

# Auditing Outsourced Services

Cheng Tan

Courant Institute, New York University

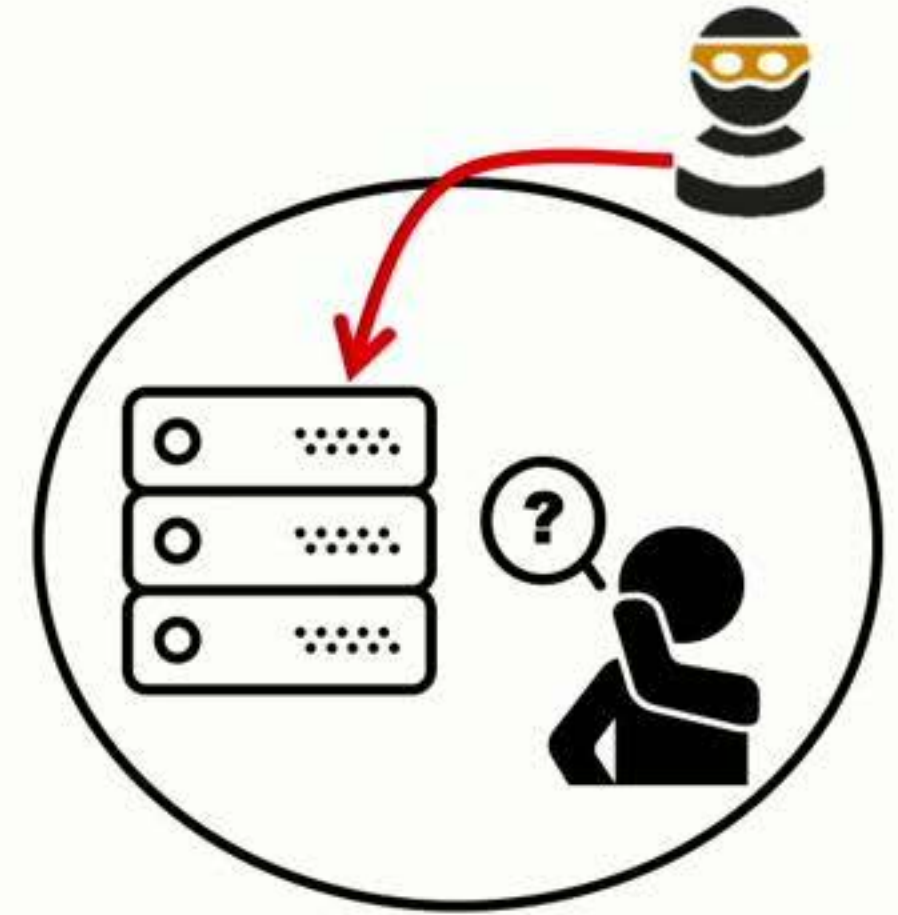
[chengtan@cs.nyu.edu](mailto:chengtan@cs.nyu.edu)



Does my remote service  
behave as promised?



Are there unexpected  
internal failures?



Are there  
external attacks?

# Remote servers (clouds) make mistakes

- bugs:
- misconfigs:
- ...

**threat**  **Dangerous Kubernetes Bugs Allow Authentication Bypass, DoS**



**Security misconfigurations:  
Code for human error**



# Remote servers (clouds) make mistakes

**threat** **post** **Dangerous Kubernetes Bugs Allow Authentication Bypass, DoS**

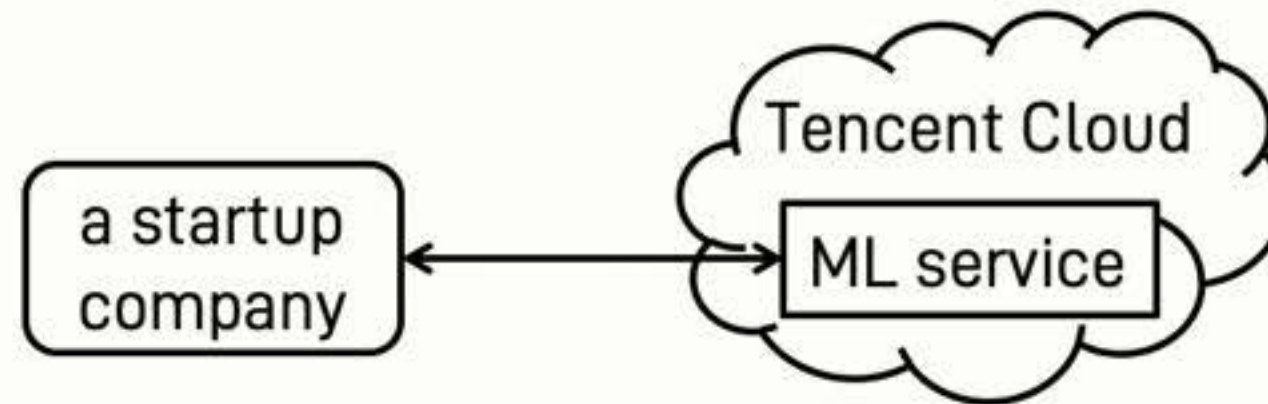
- bugs:
- misconfigs:
- untrusted cloud:



