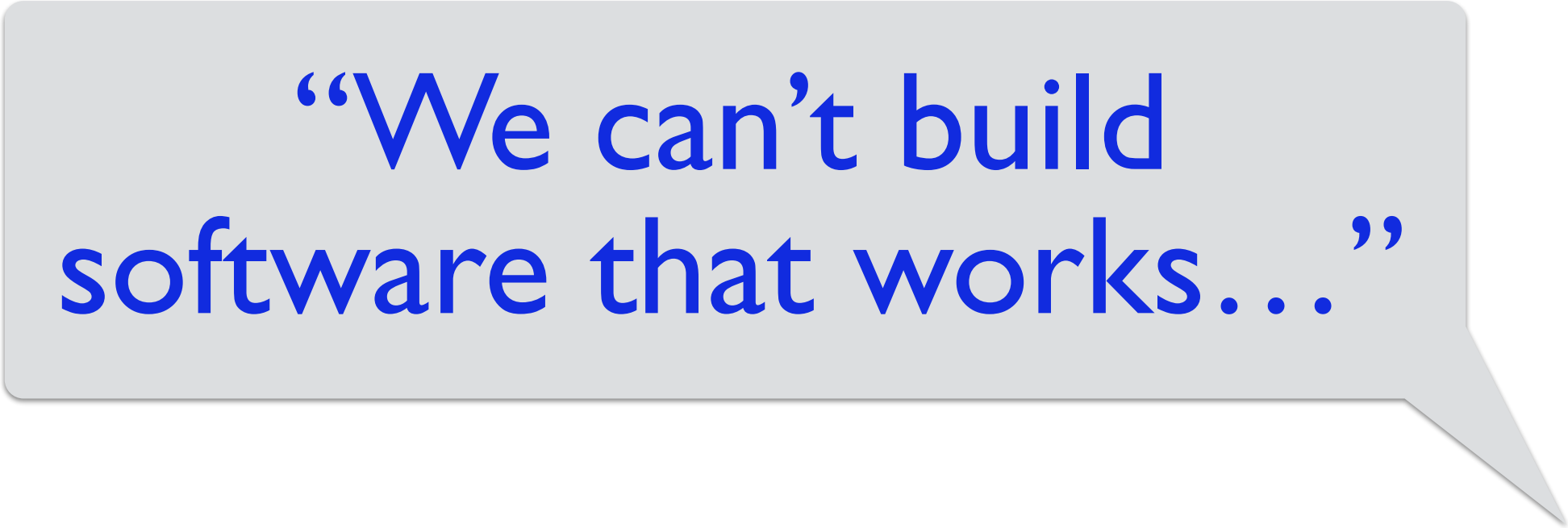


# A Deep Specification for Dropbox

Benjamin C. Pierce  
University of Pennsylvania

Clojure/conj  
November, 2015





**“We can’t build  
software that works...”**



**PWNED!**

“We can’t build software that works...”



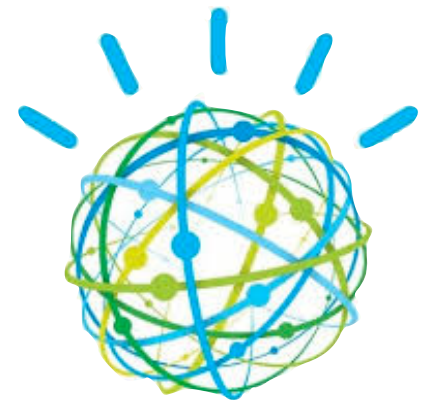
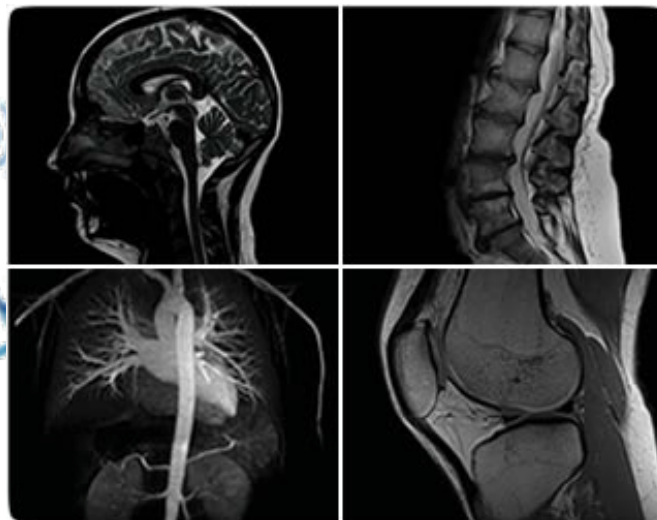
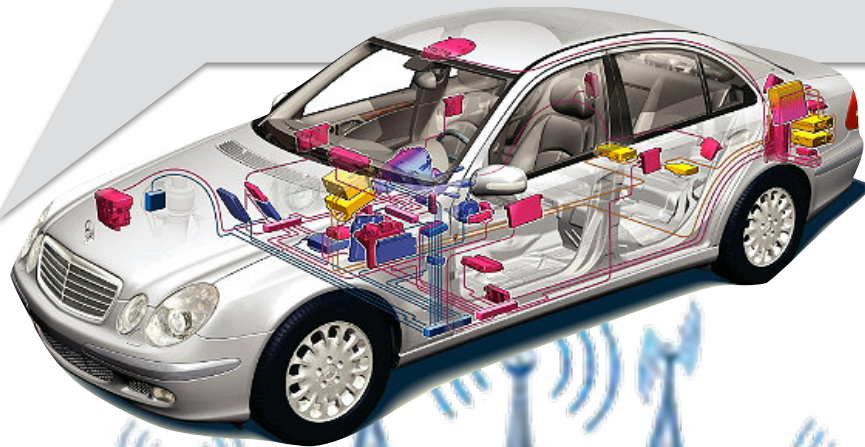


But look at all the  
software that *does* work!





But look at all the  
software that *does* work!



How did that  
happen?



Lots of ways!

# Lots of ways!

- Better programming languages
  - Basic *safety guarantees* built in
  - Powerful mechanisms for *abstraction* and *modularity*

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  - Powerful mechanisms for *abstraction* and *modularity*
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- Better use of specifications

# Lots of ways!

- Better programming languages
    - Basic *safety guarantees* built in
    - Powerful mechanisms for *abstraction* and *modularity*
  - Better software development methodology
  - Stable platforms and frameworks
  - Better use of **specifications**
- 

*I.e., descriptions of what  
software does (as  
opposed to how to do it)*

Why are  
specifications useful?

# Why are specifications useful?

If you want to build software that works, it is helpful to know what you mean by "works"!

# A Specification:

The “sort” function should take a list of items and return a list of the same items in increasing order.

# A Specification:

*useful!*



The “sort” function should take a list of items and return a list of the same items in increasing order.

# A Specification:

*useful!*



The “sort” function should take a list of items and return a list of the same items in increasing order.

*but...*

*simple*





# A Specification:

*useful!*



The “sort” function should take a list of items and return a list of the same items in increasing order.

*but...*

*simple*



*informal*



# A Specification:

*useful!*



The “sort” function should take a list of items and return a list of the same items in increasing order.

*but...*

*simple*

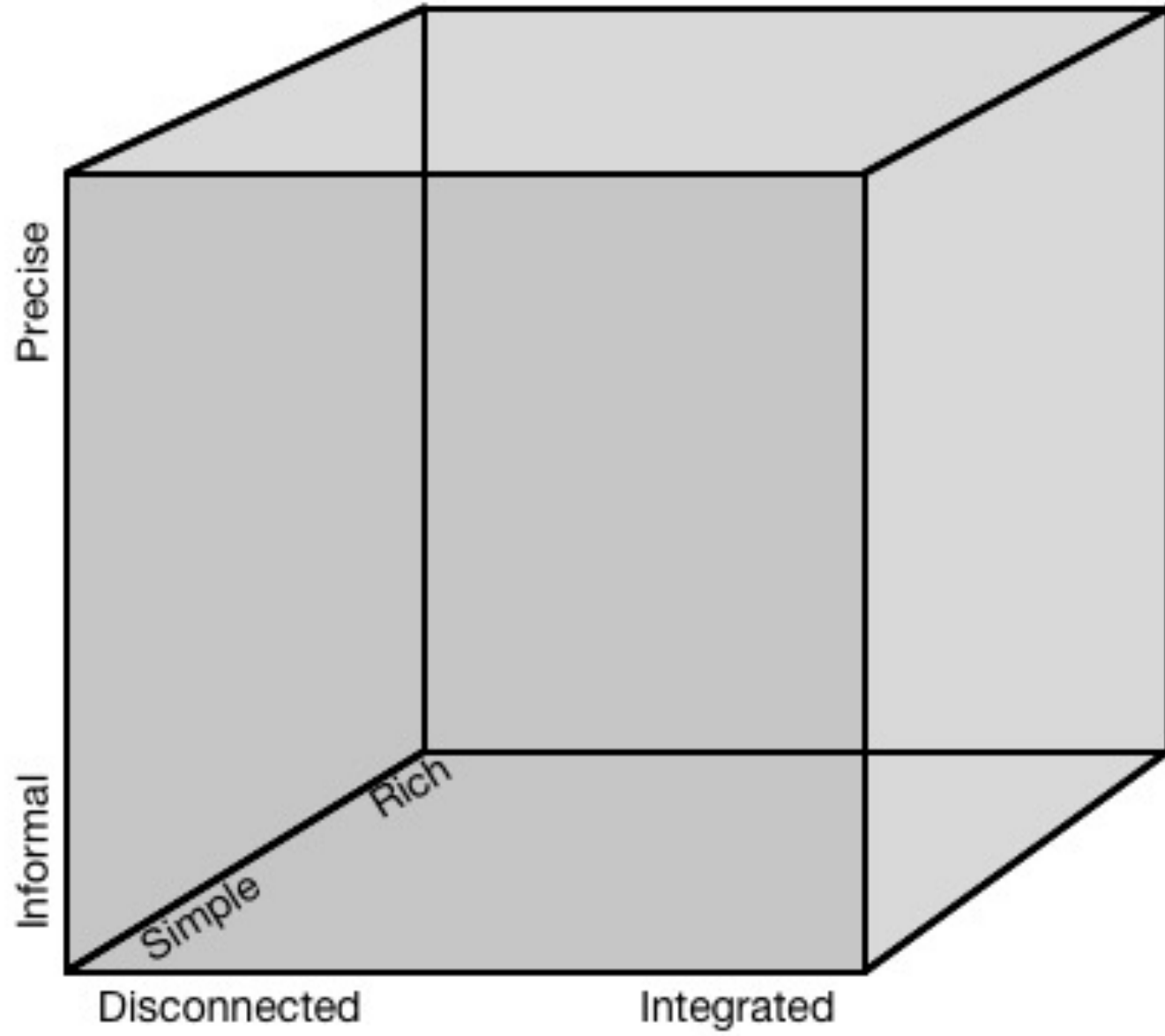


*informal*



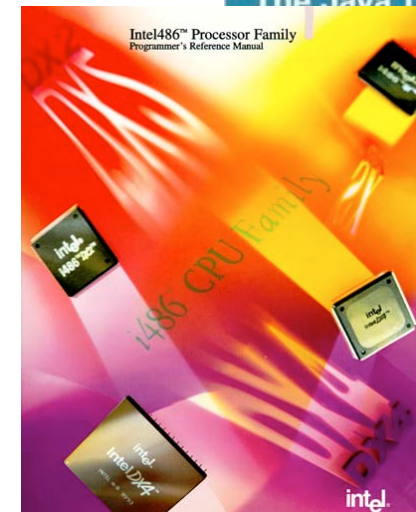
*disconnected  
from code*





# Simple → Rich

- C Language Reference
  - 592 pages
  - also Java (792 pages), C++ (1354 pages, etc.
- x86 CPU reference
  - 1499 pages
- AUTOSAR standardized automotive architecture
  - 3000 pages



# AUTOSAR

# Informal → Precise

Formal *specification languages*

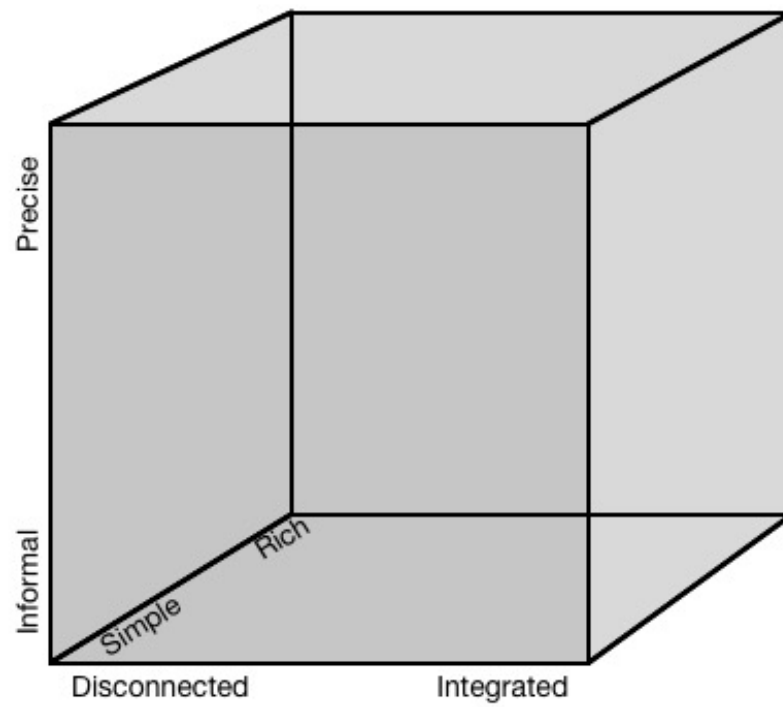
- Z, Alloy, VDM, ...
- ACL2
  - x86 instruction set
  - Java virtual machine
- (and many newer ones...)

