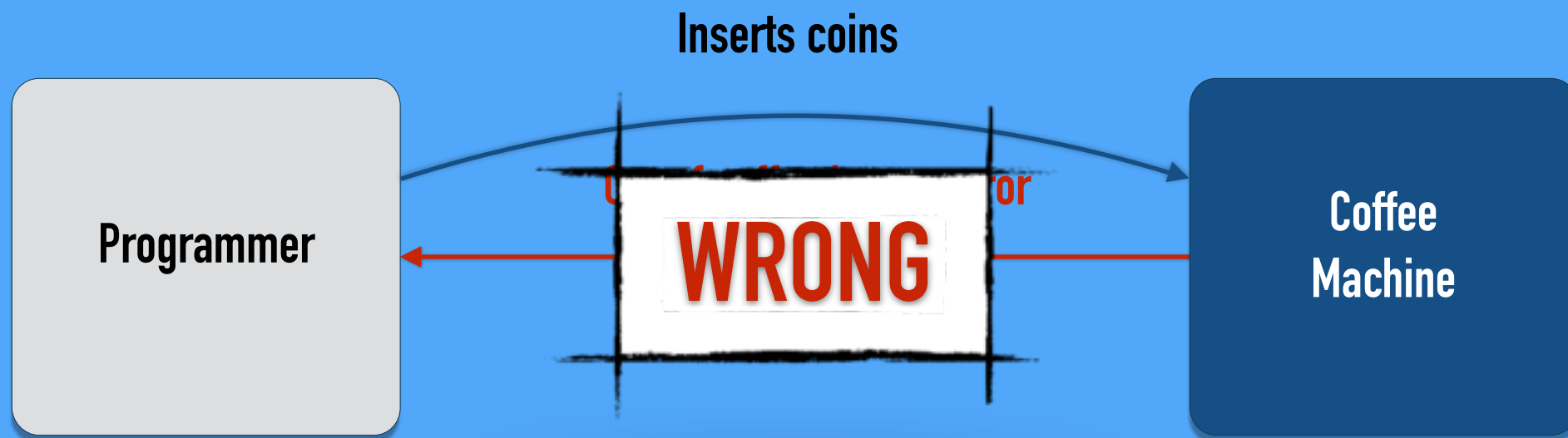
Think Vending Machine



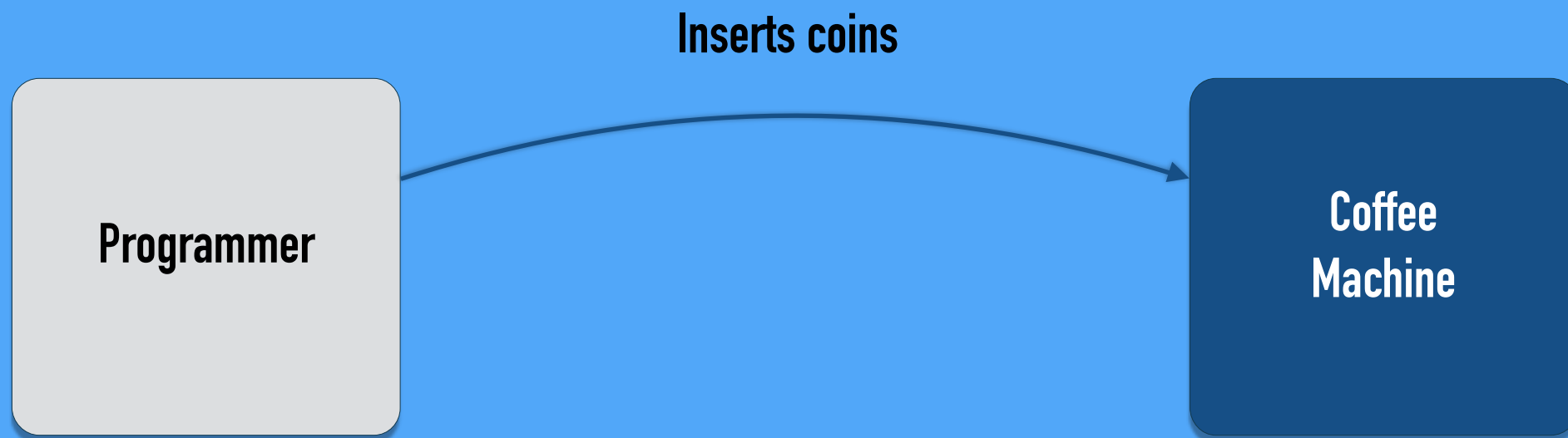
Think Vending Machine



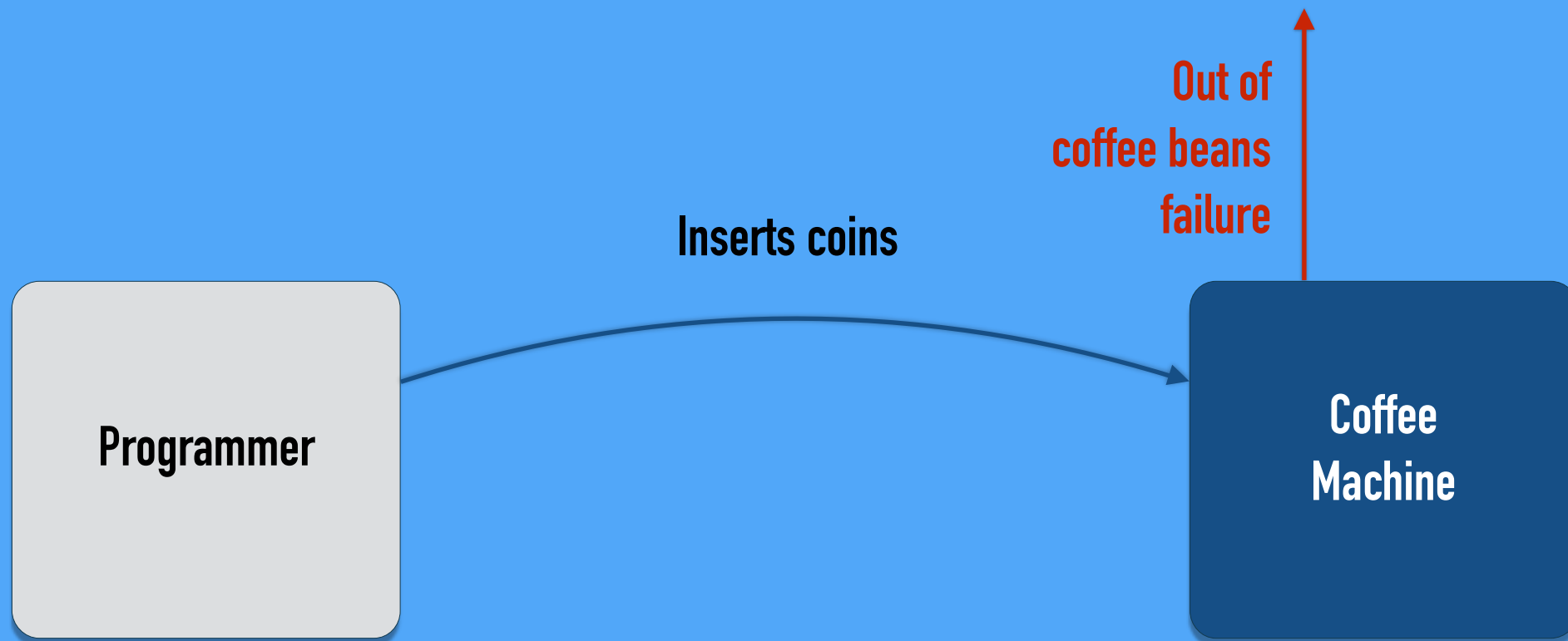
Think Vending Machine



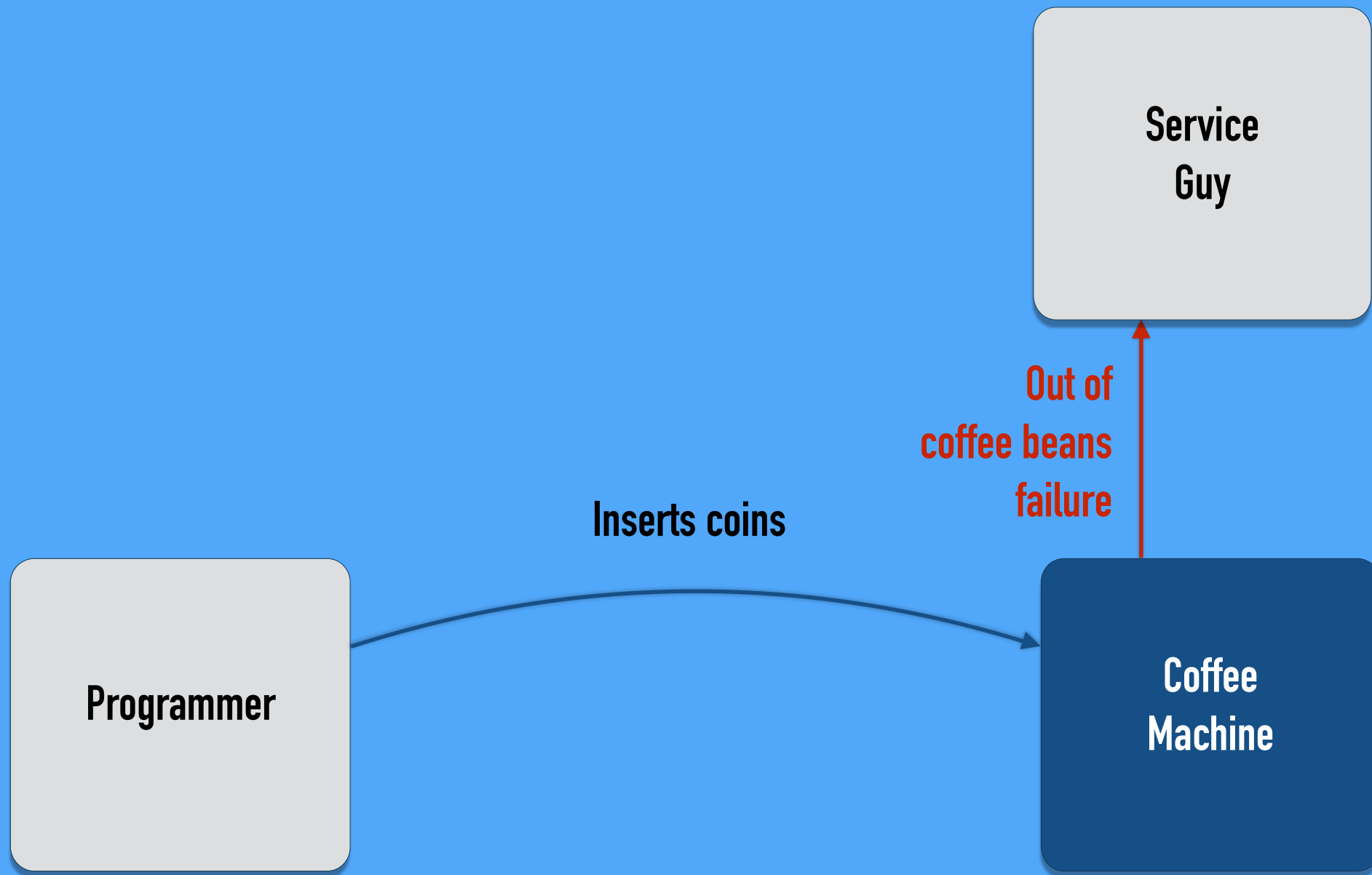
Think Vending Machine



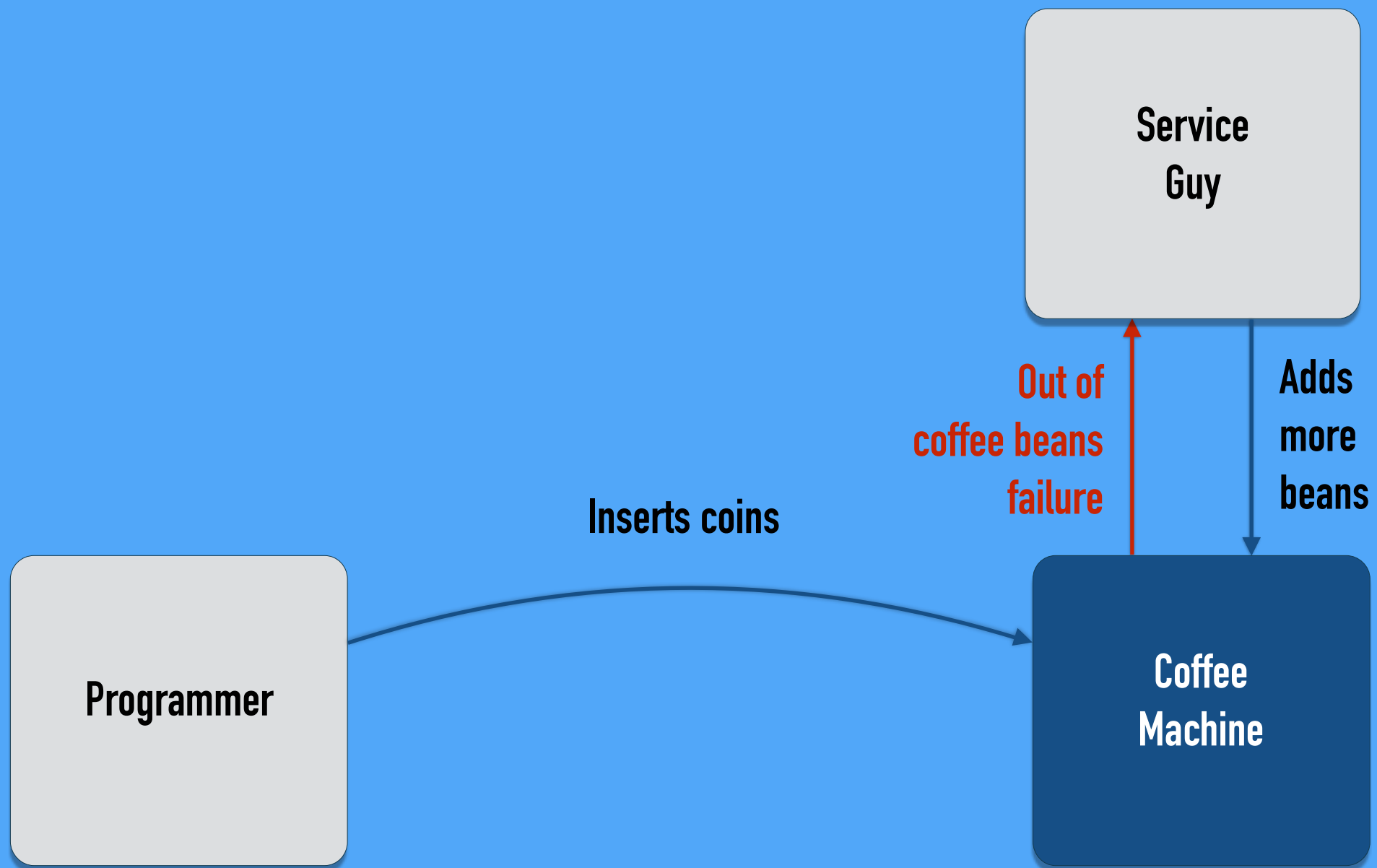
Think Vending Machine



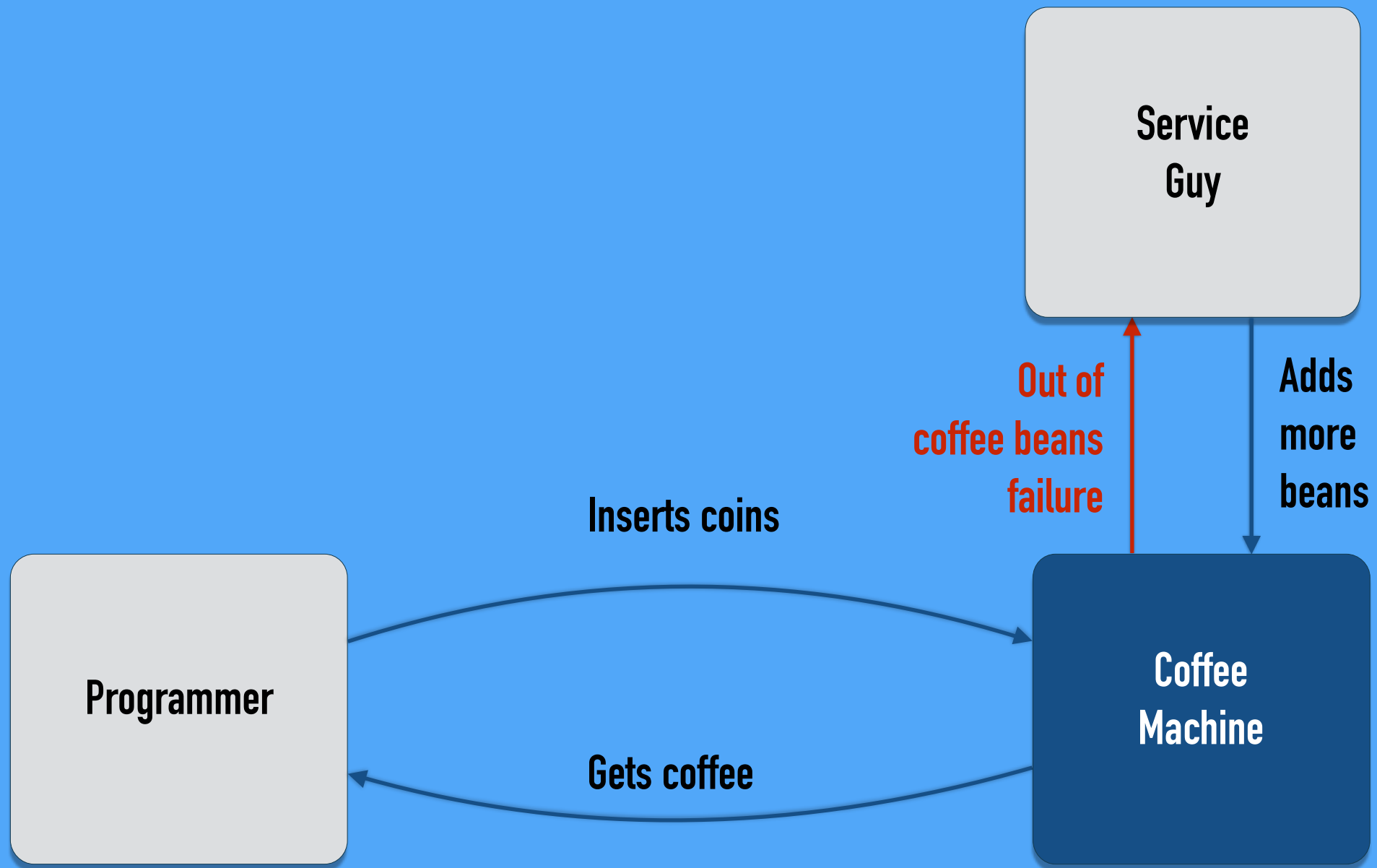
Think Vending Machine



Think Vending Machine



Think Vending Machine



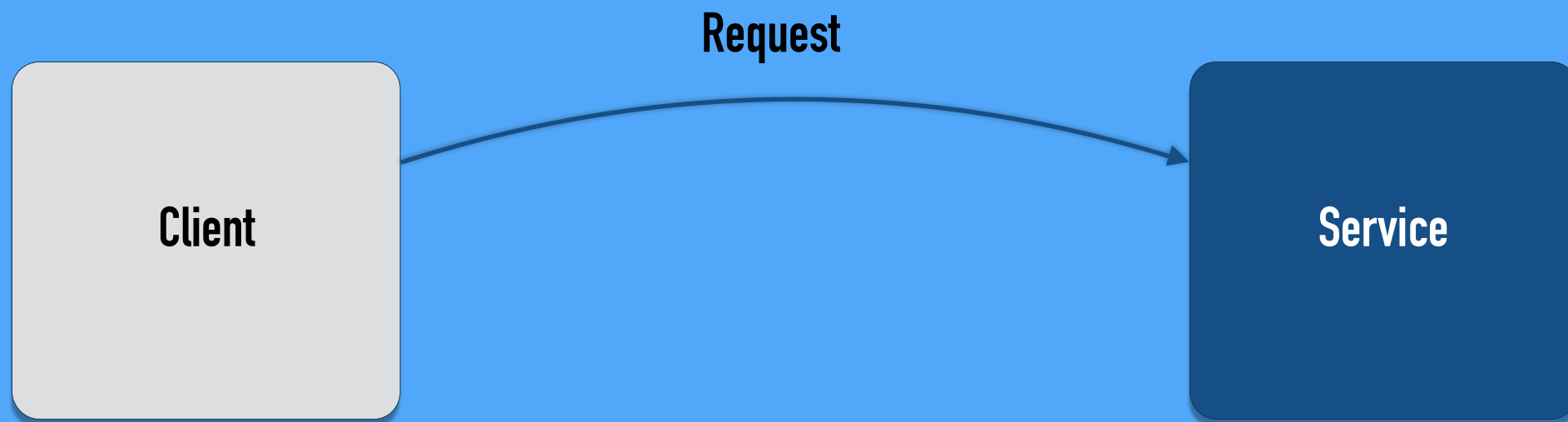
Think Vending Machine