**Security misconfigurations:  
Code for human error**



**Tencent Cloud denies technical attack against rival**



# Remote servers (clouds) make mistakes

**threat** **post** **Dangerous Kubernetes Bugs Allow Authentication Bypass, DoS**

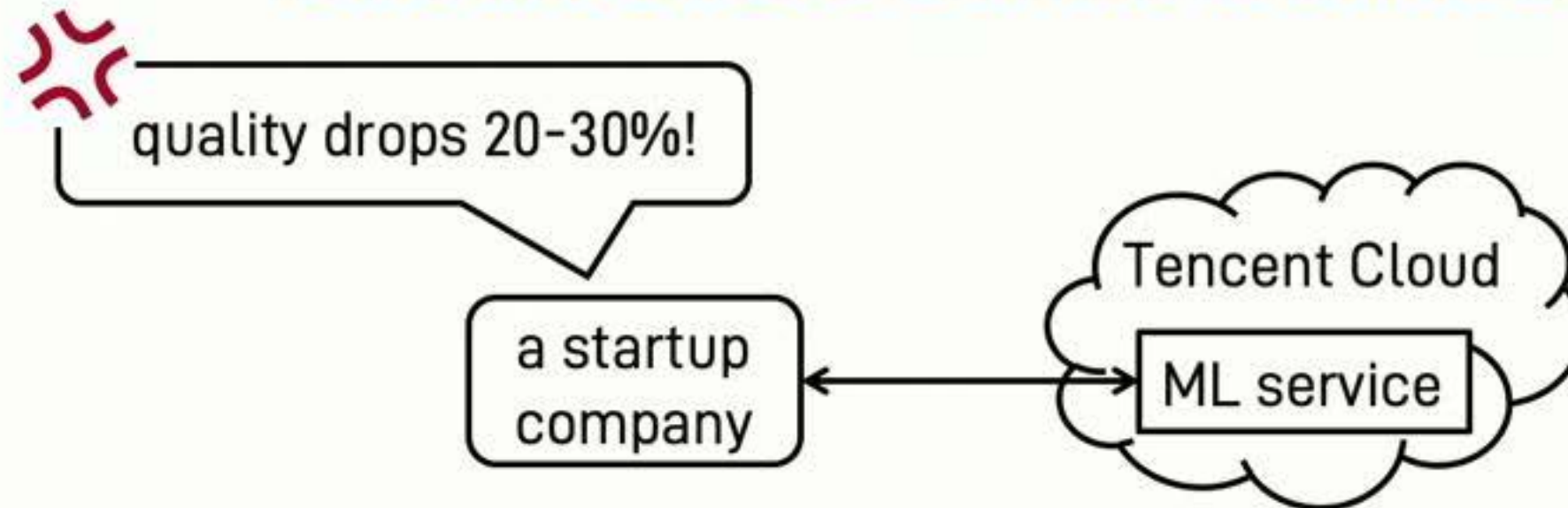
- bugs:
- misconfigs:
- untrusted cloud:



**Security misconfigurations:  
Code for human error**



**Tencent Cloud denies technical attack against rival**





# Remote servers (clouds) make mistakes

**threat** **post** **Dangerous Kubernetes Bugs Allow Authentication Bypass, DoS**

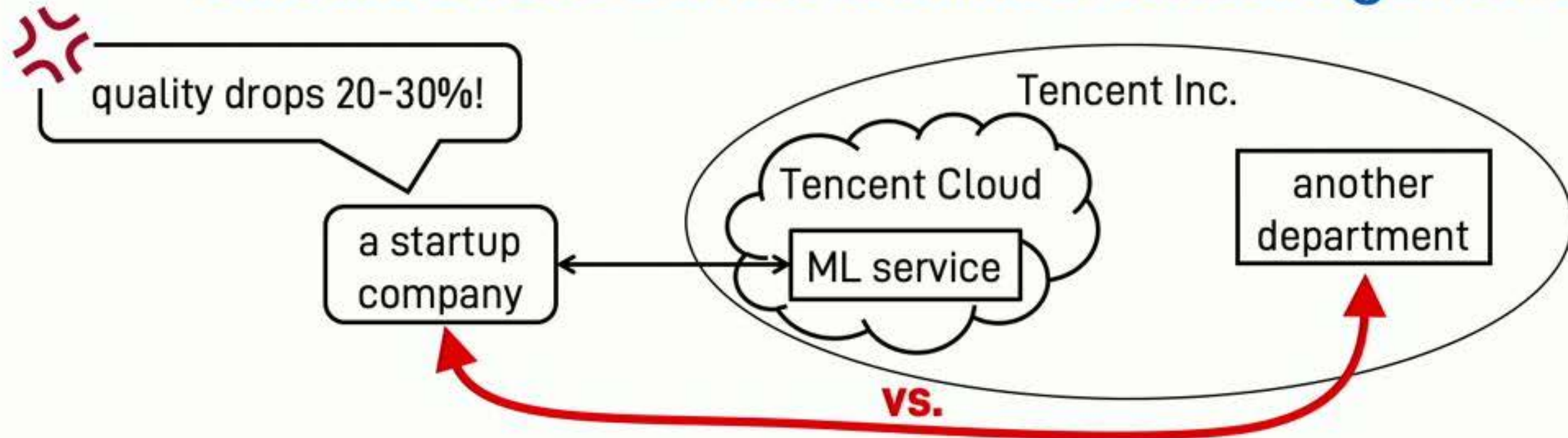
- bugs:
- misconfigs:
- untrusted cloud:



