

why are
DISTRIBUTED SYSTEMS
so hard?

@deniseyu21 deniseyu.io

Land acknowledgment:

Portland is built on the unceded, traditional Tribal lands of the Multnomah, Kathlamet, Clackamas, other Chinook bands, Oregon City Tumwater, Tualatin Kalapuya, Molalla, and many other Tribes who make their homes along the Columbia and Willamette rivers.

In using this land, it is also important to acknowledge the policies of genocide, relocation, and assimilation that still impact many Indigenous and Native American families today.

Adapted from pcc.edu/about/diversity/cascade

Software
Eng@



TORONTO
- BASED

Pivotal

cloud 

Foundry



HELLO,
#LISA19!

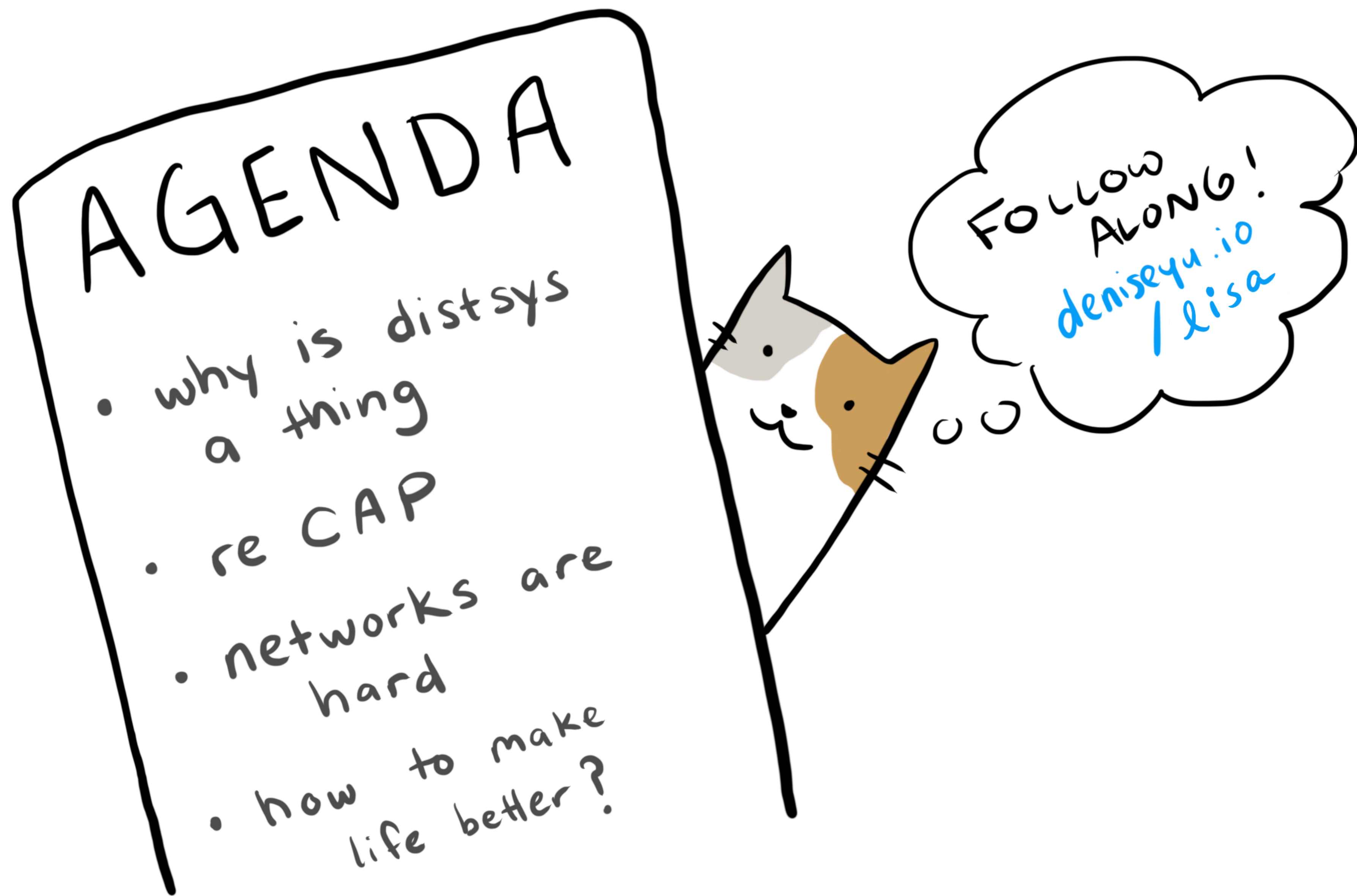
@deniseyu21

Tech-doodling

enthusiast

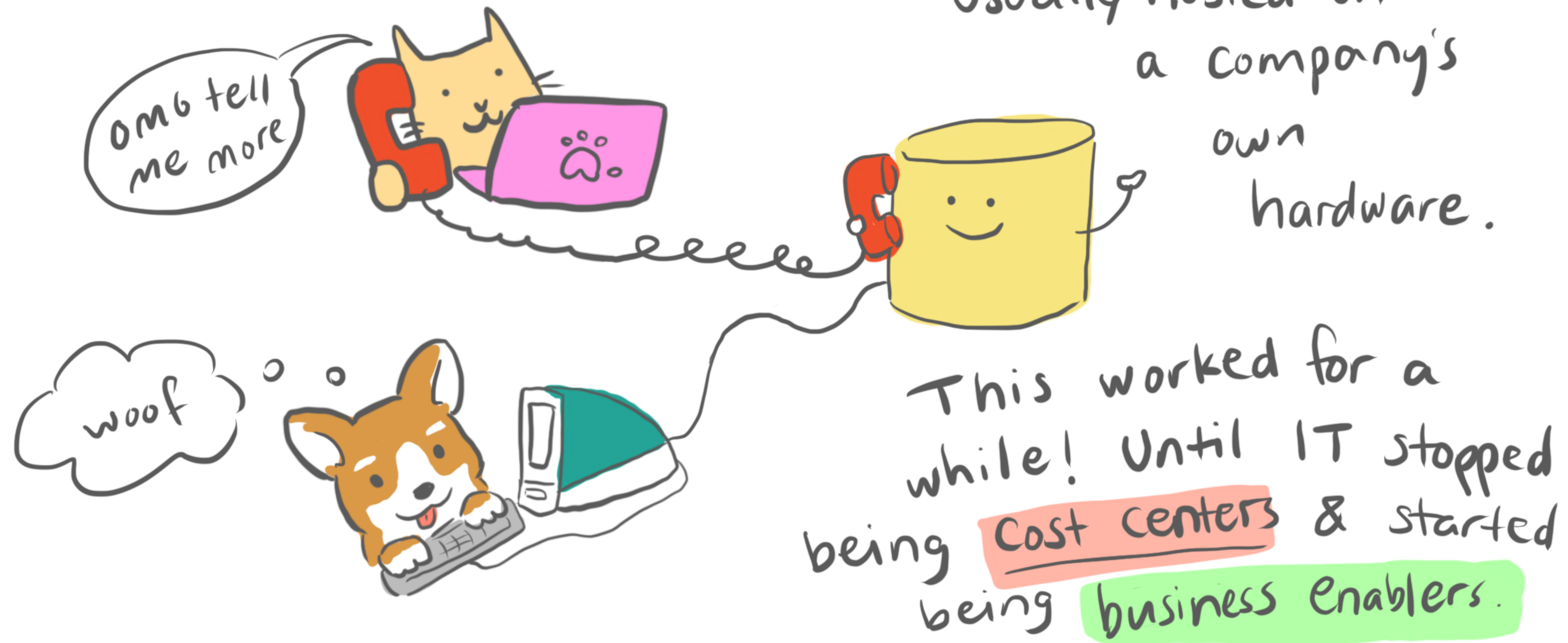


deniseyu.io/
art



A long time ago,
in a datacenter not too far away...

All business applications talked to one database,
usually hosted on
a company's
own
hardware.



Data Storage & retrieval needs evolved as software became business differentiators.

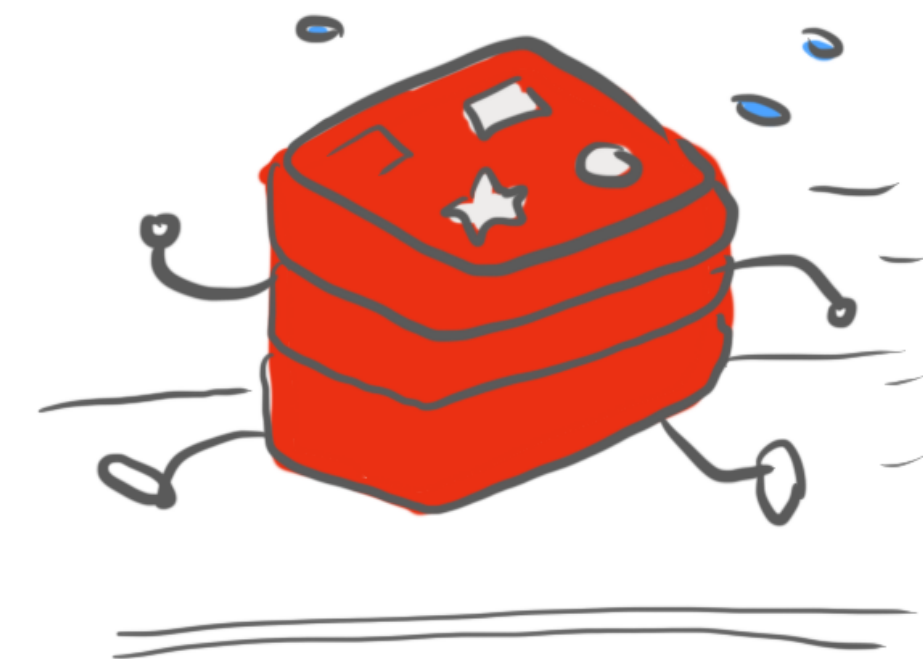
Business analysis
& data warehouses



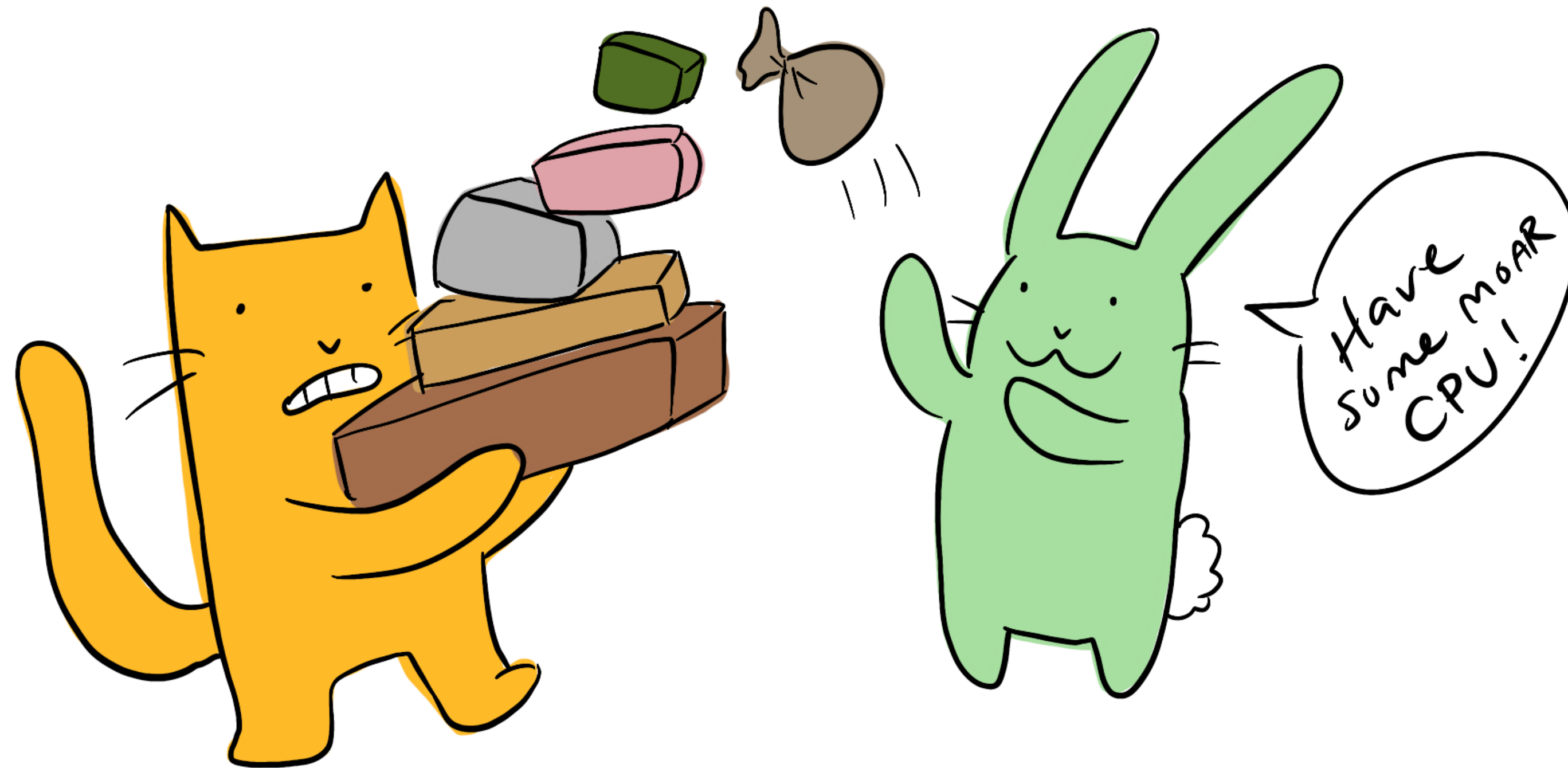
ML & Natural
language
processing



Faster, bigger
queries!



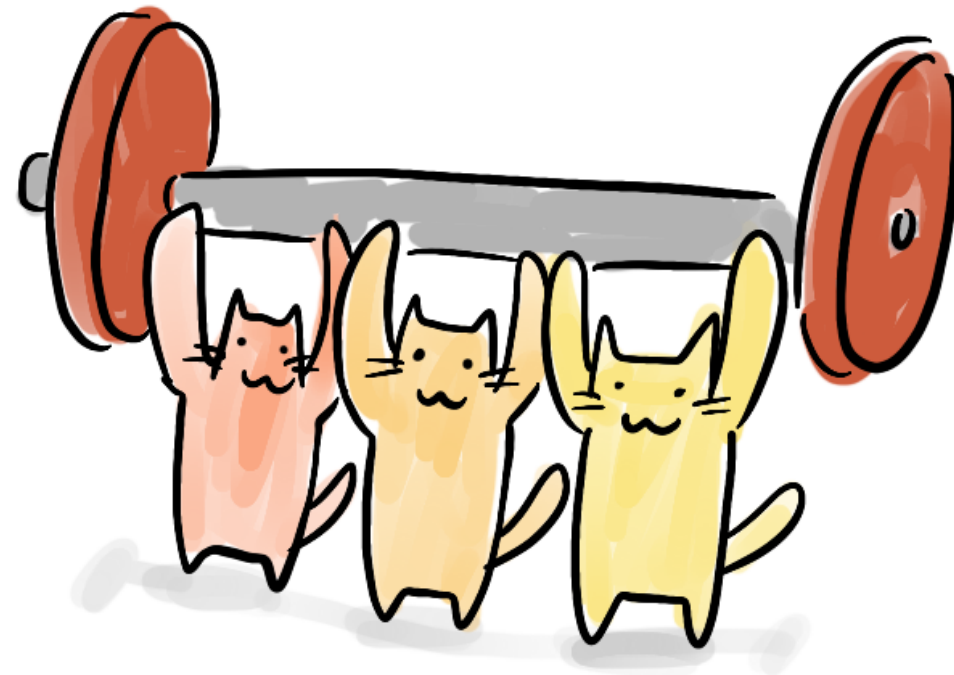
So we scaled vertically...



until unit economics (or physics) caught up.



REASONS TO HORIZONTALLY DISTRIBUTE :



Scalability :
one machine cannot
handle request or
data size



Availability:
if one machine goes
down, others keep
working



Latency:
go faster when
data is stored
geographically closer
to users

what does it
actually mean
to run a
distributed system?

LOCAL



all entities
in one
ADDRESS
SPACE



Caller & Receiver
Known

VS.

DISTRIBUTED

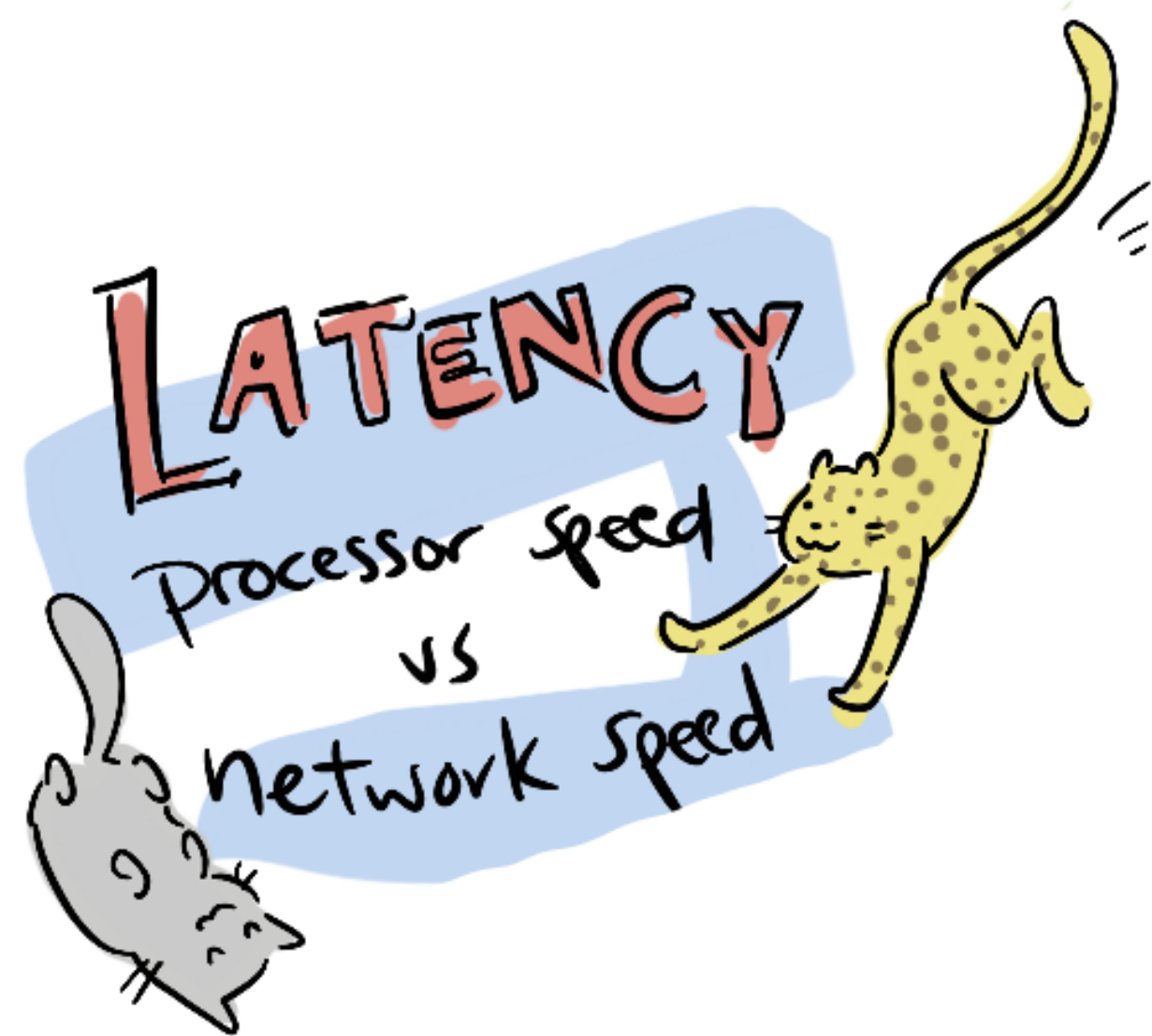
multiple address
spaces, maybe
multiple
machines