# Disconnected → Integrated

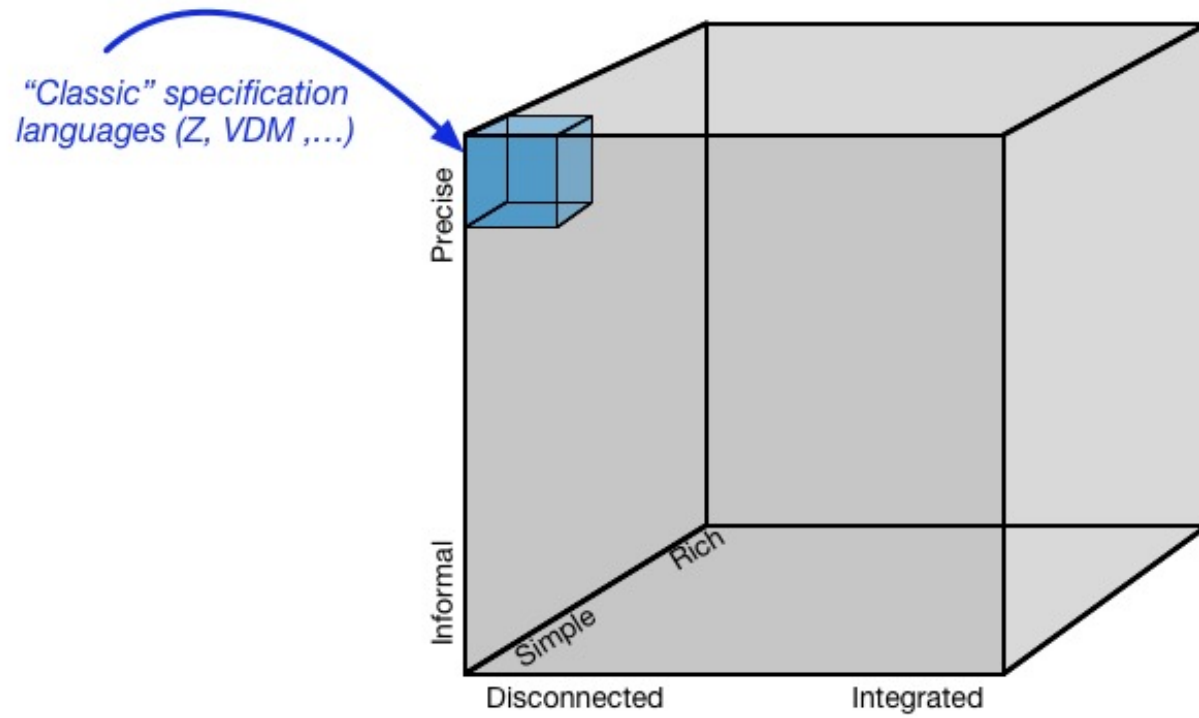
## Formal *verification tools*

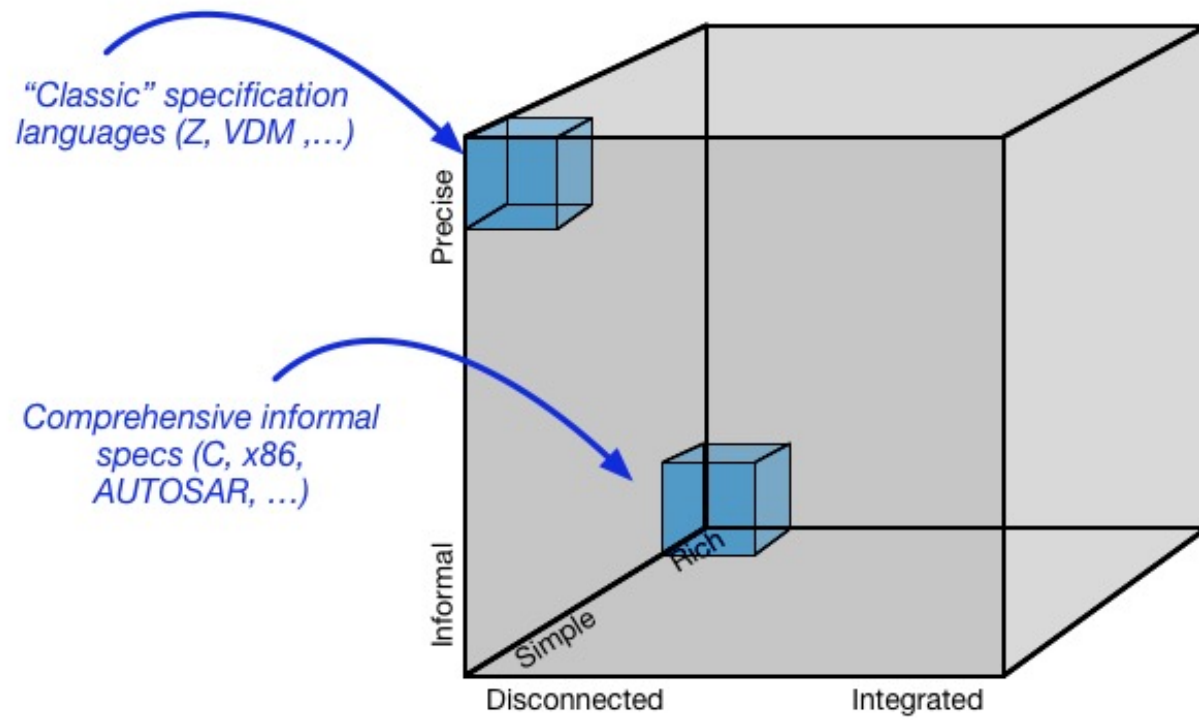
- Human constructs “proof script”; computer checks it
- Capable in principle of establishing connections between arbitrary specifications and code
- Challenging to use at scale, but getting better!

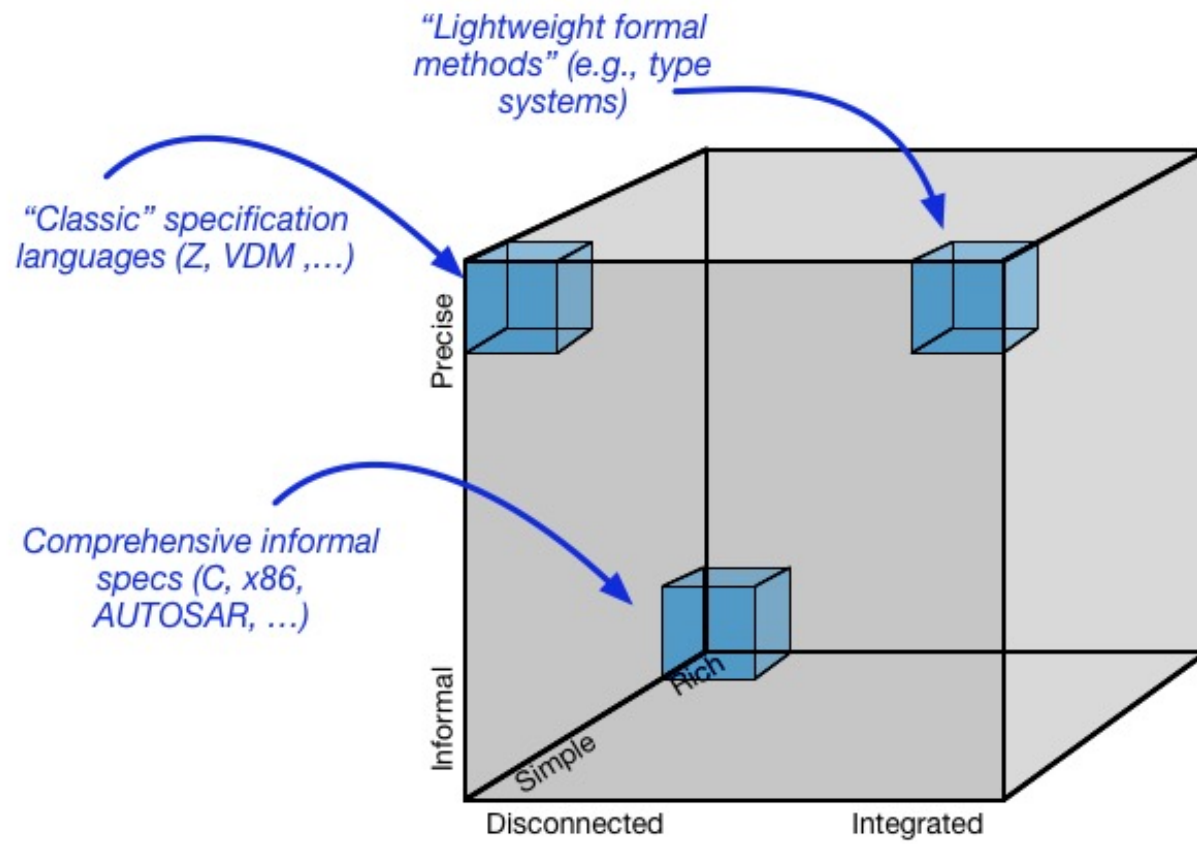
Recap...