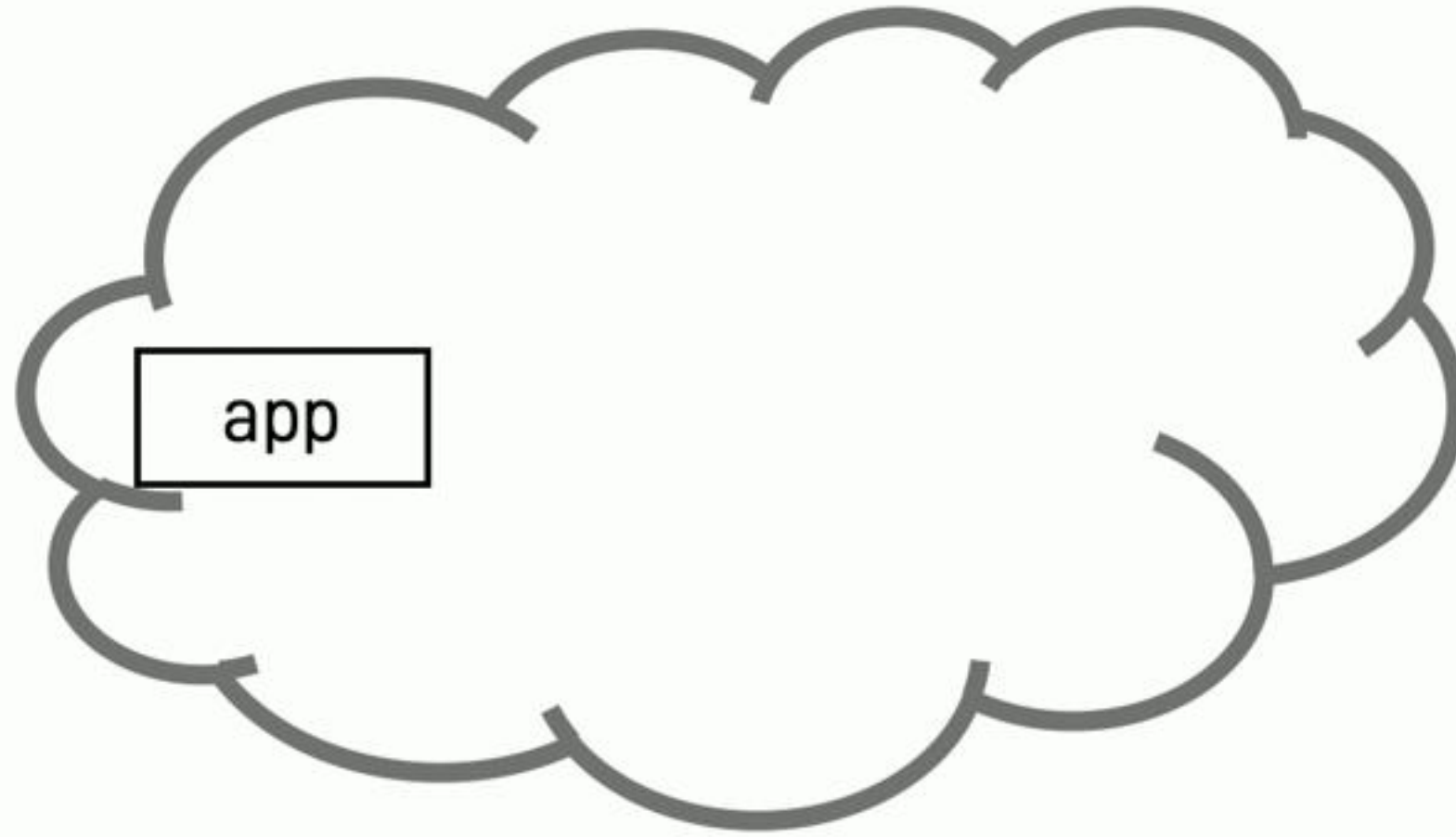
**Security misconfigurations:  
Code for human error**



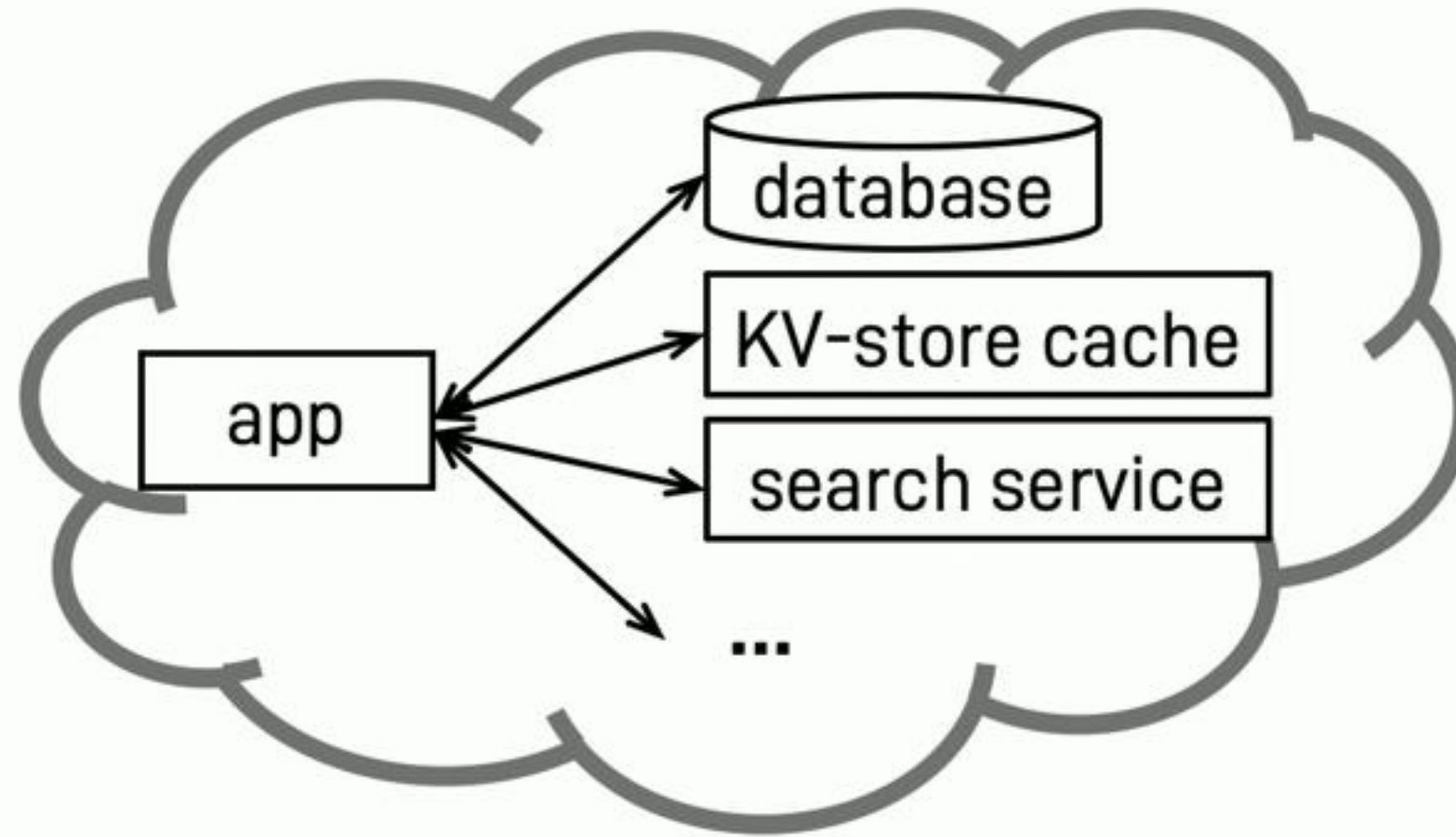
**Tencent Cloud denies technical attack against rival**