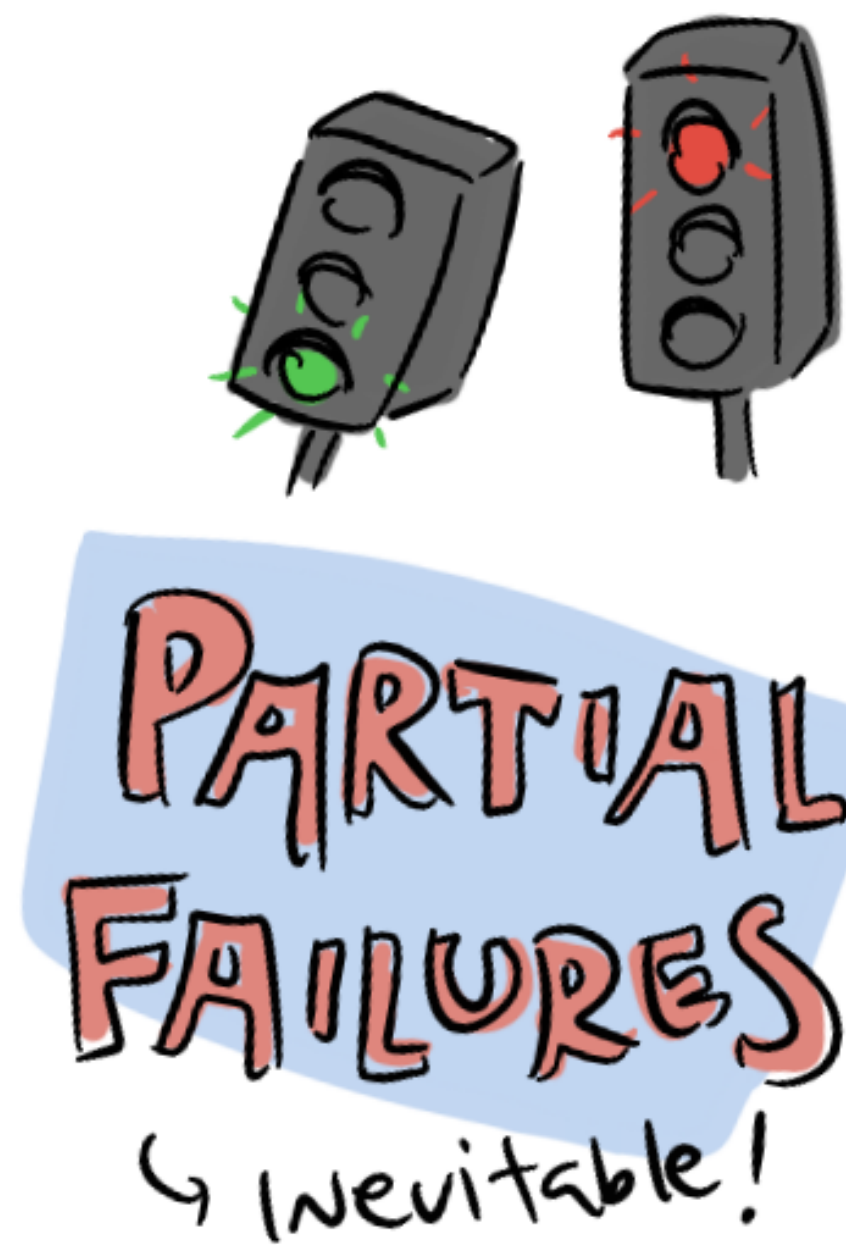
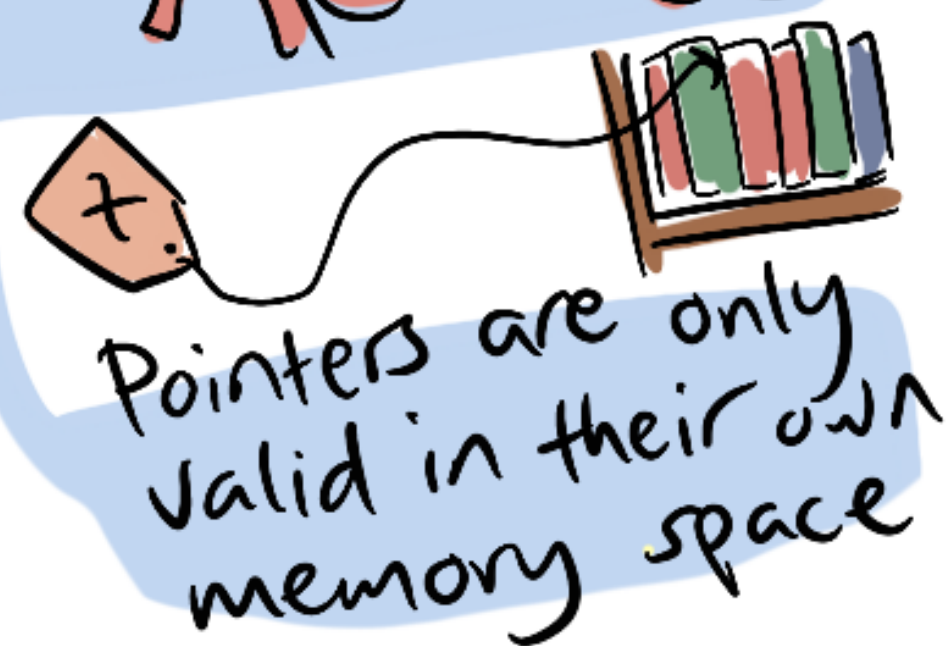
Recipient details
might be unknown?

a note on
distributed
Computing
1994





**MEMORY
ACCESS**



You may have
heard the term
"shared nothing"
architecture:

Machines do not
share access to any resources.



a note on distributed computing

by @deniseyu21

1994

Jim Waldo
Geoff Wyant
Ann Wollrath
Sam Kendall
SUN MICROSYSTEMS

BUT -
unified visions
of objects aren't
that simple
in practice.

THINKING
about
ROBUSTNESS
BROADLY:

Robustness isn't
just guarding
against failures
ex. by re-enqueuing
messages...

Underlying good
performance will
be hampered by
POOR DESIGN!
Are interfaces
designed such that
desired recovery
behavior can happen?

CASE STUDY:
Network
File
System

Handling
partial
failure in
a filesystem

2 failure modes:

Soft
mounts:
all server
errors exposed
& returned to
client

Hard
mounts:
client waits
for server
to recover.
maybe long
hang time!

Neither of these ideal
for distributed computing -
then again, NFS was designed
for local usage.

Works great
in colocated,
centrally-
managed
machines!

...there are irreconcilable
differences between local
and distributed computing...
Rather than trying to merge
local & remote objects,
engineers need to [know]
the differences, and know
when it is appropriate
to use each."

TIP:
Consider
splitting apart
remote & local
interactions into
separate objects!
More modular,
cleaner interfaces

LOCAL
all entities
in one
ADDRESS
SPACE

Caller & Receiver
Known

DISTRIBUTED
multiple address
spaces, maybe
multiple
machines

Recipient details
might be unknown

IDEALLY, a programmer should
not care whether objects are
implemented in different address
spaces, architectures, hardware...

as long as interfaces are well-
defined and followed!
Applications internally should
only worry about marshaling
passed data.

REMOTE
PROCEDURE
CALL
System design!

In REALITY,
implementation
matters.

Local
function call
≠ cross-
continent
invocation

1 Make some
interfaces
2 "CONCRETIZE":
Decide what to
make local vs remote
for performance

3 TEST with
"Real bullets"

Assumptions:
• Process/machine boundaries
will be easy to change later
• If semantically correct, how
& where we run code
ought not matter

Stand on
flawed principles:
✗ the same object-
oriented design will
work regardless of
deployment topology
✗ failures are
implementation flaws
✗ interfaces are
separate from context

How 2 BUILD A
DISTRIBUTED APP

every 10 yrs
language
trends
change
but nothing
really
promotes
distrib-
uted
app dev

put
stuff
wherever
machine
wants

"THE HARD PROBLEMS IN
DISTRIBUTED COMPUTING ARE
NOT THE PROBLEMS OF HOW
TO GET THINGS ON AND
OFF THE WIRE."

THE
HARD PARTS!

LATENCY

Processor speed
vs
Network speed

1. Hardware can
improve network speed
eventually
2. We should instrument
apps to see if critical
path calls can be made
local - architectural
design comes first!

MEMORY
ACCESS

Pointers are only
valid in their own
memory space

Therefore all memory
access must be
EITHER

100% Centrally
managed
by underlying
system

OR
100% Manually
managed

Programmers might need to be
aware of local vs remote
memory access, and
programming language design
may need to make it transparent.

PARTIAL
FAILURES

Unavoidable!
Somewhere in the middle
of a communication link
will always happen in
distributed environments.

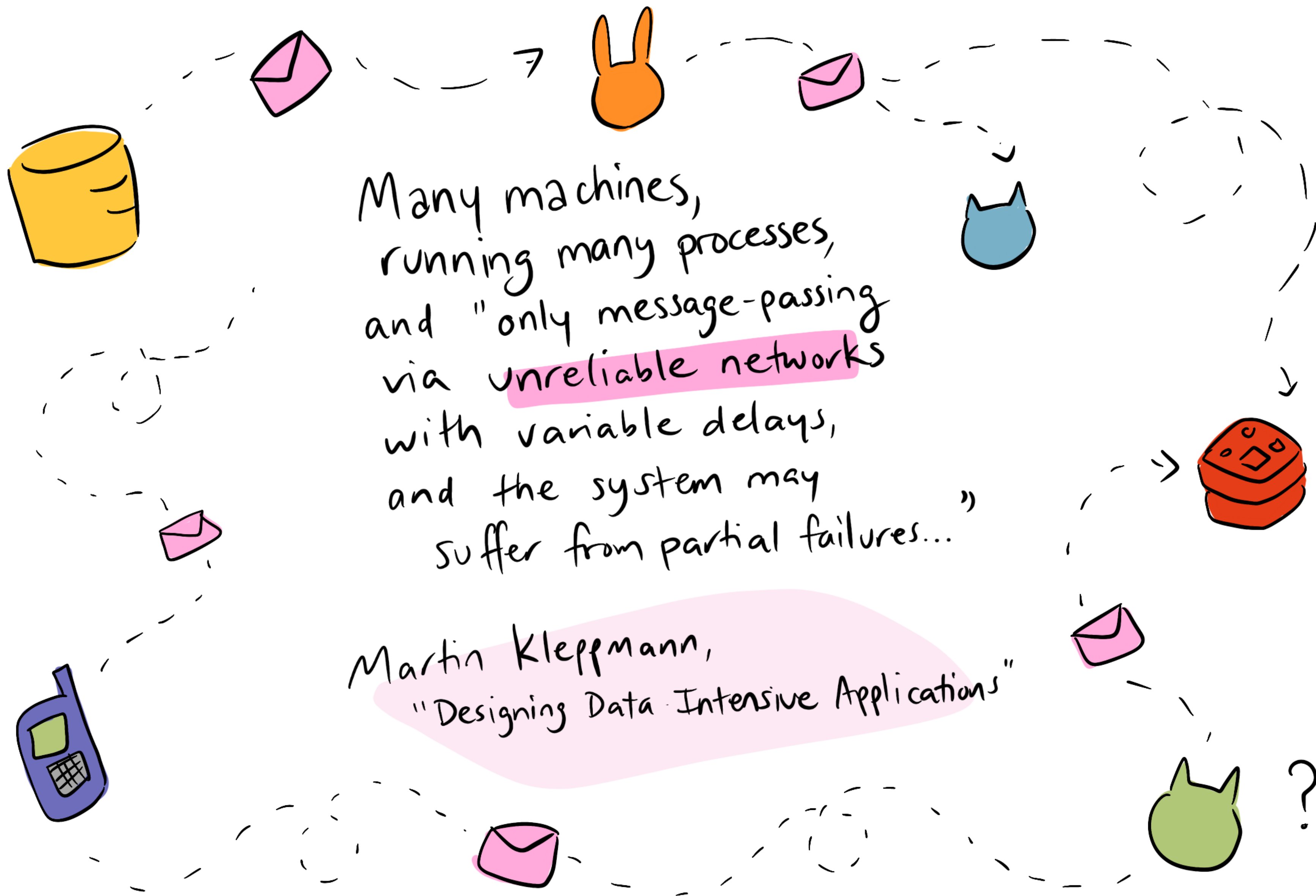
We can:

1. Always design
as if running local
No fault tolerance

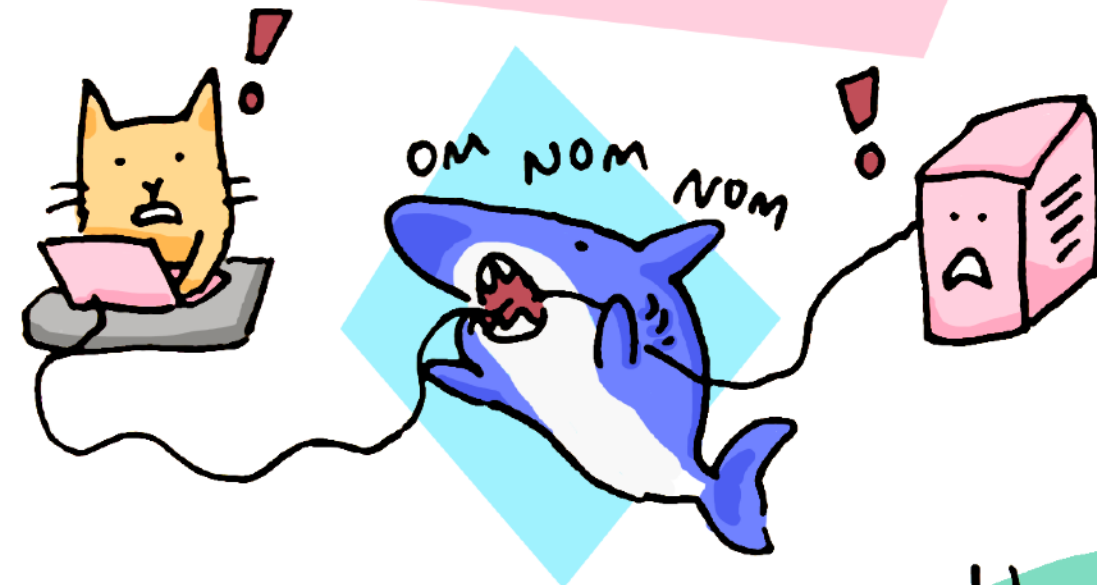
OR
2. Design for
remote
failure
lots of extra
complexity

Can a
system recover
when the cause
of failure
is unknown?

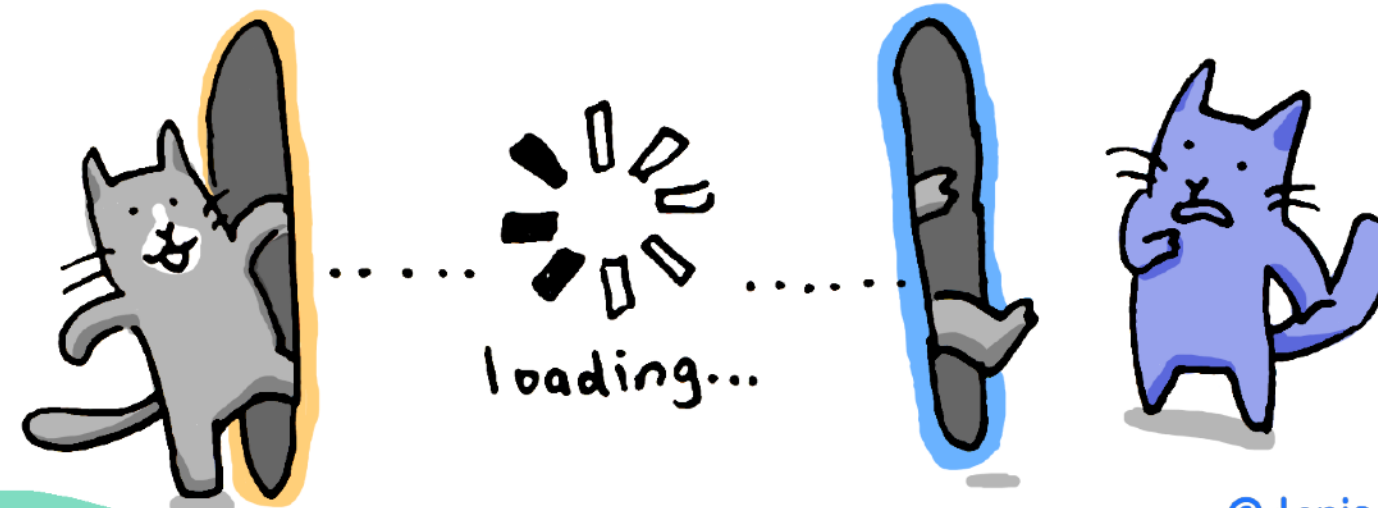
Remote
Local



① The network is reliable



② Latency is ZERO



③ Bandwidth is infinite



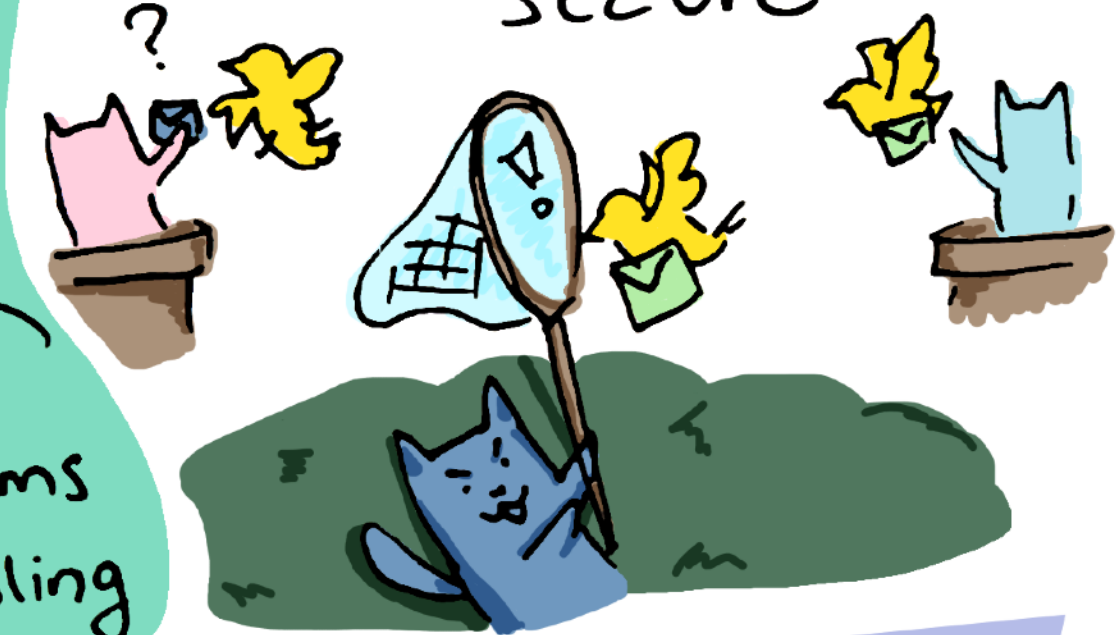
⑧ The network is homogeneous



the 8 Fallacies of Distributed Computing

Originally formulated by L. Peter Deutsch & colleagues at Sun Microsystems in 1994; #8 added in 1997 by James Gosling