Think Vending Machine

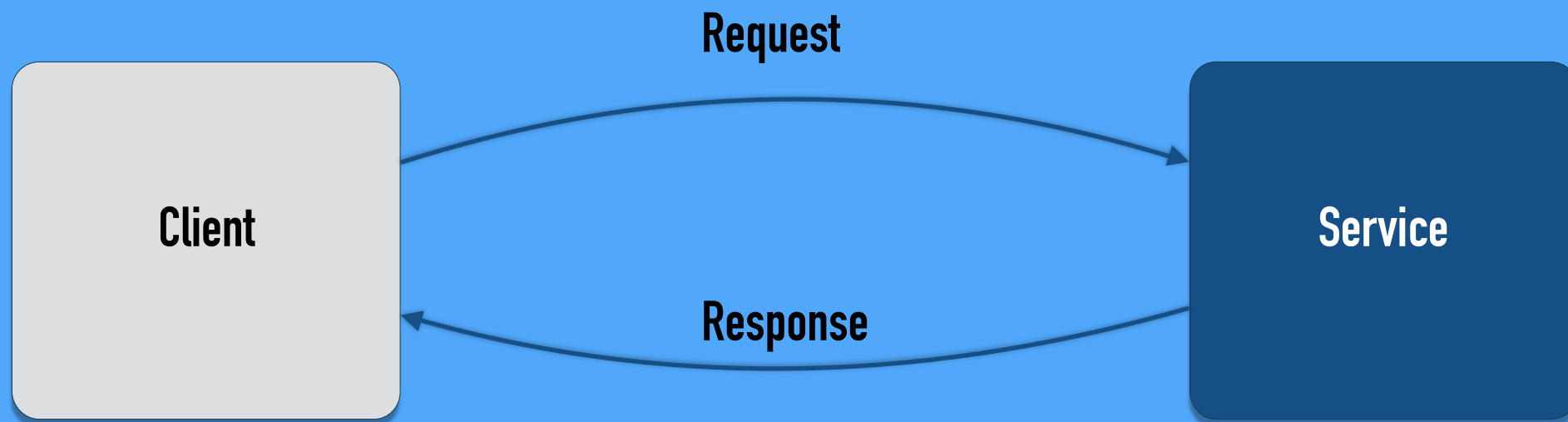
Client

Service

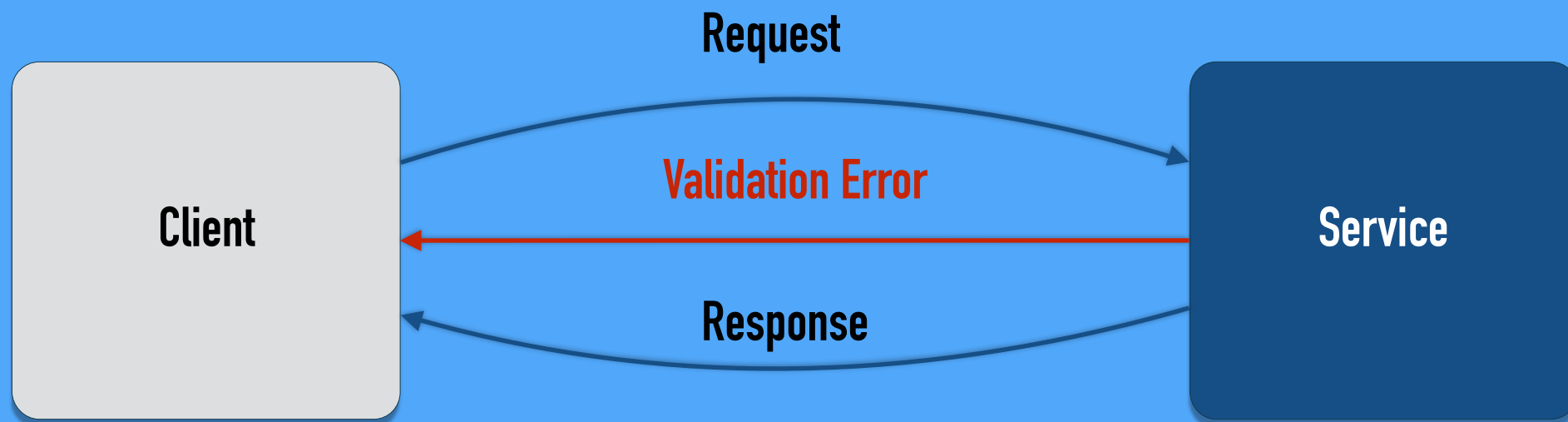
Think Vending Machine



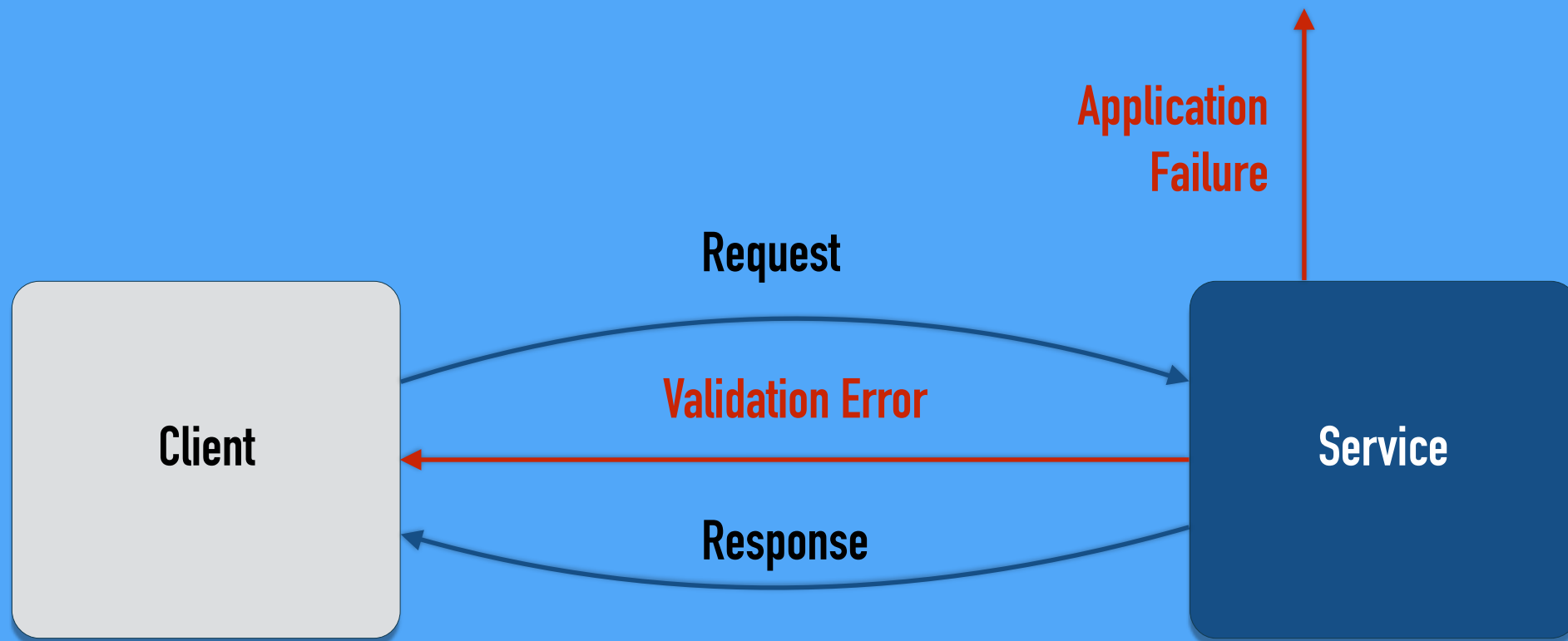
Think Vending Machine



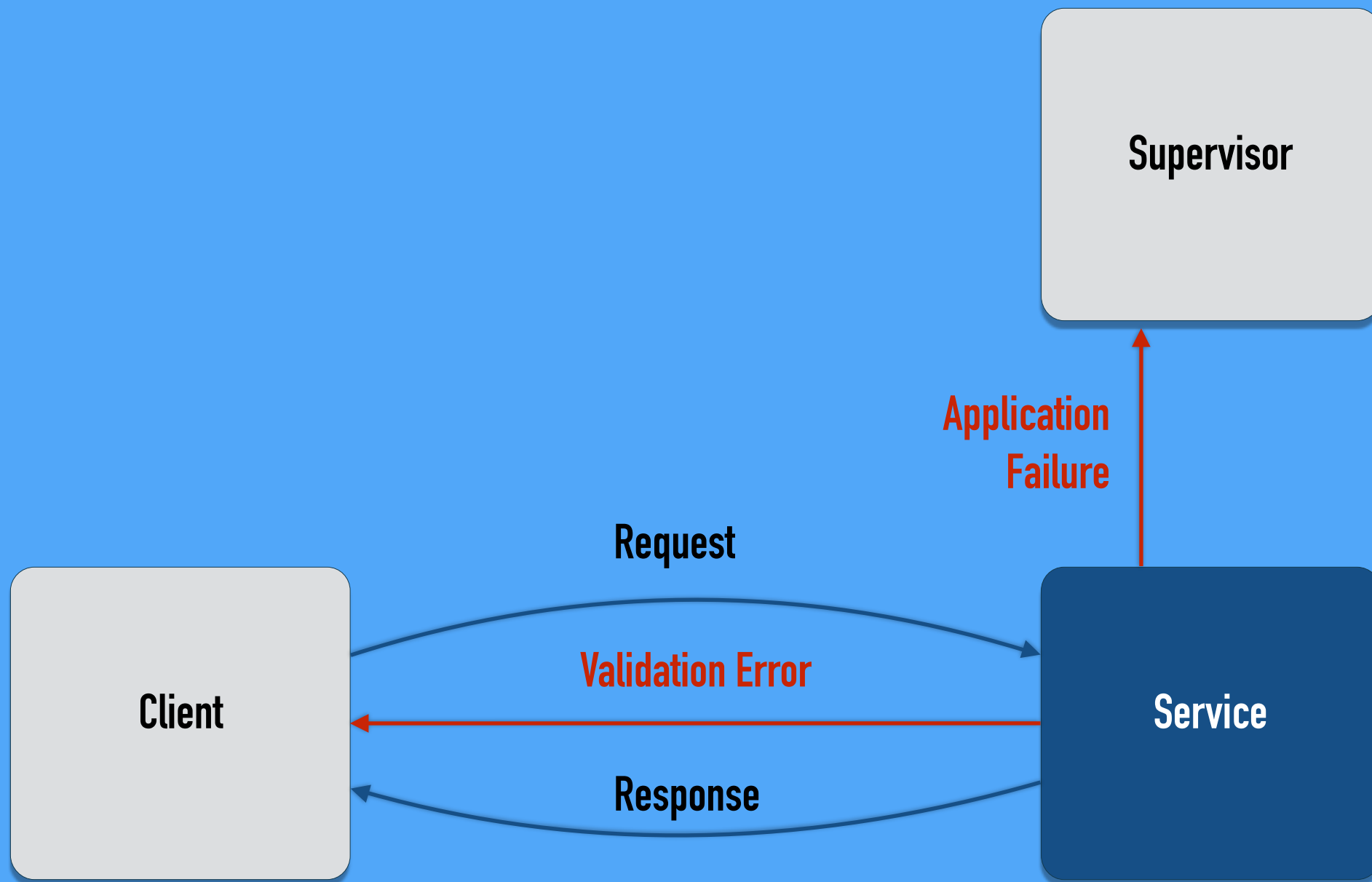
Think Vending Machine



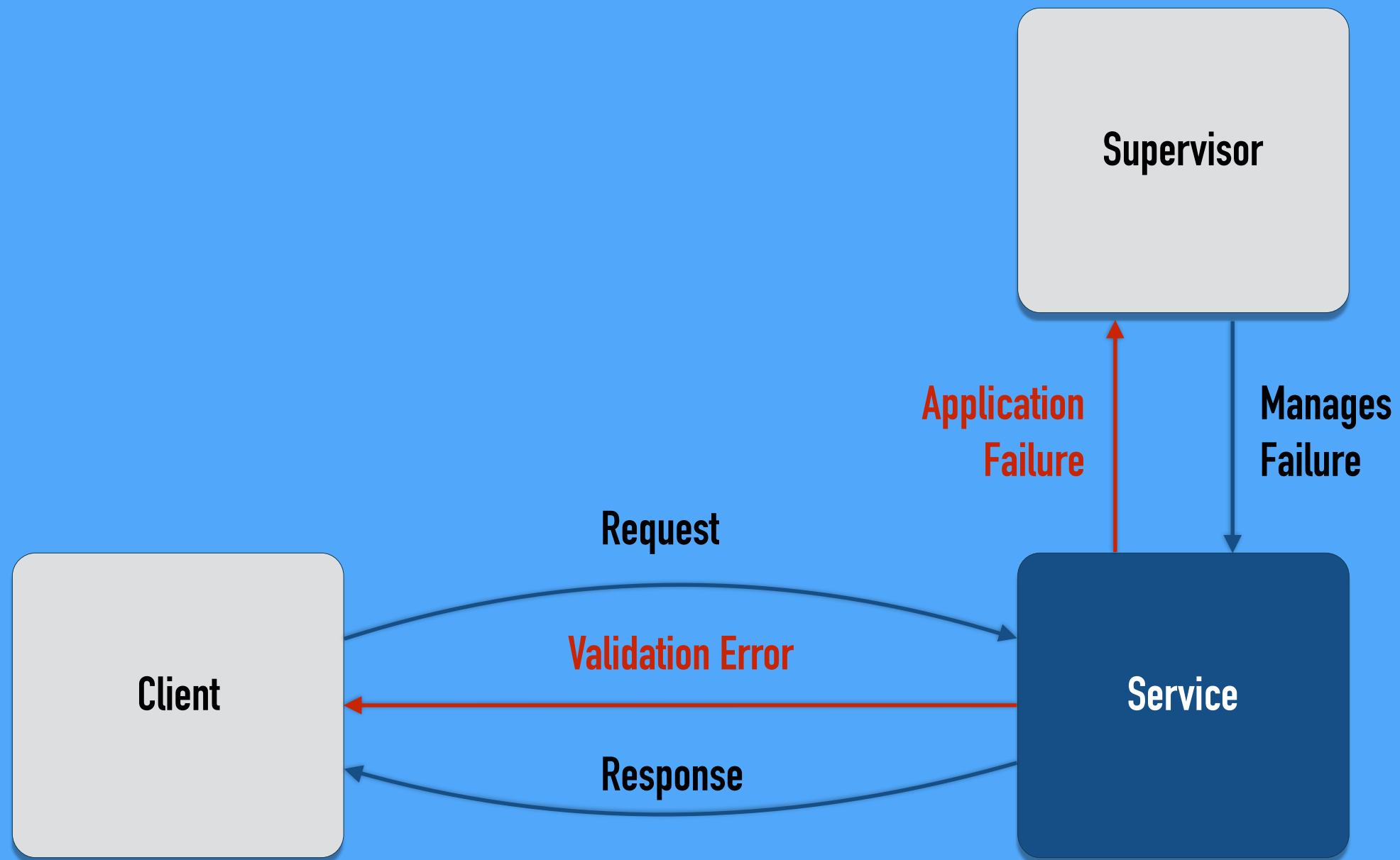
Think Vending Machine



Think Vending Machine



Think Vending Machine





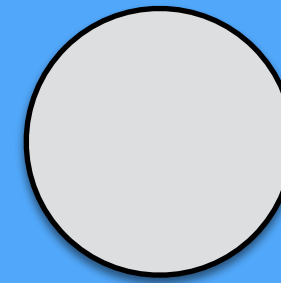
Error Kernel Pattern

ONION-LAYERED STATE & FAILURE MANAGEMENT