# Verify outsourced services with systems

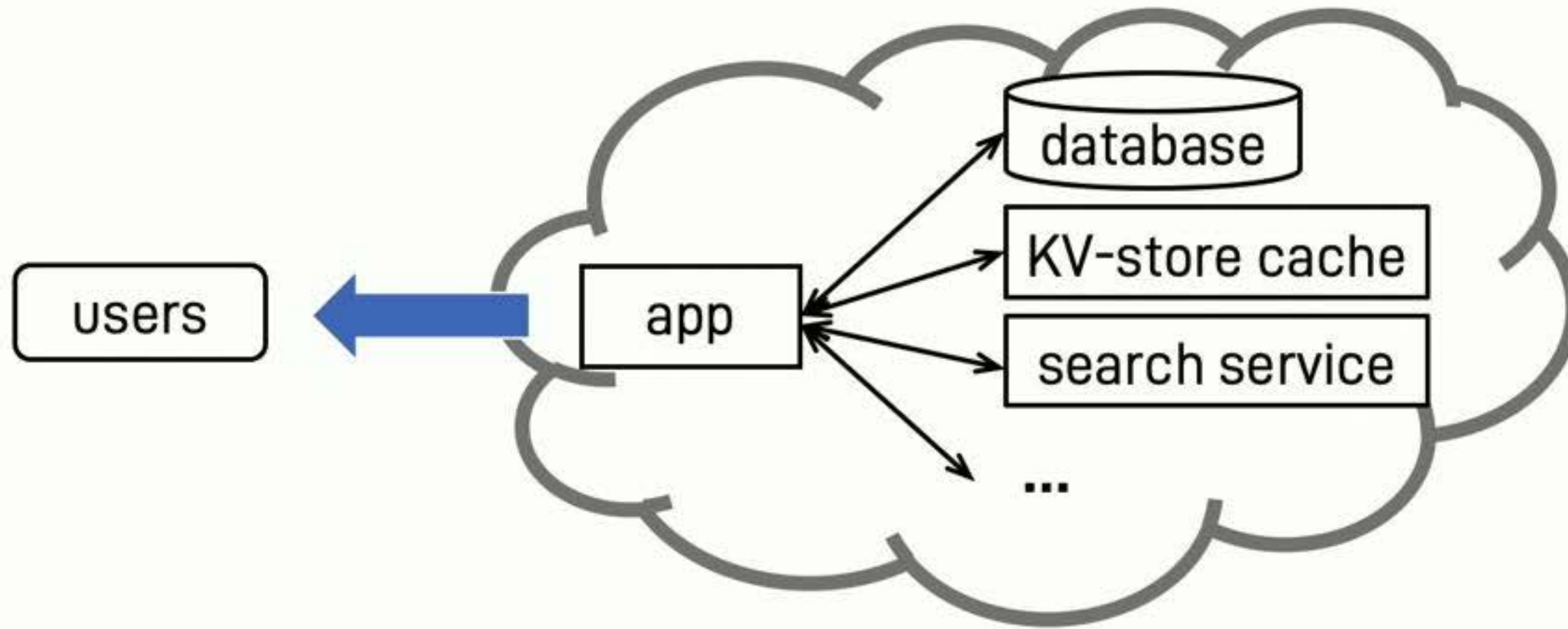


# Verify outsourced services with systems





# Verify outsourced services with systems

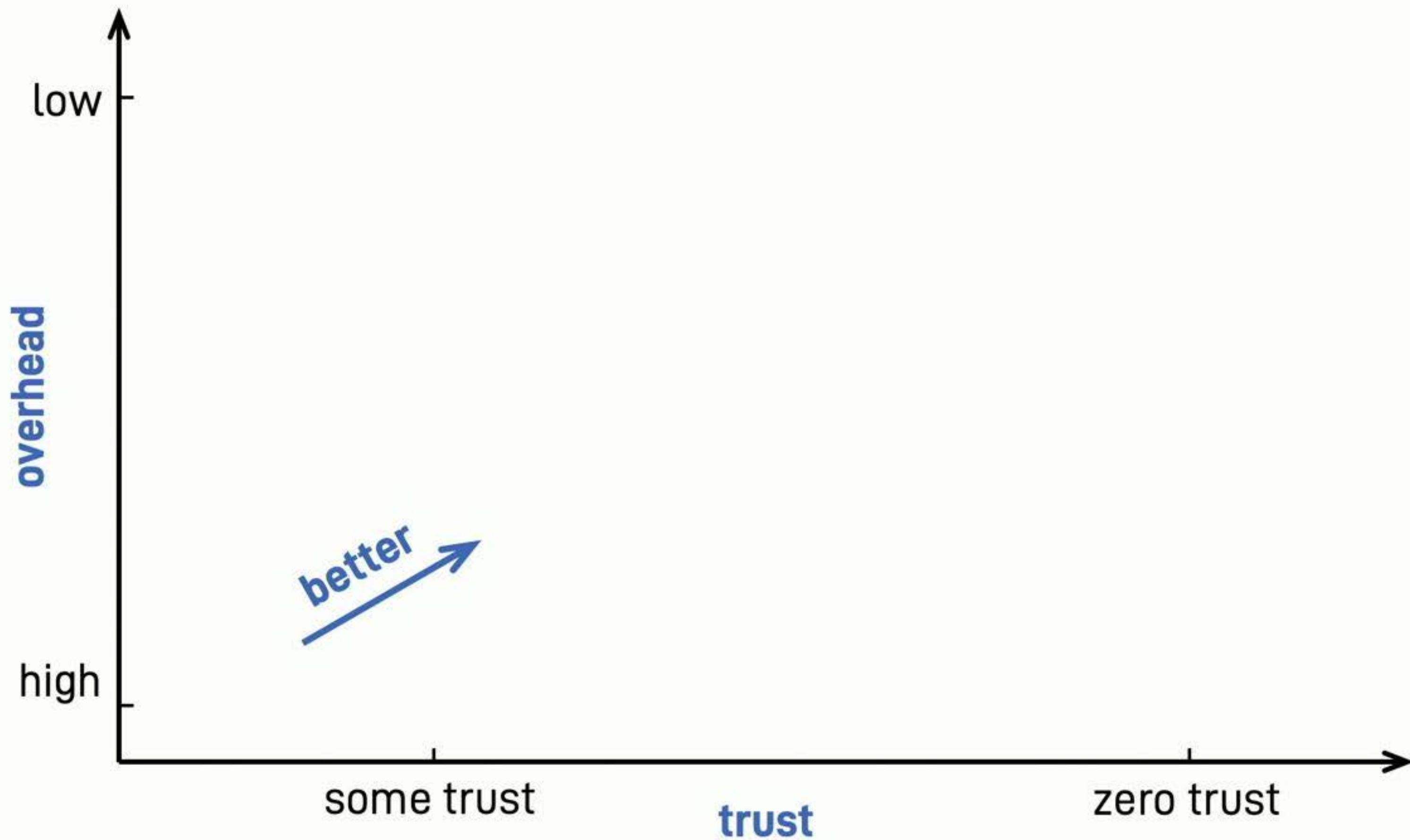