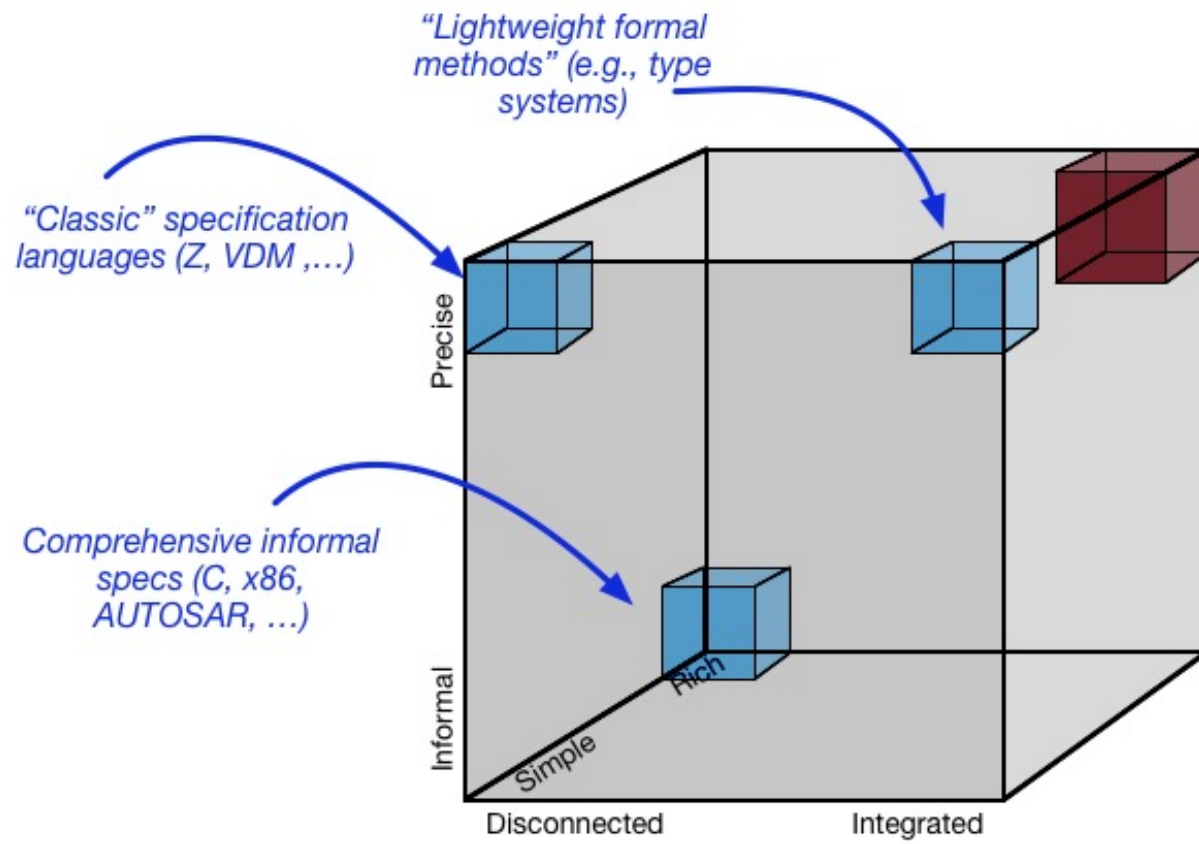


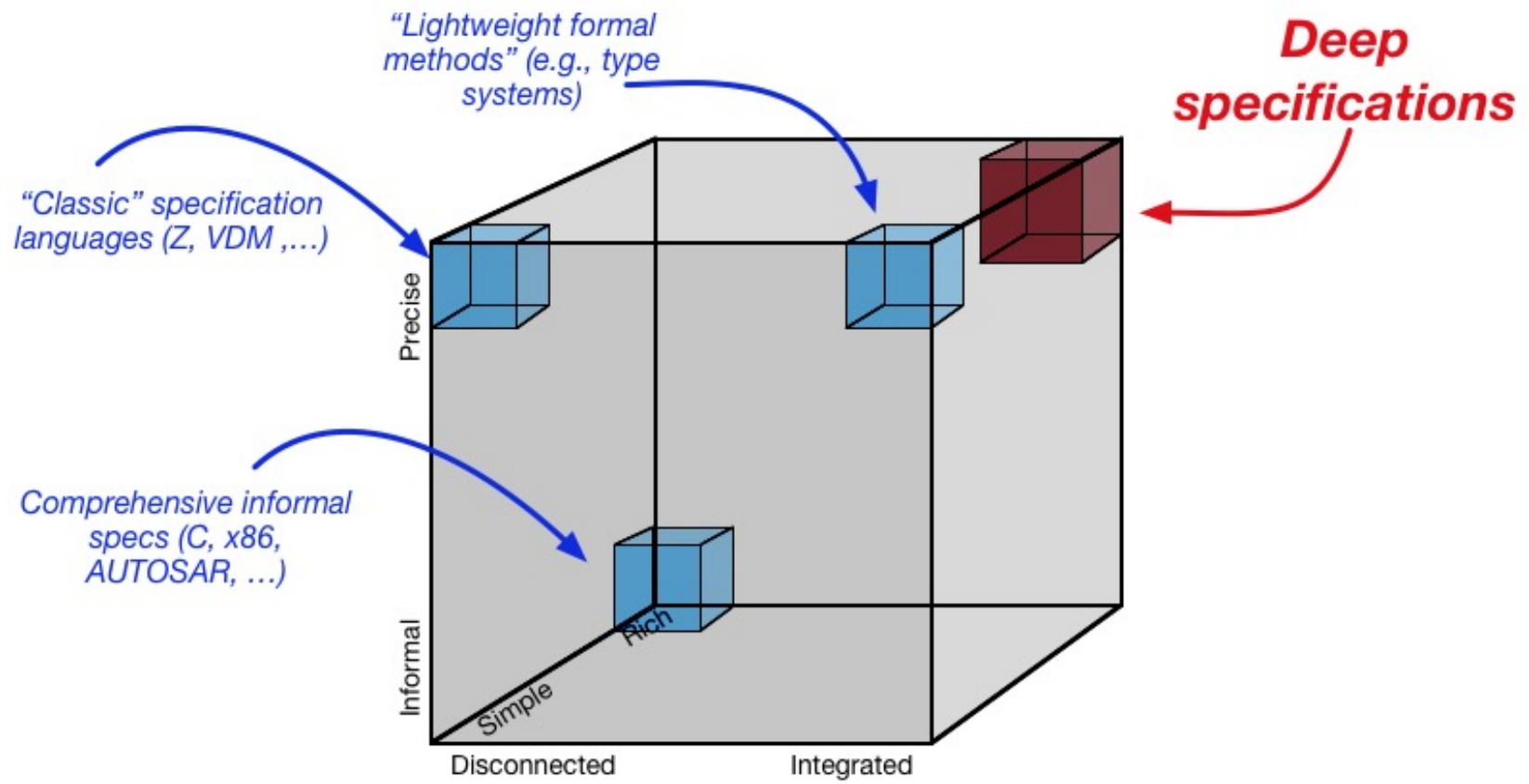












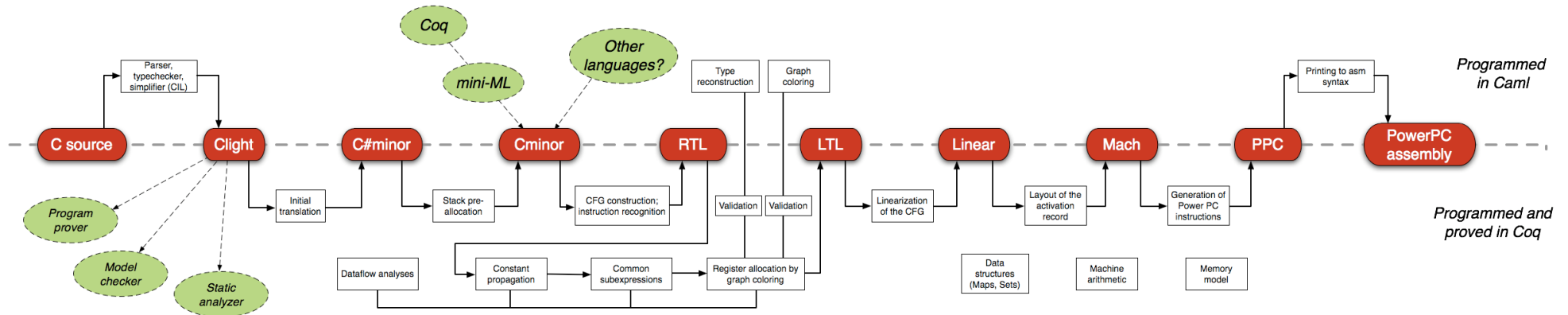
Deep specifications

# Deep specifications

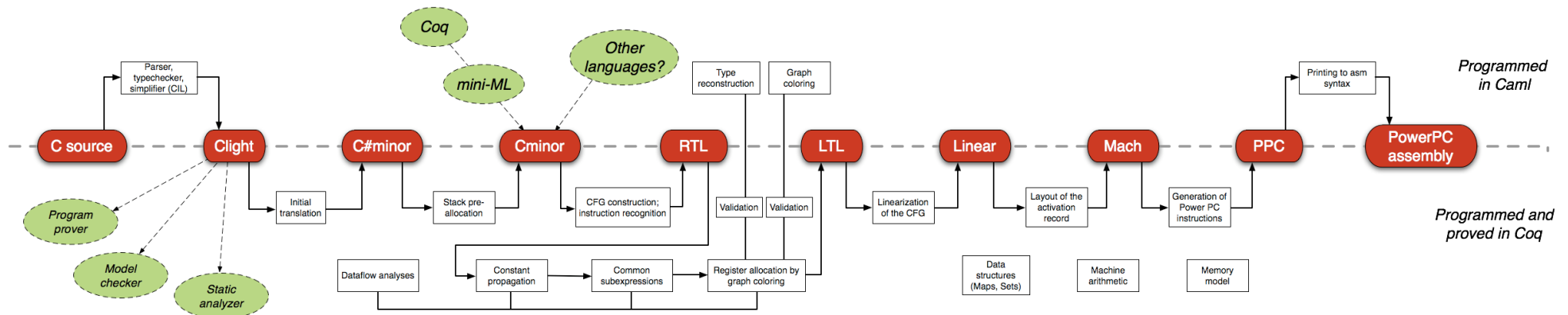
1. Rich
2. Formal
3. Integrated with code



# CompCert C compiler

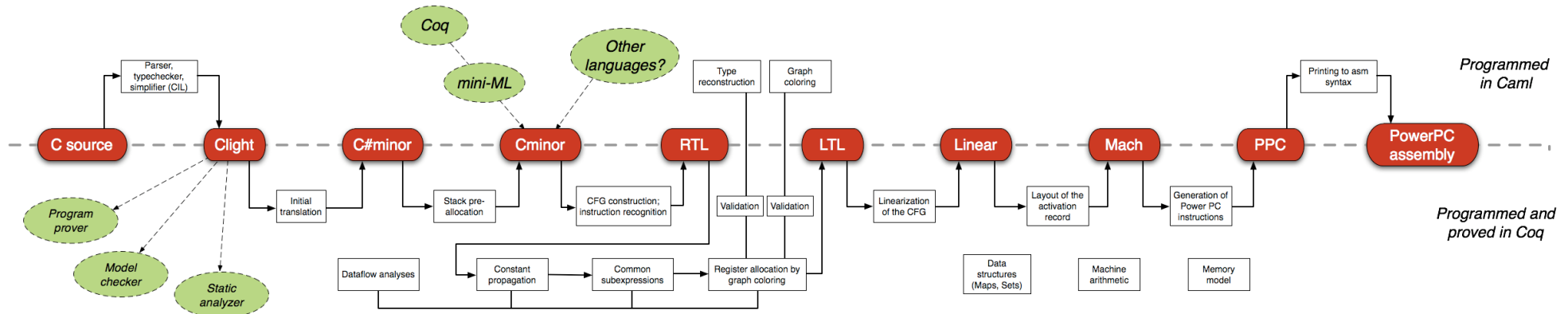


# CompCert C compiler



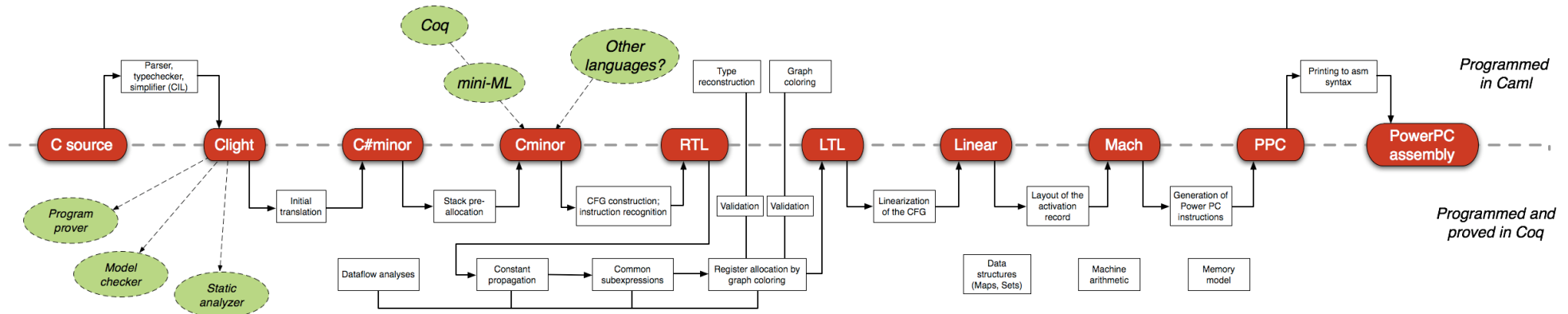
- Accepts most of the ISO C 99 language

# CompCert C compiler



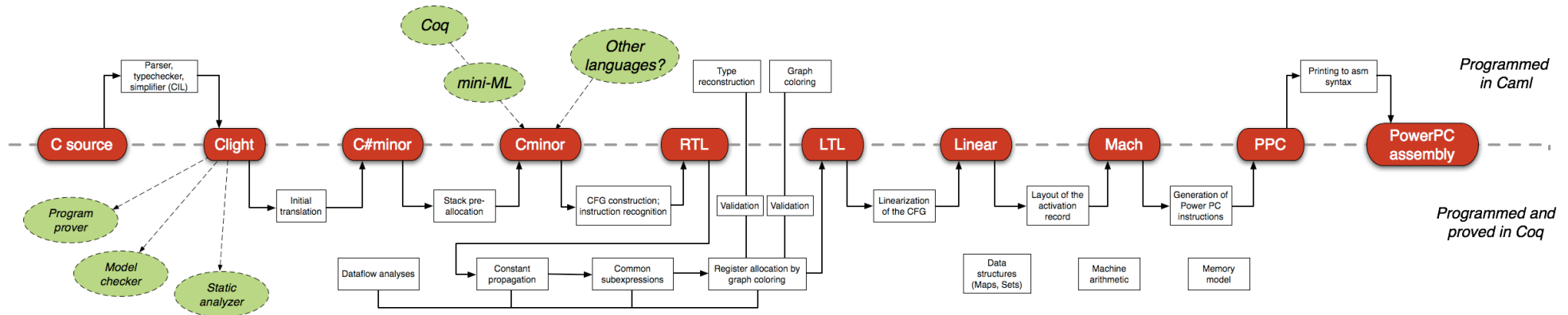
- Accepts most of the ISO C 99 language
- Produces machine code for PowerPC, ARM, and IA32 (x86 32-bit) architectures