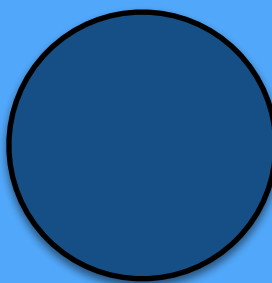
Making reliable distributed systems in the presence of software errors - Joe Armstrong
On Erlang, State and Crashes - Jesper Louis Andersen

Onion Layered State Management

Client



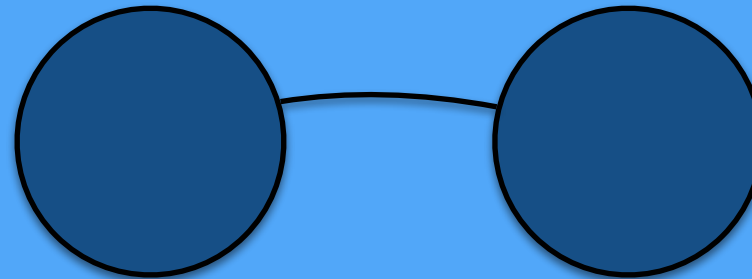
Object



Critical state
that needs protection

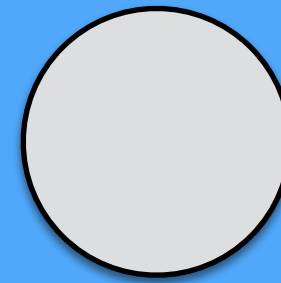


Thread boundary

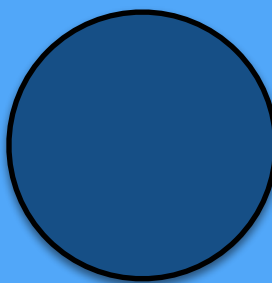


Onion Layered State Management

Client



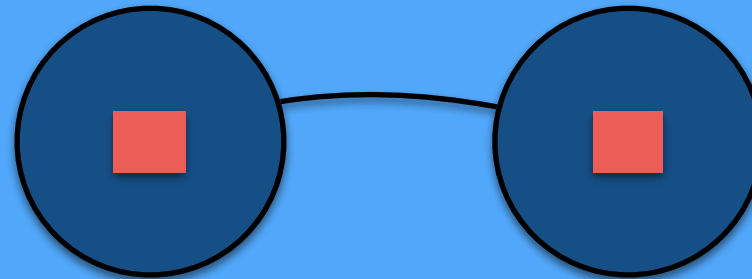
Object