- **Honest servers** can convince users that app is faithfully executed.
- **Buggy or malicious servers** cannot pass users' checks.

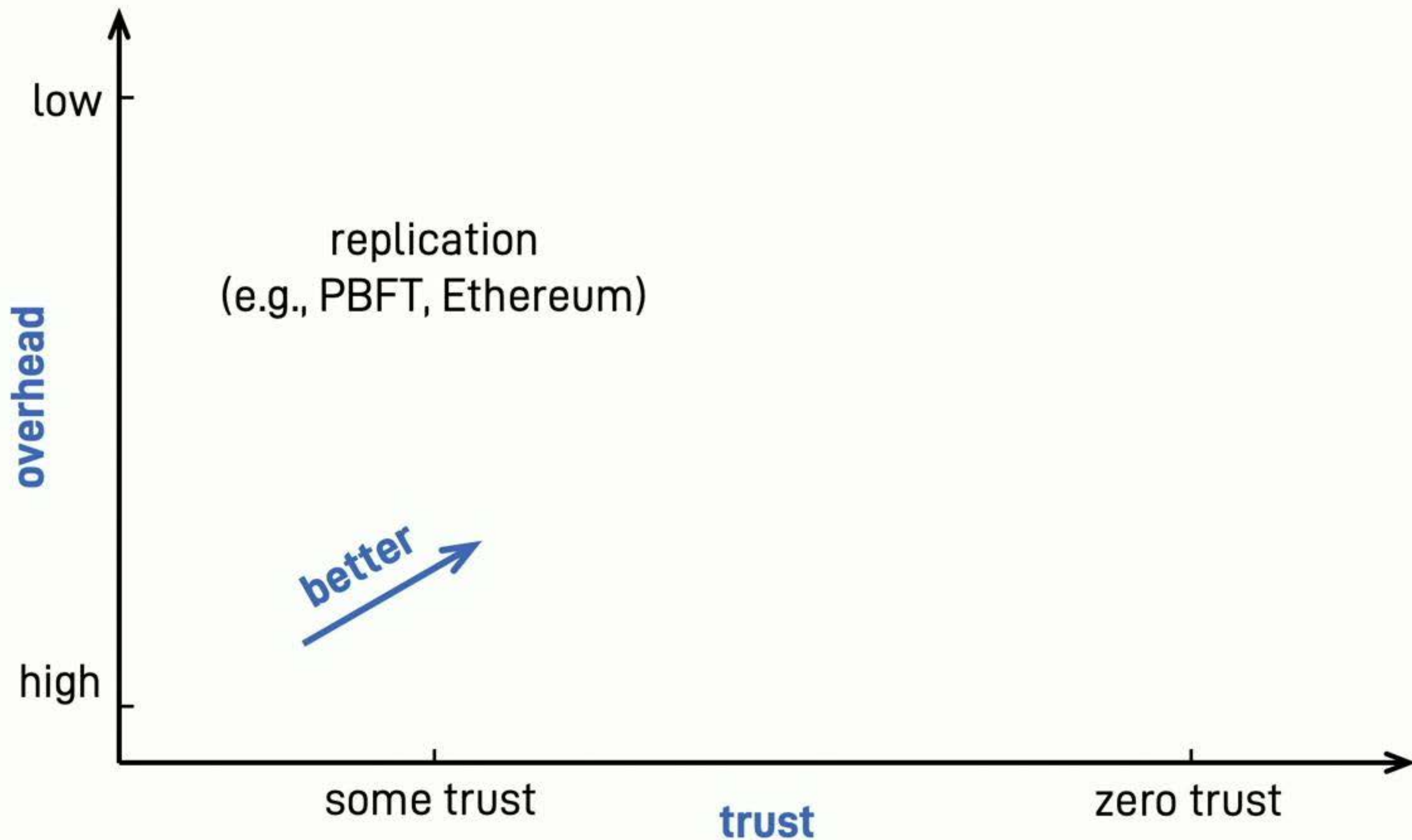
# Execution integrity...