# CompCert C compiler



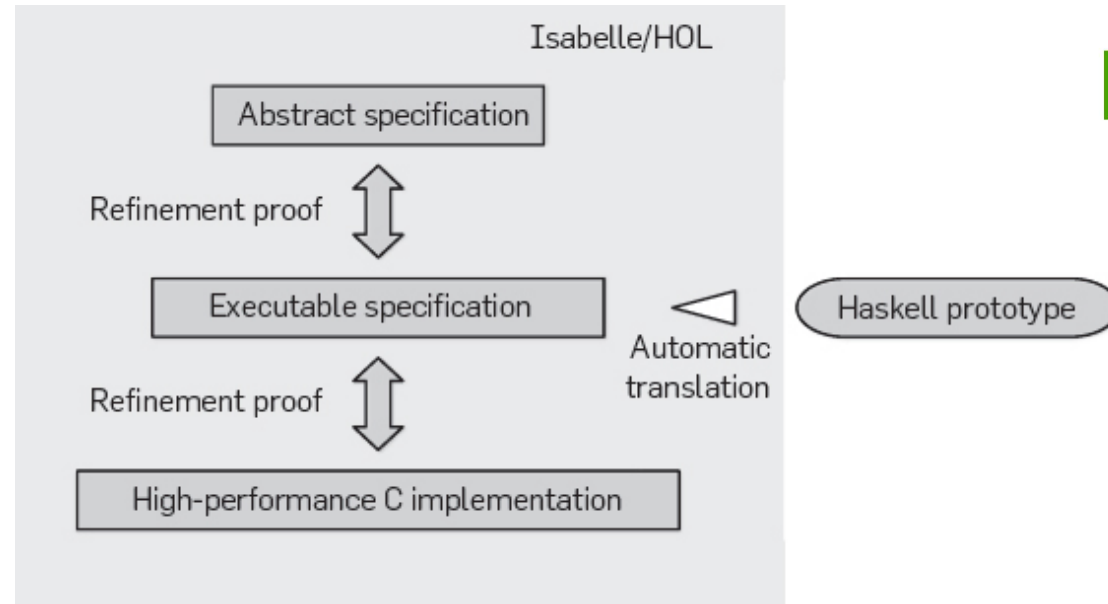
- Accepts most of the ISO C 99 language
- Produces machine code for PowerPC, ARM, and IA32 (x86 32-bit) architectures
- 90% of the performance of GCC (v4, opt. level 1)

# CompCert C compiler

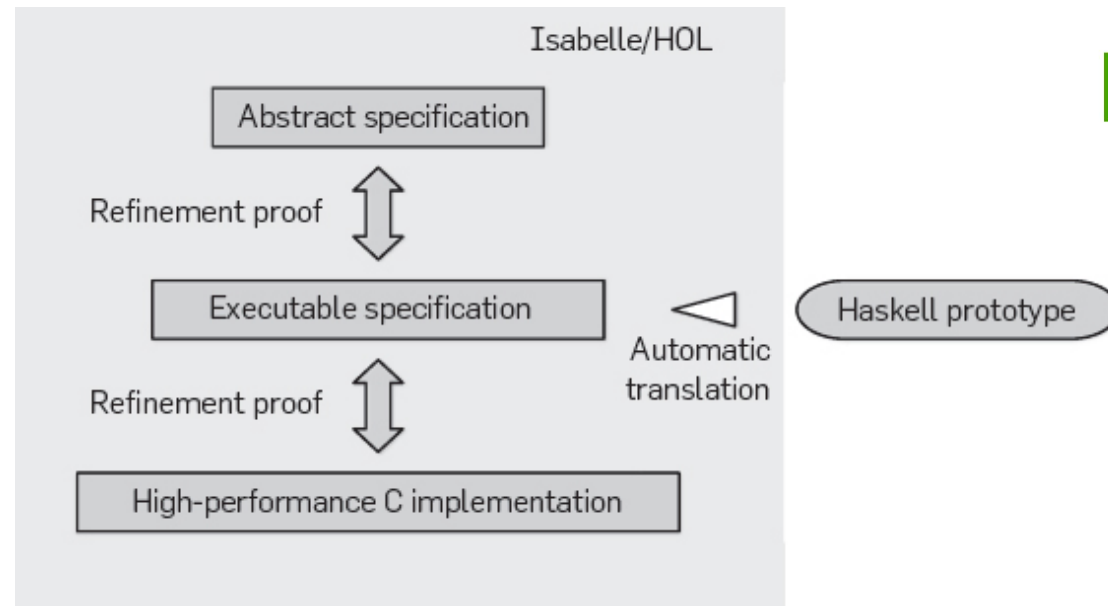


- Accepts most of the ISO C 99 language
- Produces machine code for PowerPC, ARM, and IA32 (x86 32-bit) architectures
- 90% of the performance of GCC (v4, opt. level 1)
- Fully verified

# seL4



# seL4



- Real-world operating-system kernel with an end-to-end proof of implementation correctness and security enforcement

# New tools

- Coq
- Isabelle
- ACL2
- ...

Powerful  
*proof assistants and  
program logics*

- F\*
- Dafny
- Boogie
- ...

*Mostly automatic verifiers  
based on SMT solvers*



# Formal verification of real software

- Verified compilers
  - CompCertTSO, CakeML, Bedrock,...
- Verified operating systems
  - CertiKOS, Ironclad Apps, Jitk, ...
- Verified filesystems
  - Fscq, ...
- Verified distributed systems
  - Verdi, ...
- Verified cryptographic algorithms and protocols
  - SHA, TLS, ...



What's happening  
now?

# What's happening now?



**Stephanie Weirich**  
University of Pennsylvania



**Steve Zdancewic**  
University of Pennsylvania



**Andrew Appel**  
Princeton

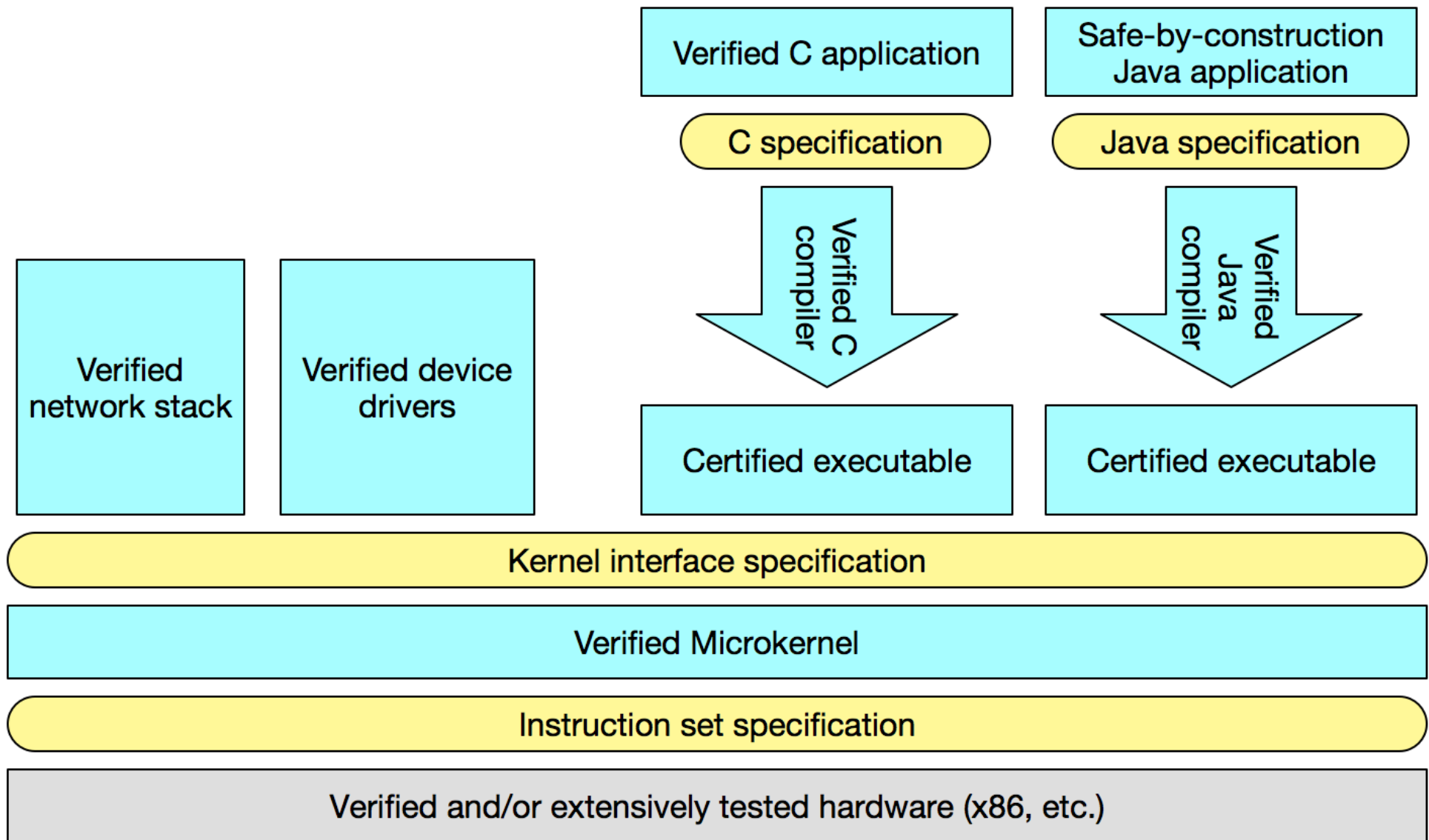


**Zhong Shao**  
Yale



**Adam Chlipala**  
MIT





*A zero-vulnerability software stack*

“But what if I don’t *want* to do formal verification?”

# Expressive type systems

## Classical type systems:

- Highly successful “lightweight formal methods”
- Designed into programming languages, not separate tools
- Limited expressiveness, but “always on” security types

## New developments:

- Component types / module systems
- Generalized abstract datatypes
- Session types
- Lightweight dependent types
- ...

“But what if I don’t  
*like types?*”





# Another way to use specifications

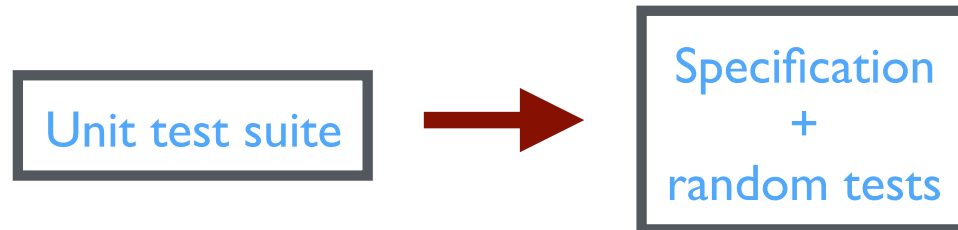
**Idea:** Use *random testing* to quickly check correspondence between systems and specs

- Good for debugging both code and spec!
- Pretty Good Assurance™ for cheap!

# Specification-based random testing

# Key ideas

- Write specification as a set of **executable** properties
- Generate many **random inputs** and check whether properties return True
- When a counterexample is found, “**shrink**” it to produce a minimal failing case



## Unit test suite

```
sort [1,2,3] => [1,2,3]
sort [3,2,1] => [1,2,3]
sort [] => []
sort [1] => [1]
sort [2,1,3,2] => [1,2,2,3]
...
```



## Specification

```
prop_ordered xs = ordered (sort xs)
  where ordered []      = True
        ordered [x]    = True
        ordered (x:y:xs) = x <= y && ordered (y:xs)

prop_permutation xs = permutation xs (sort xs)
  where permutation xs ys = null (xs \\ ys) && null (ys \\ xs)
```

## Unit test suite

```
sort [1,2,3] => [1,2,3]
sort [3,2,1] => [1,2,3]
sort [] => []
sort [1] => [1]
sort [2,1,3,2] => [1,2,2,3]
...
```



## Specification

```
( prop_ordered xs = ordered (sort xs)
  where ordered []      = True
        ordered [x]    = True
        ordered (x:y:xs) = x <= y && ordered (y:xs)

  prop_permutation xs = permutation xs (sort xs)
    where permutation xs ys = null (xs \\ ys) && null (ys \\ xs) )
```

# QuickCheck



1999—invented by Koen Claessen and John Hughes, for Haskell

2006—Quviq founded, marketing Erlang version

Many extensions, ports to many other languages (including `test.check` in **Clojure**! :-)

Finding deep bugs for Ericsson, Volvo Cars, Basho, etc...

# A Deep Specification for Dropbox

# A Deep Specification for Dropbox

with

John Hughes  
Thomas Arts

QuviQ AB





Why specify Dropbox?