Critical state
that needs protection

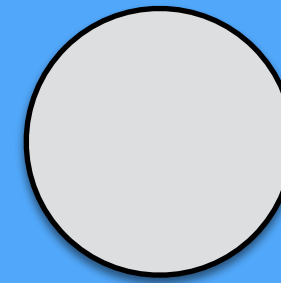


Thread boundary

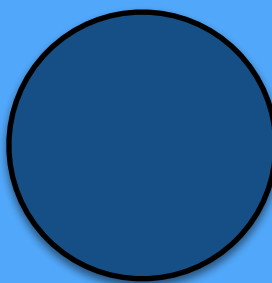


Onion Layered State Management

Client



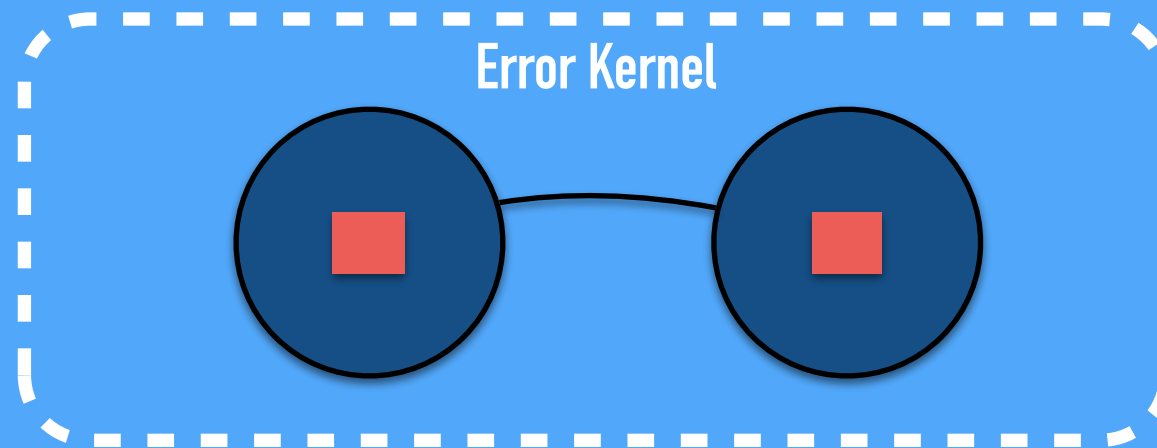
Object



Critical state
that needs protection

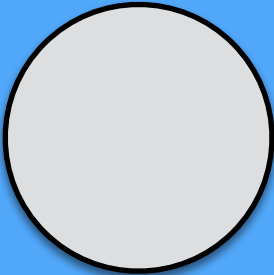


Thread boundary

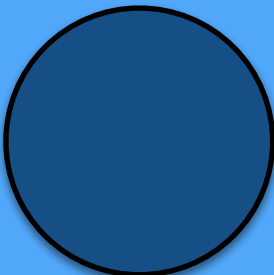


Onion Layered State Management

Client



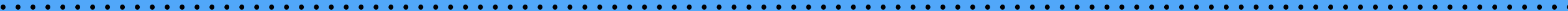
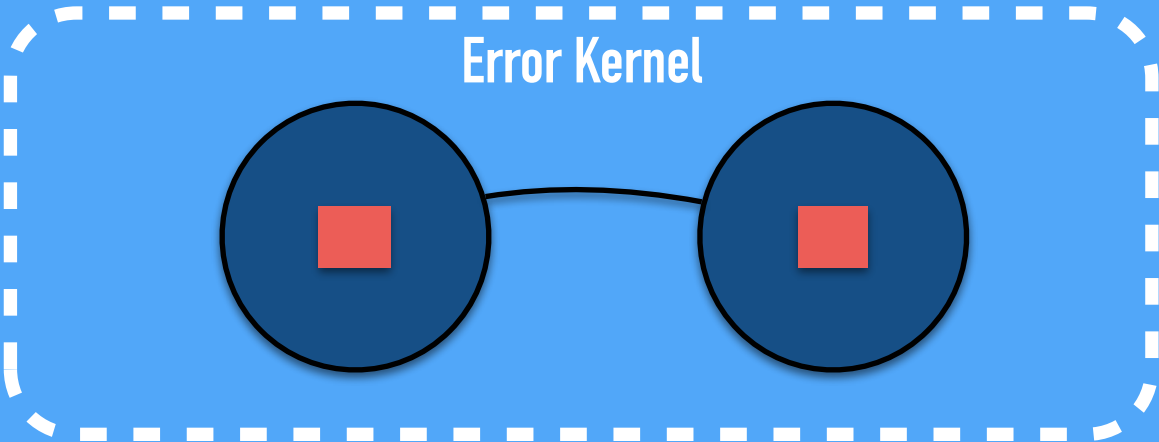
Object