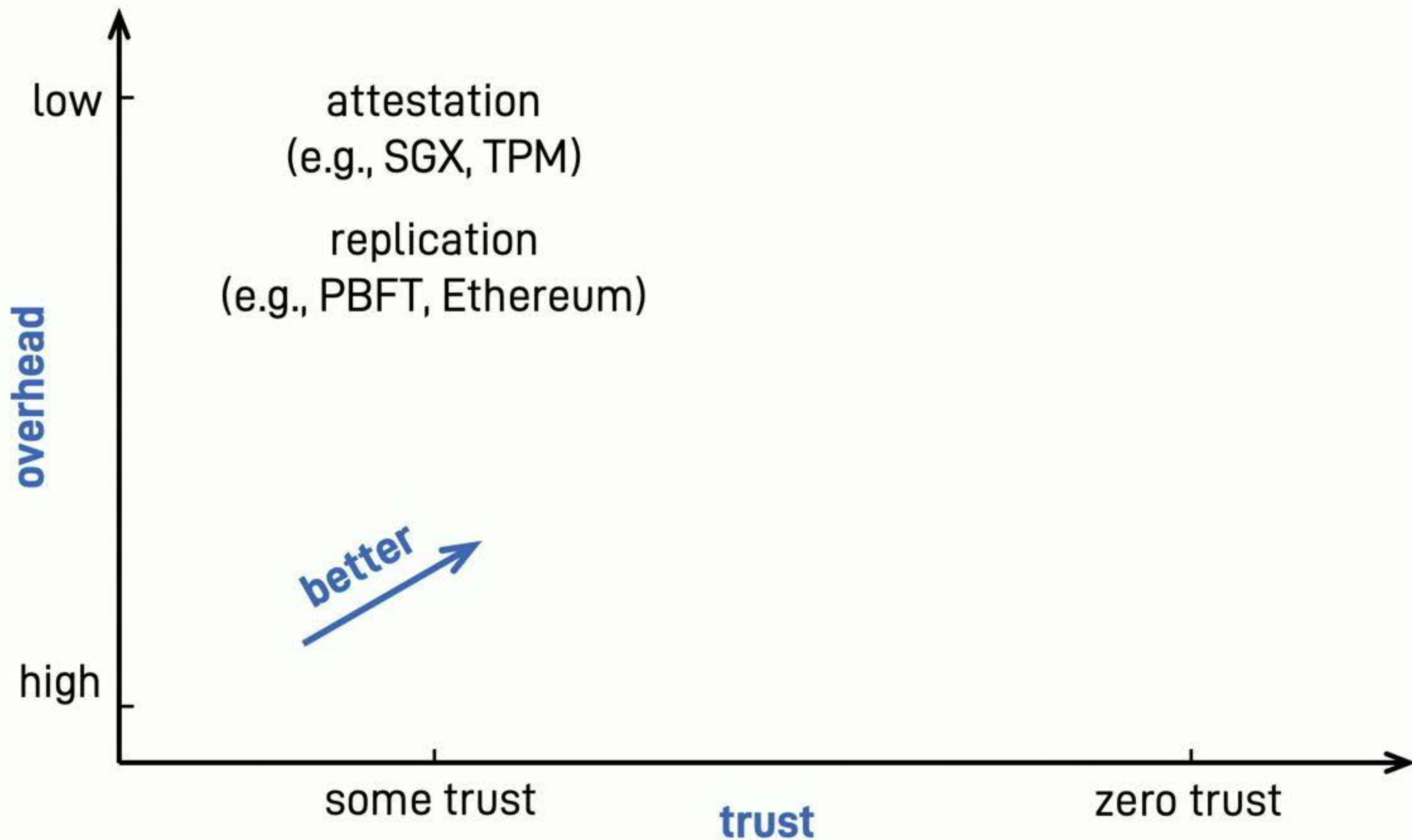
...is about executing code **faithfully**.

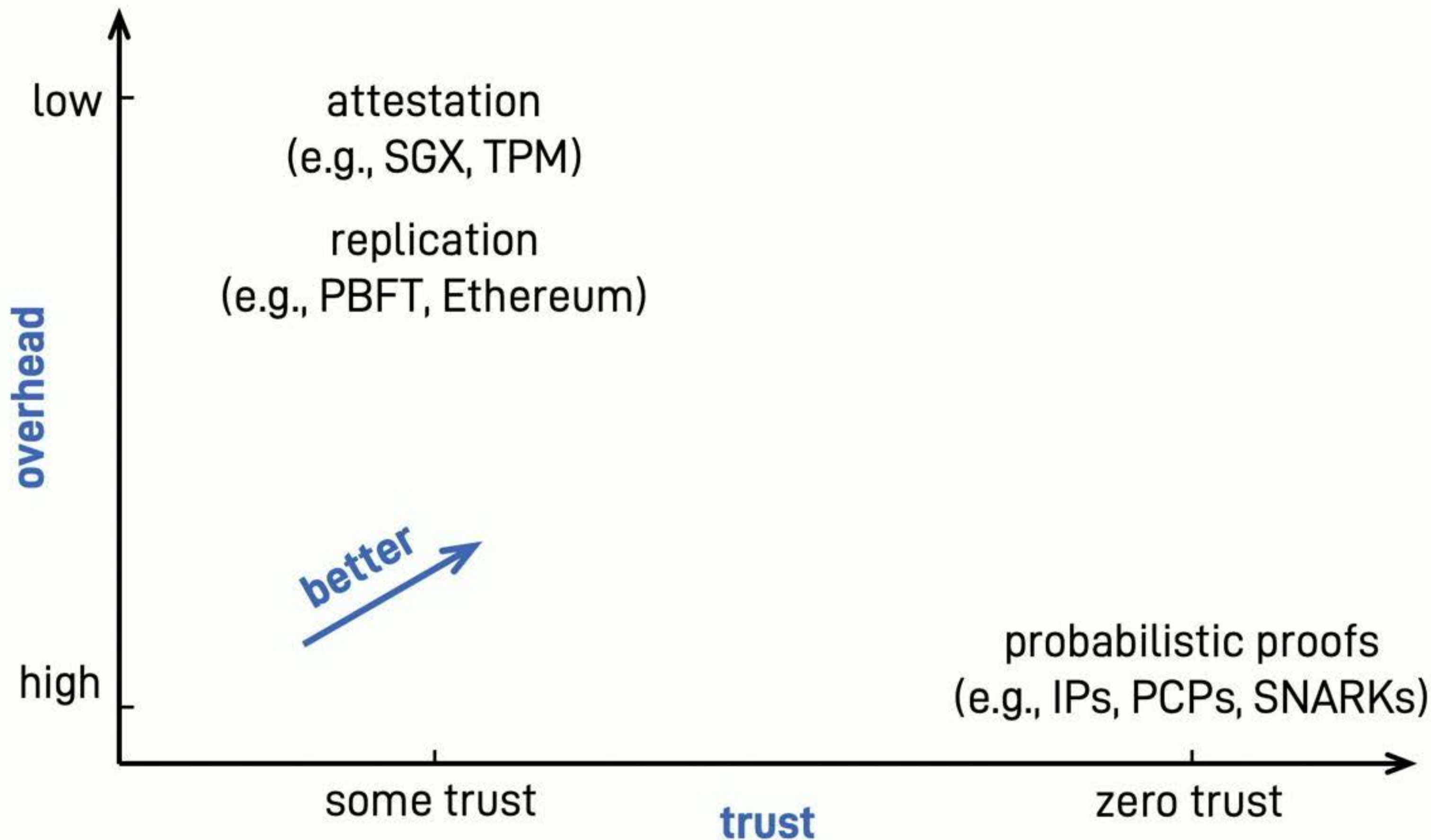
...is separate from program verification.