④ The network is secure



⑦ Transport costs \$0



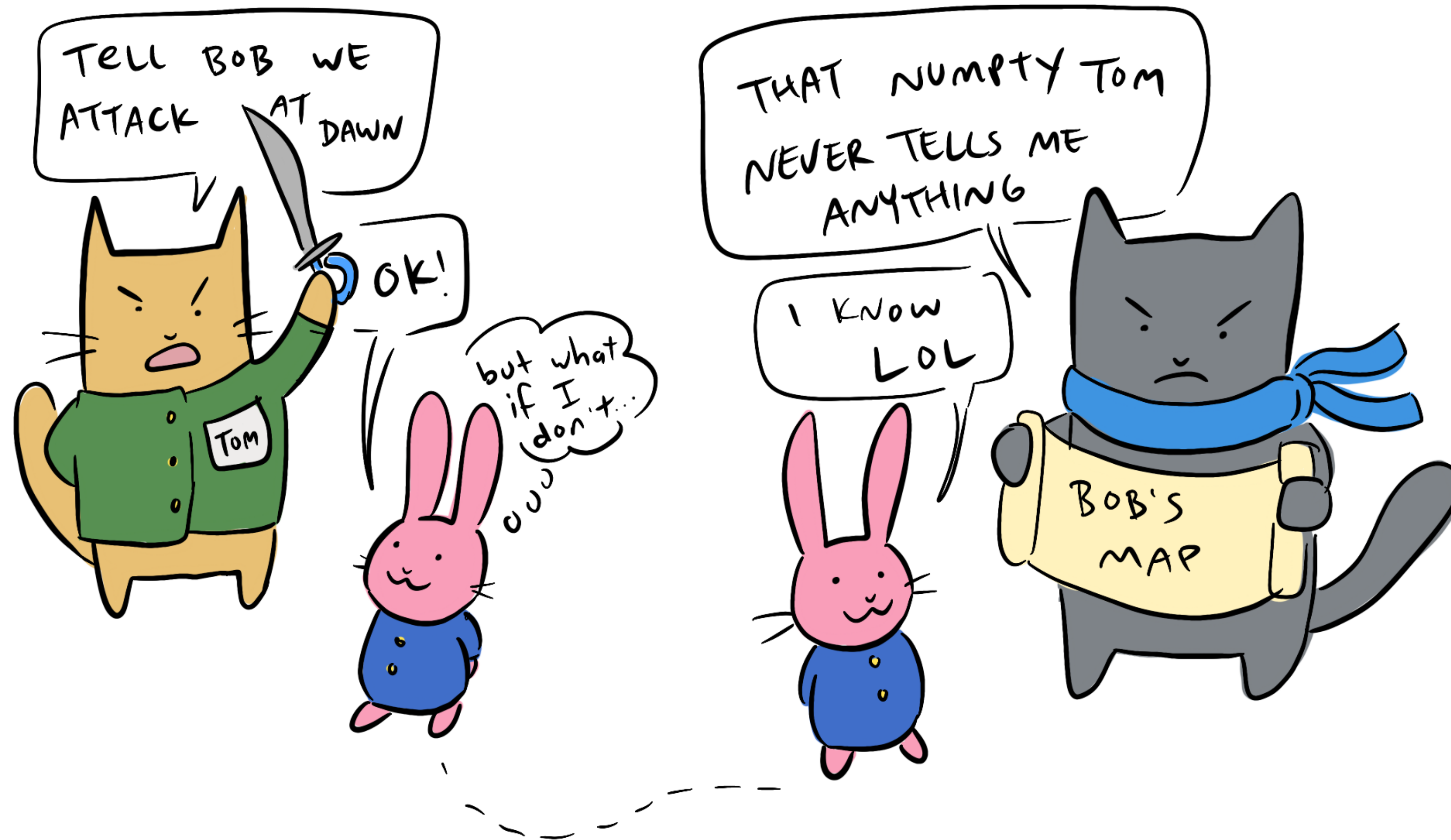
⑥ There is only one administrator

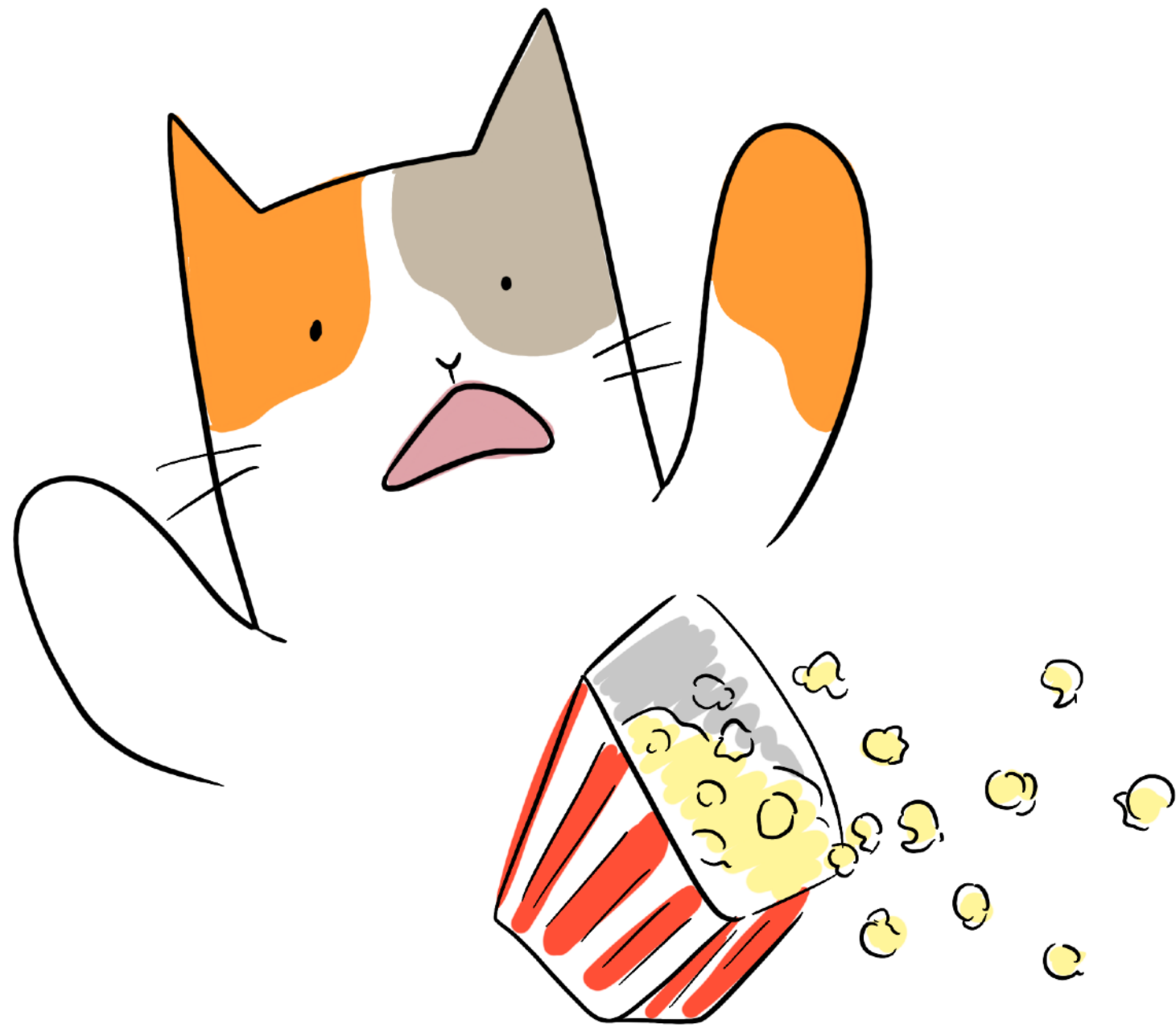


⑤ Topology doesn't change



The Byzantine Generals Problem

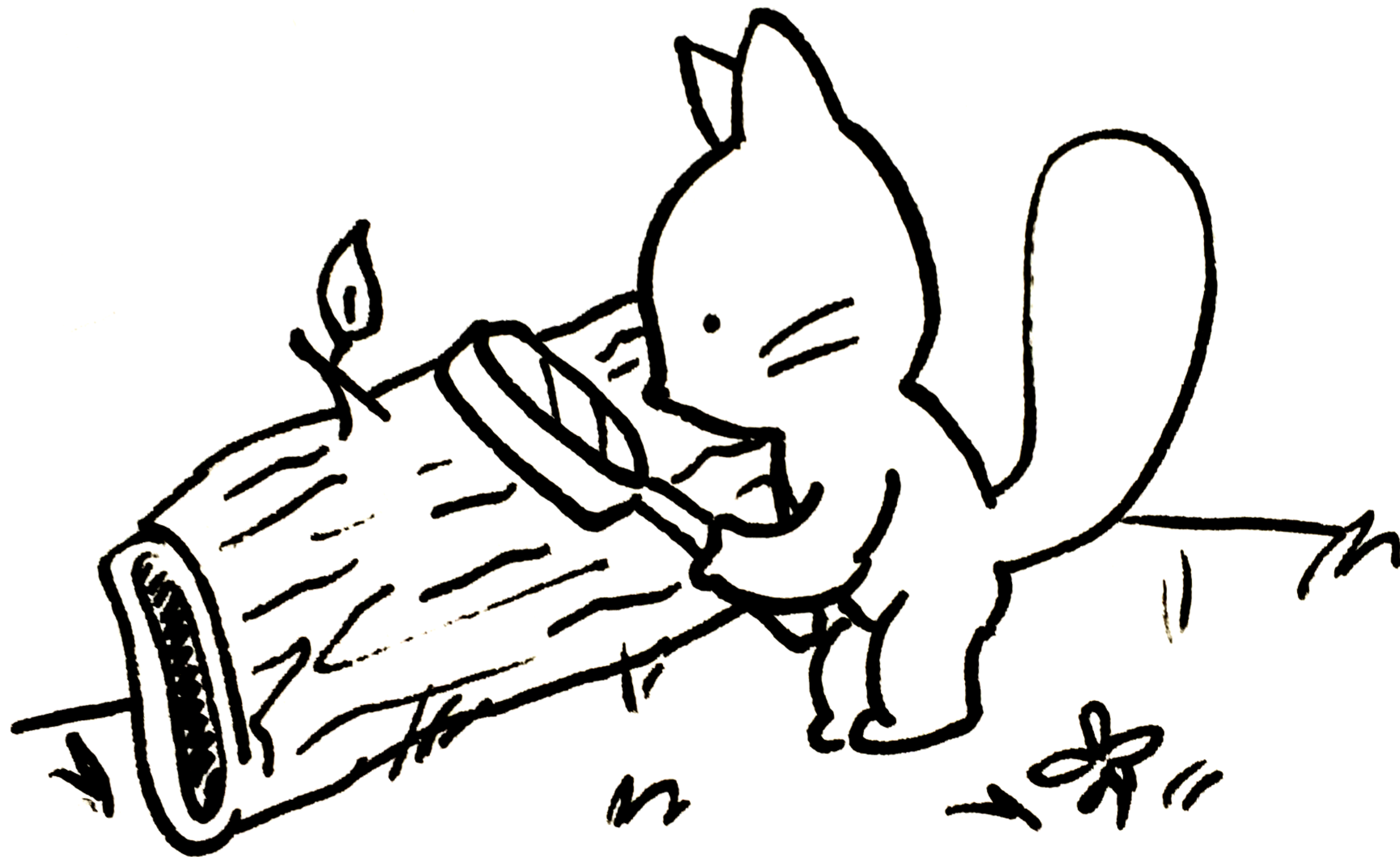




SO MUCH UNRELIABILITY!

How can we even
know what is true
about the state of
the world?

MONITOR & observe



@deniseyu21 🐾

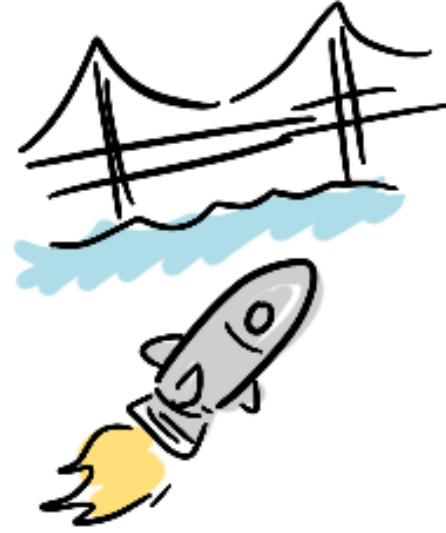
8 TRAPS OF #chaos Day 19

CHAOS ENGINEERING



NORA JONES
@NORA_JS

Chaos Eng
borrows from
many other
industries
& incidents.



Apollo 11

Launch Test:

During a test, safety
precautions were not
taken \Rightarrow "an experiment
that went wrong" changed
space travel forever



① "More vulnerabilities
= more success!"



Error discovery
is not linearly
related to
resilience outcomes.

Focusing on
these NUMBERS
distracts from having
richer conversations
about what actually
is working.

② You can prep an
exercise with a subset
of the team



"We were
just trying to
save time."

③ There is a
prescriptive way
to "do" chaos eng.

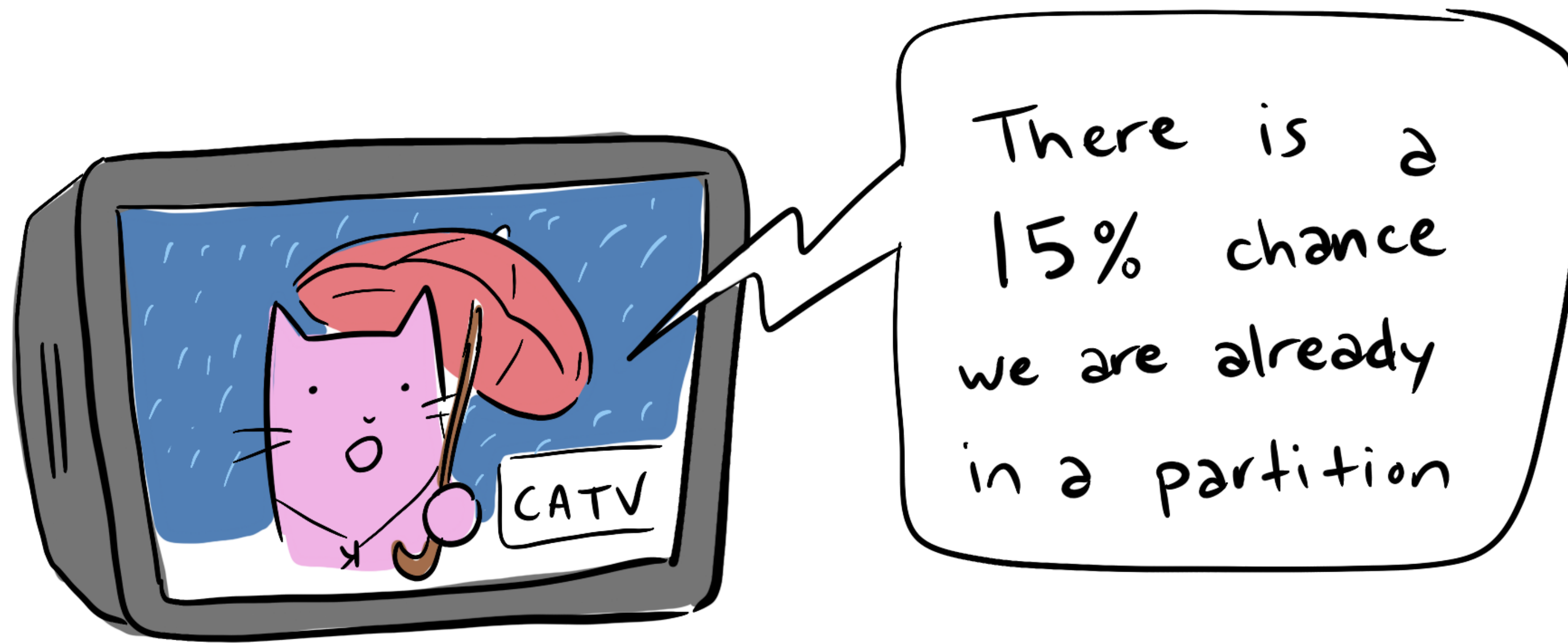
Chaos Eng is inherently
unpredictable.

we get
better by
sharing.



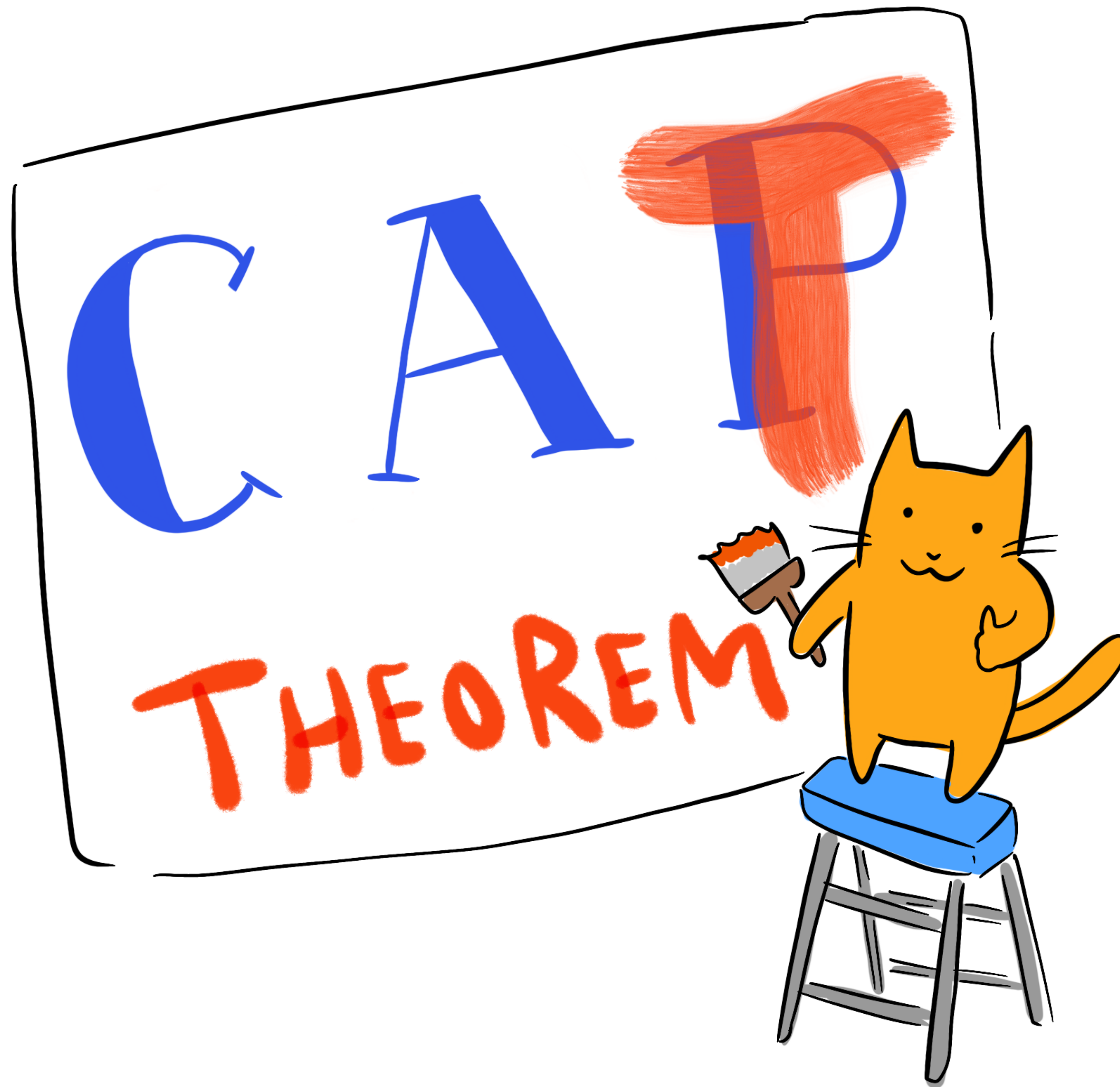
⑤ "Real" Chaos Eng
goes beyond Game
etc.

(4.5) Chaos



There are lots we can't know. But
in distributed computing, we can know one thing:

Shit's gonna fail



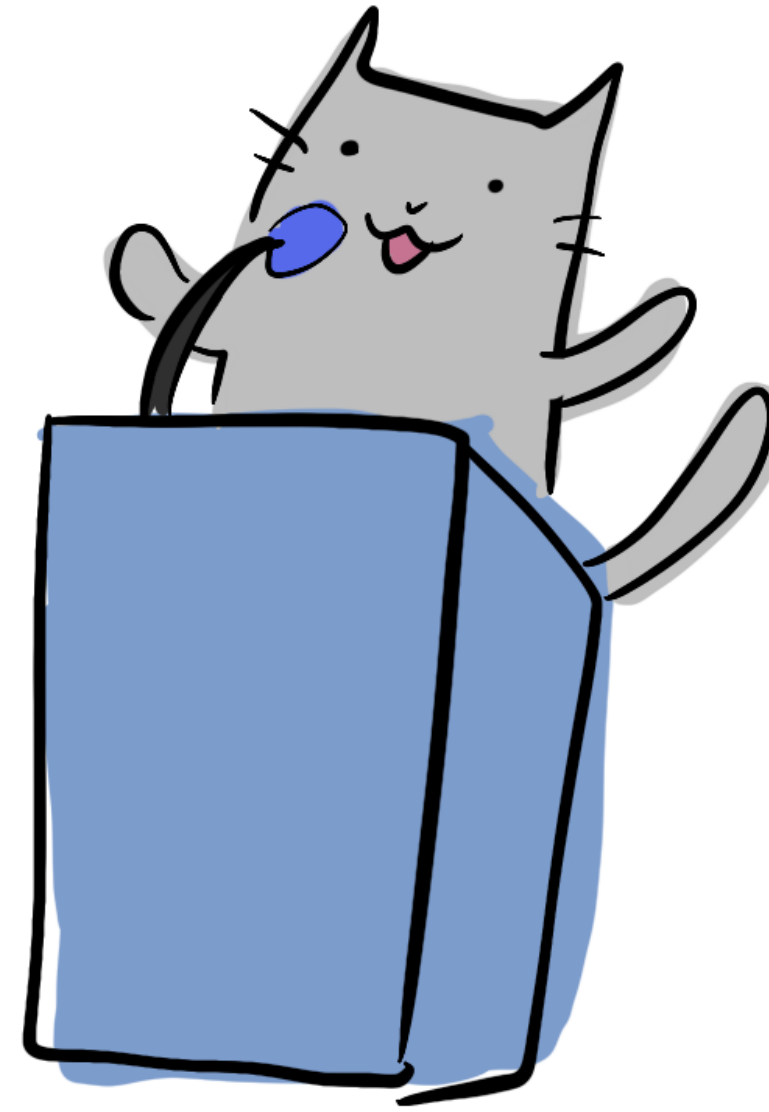
@deniseyu21 🐱

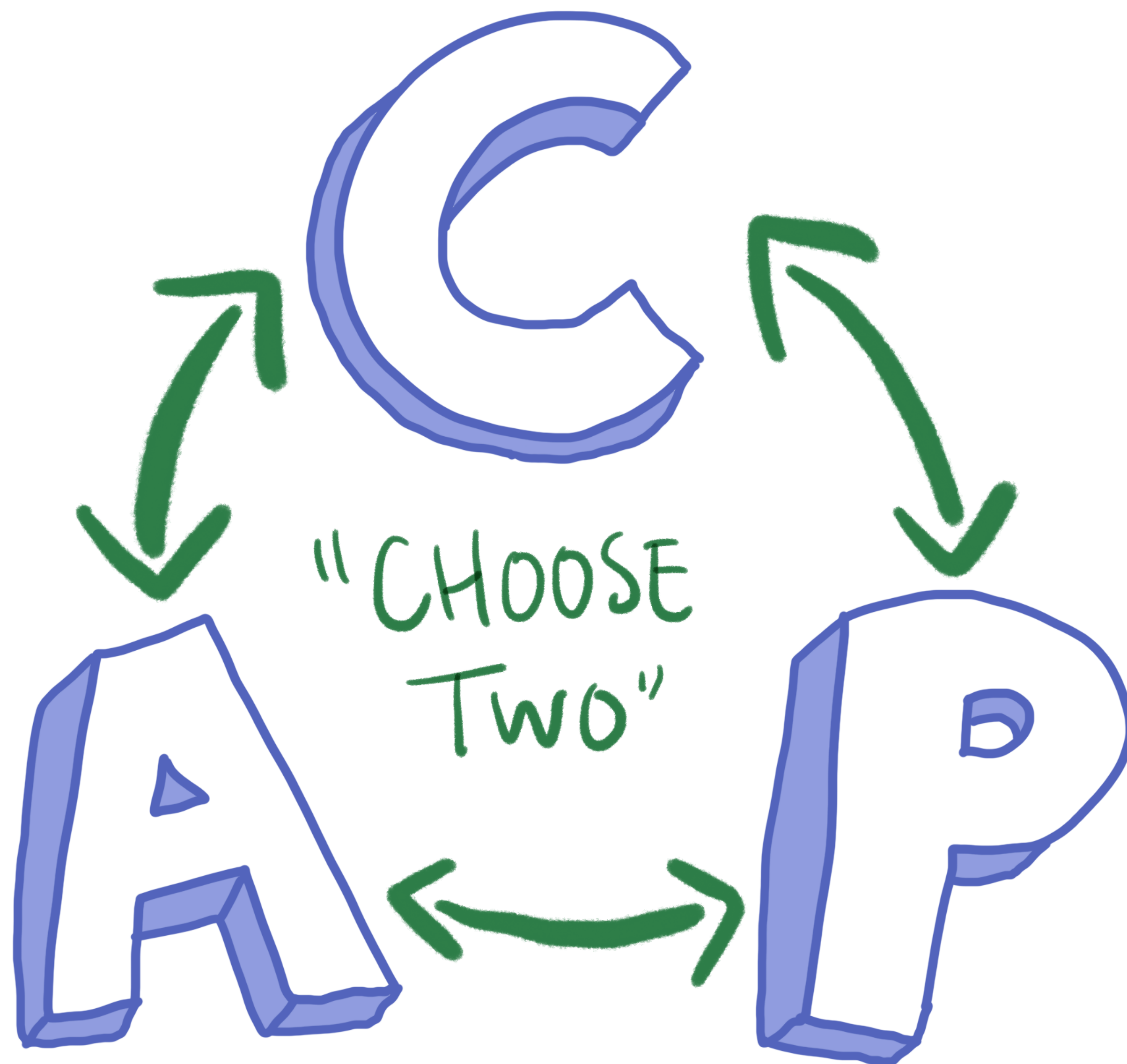
2000

DR ERIC
BREWER

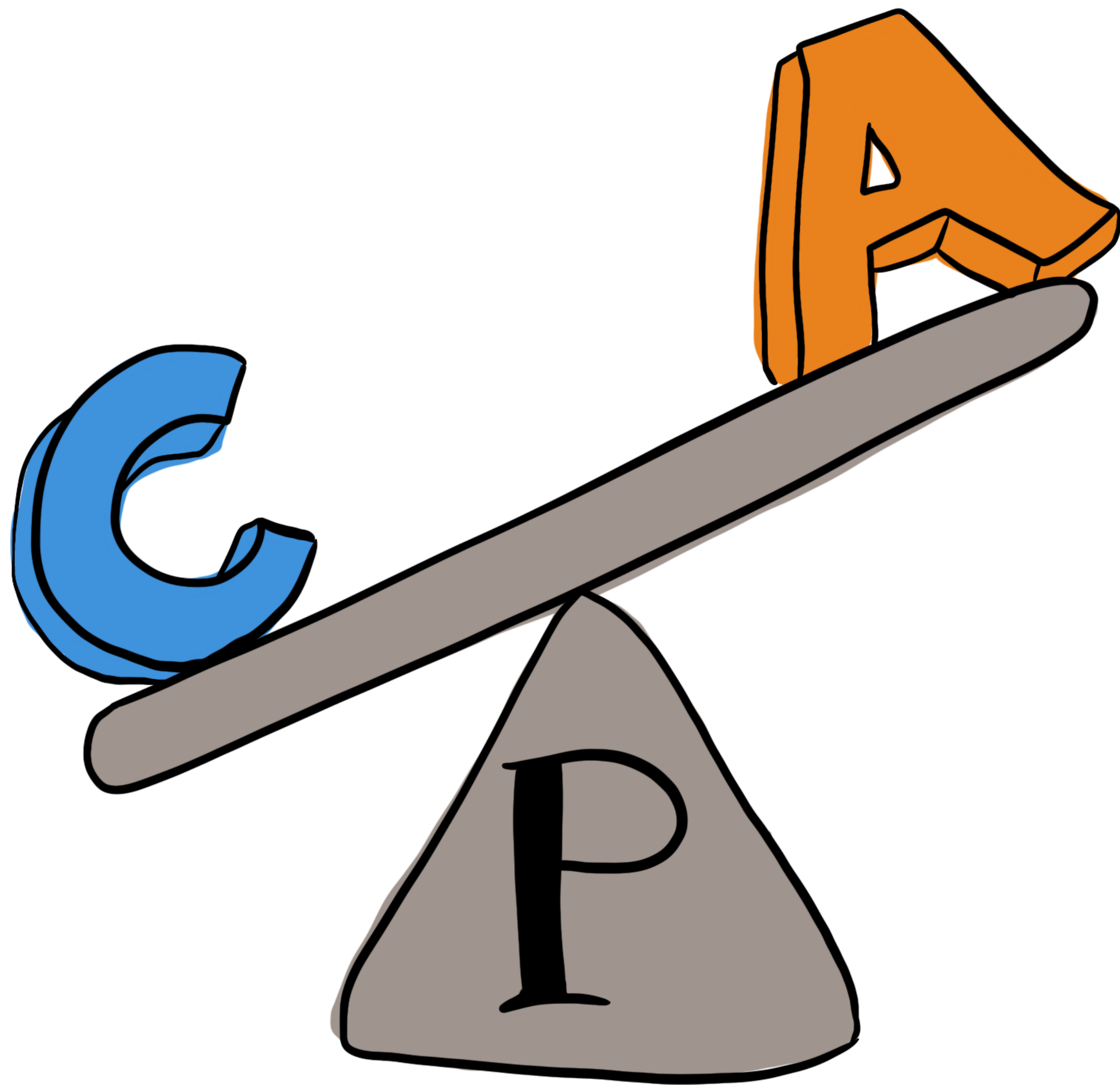
"Towards Robust
Distributed
Systems"

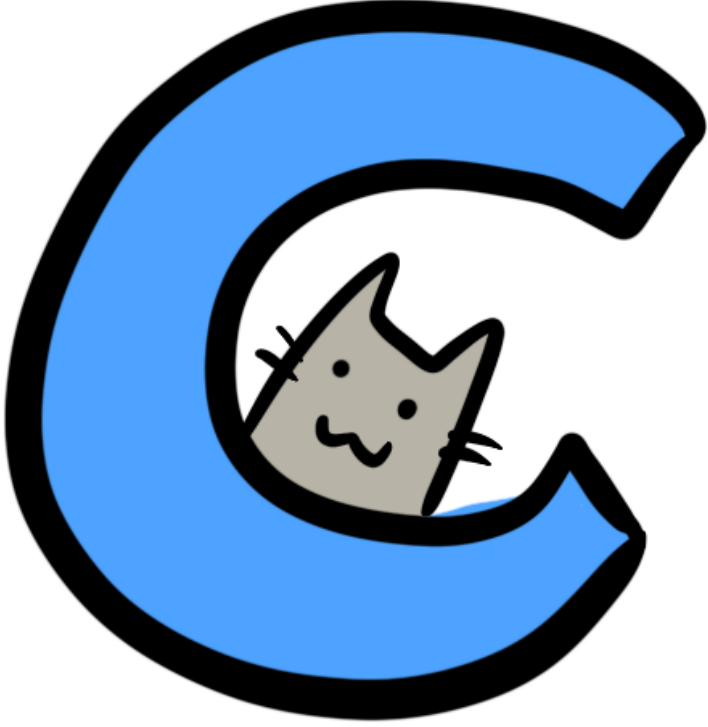
@ Principles of Computing Conf

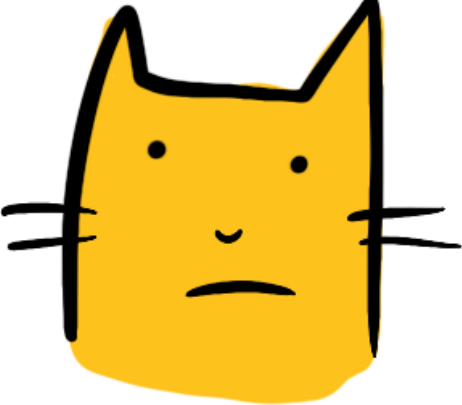









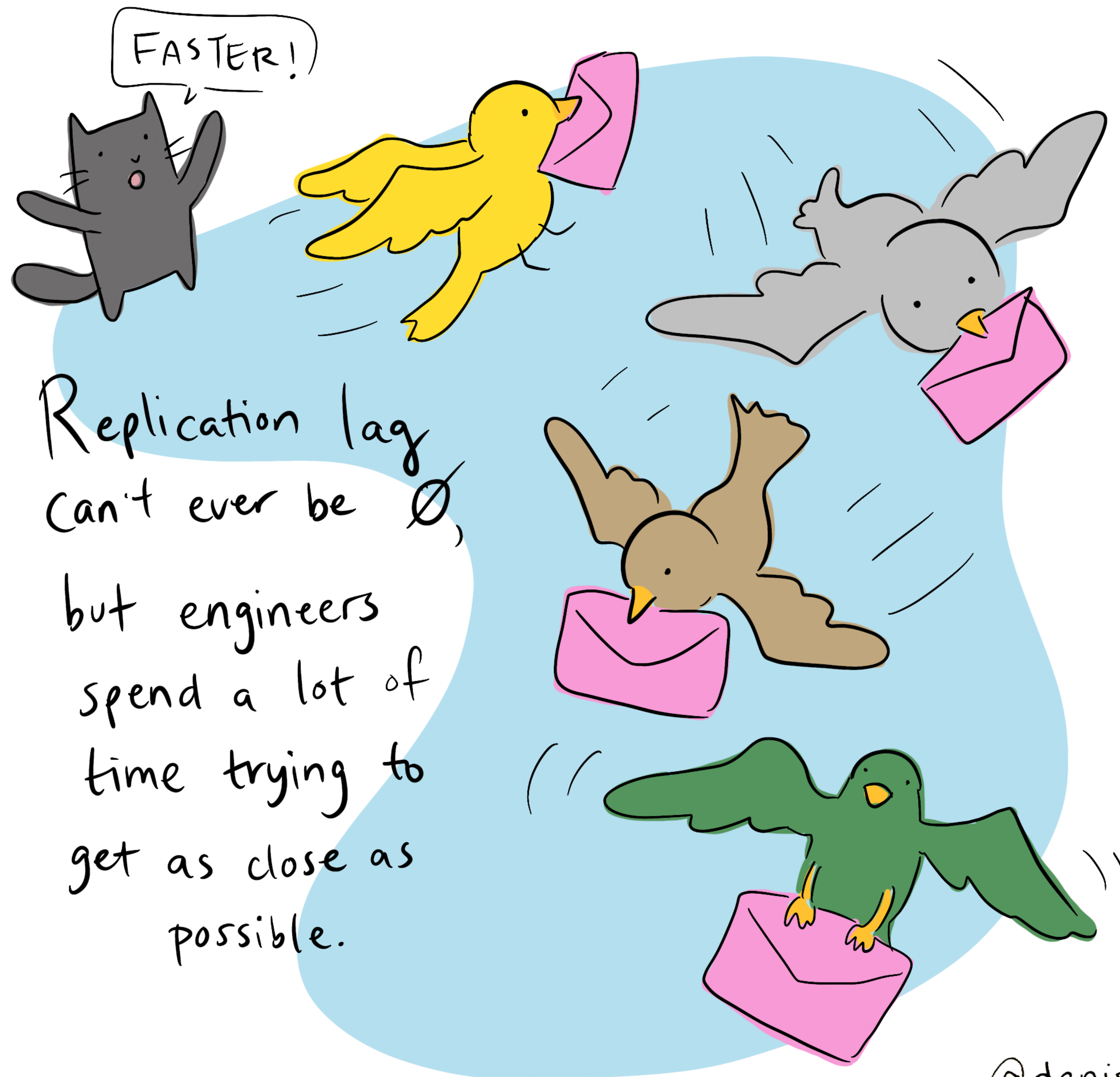
 IS FOR LINEARIZABILITY

t_0  cat.state = 'hungry'

t_1  cat.state = 'full'

All nodes must have t_1 if anyone showed t_1

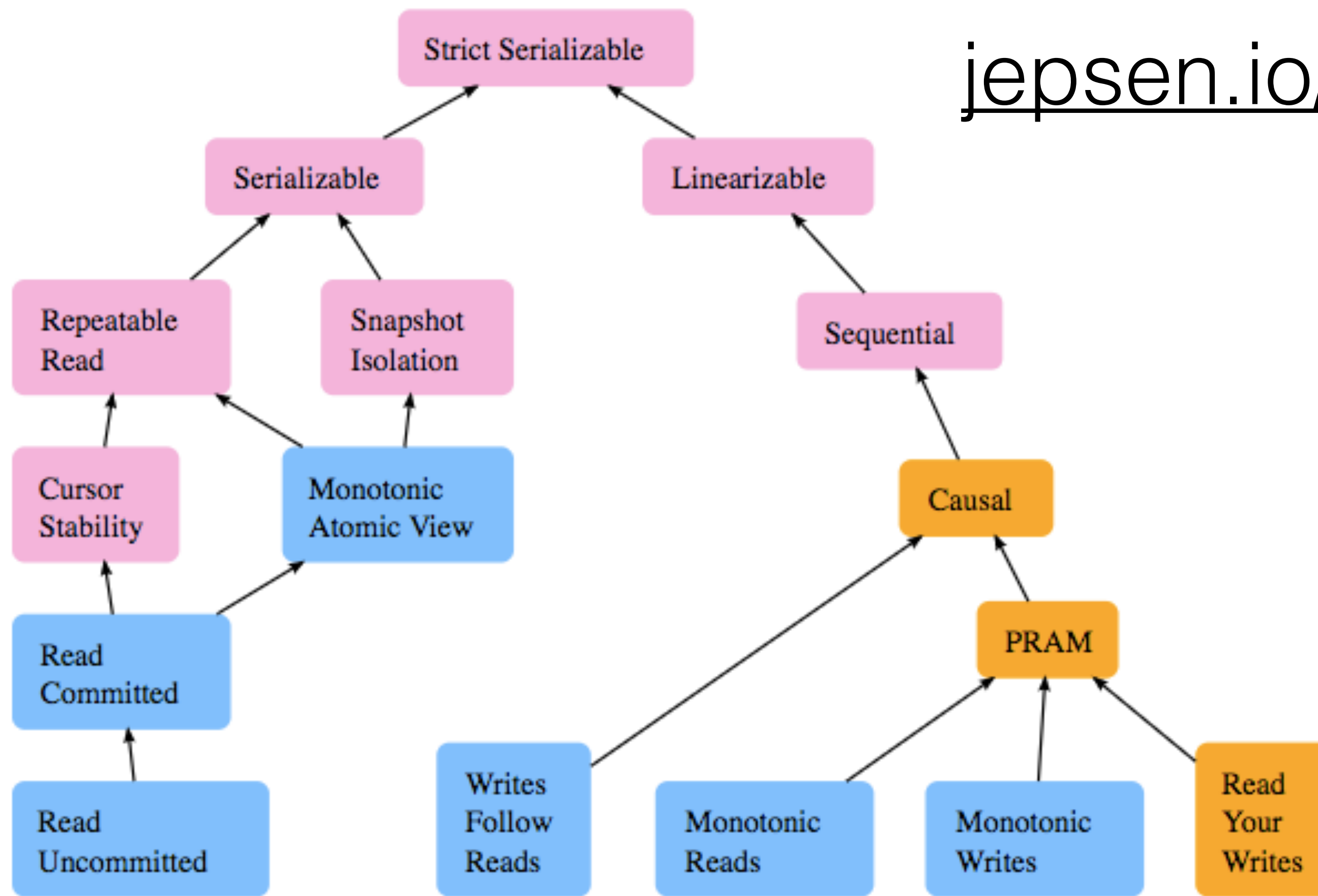
This is really hard! Instant & universal replication.



Replication lag
can't ever be \emptyset ,
but engineers
spend a lot of
time trying to
get as close as
possible.

(BTW, eventual consistency doesn't count.

jepsen.io/consistency

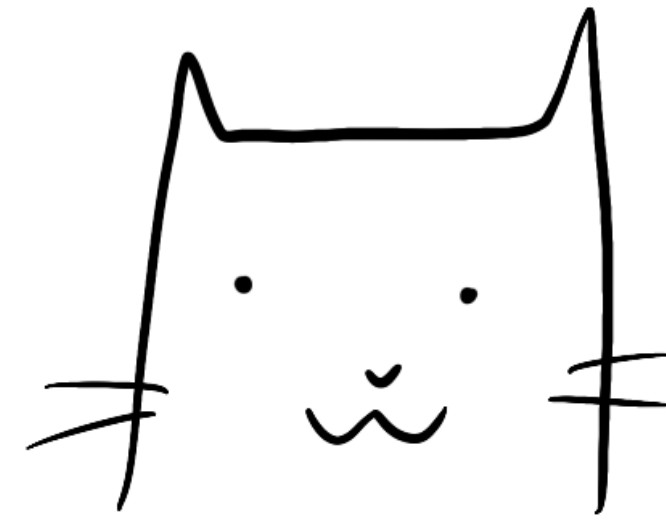
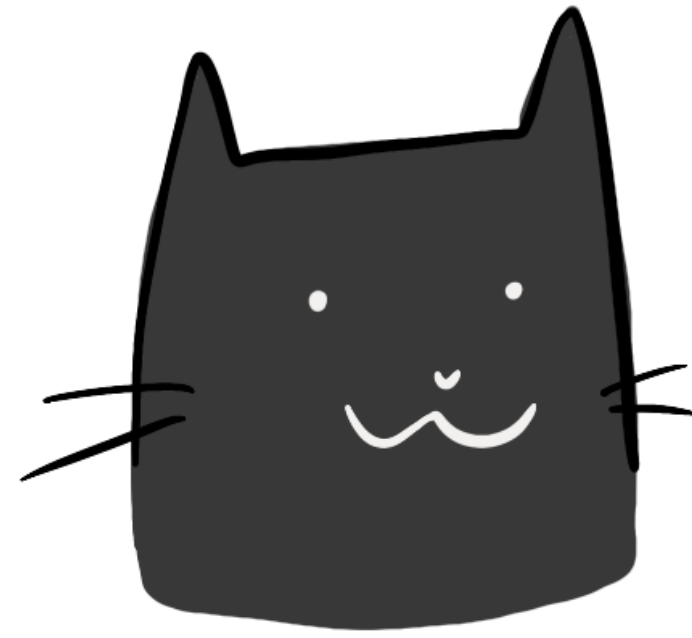


Legend

Unavailable	Not available during some types of network failures. Some or all nodes must pause operations in order to ensure safety.
Sticky Available	Available on every non-faulty node, so long as clients only talk to the same servers, instead of switching to new ones.
Total Available	Available on every non-faulty node, even when the network is completely down.

A

IS FOR AVAILABILITY



We tend to think of availability as a binary state. BUT — reality is much messier!

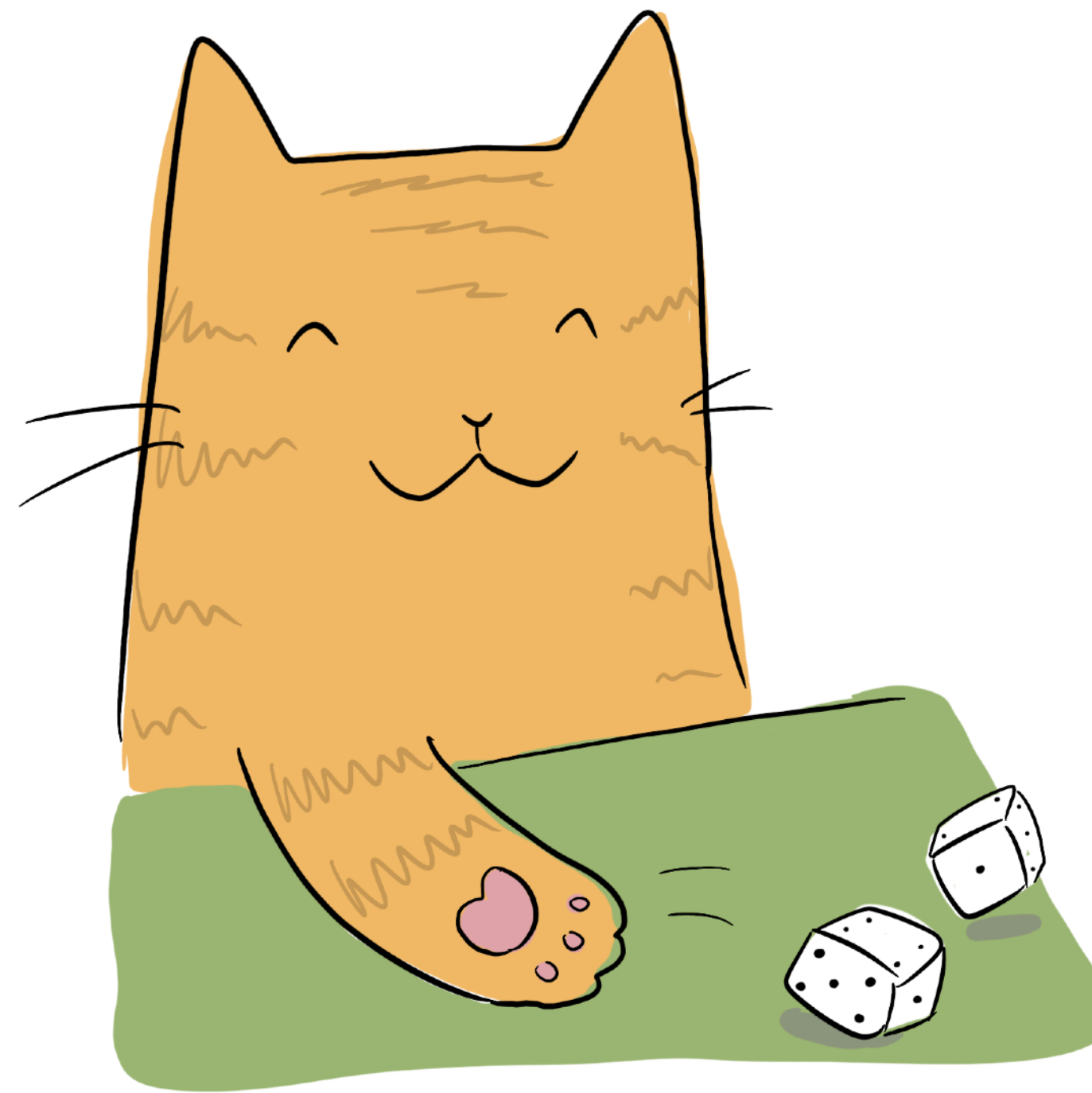
Because LATENCY

How can we know if a node is unresponsive...
or just slow?



Network latency wasn't part of the
original CAP formulation.