Critical state
that needs protection

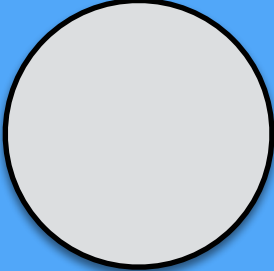


Thread boundary

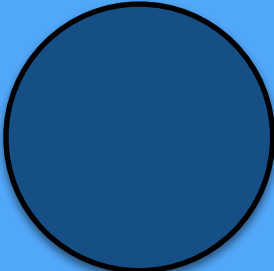


Onion Layered State Management

Client



Object



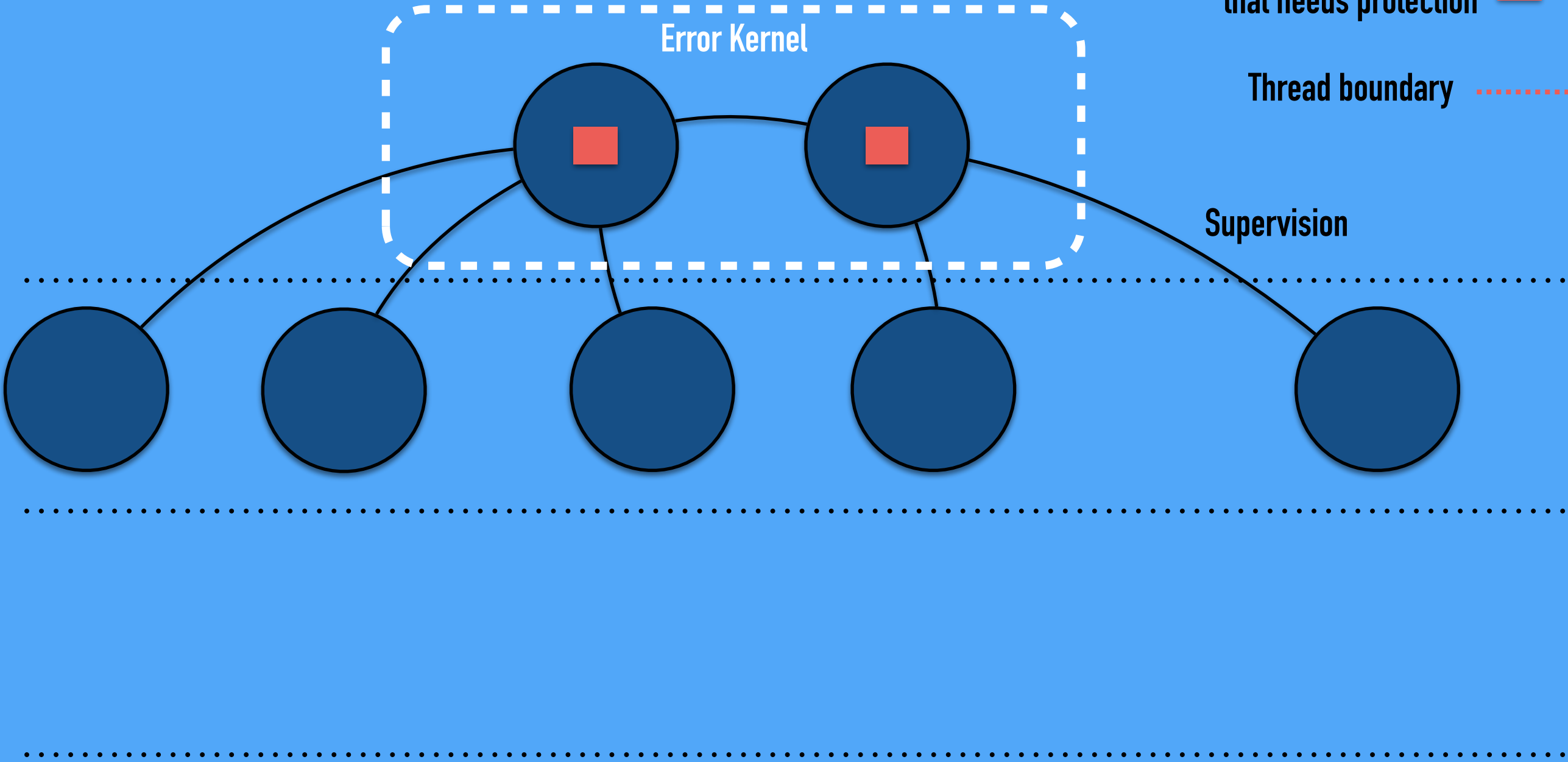
Critical state
that needs protection



Thread boundary

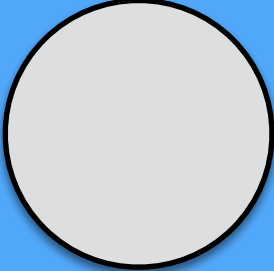


Supervision

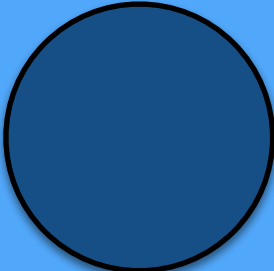


Onion Layered State Management

Client



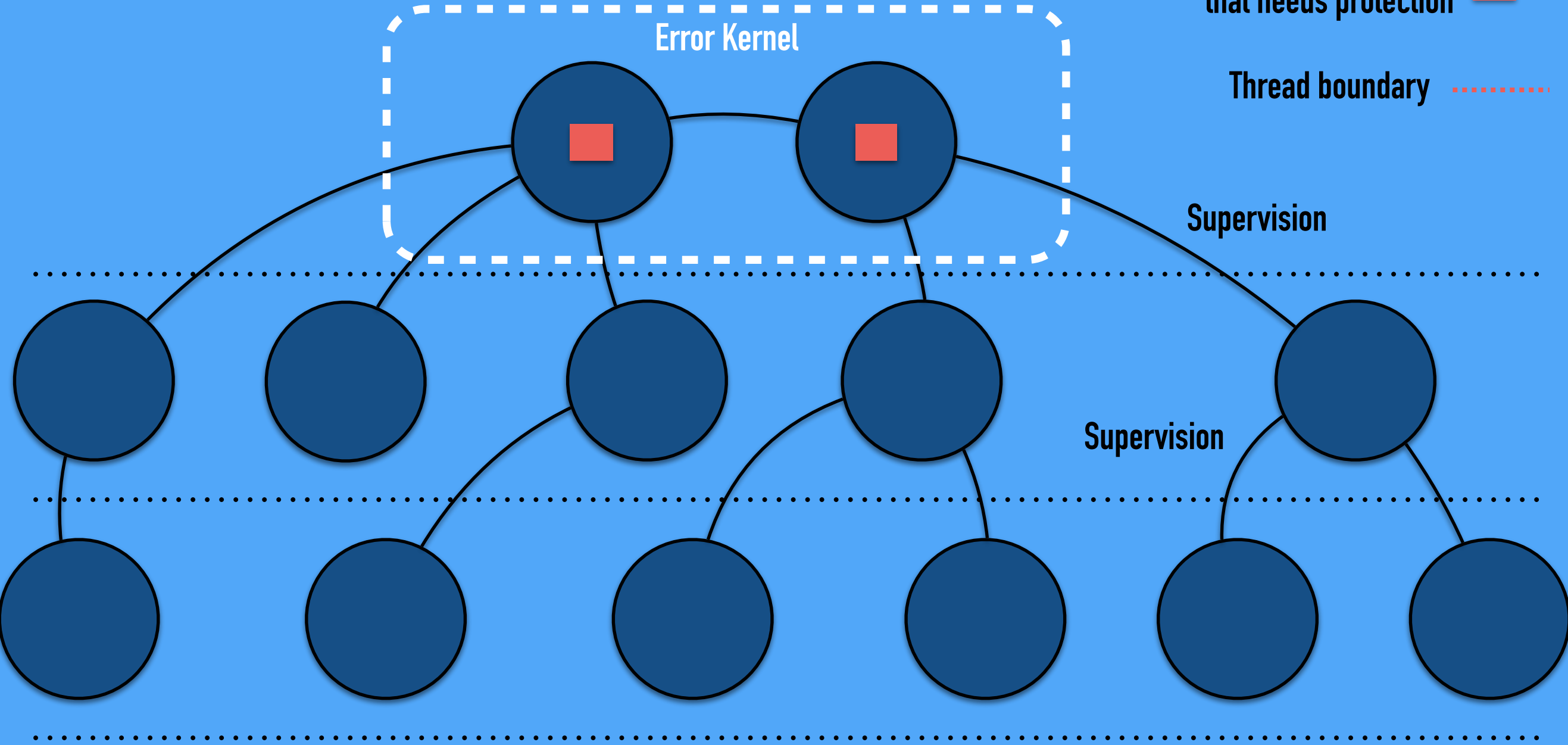
Object



Critical state
that needs protection

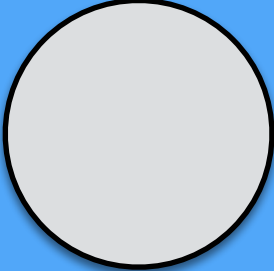


Thread boundary

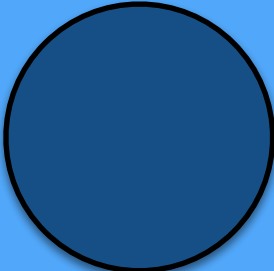


Onion Layered State Management

Client



Object



Critical state
that needs protection



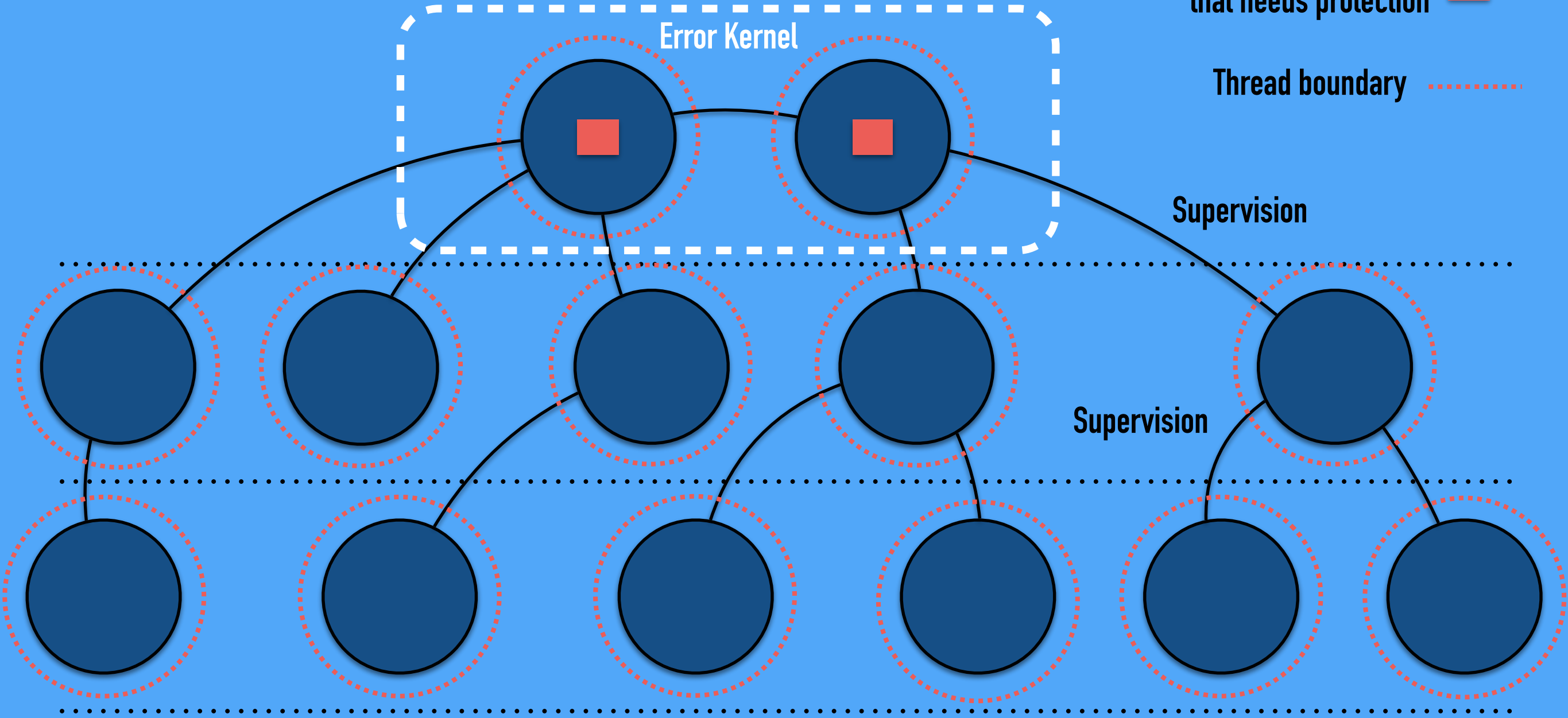
Thread boundary