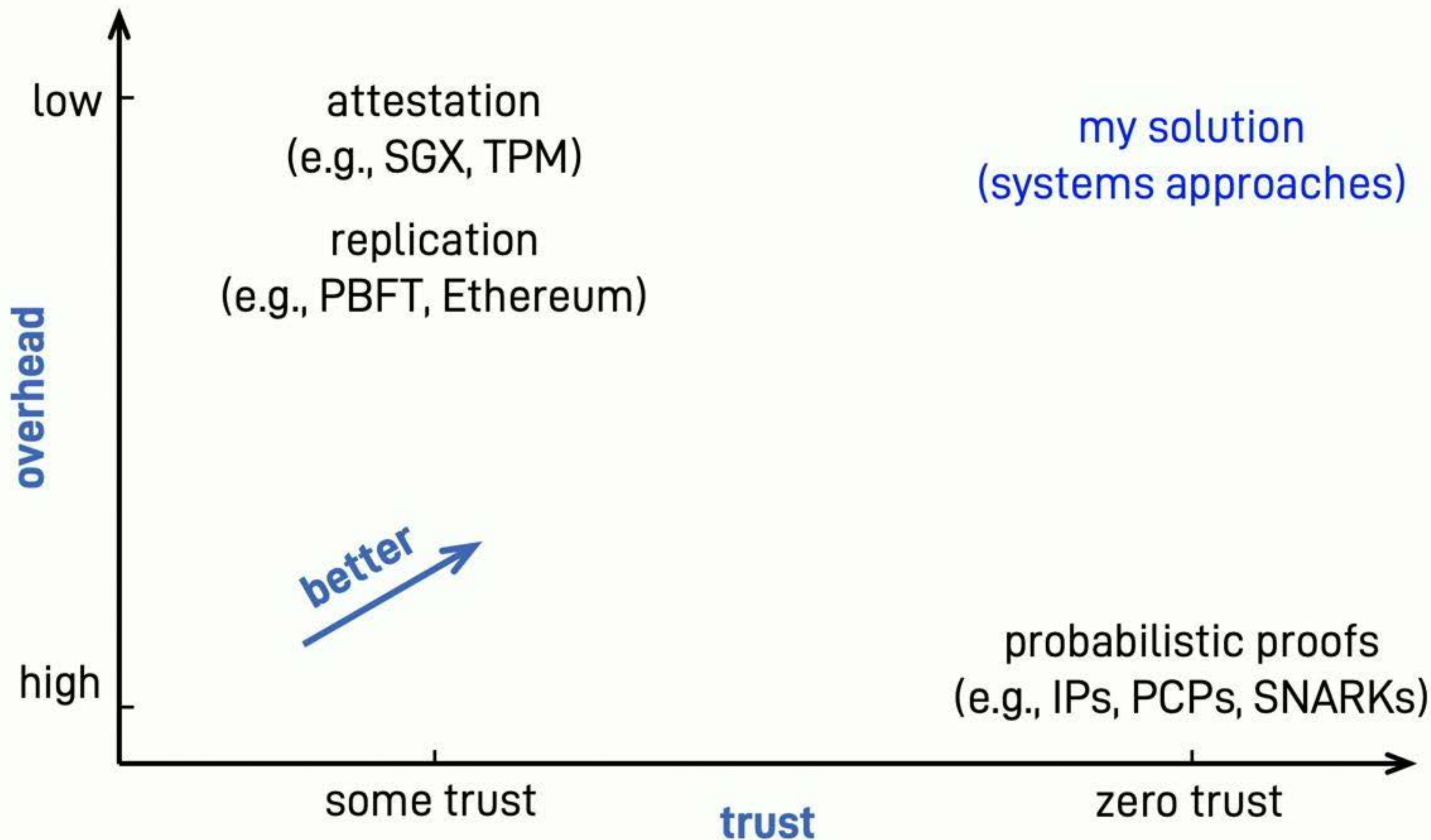


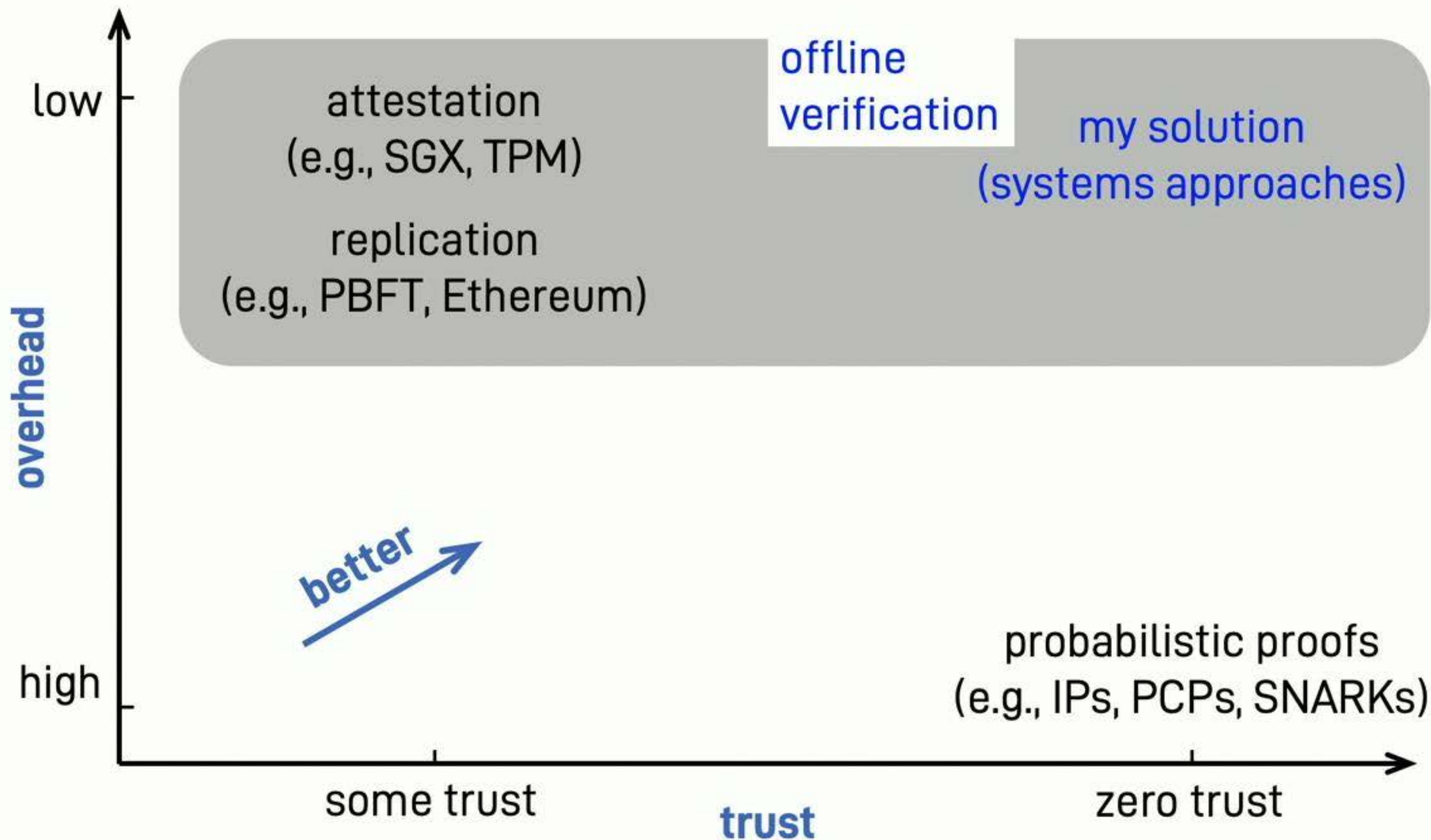