## Many synchronization services...

- Dropbox, Google Drive, OneDrive, Owncloud, SpiderOak, Sugarsync, Box.net, Seafile, Pulse, Wuala, Teamdrive, Cloudme, Cx, Amazon cloud service, ...

## ...with *many* users...

- Dropbox: >400M
- Google Drive, MS OneDrive: >240M

...executing complex distributed algorithms over large amounts of precious data

Many synchronization services...

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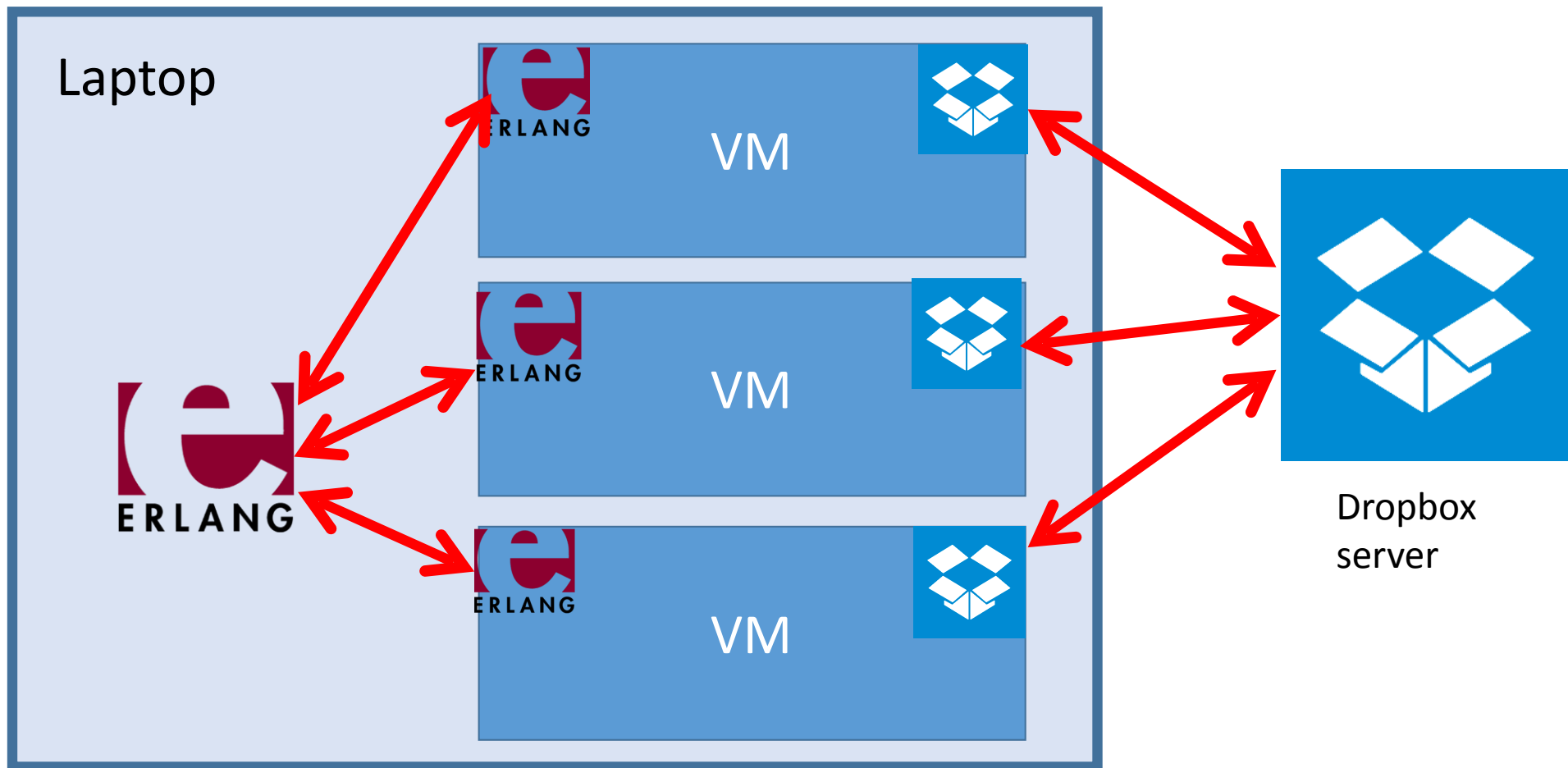
...executing complex distributed algorithms over large amounts of precious data

What could go wrong...?

# Goals

- Give a *precise specification* of the core behavior of a synchronization service
  - Phrased from the perspective of *users*
  - Applicable to a variety of different synchronizers
- *Validate* it against Dropbox's observed behavior
  - Using Erlang QuickCheck

# Test Setup





System  
under test

Model

Test = list of *operations*

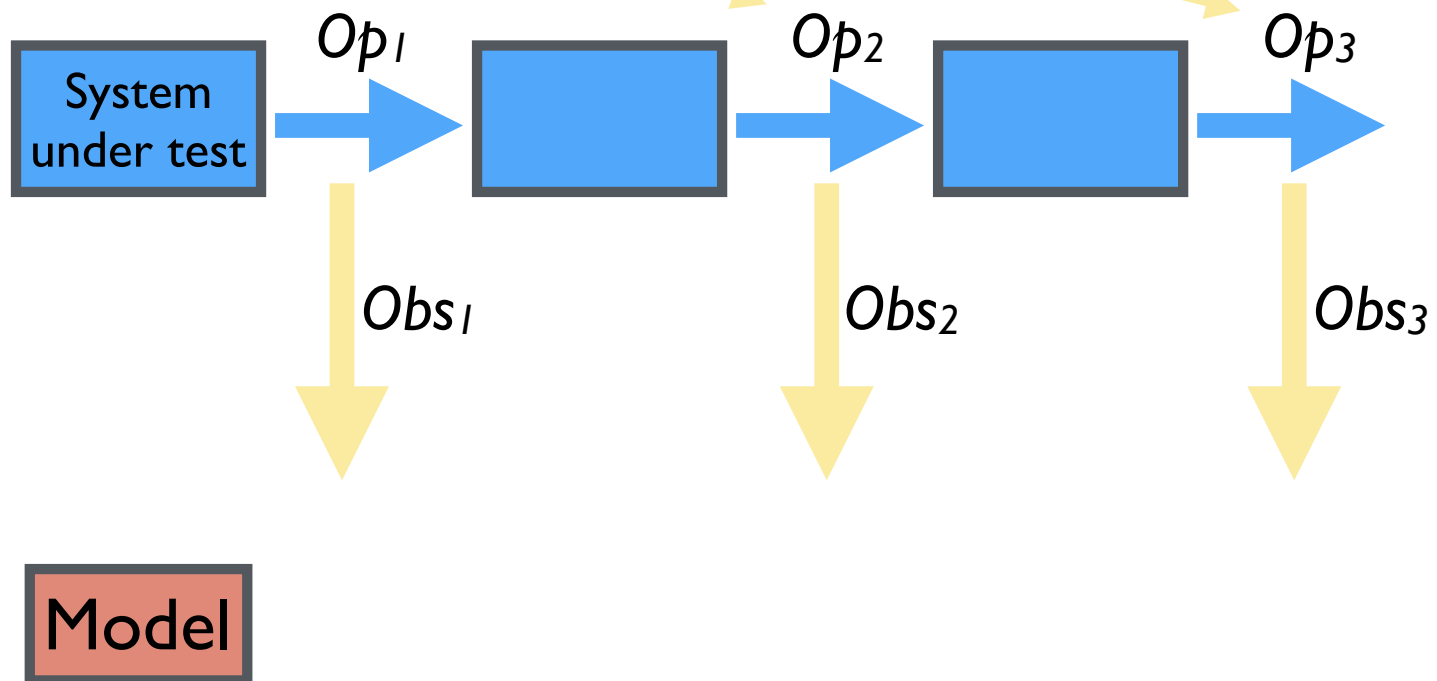


Model

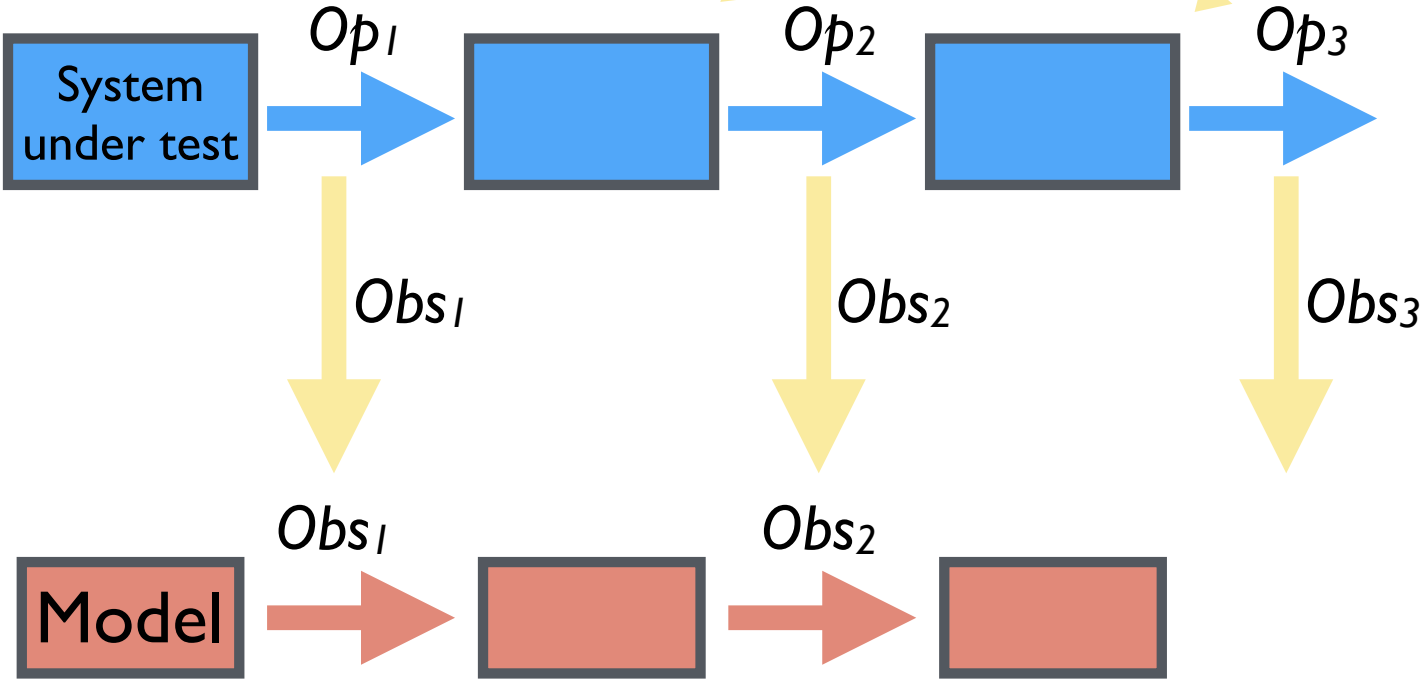


Test = list of *operations*

Each operation gives rise to an *observation*



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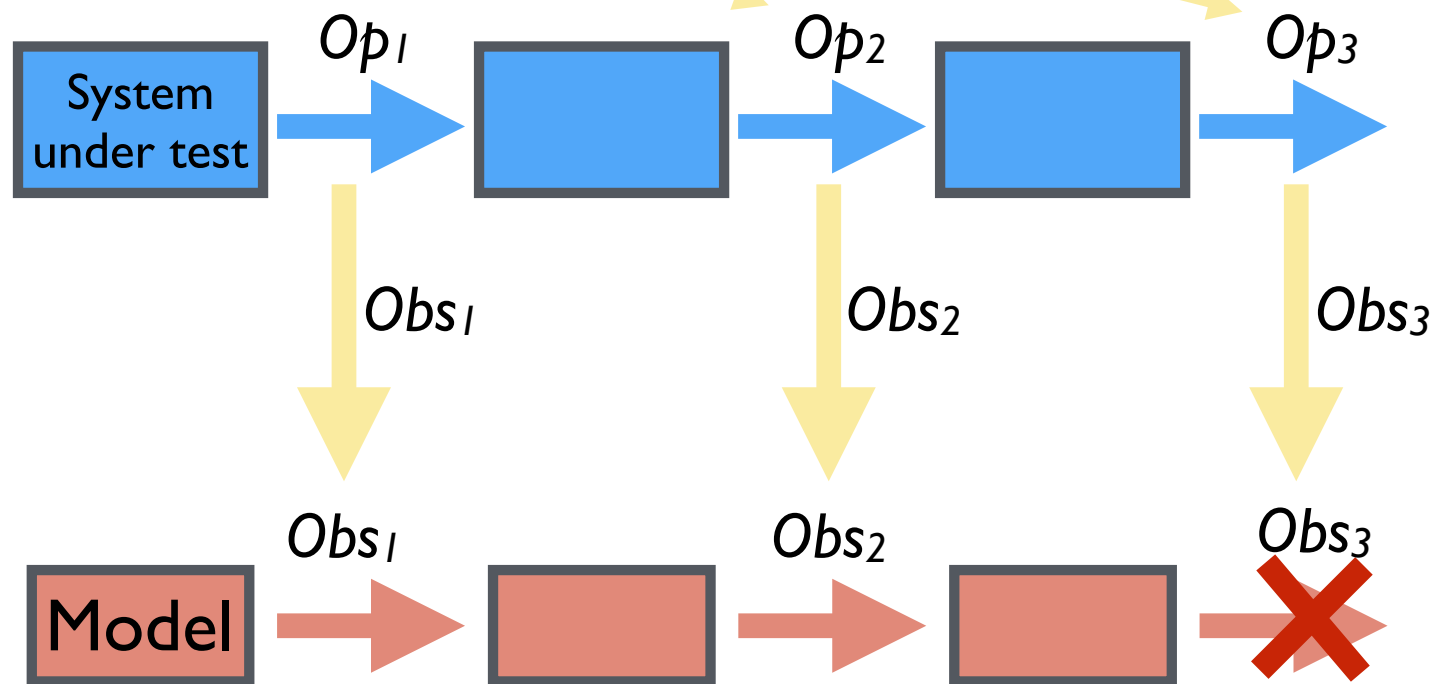
Each observation induces a *transition* from one *model state* to the next

Test = list of *operations*

Each operation gives rise to an *observation*

Each observation induces a *transition* from one *model state* to the next

A test *fails* when the model admits no transition validating some observation we've made



# Basic Specification

If  $Op_1 \dots Op_n$  is some sequence of operations and  $Obs_1 \dots Obs_n$  are the observations we make when we run them, then



is a valid sequence of transitions of the model.