Error Kernel

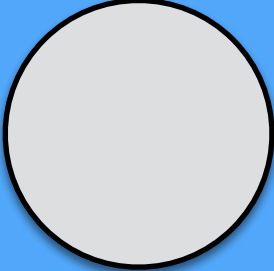
Supervision

Supervision

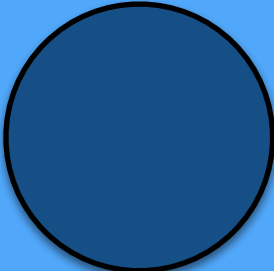


Onion Layered State Management

Client



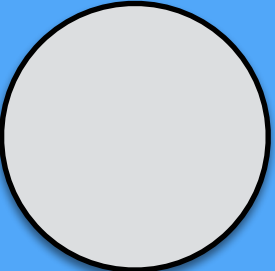
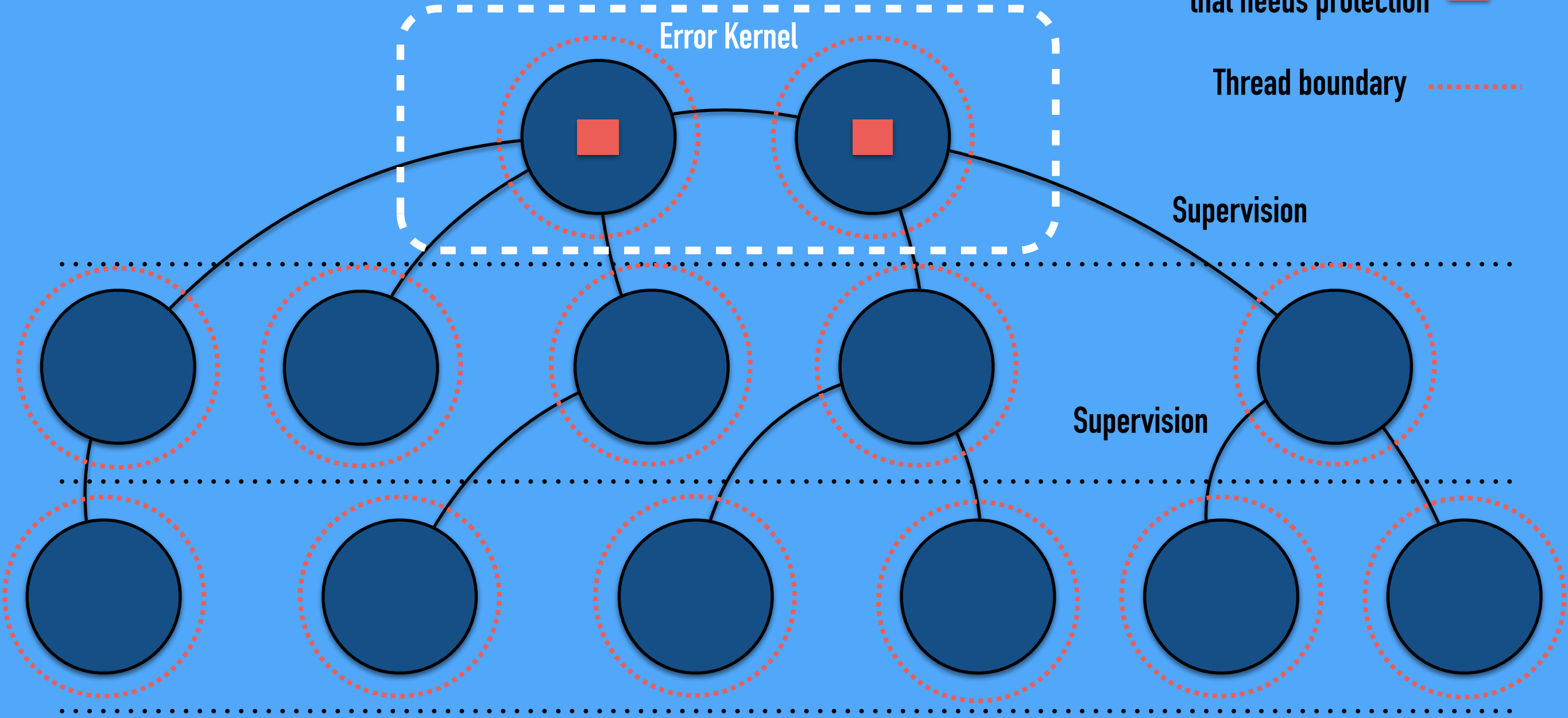
Object



Critical state
that needs protection

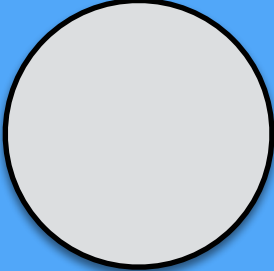


Thread boundary

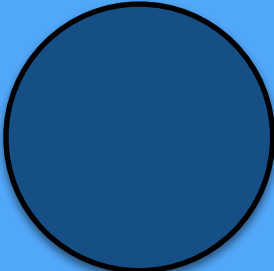


Onion Layered State Management

Client



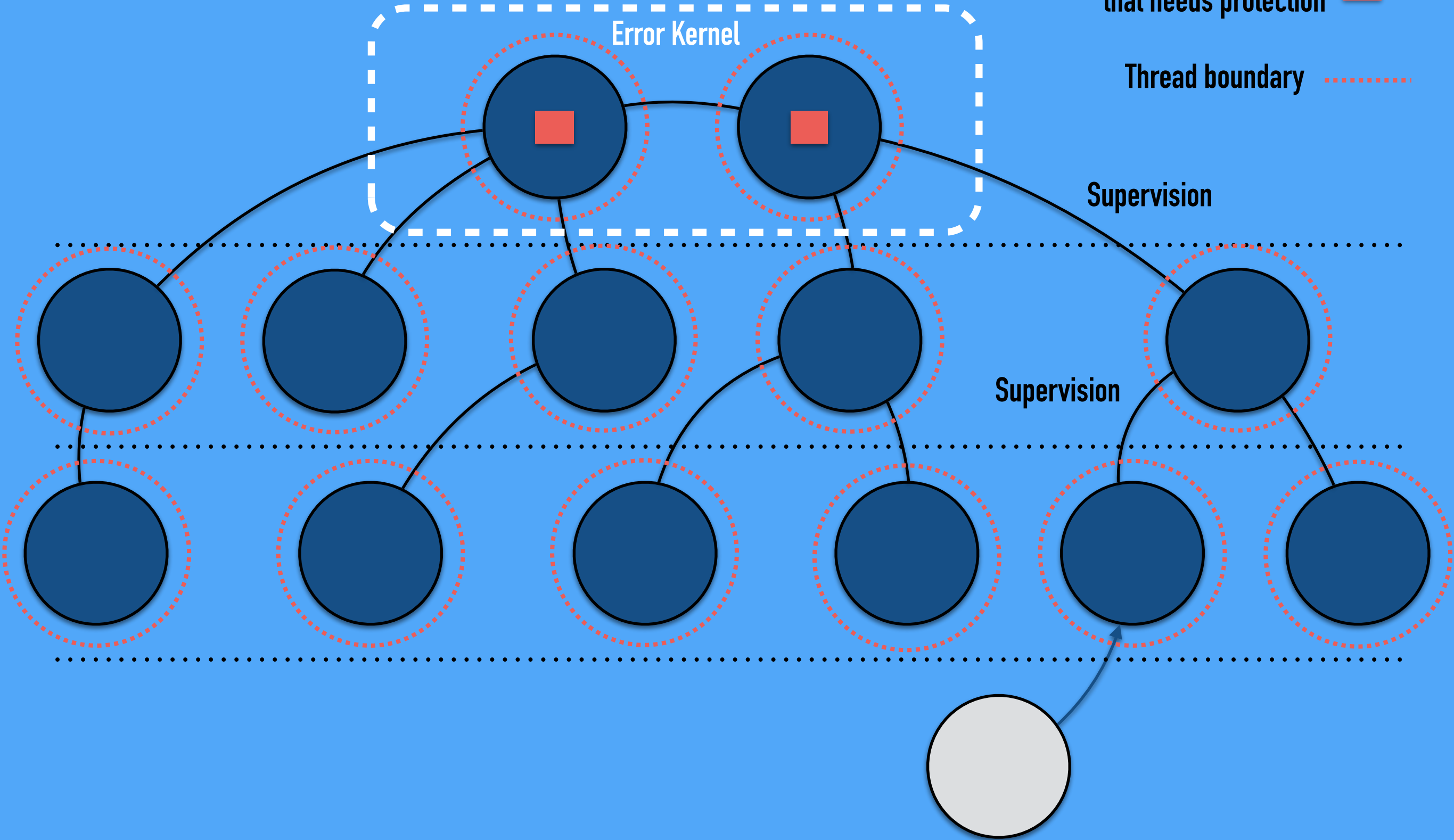
Object



Critical state
that needs protection



Thread boundary

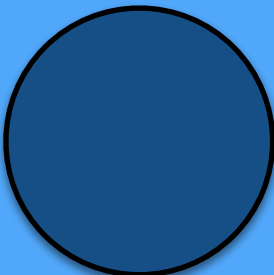


Onion Layered State Management

Client



Object



Critical state
that needs protection



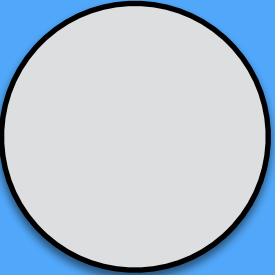
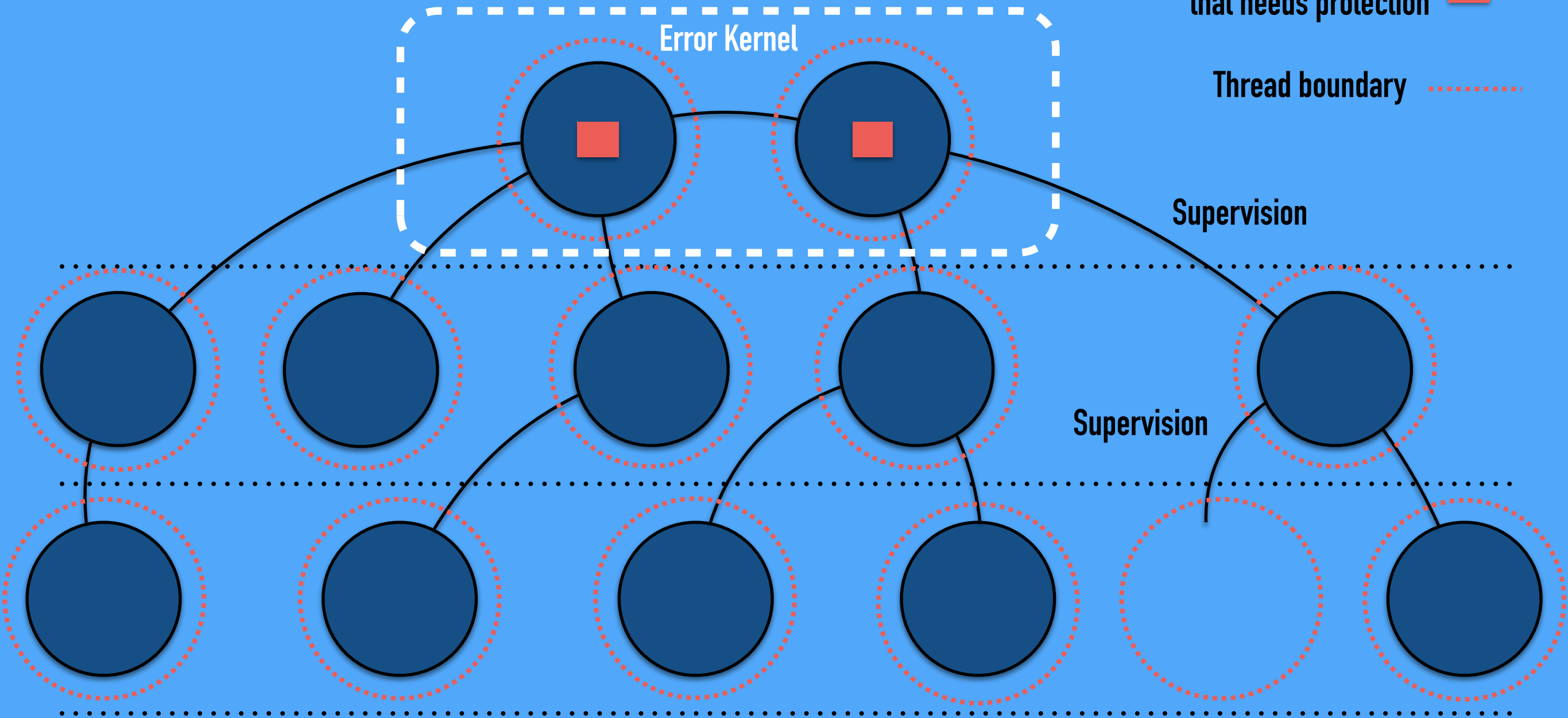
Thread boundary