Determining a
timeout limit
is a very
scientific
process



P IS FOR PARTITION TOLERANCE

Network partitions occur when
network connectivity between two
datacenters (running your nodes!)
is interrupted!

P IS FOR PARTITION TOLERANCE

During a partition,
your nodes might as
well be on opposite sides
of a wormhole: there
is no way to know what's
happening on the other side.

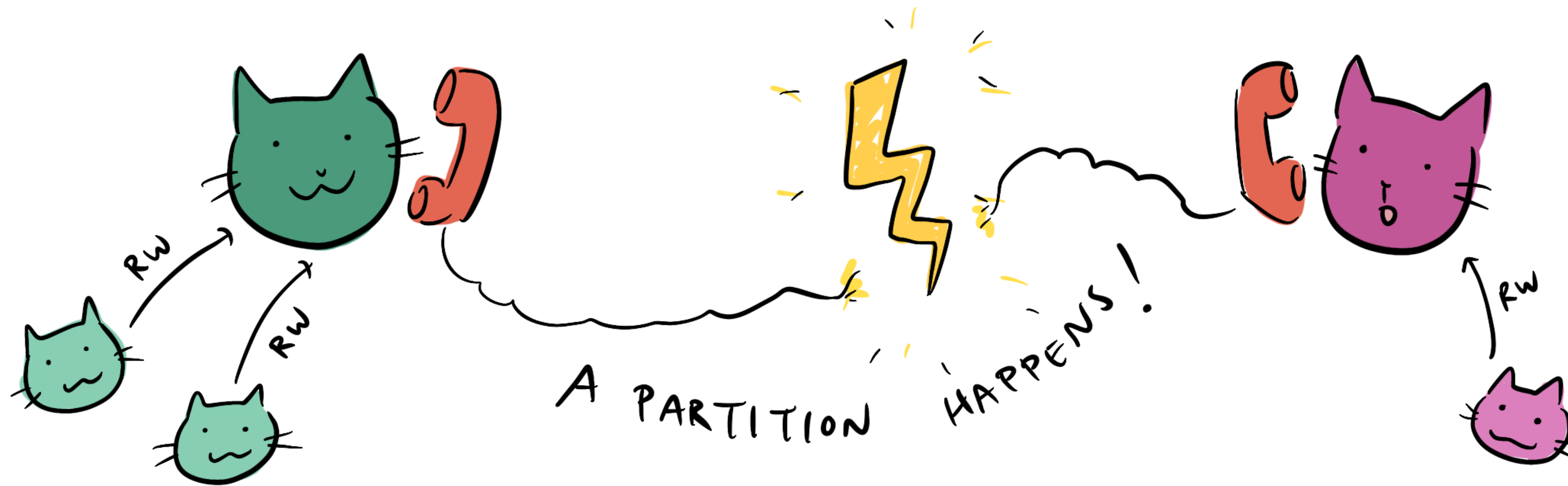


CONSISTENCY *

A VAILABILITY

Partition
tolerance

PROOF OF CAP THEOREM



OPTION 1

Let clients keep R/w
in both sides of split

~~LINEARIZABILITY~~

OPTION 2

Stop writing in one
side until partition ends

~~AVAILABILITY~~

PARTITION TOLERANCE



Network partitions
are inevitable.

How inevitable?

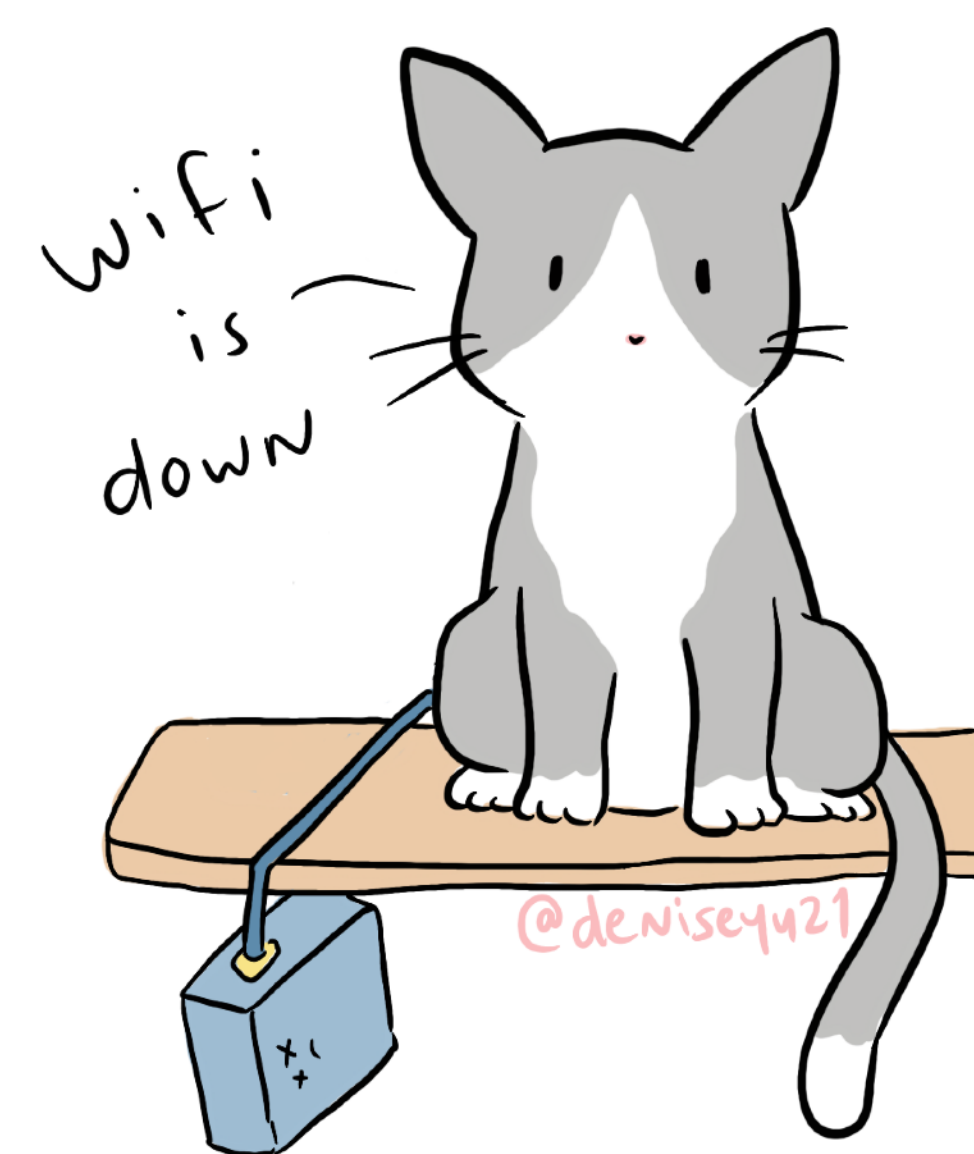
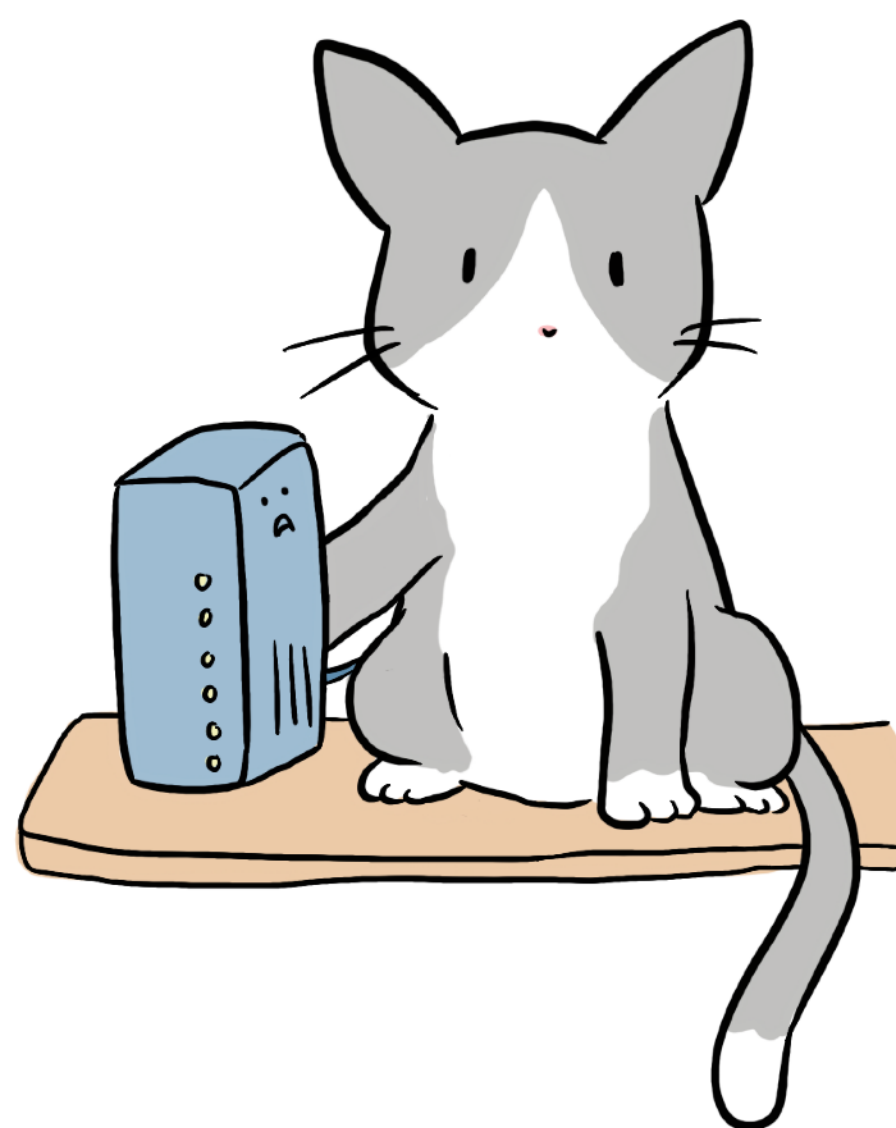
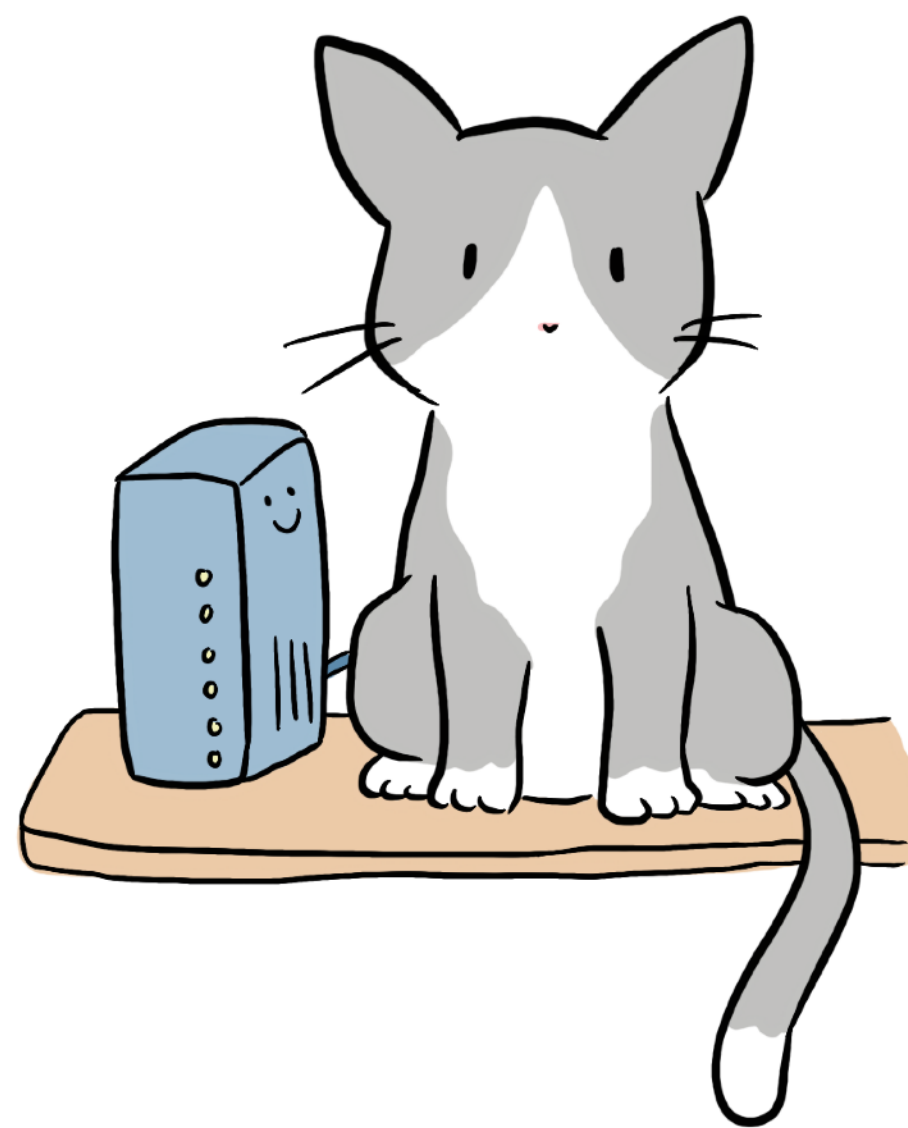
In the first
year of a Google
cluster's life, it
will experience

- 5 rack failures
- 3 router failures
- 8 network
maintenances

(Jeffrey Dean)

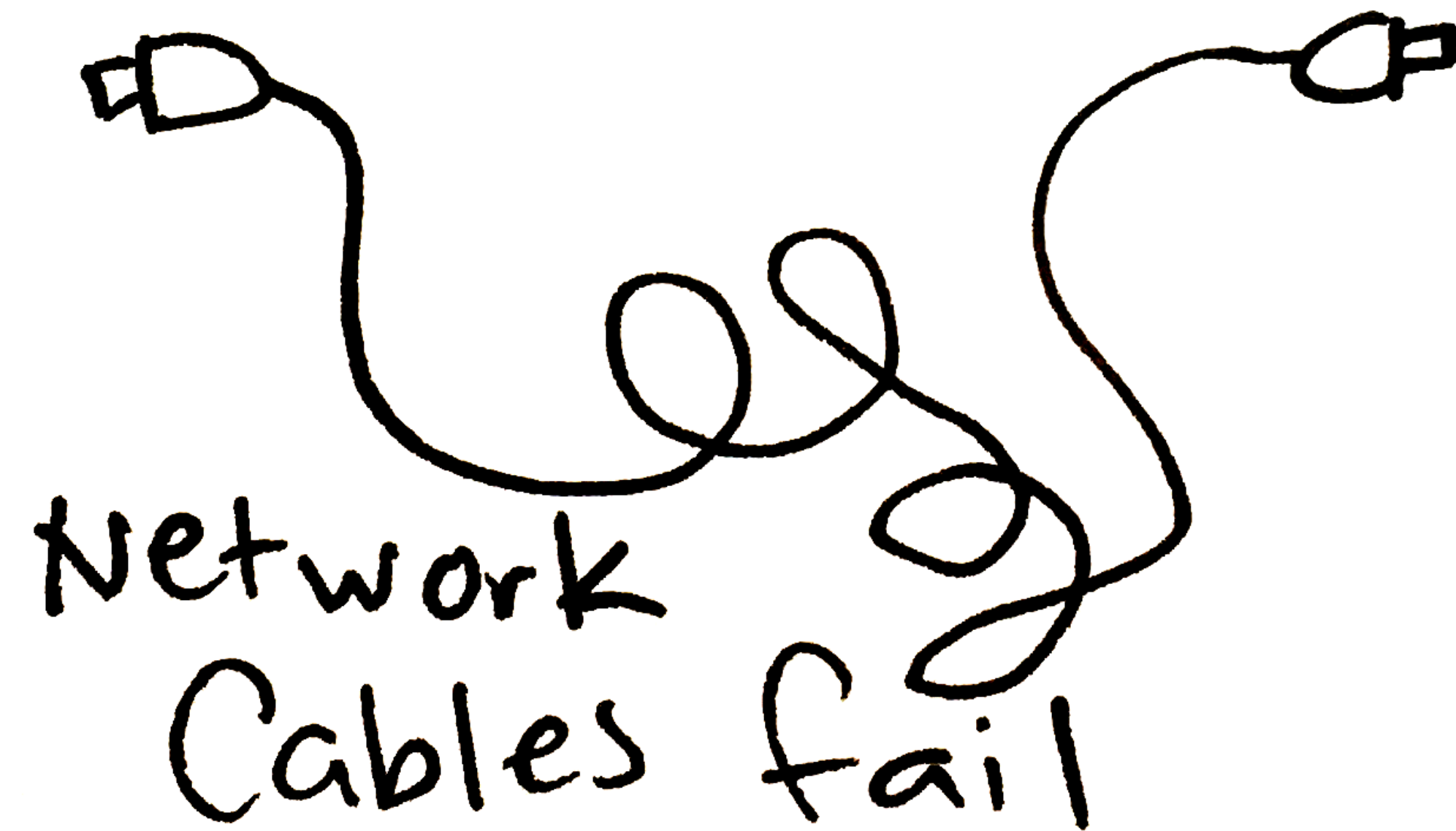


Hardware will fail



@denisey21 🐱

Hardware will
fail



Network
Cables fail

Hardware will
fail



@deniseyu21 🐙

POLICY —

It's official: Sharks no longer a threat to subsea Internet cables

First known cable shark attacks were in 1985.