**“What operations and  
observations do we  
need?”**

First try...

First try...

Operations	Observations
$\text{READ}_N$	$\text{READ}_N \rightarrow \text{"current value"}$

First try...

Operations	Observations
$\text{READ}_N$	$\text{READ}_N \rightarrow \text{“current value”}$
$\text{WRITE}_N (\text{“new value”})$	$\text{WRITE}_N (\text{“new value”}) \rightarrow \text{“old value”}$



## First try...

Operations	Observations
$\text{READ}_N$	$\text{READ}_N \rightarrow \text{"current value"}$
$\text{WRITE}_N (\text{"new value"})$	$\text{WRITE}_N (\text{"new value"}) \rightarrow \text{"old value"}$

Use special value  $\perp$  for “no file”

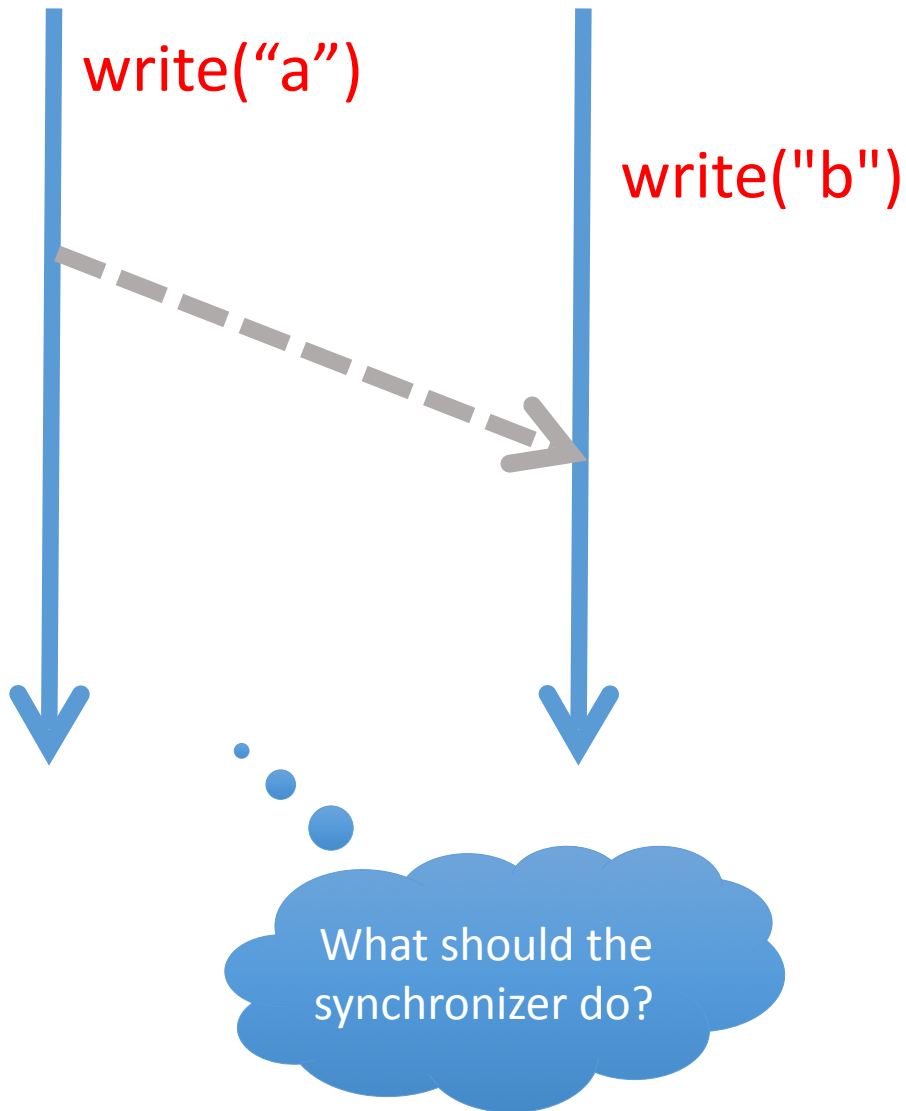
$\text{READ}_N \rightarrow \perp$

$\text{WRITE}_N (\perp)$

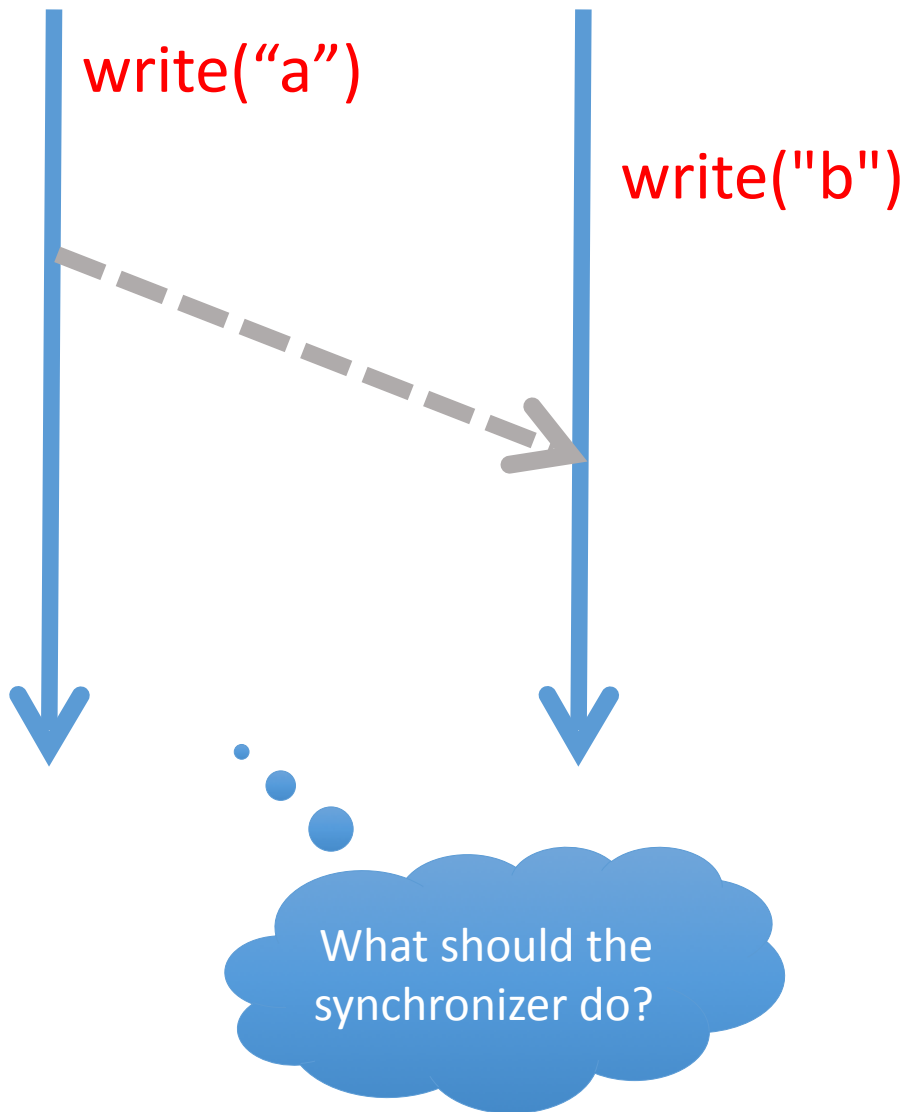
means that the file is missing

means delete the file

# Challenge #1: conflicts



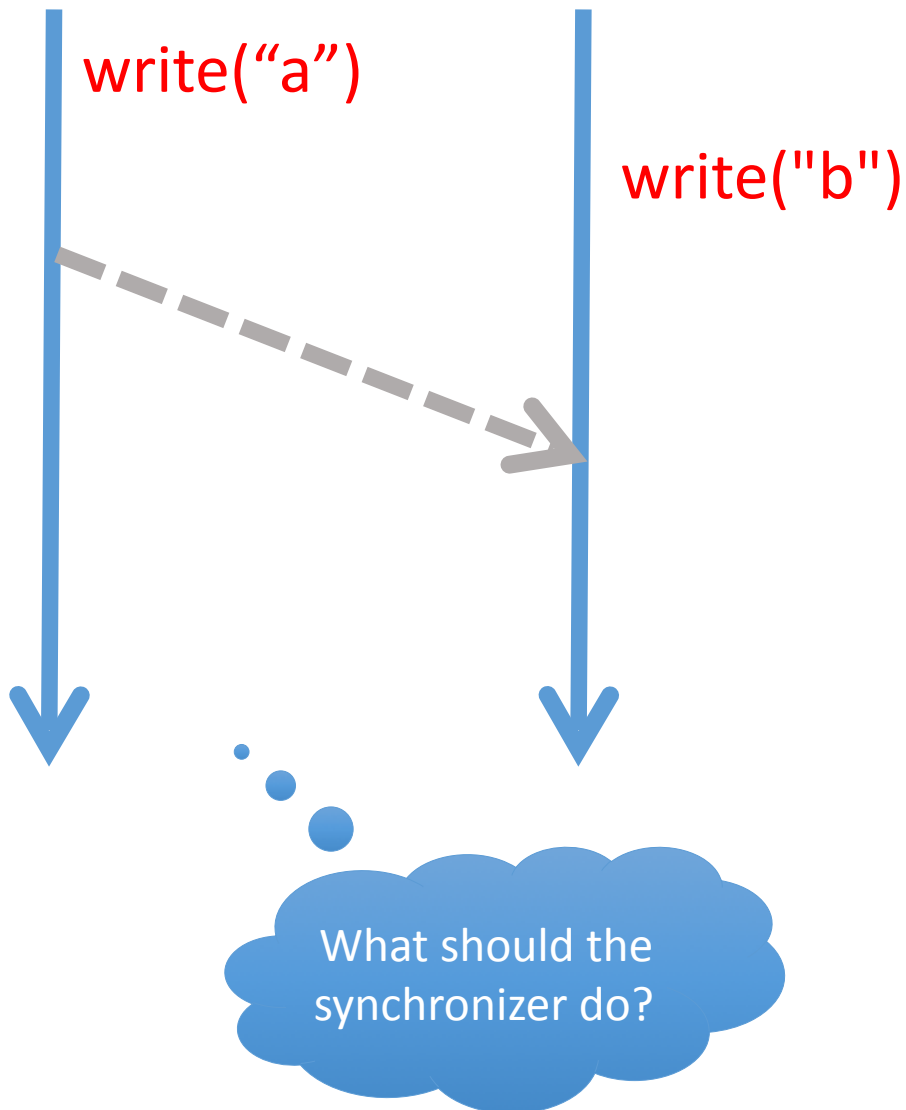
# Challenge #1: conflicts



Dropbox's answer:

The "earlier" value wins;  
other values are moved to  
*conflict files* in the same  
directory.

# Challenge #1: conflicts



Dropbox's answer:

The “earlier” value wins;  
other values are moved to  
*conflict files* in the same  
directory.