Error Kernel

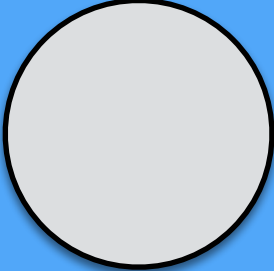
Supervision

Supervision

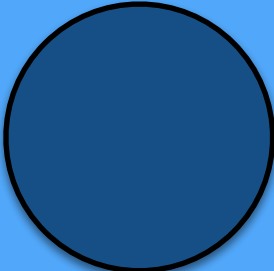


Onion Layered State Management

Client



Object



Critical state
that needs protection



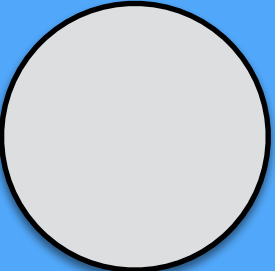
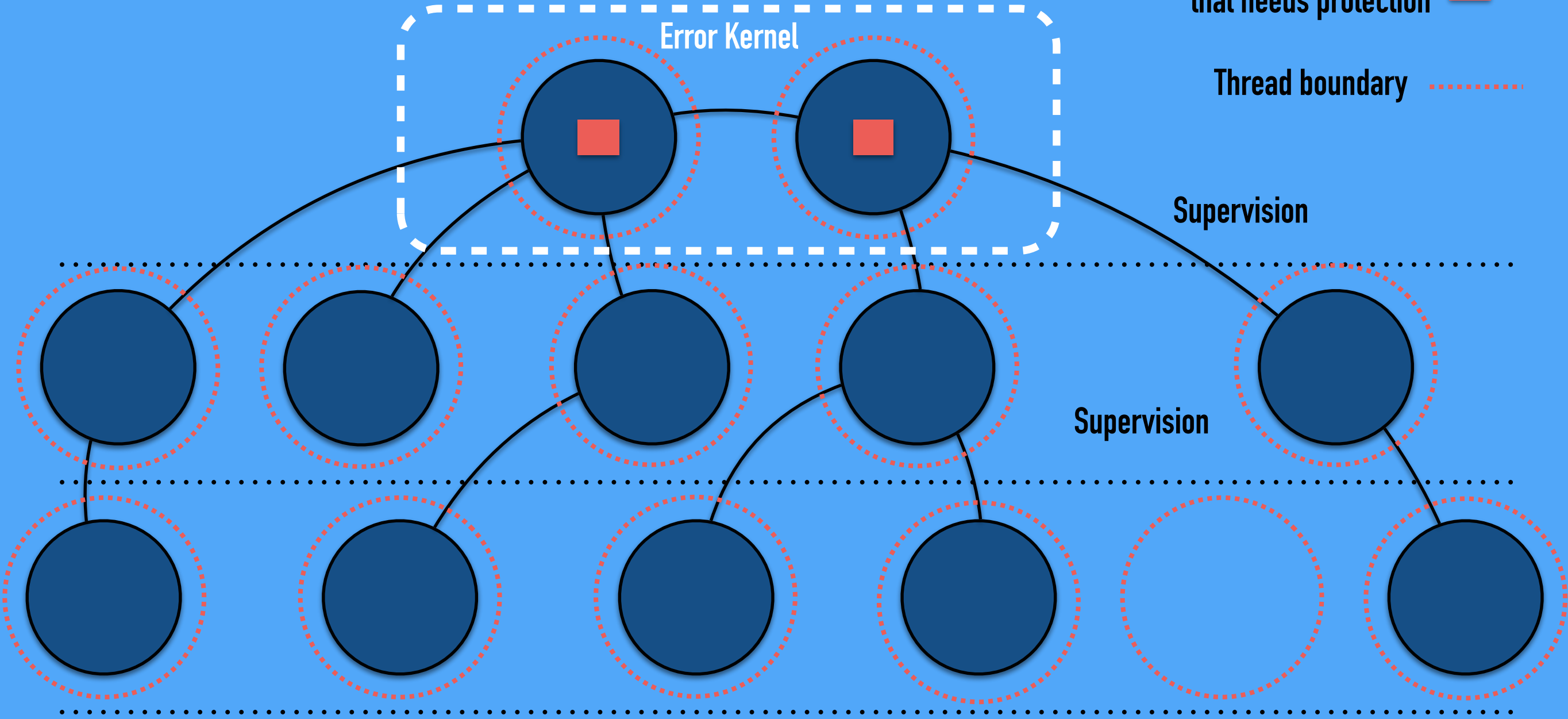
Thread boundary