DAVID KRAVETS - 7/10/2015, 5:16 PM

Software will behave weirdly

"Bursty" VMs
borrow resources
from each other -
the Noisy
Neighbor
Problem



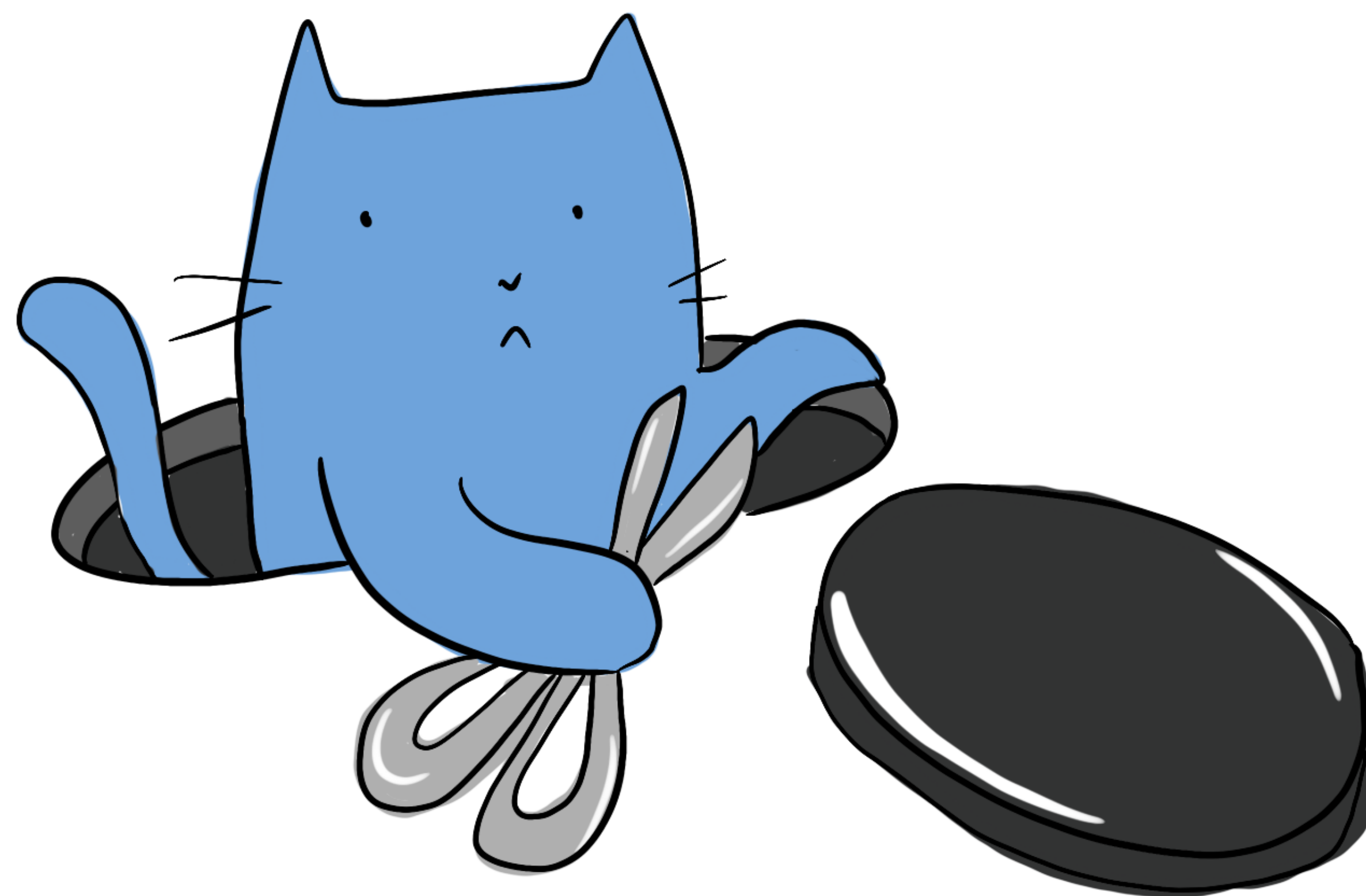
Software will
behave weirdly



"Stop the
World"
garbage
Collection

Network glitches

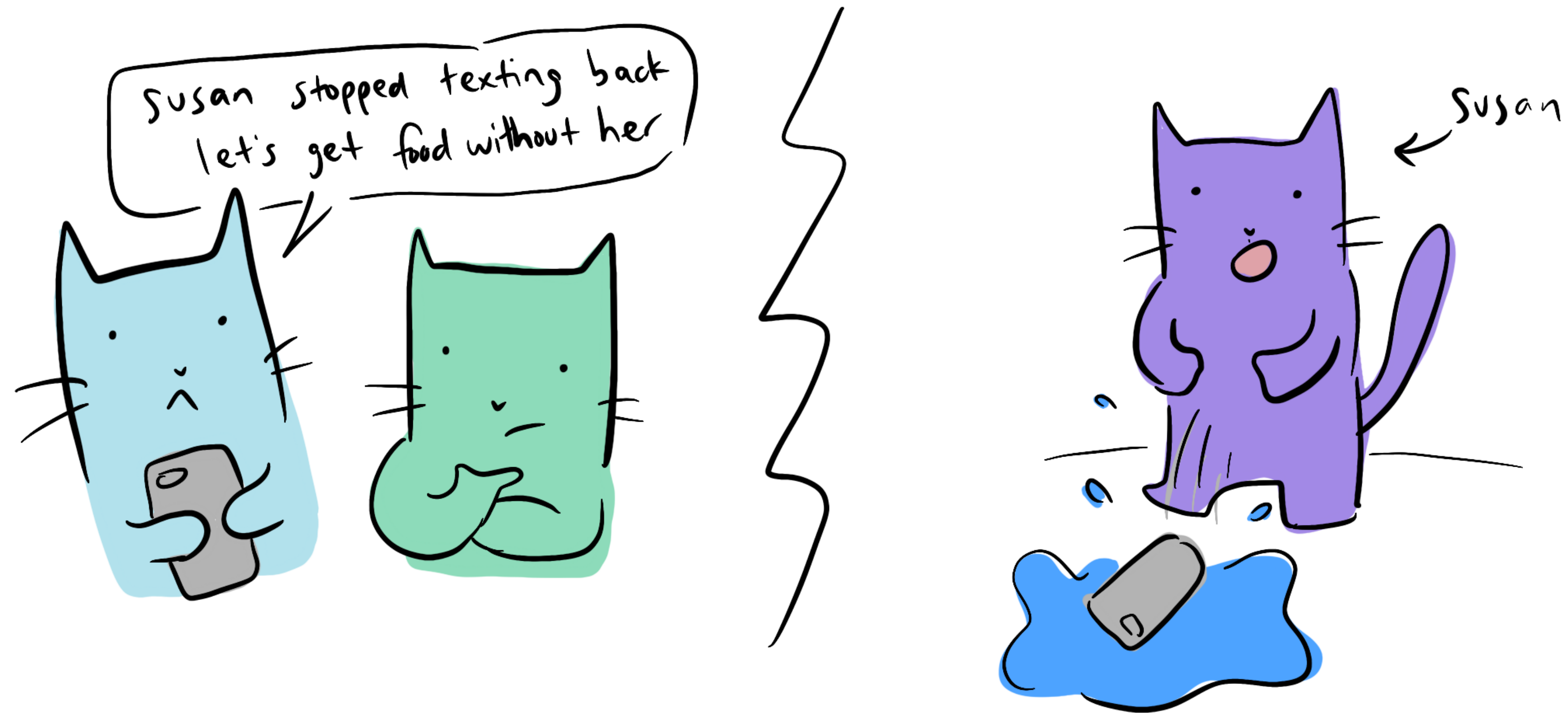




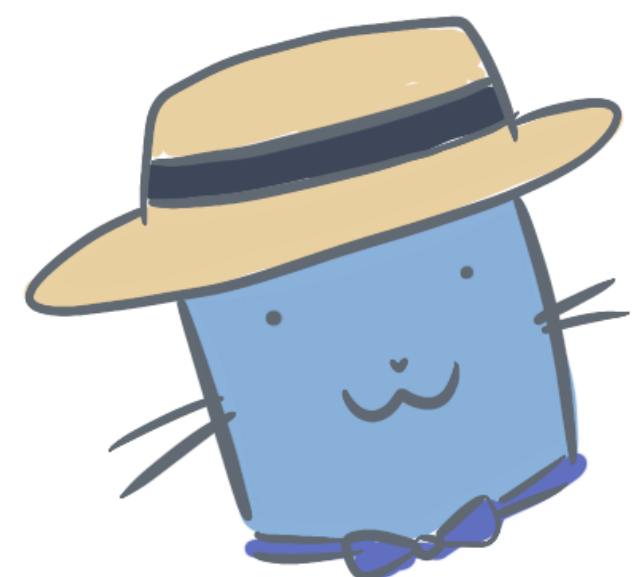
@deniseyu21 🐱

why does any
of this matter?

Some part of every system
is always at risk of failing

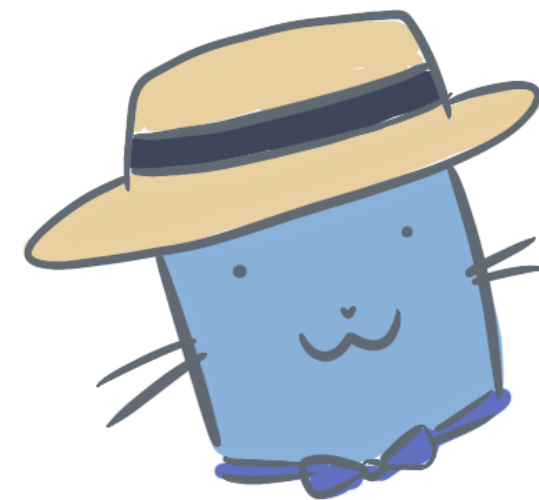


Fischer Lynch Paterson



Correctness result

distributed consensus is
Impossible when at least
one process might fail!



“Impossibility of Distributed Consensus with One Faulty Process, 1985.

to manage
uncertainty,
we have
mitigation
strategies

what is AUTOMATIC LEADER

FALLOVER?

LEADER-FOLLOWER* is

a common pattern for REPLICATING data across nodes in a cluster. If a follower node fails, it's NO BIG DEAL usually, because other nodes can continue to serve READ requests!



STEP ONE

Detect that a node failed! most databases have a default TIMEOUT (ex. 30s)

"If a node has no activity for this time, it is considered to be **offline**"

WHAT IF THE LEADER NODE FAILS?

the cluster must initiate a **FALLOVER** to choose a new leader!

* You may have encountered "master-slave replication". I prefer not to use this term, because as technologists, our language matters. We should choose terms that are inclusive & don't cause harm.

STEP TWO

From the remaining followers, elect a new leader!



Becky's data is most up to date I vote Becky



YEH OK I'll do it



Becky

Some databases have a **CONTROLLER NODE** who chooses



He has ONE JOB!

STEP THREE

Tell the world about the new LEADER

I AM THE NEW LEADER!



Yea Becky we know



Traffic will be routed to the new leader for all future write requests



@deniseyu21
sketch-ops.tumblr.com

how does RAFT WORK?

RAFT IS A
CONSENSUS ALGORITHM

used in many
projects in the
real world -
ex. etcd

a process
for getting
multiple machines
to "agree"!

WHY?

Distributed
systems come
with uncertainty.
Achieving consensus
is important so data
can be replicated!

- RAFT doesn't stand for
anything. It's a bunch of logs
tied together.



WHAT ABOUT NETWORK
PARTITIONS?!

In a partition,
if the leader
falls on the smaller
side, a new leader is
elected within the majority
side. When the partition
ends, messages received
by the minority side are
discarded, and those nodes
converge their state to
match the majority's.



WHEN A
NEW WRITE
HAPPENS:



(Any node can
write!)

Message is
queued



copy
me!

Message
forwarded
to
leader
node



Ack!

Followers
copy leader



Ack



Leader
"Commits"
the new data



&
Followers
increment their
state counter





... BUT WHY??





🐼 and his hair was perfect 🐼
@palvaro



another highlight:

Me: so... what is the hard thing about distributed systems? if you had to pick one word...

Student 1: uncertainty?

Me: *beaming* GOOD. *writes it on the board*

Student 2: Docker

Student 1: actually that's better, take mine off

6:33 PM · Oct 20, 2019 · [Twitter Web App](#)

Woods' theorem:

"as the complexity of a system increases, the accuracy of any single agent's own model of that system decreases rapidly."



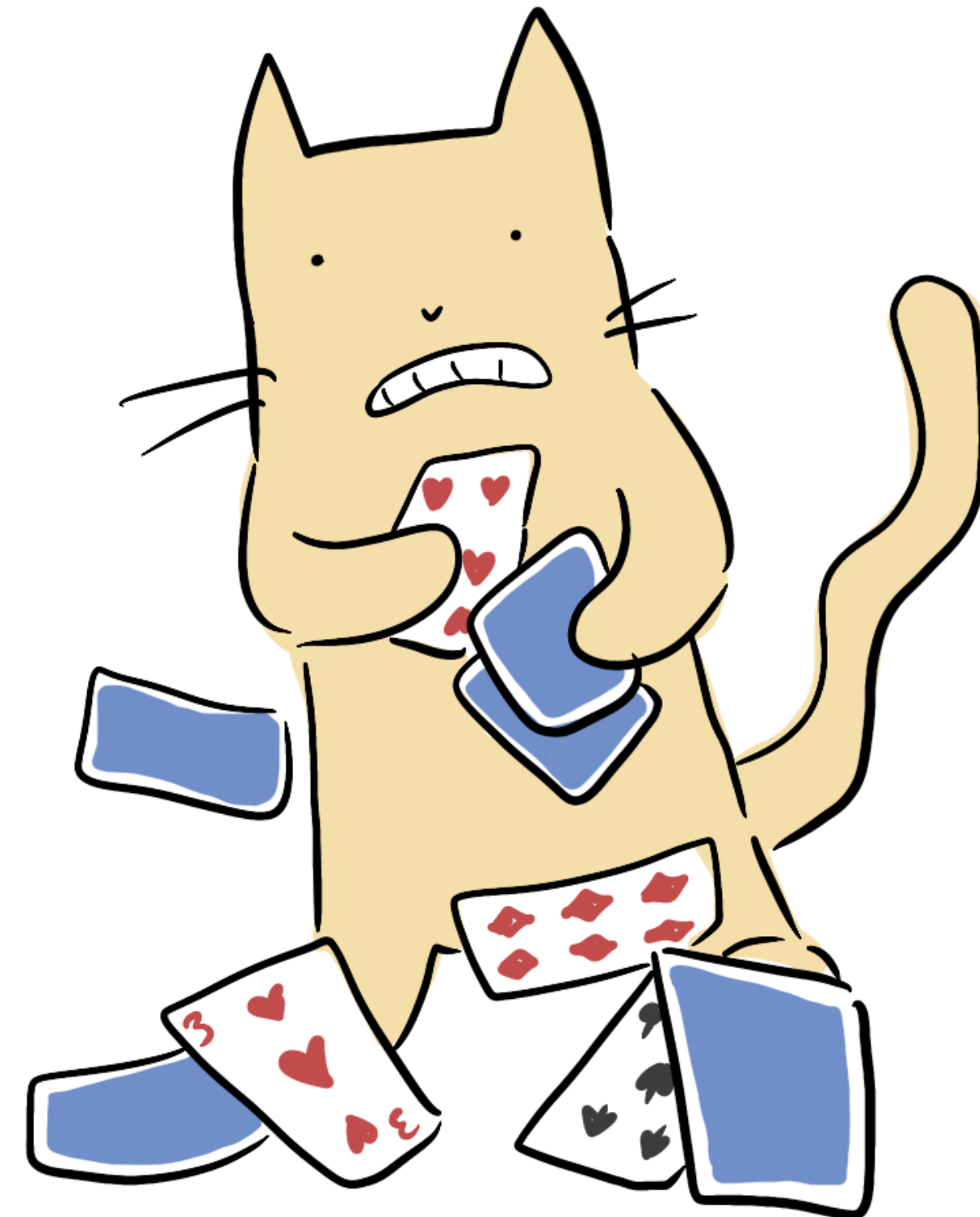
"Coping With Complexity: the psychology of human behavior in complex systems." Dr. David Woods, 1988.

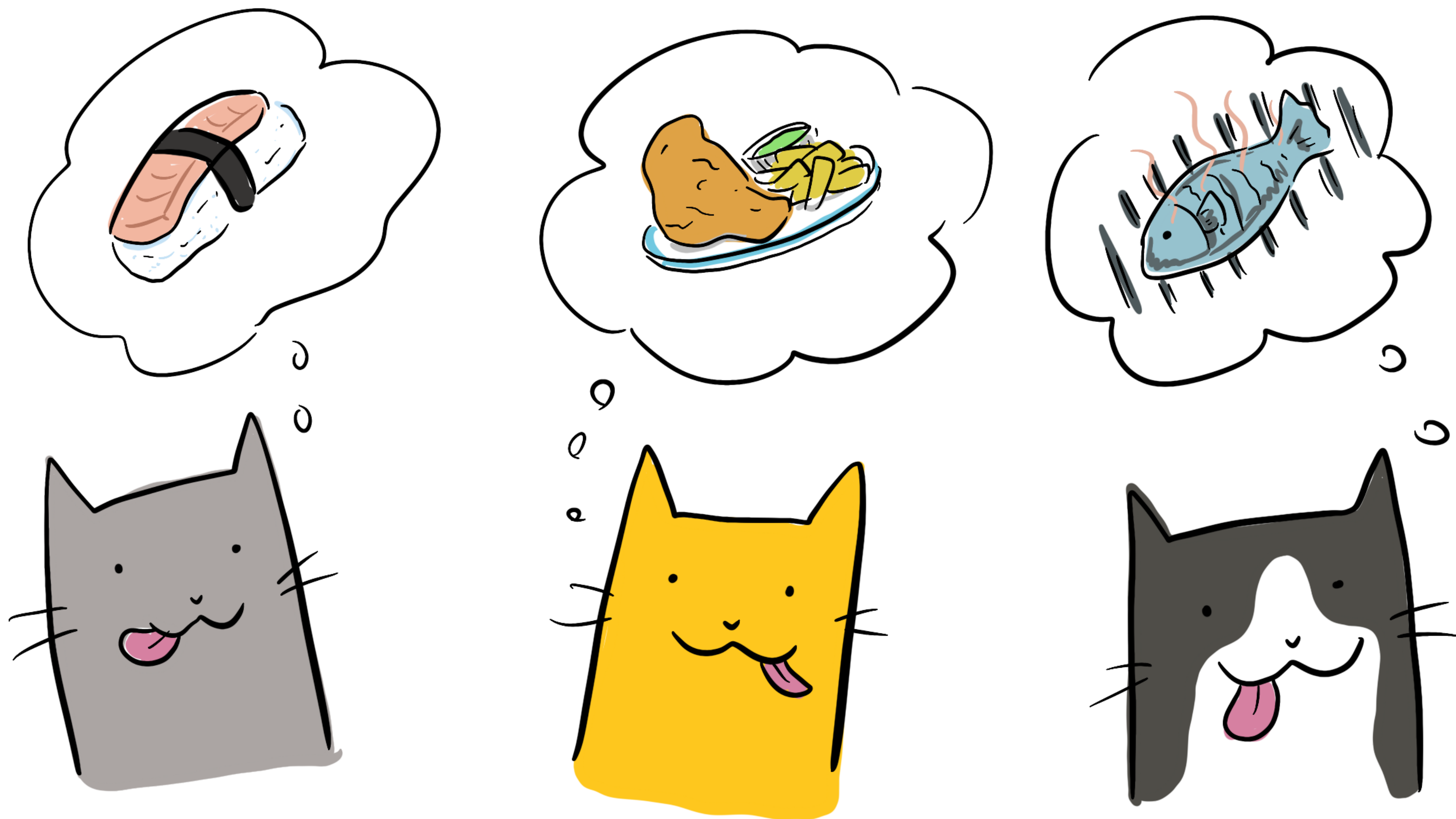
BUILDING MENTAL MODELS

in theory:

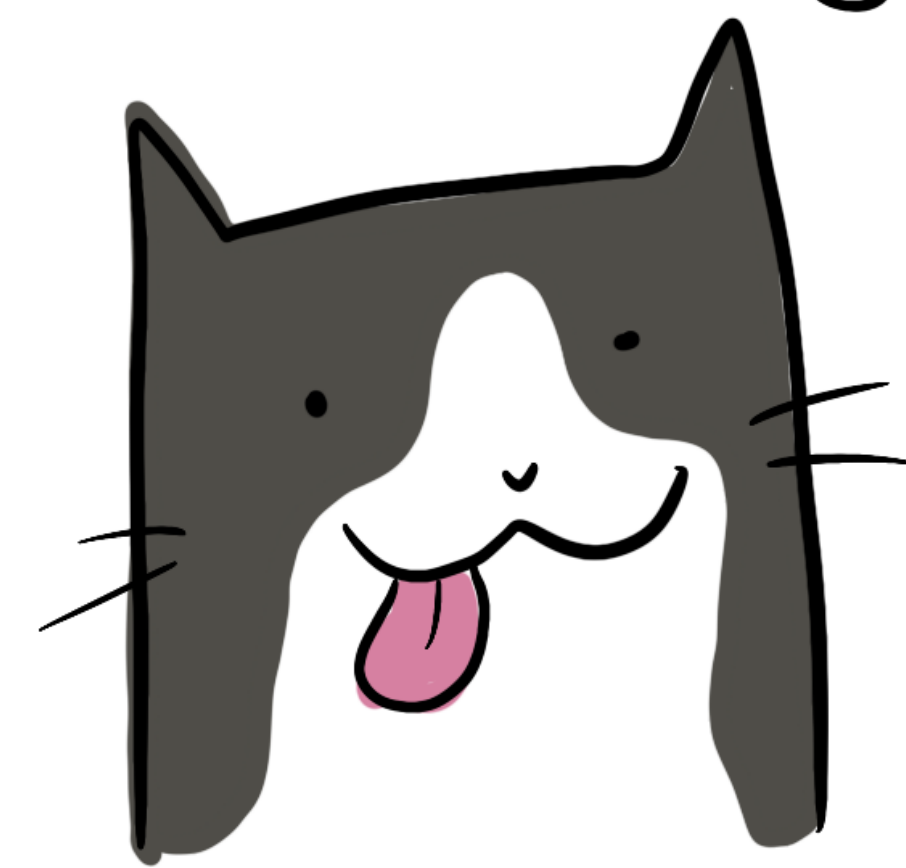
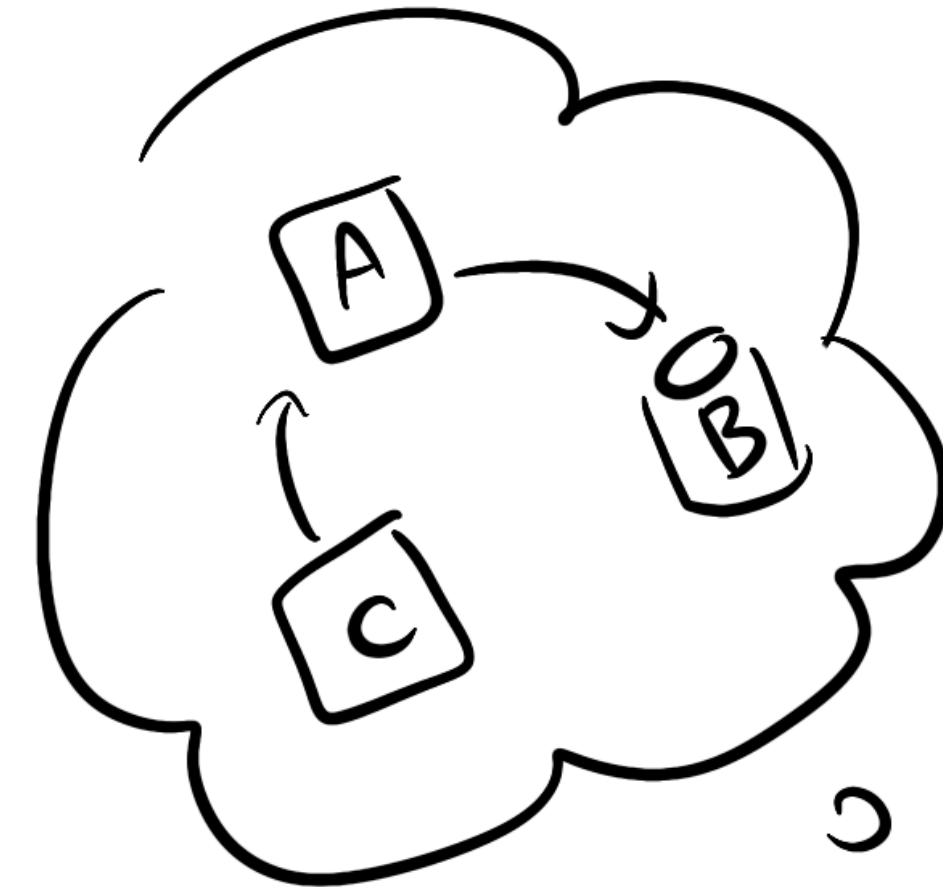
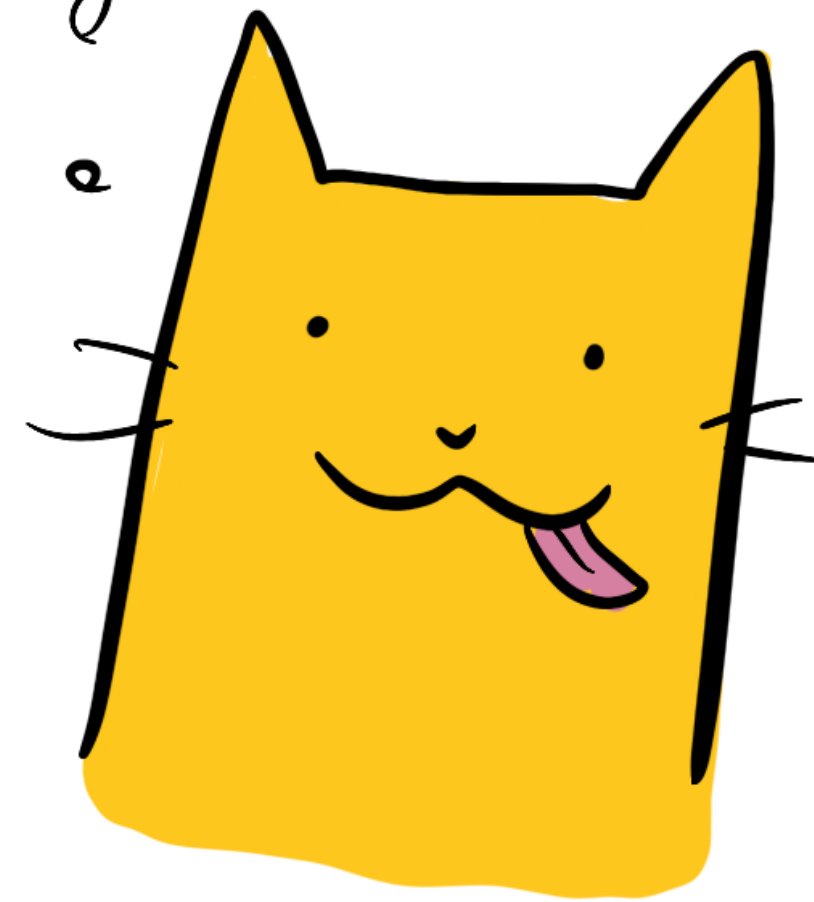
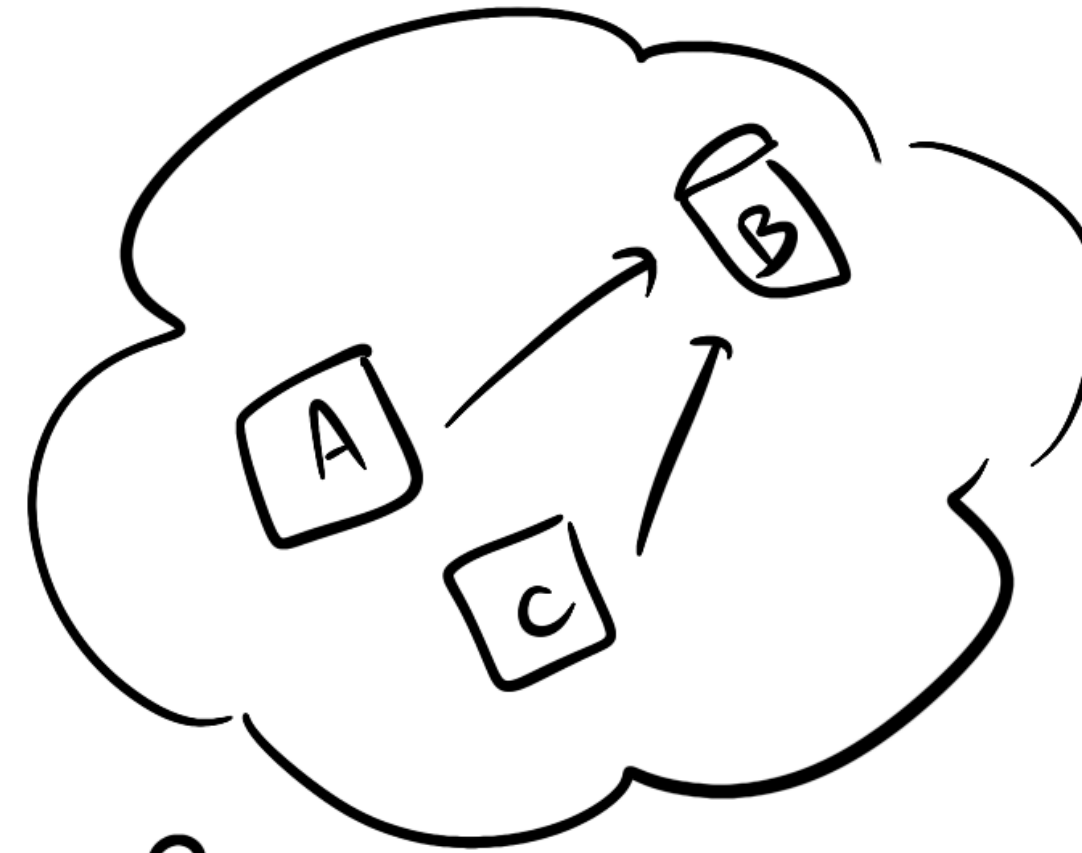
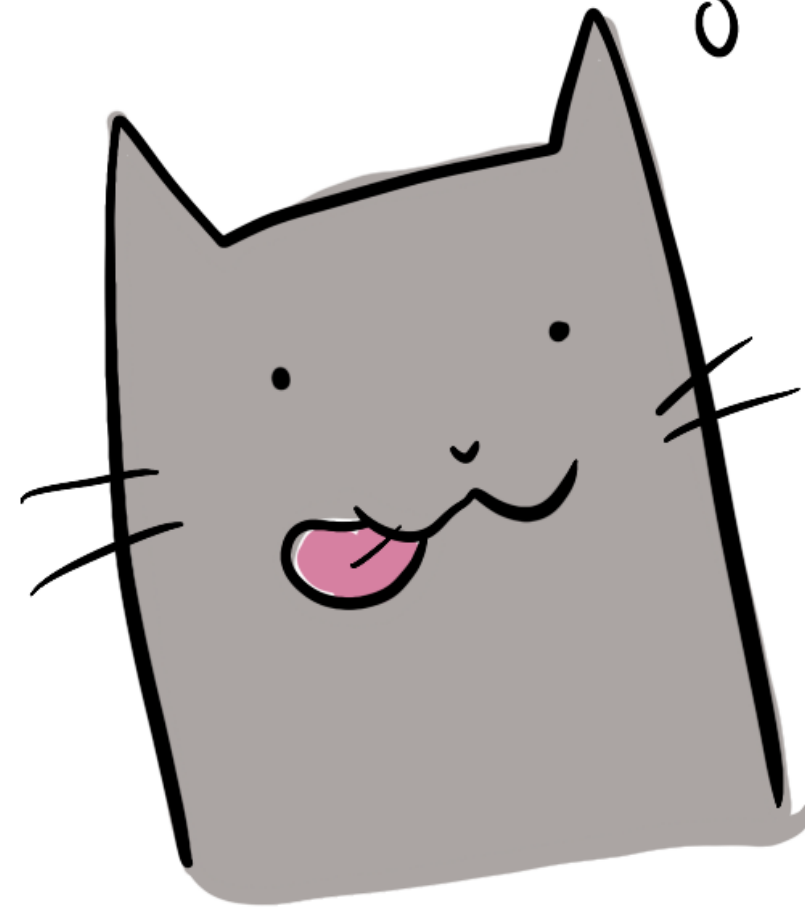
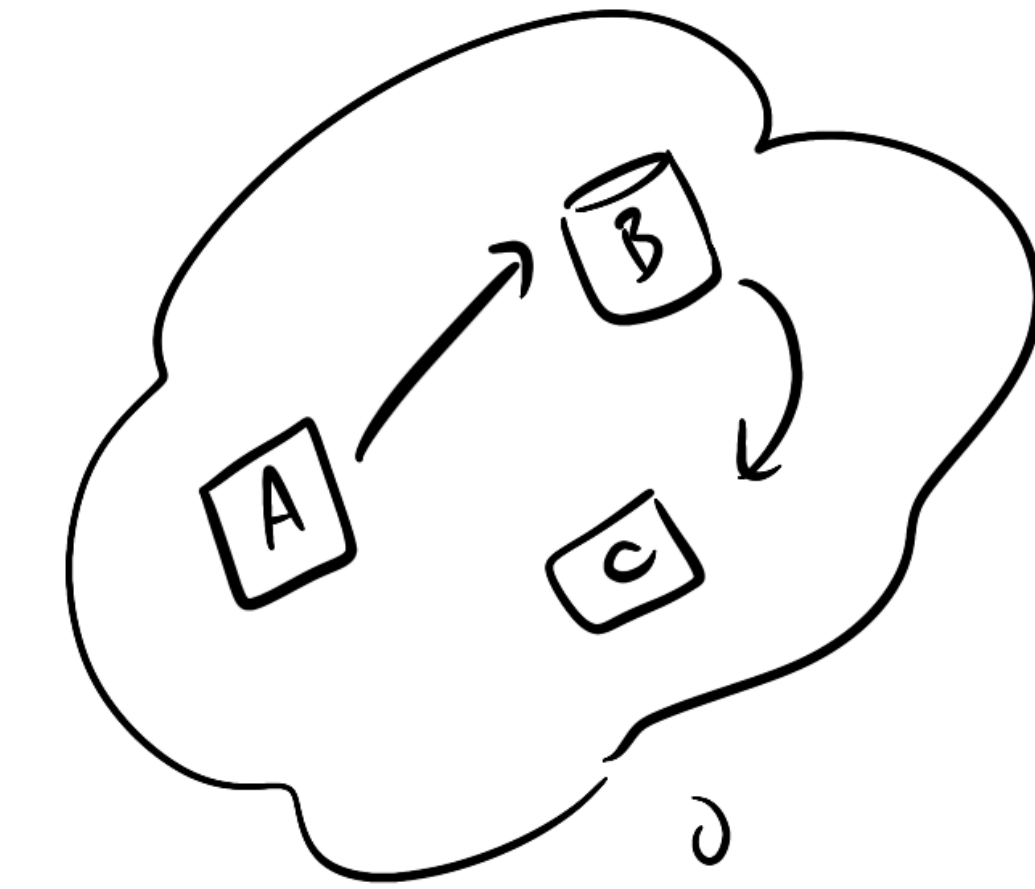


in practice:



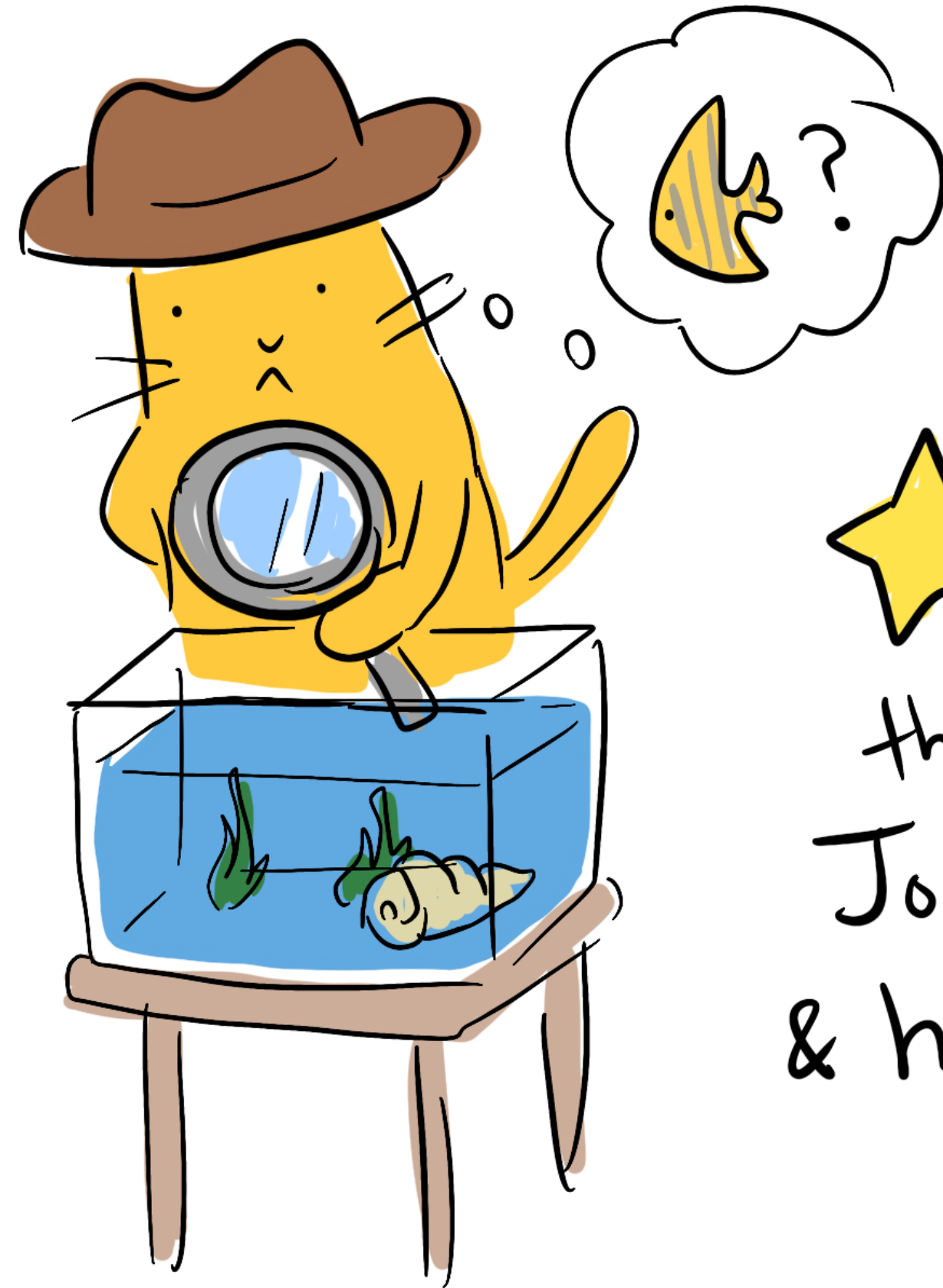


Mental models are hard to compare,
which makes them hard to calibrate



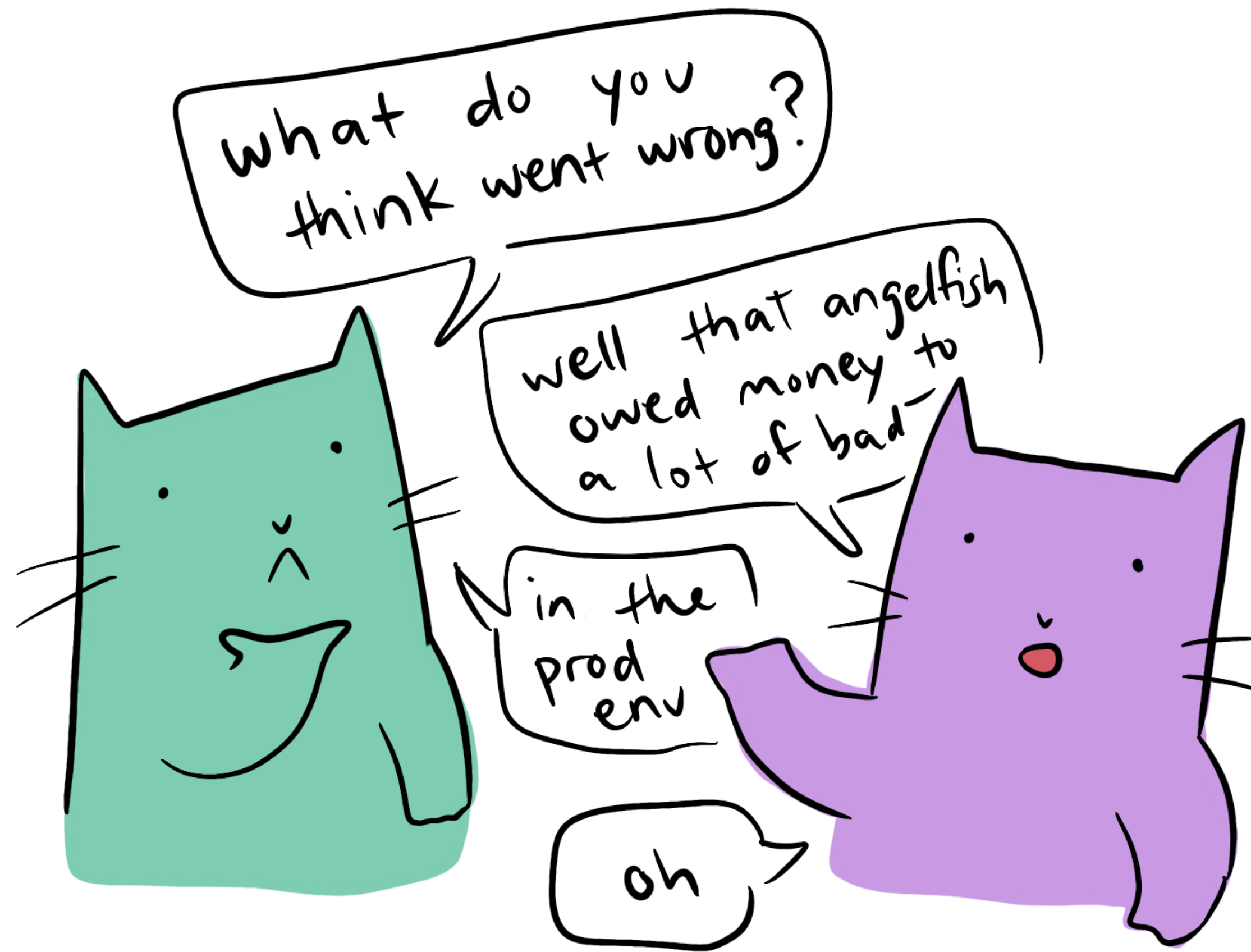
Mental models are hard to Compare,
which makes them hard to calibrate

INCIDENT ANALYSIS



★ This is
the work of
John Alls
& his team 

is particularly great for
mental model calibration



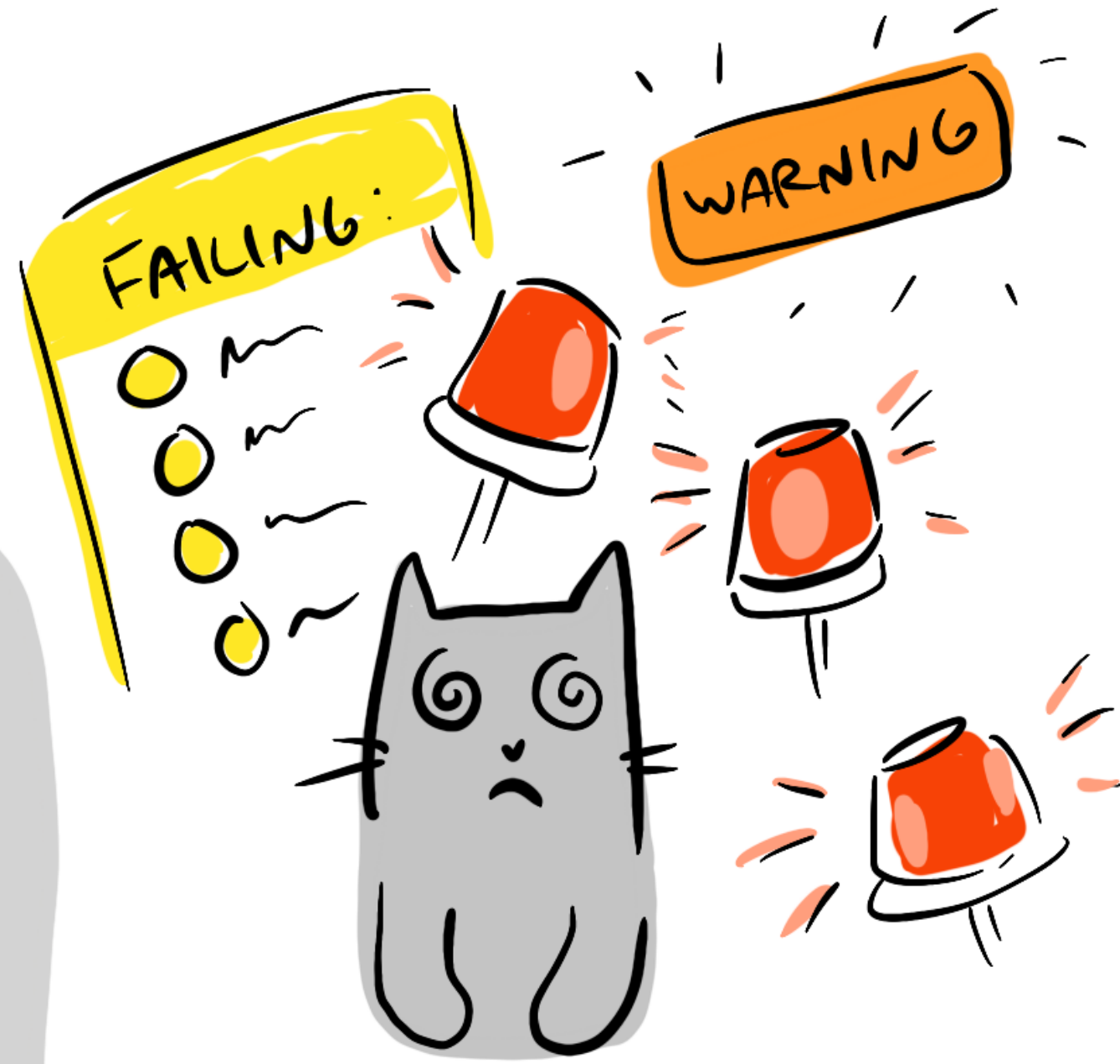
Blameless discussions
Optimized for learning

Don't accept HUMAN
ERROR as the root
cause. Dig deeper!