**However**, these conflict files  
may not appear for a little  
while!

## Second try...

Operations	Observations
$\text{READ}_N$	$\text{READ}_N \rightarrow \text{"current value"}$
$\text{WRITE}_N (\text{"new value"})$	$\text{WRITE}_N (\text{"new value"}) \rightarrow \text{"old value"}$
STABILIZE	$\text{STABILIZE} \rightarrow (\text{"value"}, \{\text{"conflict values"}\})$

## Second try...

Operations	Observations
$\text{READ}_N$	$\text{READ}_N \rightarrow \text{"current value"}$
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*Same value in the file on all clients*




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$\text{READ}_N$	$\text{READ}_N \rightarrow \text{"current value"}$
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STABILIZE	$\text{STABILIZE} \rightarrow (\text{"value"}, \{\text{"conflict values"}\})$



*Same value in the file on all clients*



*Same set of values in conflict files on all clients*

# Challenge #2: Background operations

- The Dropbox client communicates with the test harness by observing what it writes to the filesystem.

But...

- The Dropbox client *also* communicates with the Dropbox servers!
  - Timing of these communications is unpredictable



# Challenge #2: Background operations

- The Dropbox client communicates with the test harness by observing what it writes to the filesystem.

But...

- The Dropbox client *also* communicates with the Dropbox servers!
  - Timing of these communications is unpredictable

Invisible, unpredictable activity → Nondeterminism!

# Approach

- Model the whole system state *including the (invisible) state of the server*
- Add "conjectured actions" to the observed ones

$UP_N$	node $N$ uploads its value to the server
$DOWN_N$	node $N$ is refreshed by the server

## Final version:

Operations	Observations
$\text{READ}_N$	$\text{READ}_N \rightarrow \text{“current value”}$
$\text{WRITE}_N (\text{“new value”})$	$\text{WRITE}_N (\text{“new value”}) \rightarrow \text{“old value”}$
STABILIZE	$\text{STABILIZE} \rightarrow (\text{“value”}, \{\text{“conflict values”}\})$
	$\text{UP}_N$
	$\text{DOWN}_N$

For example...

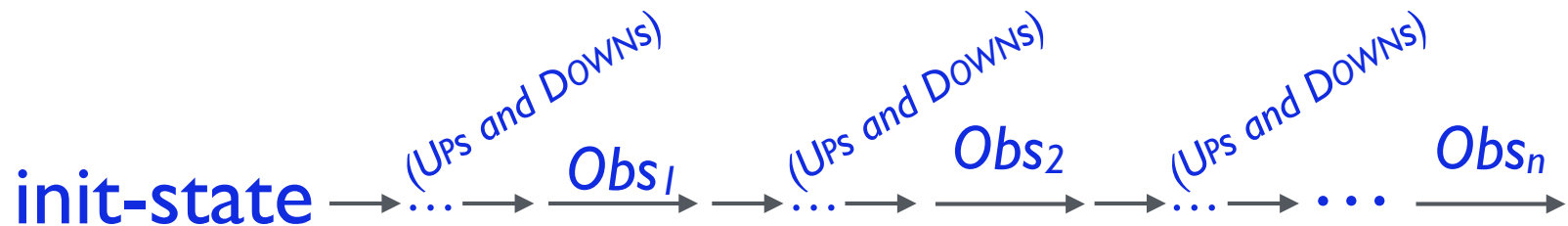
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STABILIZE	$\text{STABILIZE} \rightarrow (\text{"value"}, \{\text{"conflict values"}\})$
	$\text{UP}_N$
	$\text{DOWN}_N$

For example...

# Final specification

If  $Op_1 \dots Op_n$  is some sequence of operations and  $Obs_1 \dots Obs_n$  are the observations we make when we run them, then we can add UP/DOWN “observations” to yield an *explanation* such that



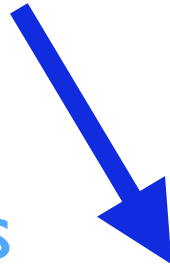
is a valid sequence of transitions of the model.

## Test

Client 1	Client 2
WRITE 'a'	WRITE 'b'
READ	WRITE 'c'
STABILIZE	

## Test

Client 1	Client 2
WRITE 'a'	WRITE 'b'
READ	WRITE 'c'
STABILIZE	



## Observations

Client 1	Client 2
WRITE 'a' $\rightarrow \perp$	WRITE 'b' $\rightarrow$ 'a'
READ $\rightarrow$ 'b'	WRITE 'c' $\rightarrow$ 'b'
STABILIZE $\rightarrow$ ('c', $\emptyset$ )	

## Test

Client 1	Client 2
WRITE 'a'	WRITE 'b'
READ	WRITE 'c'
STABILIZE	

## Explanation

Client 1	Client 2
WRITE 'a' $\rightarrow \perp$ Up	DOWN WRITE 'b' $\rightarrow$ 'a' Up
DOWN	WRITE 'c' $\rightarrow$ 'b' Up
READ $\rightarrow$ 'b' DOWN	
STABILIZE $\rightarrow$ ('c', $\emptyset$ )	

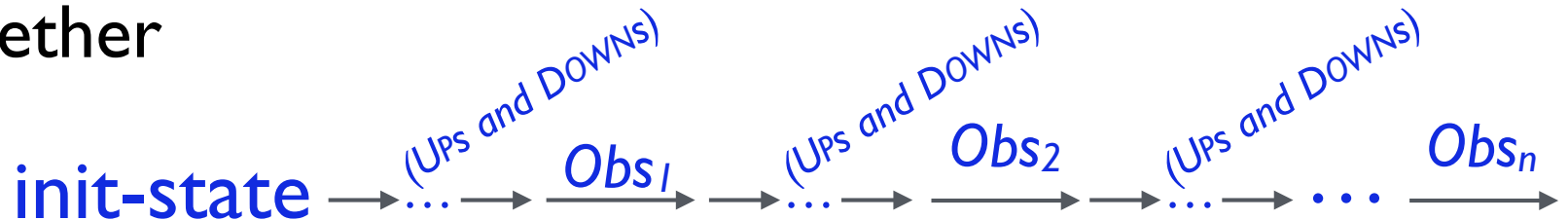
## Observations

Client 1	Client 2
WRITE 'a' $\rightarrow \perp$ READ $\rightarrow$ 'b'	WRITE 'b' $\rightarrow$ 'a' WRITE 'c' $\rightarrow$ 'b'
STABILIZE $\rightarrow$ ('c', $\emptyset$ )	



# Using the specification for testing

1. Generate a random sequence of operations  $Op_1 \dots Op_n$
2. Apply them to the system under test, yielding observations  $Obs_1 \dots Obs_n$
3. Calculate *all* ways of interleaving Up and Down observations with  $Obs_1 \dots Obs_n$  and, for each one, check whether



is a valid sequence of transitions of the model

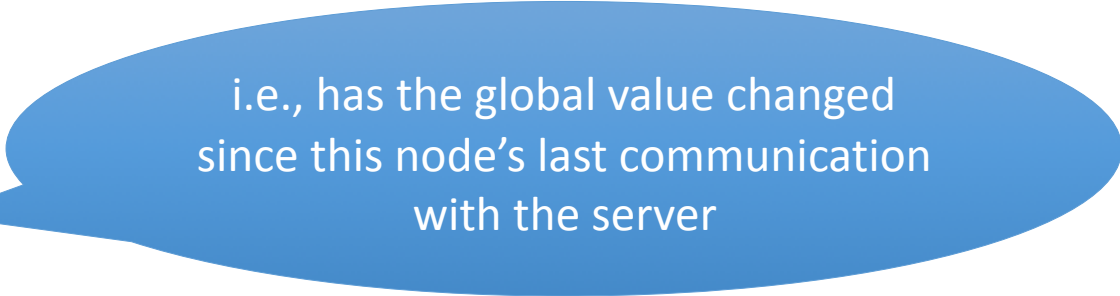
4. If the answer is “no” for every possible interleaving, we have found a failing test; otherwise, repeat

# Model states

- *Stable value* (i.e., the one on the server)
- *Conflict set* (only ever grows)
- For each node:
  - Current *local value*
  - "FRESH" or "STALE"
  - "CLEAN" or "DIRTY"

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i.e., has the global value changed since this node's last communication with the server

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- For each node:
  - Current *local value*
  - "FRESH" or "STALE"
  - "CLEAN" or "DIRTY"

i.e., has the global value changed since this node's last communication with the server

i.e., has the local value been written since this node was last refreshed by the server

# Modeling the operations

**READ**  $\rightarrow V$

*Precondition:*  $LocalVal_N = V$

*Effect:* none

**WRITE**  $V_{new} \rightarrow V_{old}$

*Precondition:*  $LocalVal_N = V_{old}$

*Effect:*  $LocalVal_N \leftarrow V_{new}$

$Clean?_N \leftarrow \text{DIRTY}$

# Modeling the operations

STABILIZE  $\rightarrow (V, C)$

*Precondition:*  $ServerVal = V$

$Conflicts = C$

for all  $N$ ,  $Fresh?_N = \text{FRESH}$

$Clean?_N = \text{CLEAN}$

*Effect:* none

# Modeling the operations

DOWN

*Precondition:*  $Fresh?_N = \text{STALE}$

$Clean?_N = \text{CLEAN}$

*Effect:*  $LocalVal_N \leftarrow ServerVal$

$Fresh?_N \leftarrow \text{FRESH}$

# Modeling the operations

UP

*Precondition:*  $Clean?_N = \text{DIRTY}$

*Effect:*  $Clean?_N \leftarrow \text{CLEAN}$

if  $Fresh?_N = \text{FRESH}$  then

if  $LocalVal_N \neq ServerVal$  then

$Fresh?_{N'} \leftarrow \text{STALE}$  for all  $N' \neq N$

$ServerVal \leftarrow LocalVal_N$

else

if  $LocalVal_N \notin \{ServerVal, \perp\}$  then

$Conflicts \leftarrow Conflicts \cup \{LocalVal_N\}$



Surprises...

**Surprise:** Dropbox can (briefly) delete a newly created file...

Client 1	Client 2
WRITE 'a' $\rightarrow \perp$ WRITE $\perp \rightarrow$ 'a'  WRITE 'c' $\rightarrow \perp$ READ $\rightarrow \perp$	WRITE 'b' $\rightarrow$ 'a'

**Surprise:** Dropbox can (briefly) delete a newly created file...

Create file

Client 1	Client 2
WRITE 'a' $\rightarrow \perp$ WRITE $\perp \rightarrow$ 'a'  WRITE 'c' $\rightarrow \perp$ READ $\rightarrow \perp$	WRITE 'b' $\rightarrow$ 'a'

**Surprise:** Dropbox can (briefly) delete a newly created file...

Create file  
Delete it

Client 1	Client 2
WRITE 'a' $\rightarrow \perp$ WRITE $\perp \rightarrow$ 'a'  WRITE 'c' $\rightarrow \perp$ READ $\rightarrow \perp$	WRITE 'b' $\rightarrow$ 'a'

**Surprise:** Dropbox can (briefly) delete a newly created file...

Create file Delete it	Client 1	Client 2	Observe creation
	WRITE 'a' $\rightarrow \perp$ WRITE $\perp \rightarrow$ 'a'  WRITE 'c' $\rightarrow \perp$ READ $\rightarrow \perp$	WRITE 'b' $\rightarrow$ 'a'	

**Surprise:** Dropbox can (briefly) delete a newly created file...

Create file  
Delete it

Client 1

WRITE 'a'  $\rightarrow$   $\perp$   
WRITE  $\perp \rightarrow$  'a'

WRITE 'c'  $\rightarrow$   $\perp$   
READ  $\rightarrow$   $\perp$

Client 2

WRITE 'b'  $\rightarrow$  'a'

Observe  
creation

Create it again

**Surprise:** Dropbox can (briefly) delete a newly created file...

Create file  
Delete it

Client 1

WRITE 'a'  $\rightarrow$   $\perp$   
WRITE  $\perp \rightarrow$  'a'

WRITE 'c'  $\rightarrow$   $\perp$   
READ  $\rightarrow$   $\perp$

Client 2

WRITE 'b'  $\rightarrow$  'a'

Observe  
creation

Create it again  
File is gone!

**Surprise:** Dropbox can (briefly) delete a newly created file...

	Client 1	Client 2	
Create file Delete it	WRITE 'a' $\rightarrow \perp$ WRITE $\perp \rightarrow$ 'a'	WRITE 'b' $\rightarrow$ 'a'	Observe creation
Create it again File is gone!	WRITE 'c' $\rightarrow \perp$ READ $\rightarrow \perp$		

Timing is critical!



**Surprise:** Dropbox can (briefly) delete a newly created file...

Create file  
Delete it

Client 1

WRITE 'a'  $\rightarrow \perp$   
WRITE  $\perp \rightarrow$  'a'

WRITE 'c'  $\rightarrow \perp$   
READ  $\rightarrow \perp$

Client 2

WRITE 'b'  $\rightarrow$  'a'

Observe  
creation

Create it again  
File is gone!

Timing is critical!