Supervision

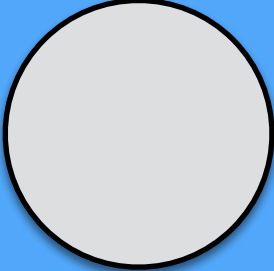
Supervision

Error Kernel

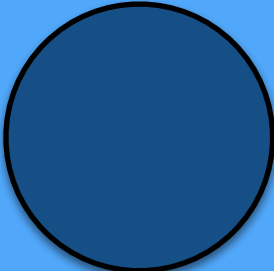


Onion Layered State Management

Client



Object



Critical state
that needs protection



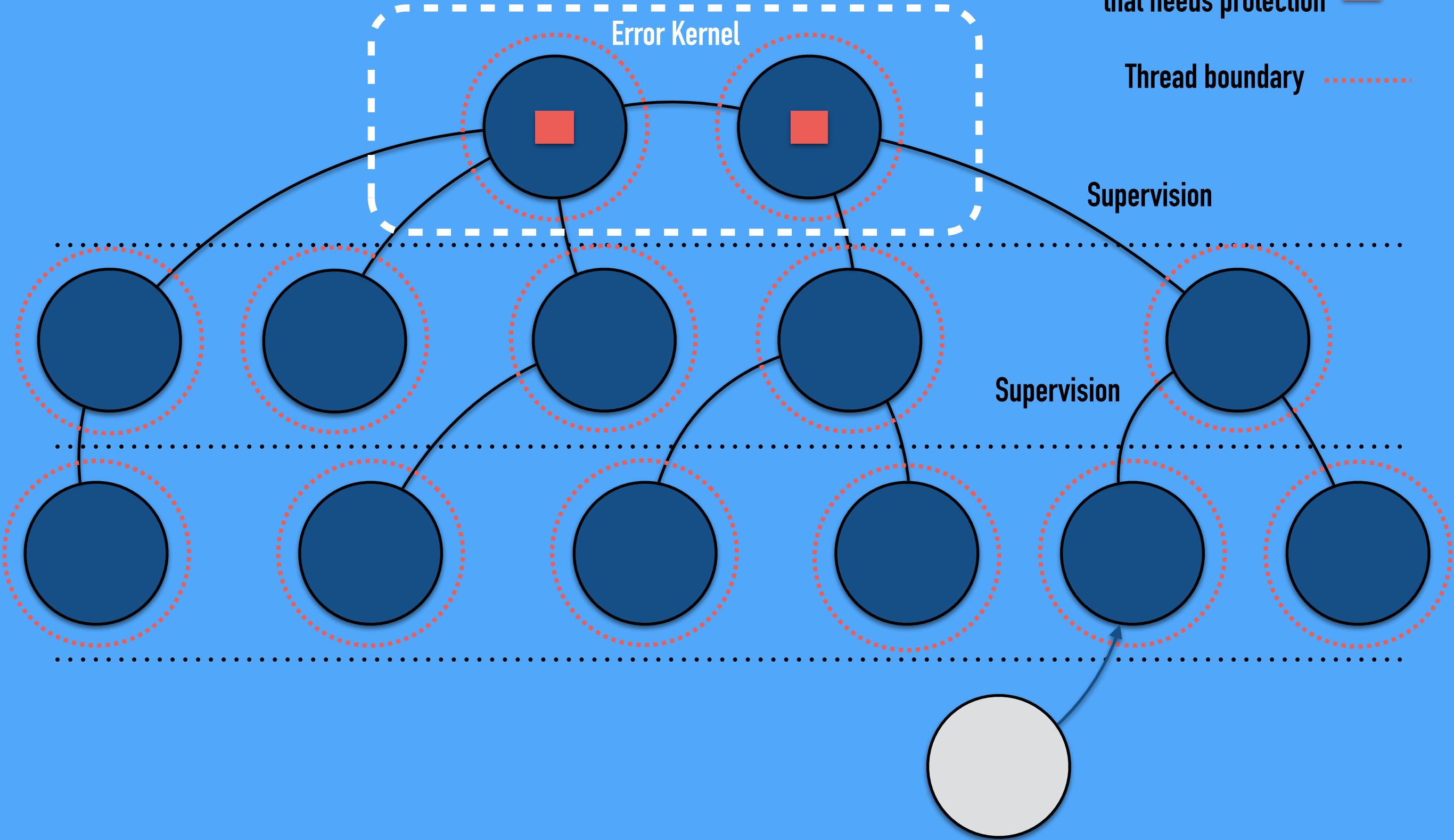
Thread boundary



Error Kernel

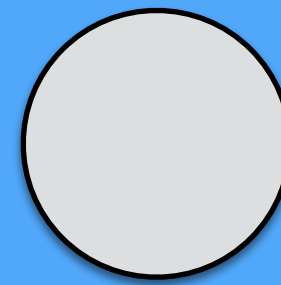
Supervision

Supervision

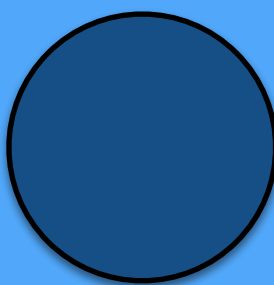


Onion Layered

Client



Object



Critical state
that needs protection

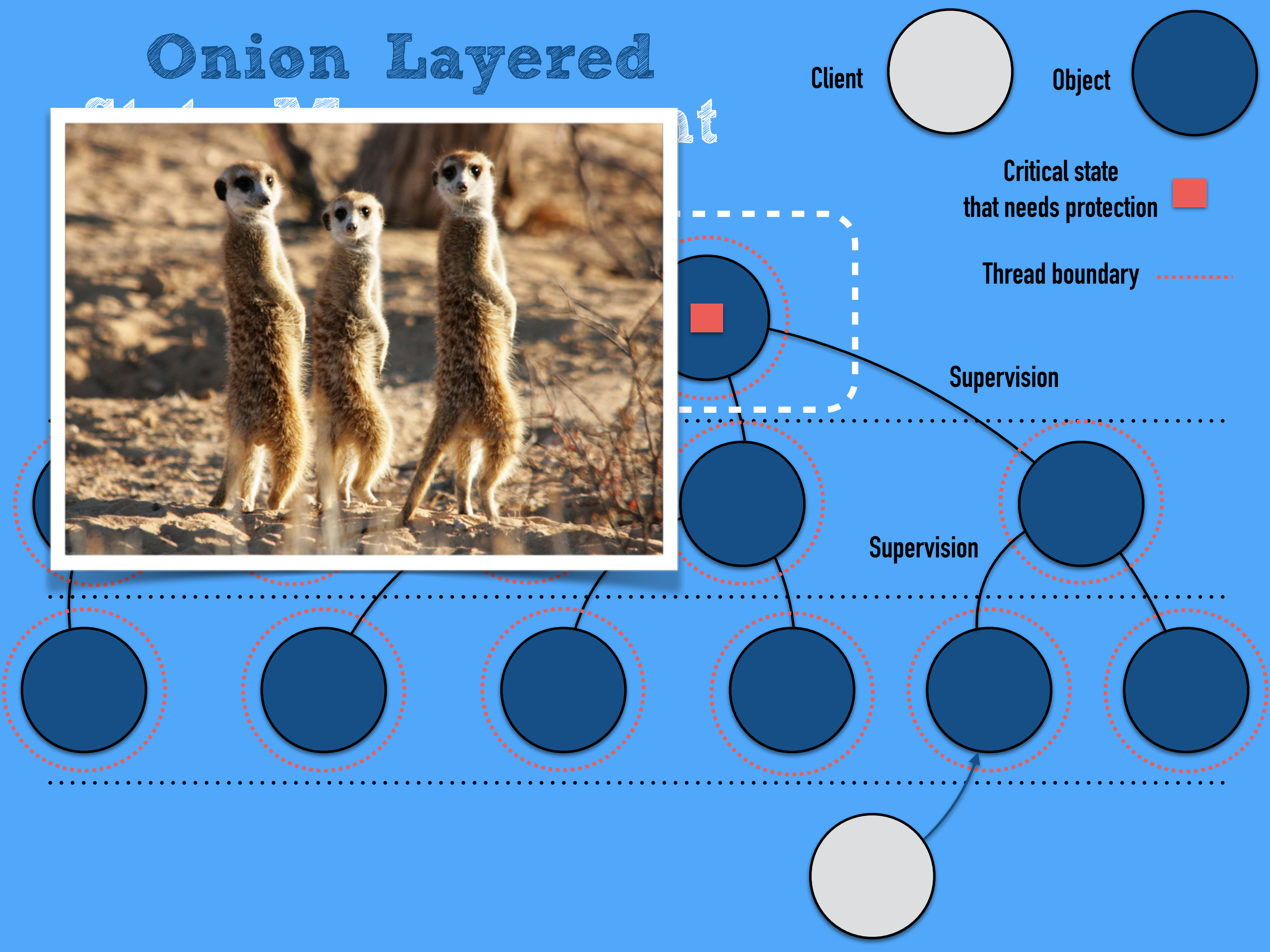


Thread boundary



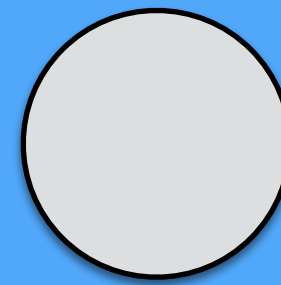
Supervision

Supervision

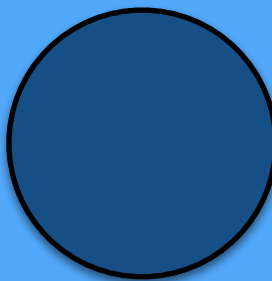


Onion Layered

Client



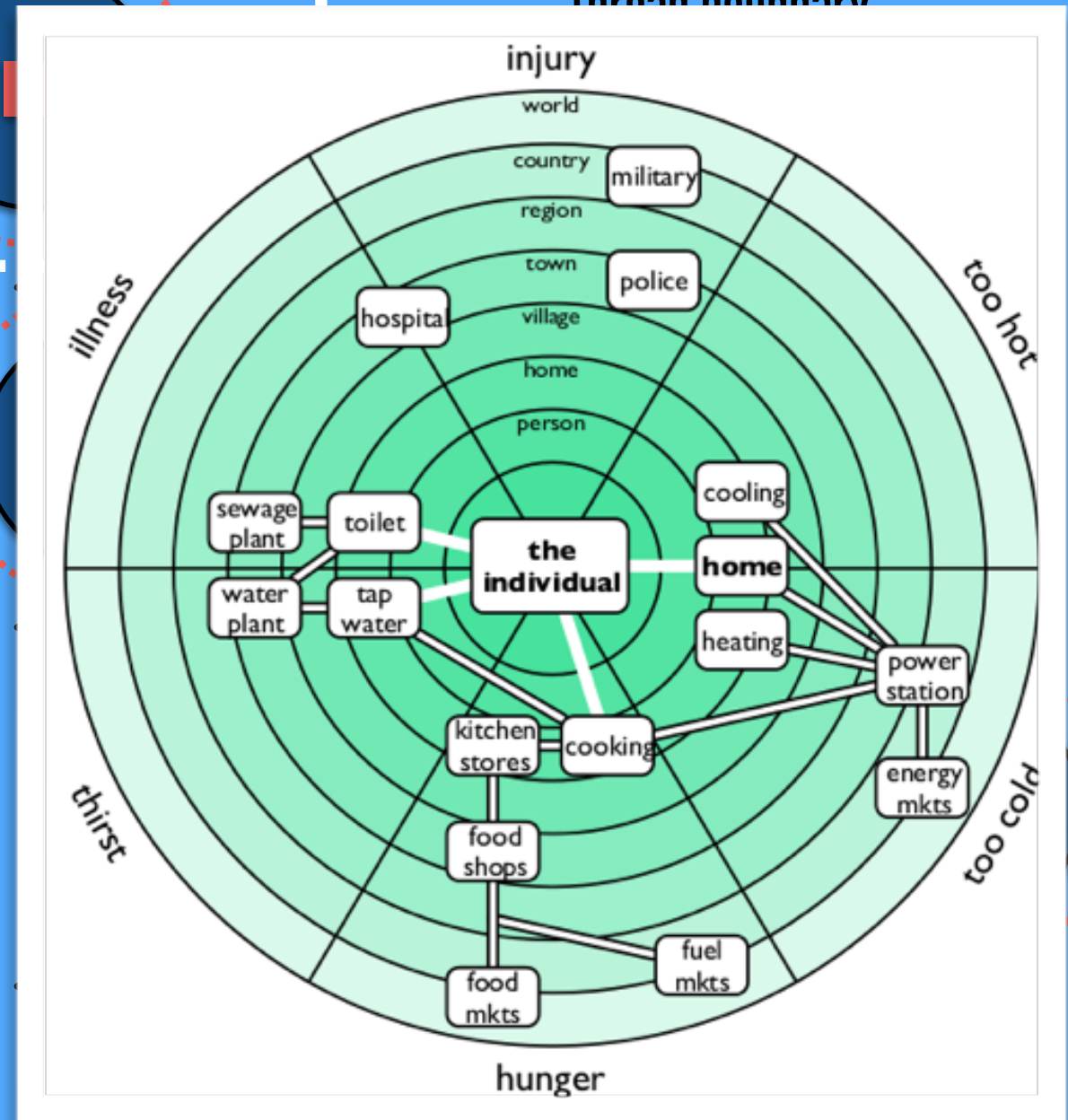
Object



Critical state
that needs protection



Thread boundary





Maintain Diversity and Redundancy



A man with curly hair, a mustache, and sunglasses is smiling and giving a thumbs up. He is wearing a light-colored suit jacket, a striped shirt, and a tie. The background is a desert landscape with a large cactus on the right and some shrubs on the left. The entire image has a blue tint.

**The Network
is Reliable**

A man with curly hair, a mustache, and sunglasses is smiling and giving a thumbs up. He is wearing a light-colored suit jacket, a dark shirt, and a tie. The background is a desert landscape with a large cactus on the right and some shrubs on the left. The entire image has a blue tint.


**The Network
is Reliable**

NAT



**Strong
Consistency**

IS THE WRONG DEFAULT



**WE NEED SYSTEMS THAT ARE
DECOUPLED IN
Time and Space**

Resilient Protocols

DEPEND ON

ASYNCHRONOUS COMMUNICATION

EVENTUAL CONSISTENCY

Resilient Protocols

DEPEND ON

ASYNCHRONOUS COMMUNICATION

EVENTUAL CONSISTENCY

- ARE TOLERANT TO
 - MESSAGE LOSS
 - MESSAGE REORDERING
 - MESSAGE DUPLICATION

Resilient Protocols

DEPEND ON

ASYNCHRONOUS COMMUNICATION

EVENTUAL CONSISTENCY

- ARE TOLERANT TO
 - MESSAGE LOSS
 - MESSAGE REORDERING
 - MESSAGE DUPLICATION
- EMBRACE ACID 2.0
 - ASSOCIATIVE
 - COMMUTATIVE
 - IDEMPOTENT
 - DISTRIBUTED

Testing



WHAT CAN WE LEARN FROM ARNOLD?



WHAT CAN WE LEARN FROM ARNOLD?



WHAT CAN WE LEARN FROM ARNOLD?



BLOW THINGS UP

Shoot
Your App
Down





Pull the Plug

...AND SEE WHAT HAPPENS



Executive Summary

“Complex systems run in degraded mode.”
“Complex systems run as broken systems.”

- RICHARD COOK

Resilience is by Design



Photo courtesy of FEMA/Joselyne Augustino

Thank

You

Thank

You

References

- **Antifragile: Things That Gain from Disorder** - <http://www.amazon.com/Antifragile-Things-that-Gain-Disorder-ebook/dp/B009K6DKTS>
- **Drift into Failure** - <http://www.amazon.com/Drift-into-Failure-Components-Understanding-ebook/dp/B009KOKXKY>
- **How Complex Systems Fail** - <http://web.mit.edu/2.75/resources/random/How%20Complex%20Systems%20Fail.pdf>
- **Leverage Points: Places to Intervene in a System** - <http://www.donellameadows.org/archives/leverage-points-places-to-intervene-in-a-system/>
- **Going Solid: A Model of System Dynamics and Consequences for Patient Safety** - <http://www.ncbi.nlm.nih.gov/pmc/articles/PMC1743994/>
- **Resilience in Complex Adaptive Systems: Operating at the Edge of Failure** - <https://www.youtube.com/watch?v=PGLYEDpNu60>
- **Dealing in Security** - http://resiliencemaps.org/files/Dealing_in_Security.July2010.en.pdf
- **What is resilience? An introduction to social-ecological research** - http://www.stockholmresilience.org/download/18.10119fc11455d3c557d6d21/1398172490555/SU_SRC_whatisresilience_sidaApril2014.pdf
- **Applying resilience thinking: Seven principles for building resilience in social-ecological systems** - <http://www.stockholmresilience.org/download/18.10119fc11455d3c557d6928/1398150799790/SRC+Applying+Resilience+final.pdf>
- **Puppies! Now that I've got your attention, Complexity Theory** - https://www.ted.com/talks/nicolas_perony_puppies_now_that_i_ve_got_your_attention_complexity_theory
- **How Bacteria Becomes Resistant** - <http://www.abc.net.au/science/slab/antibiotics/resistance.htm>
- **Towards Resilient Architectures: Biology Lessons** - <http://www.metropolismag.com/Point-of-View/March-2013/Toward-Resilient-Architectures-1-Biology-Lessons/>
- **Crash-Only Software** - https://www.usenix.org/legacy/events/hotos03/tech/full_papers/candea/candea.pdf
- **Recursive Restartability: Turning the Reboot Sledgehammer into a Scalpel** - http://roc.cs.berkeley.edu/papers/recursive_restartability.pdf
- **Out of the Tar Pit** - <http://citeseerx.ist.psu.edu/viewdoc/summary?doi=10.1.1.93.8928>
- **Bulkhead Pattern** - <http://skife.org/architecture/fault-tolerance/2009/12/31/bulkheads.html>
- **Making Reliable Distributed Systems in the Presence of Software Errors** - http://www.erlang.org/download/armstrong_thesis_2003.pdf
- **On Erlang, State and Crashes** - <http://jlouisramblings.blogspot.be/2010/11/on-erlang-state-and-crashes.html>
- **Akka Supervision** - <http://doc.akka.io/docs/akka/snapshot/general/supervision.html>
- **Release It!: Design and Deploy Production-Ready Software** - <https://pragprog.com/book/mnee/release-it>
- **Hystrix** - <https://github.com/Netflix/Hystrix>
- **Akka Circuit Breaker** - <http://doc.akka.io/docs/akka/snapshot/common/circuitbreaker.html>
- **Reactive Streams** - <http://reactive-streams.org>
- **Akka Streams** - <http://doc.akka.io/docs/akka-stream-and-http-experimental/1.0/scala/stream-introduction.html>
- **RxJava** - <https://github.com/ReactiveX/RxJava>
- **Feedback Control for Computer Systems** - <http://www.amazon.com/Feedback-Control-Computer-Systems-Philipp/dp/1449361692>
- **Simian Army** - <https://github.com/Netflix/SimianArmy>
- **Gatling** - <http://gatling.io>
- **Akka MultiNode Testing** - <http://doc.akka.io/docs/akka/snapshot/dev/multi-node-testing.html>

Q & A