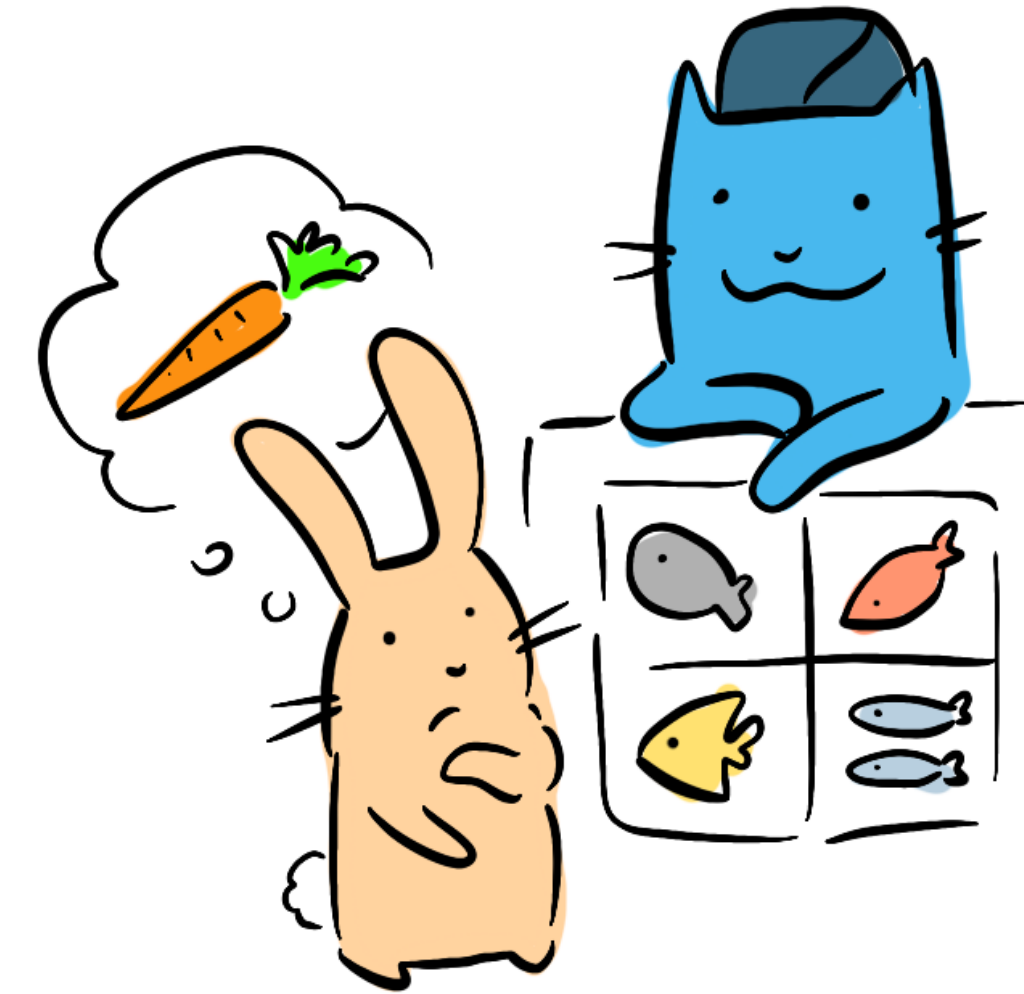
Unintuitive design?

☐ check if you
do not not not not
not not not wish
to receive
emails

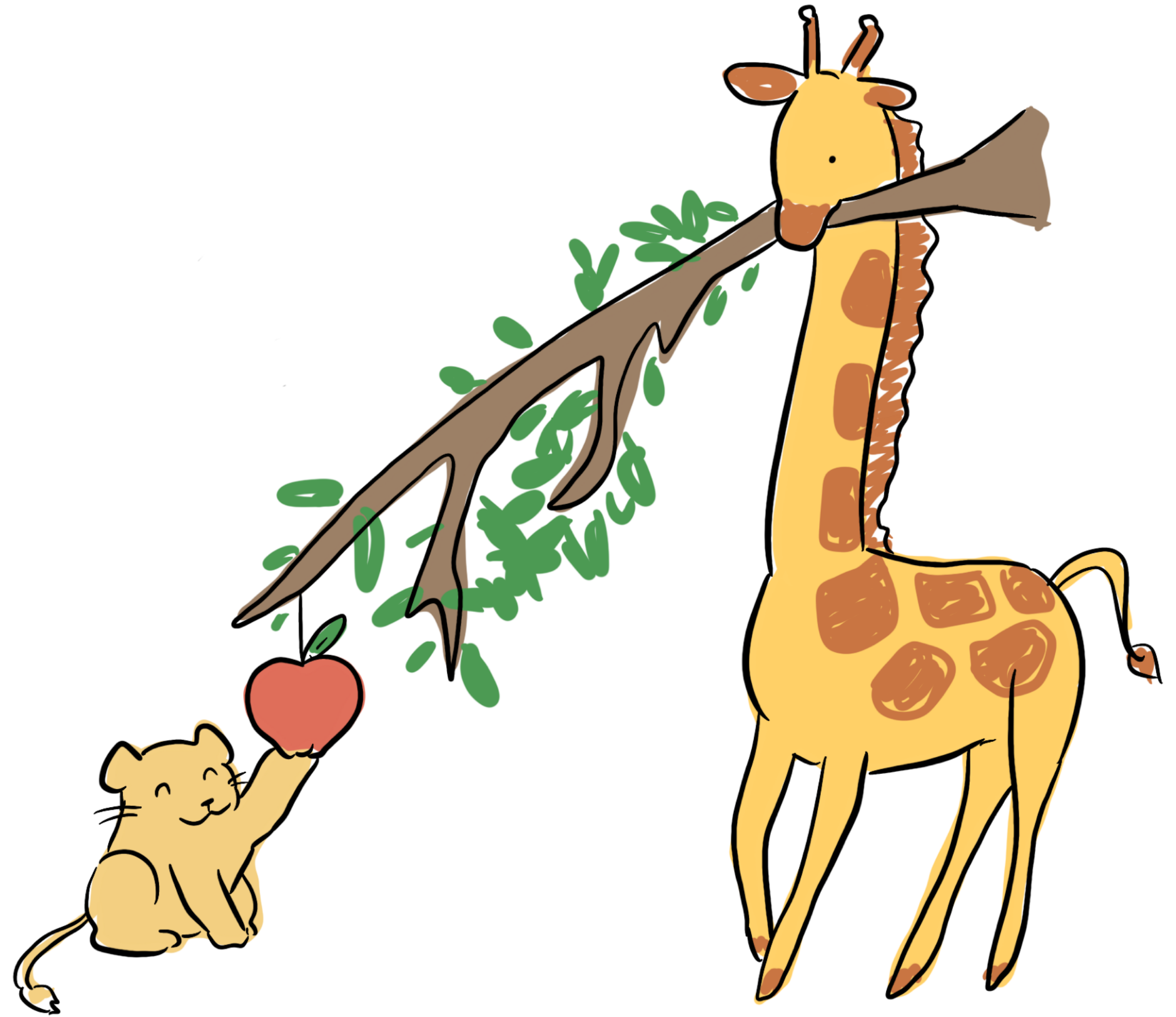


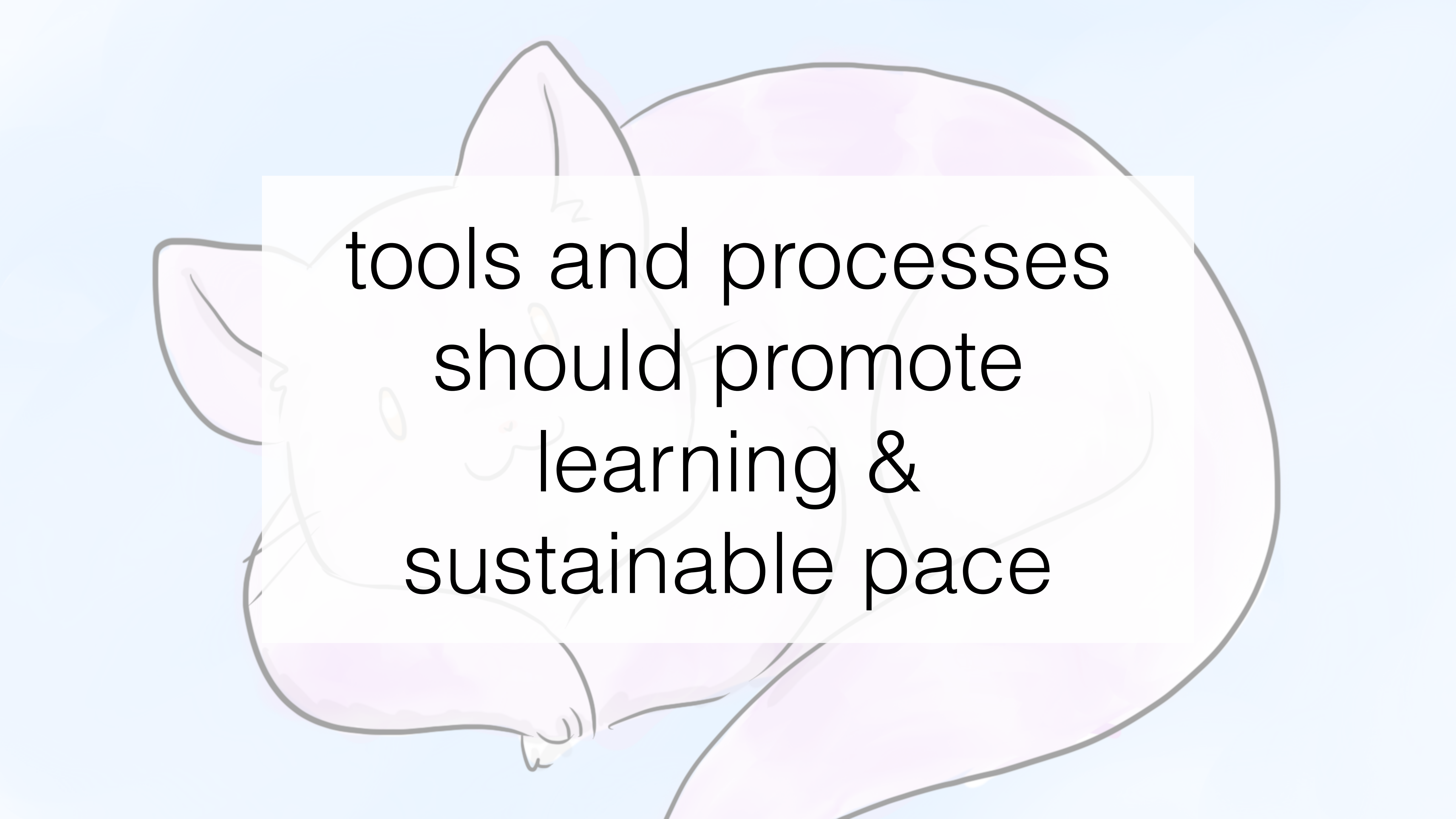
Alert
fatigue?

Not understanding
the users' assumptions
and needs?



design your
systems for
humans, not
machines



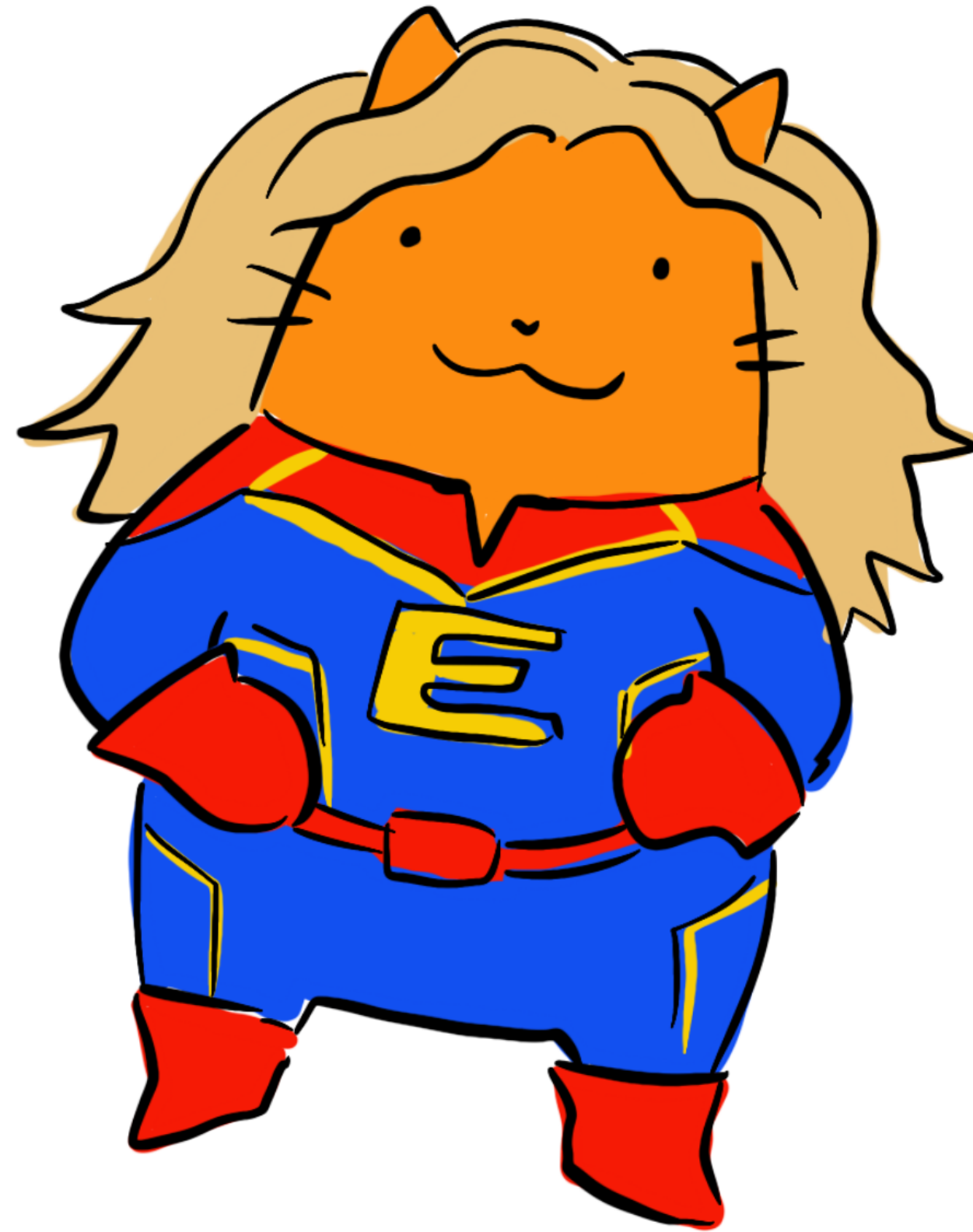


tools and processes
should promote
learning &
sustainable pace



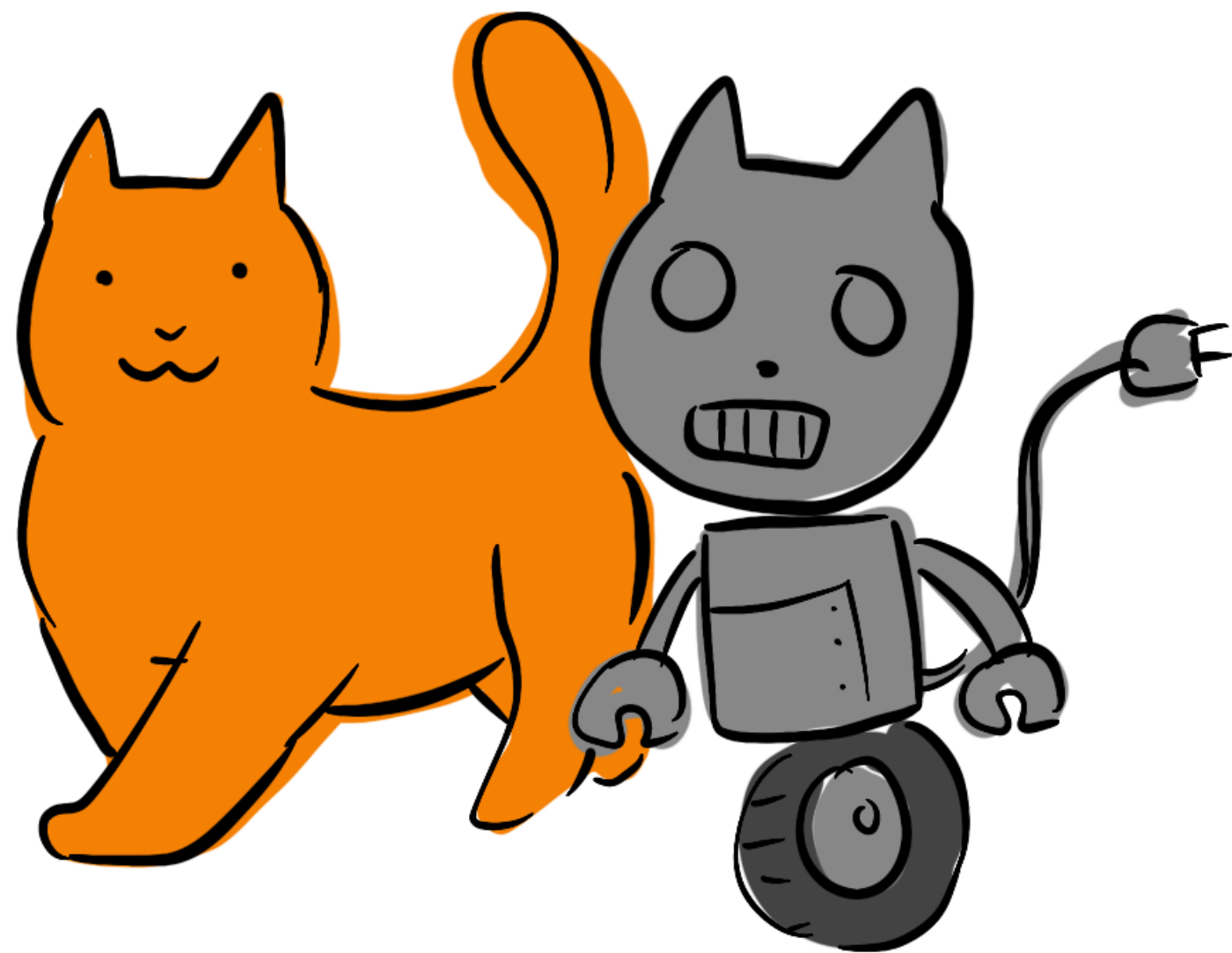
be kind to each other
#HugOps

our superpower, as humans:

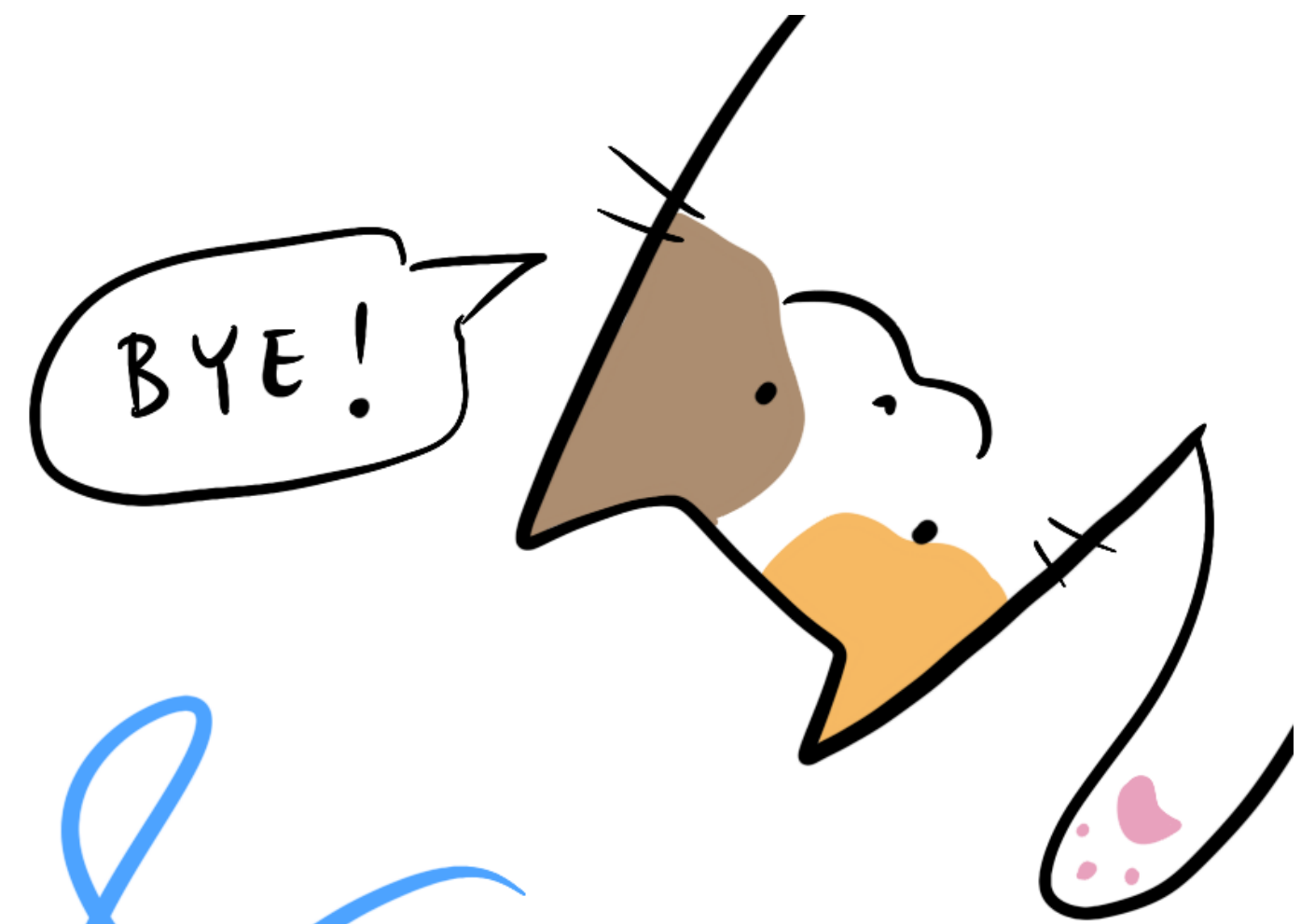


empathy

we owe it to our end users &
our teams to understand
& design for the whole system



including the fleshy human parts.



slides &
references

deniseyu.io/lisa