Add **SLEEP** operations  
in tests

**Surprise:** Dropbox can (permanently)  
re-create a deleted file...

Client 1
WRITE 'b' $\rightarrow$ $\perp$
WRITE $\perp \rightarrow$ 'b'
READ $\rightarrow$ 'b'

(other clients idle)

**Surprise:** Dropbox can (permanently)  
re-create a deleted file...

Create file

Client 1
WRITE 'b' $\rightarrow$ $\perp$ WRITE $\perp \rightarrow$ 'b' READ $\rightarrow$ 'b'

(other clients idle)

**Surprise:** Dropbox can (permanently)  
re-create a deleted file...

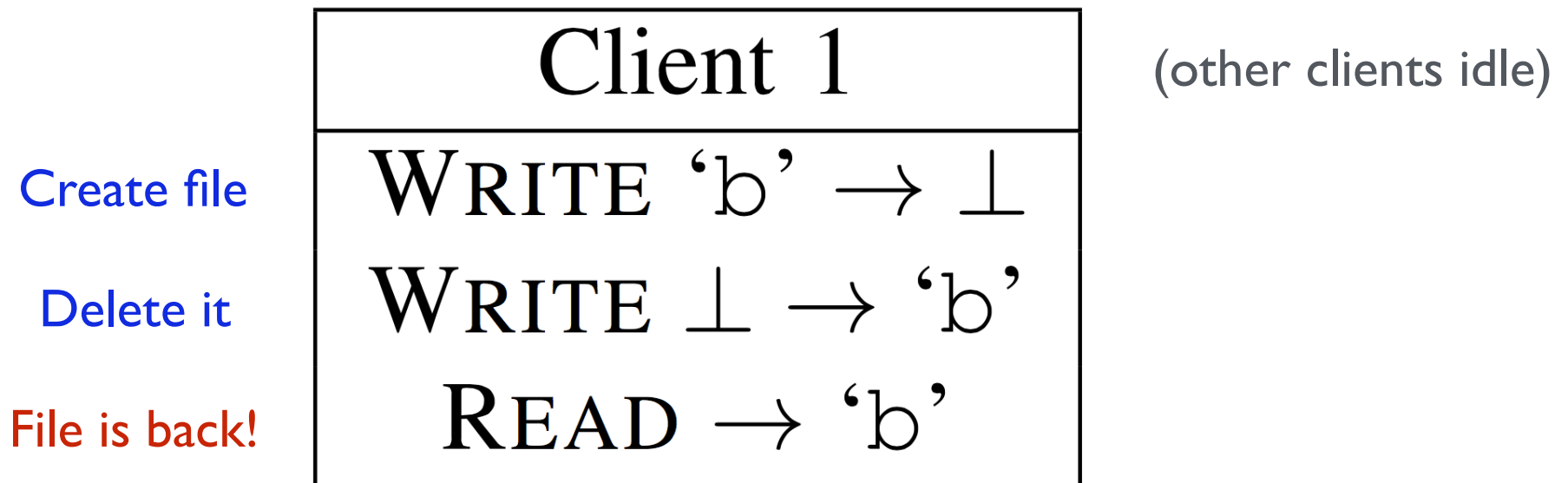
Create file

Delete it

Client 1
WRITE 'b' $\rightarrow$ $\perp$
WRITE $\perp \rightarrow$ 'b'
READ $\rightarrow$ 'b'

(other clients idle)

**Surprise:** Dropbox can (permanently)  
re-create a deleted file...



(Again, timing is critical)

# Surprise: Dropbox can lose data

Client 1	Client 2
WRITE 'a' $\rightarrow$ 'b' READ $\rightarrow$ 'a'	WRITE 'b' $\rightarrow \perp$
STABILIZE $\rightarrow$ $\{ ('a', \emptyset), ('b', \emptyset) \}$	

# Surprise: Dropbox can lose data

Client 1	Client 2
WRITE 'a' $\rightarrow$ 'b' READ $\rightarrow$ 'a'	WRITE 'b' $\rightarrow \perp$
STABILIZE $\rightarrow$ $\{ ('a', \emptyset), ('b', \emptyset) \}$	

Create file

# Surprise: Dropbox can lose data

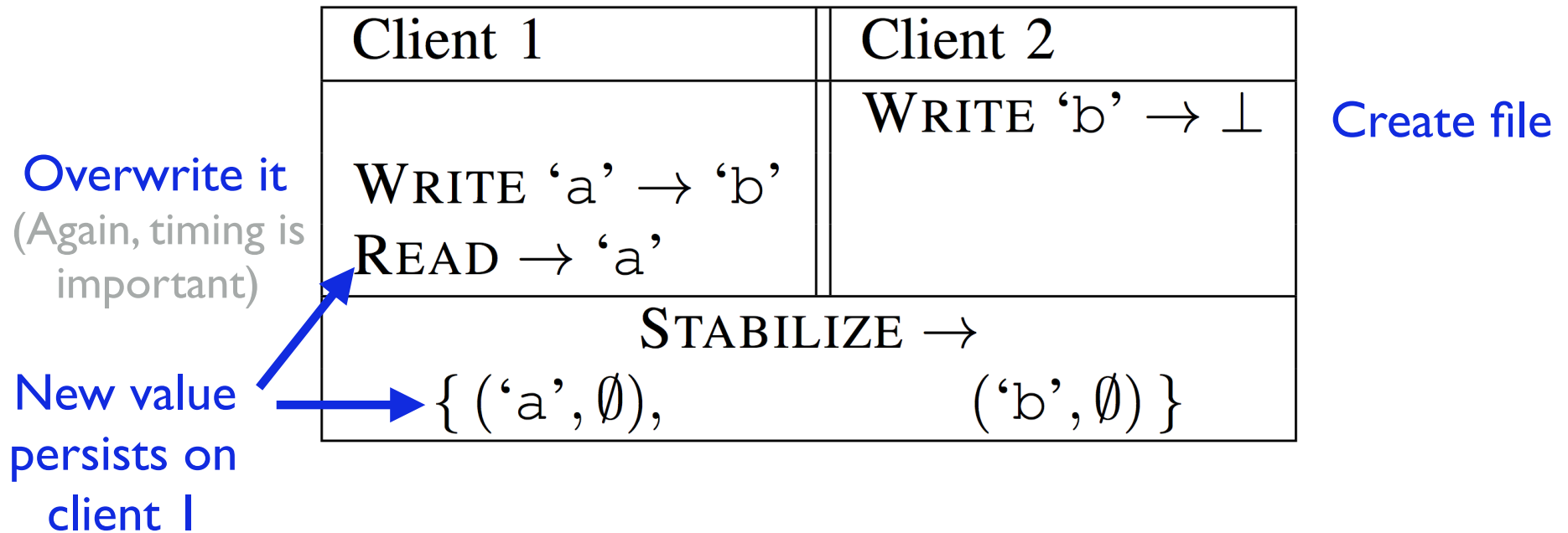
Overwrite it  
(Again, timing is  
important)

Client 1	Client 2
WRITE 'a' $\rightarrow$ 'b' READ $\rightarrow$ 'a'	WRITE 'b' $\rightarrow \perp$
STABILIZE $\rightarrow$ $\{ ('a', \emptyset), ('b', \emptyset) \}$	

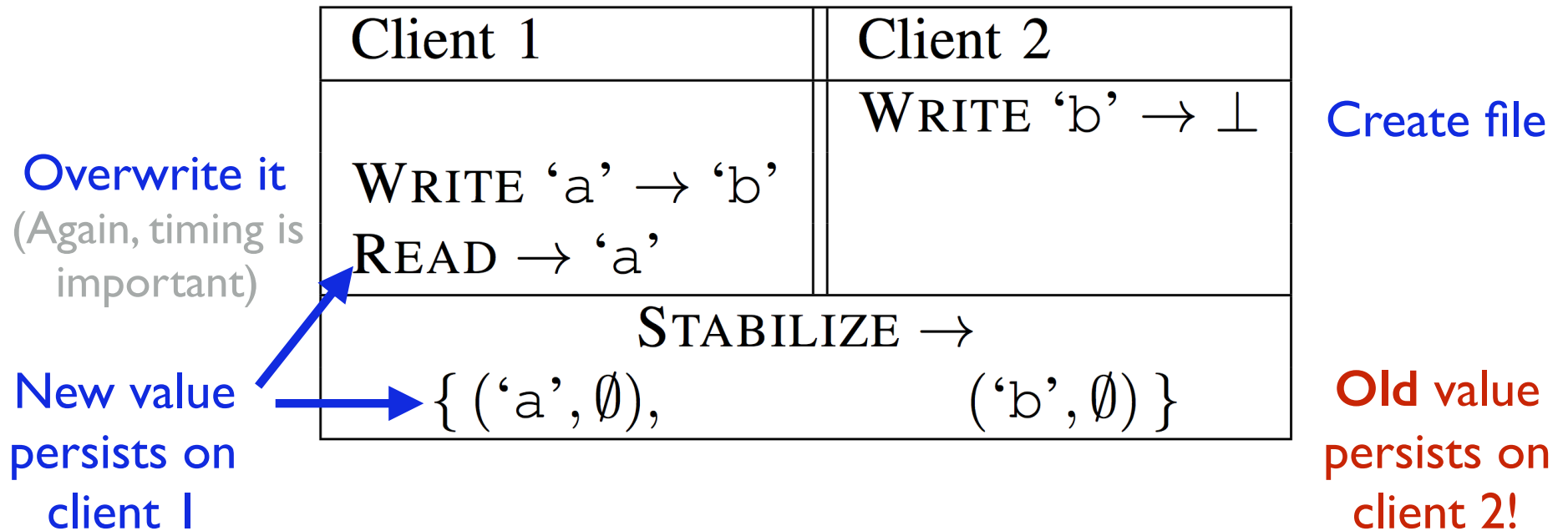
Create file



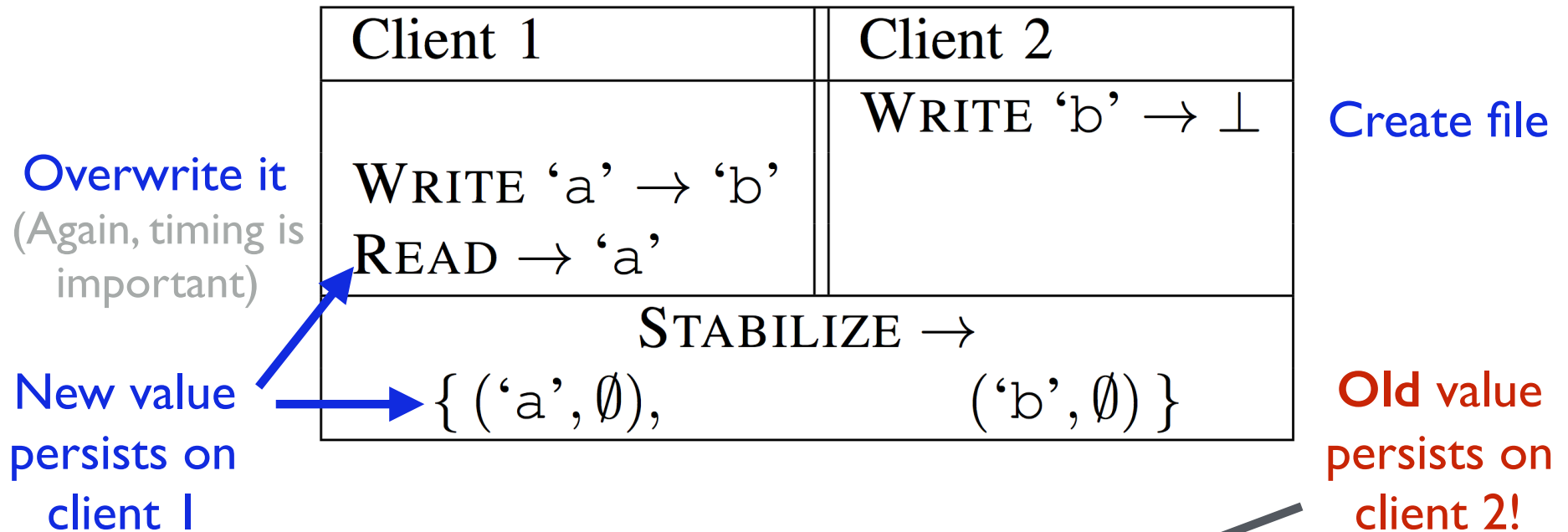
# Surprise: Dropbox can lose data



# Surprise: Dropbox can lose data



# Surprise: Dropbox can lose data



Client 1 believes it is still Fresh, so if we later write a new value on client 2, it will silently overwrite client 1's value and no conflict file will be created

# Work in progress!

- More details:
  - [Draft paper](#) available from my webpage
- Next steps:
  - Add directories
  - Test your favorite synchronizer :-)

# Thank you!

(Any questions?)