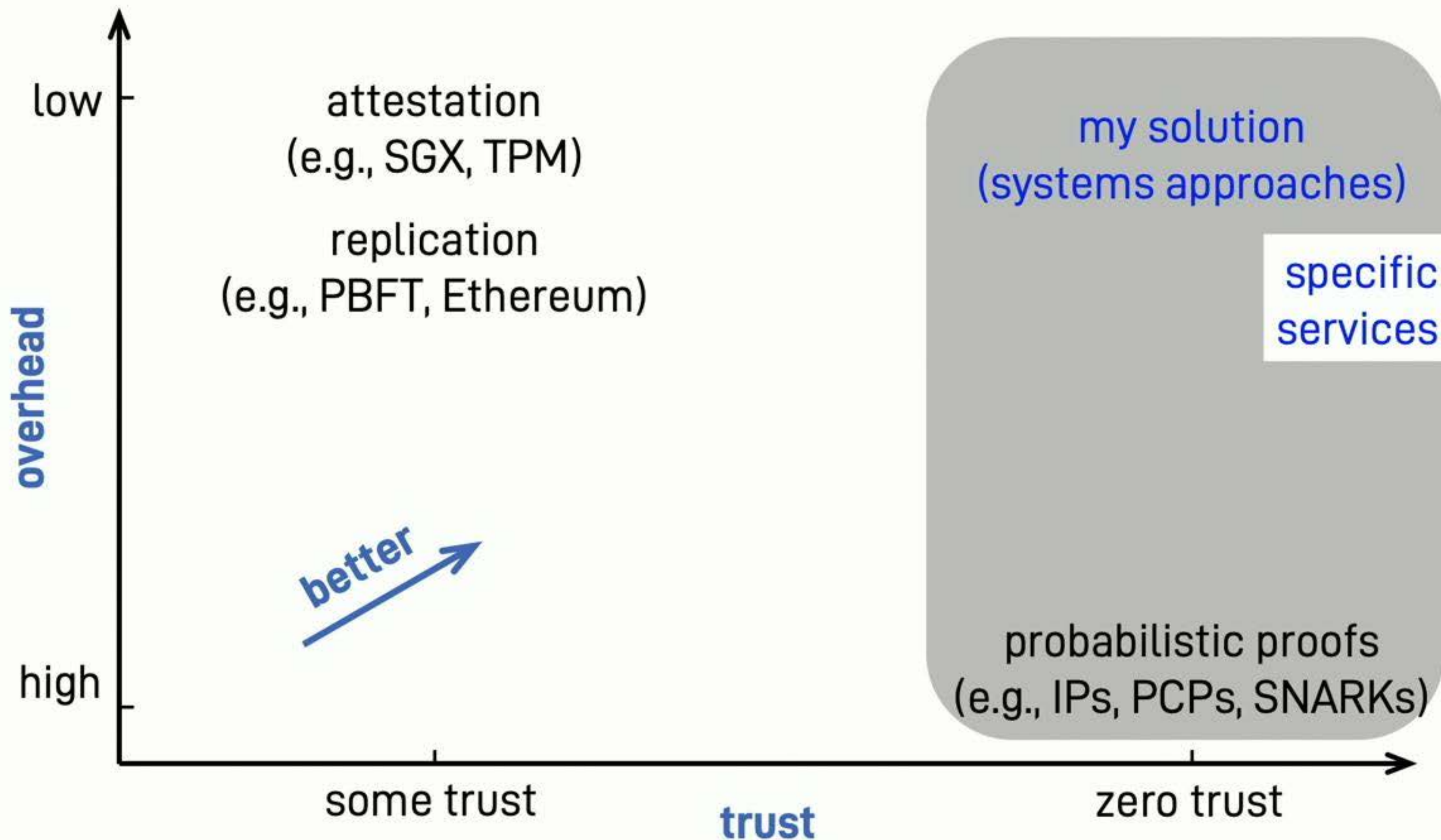




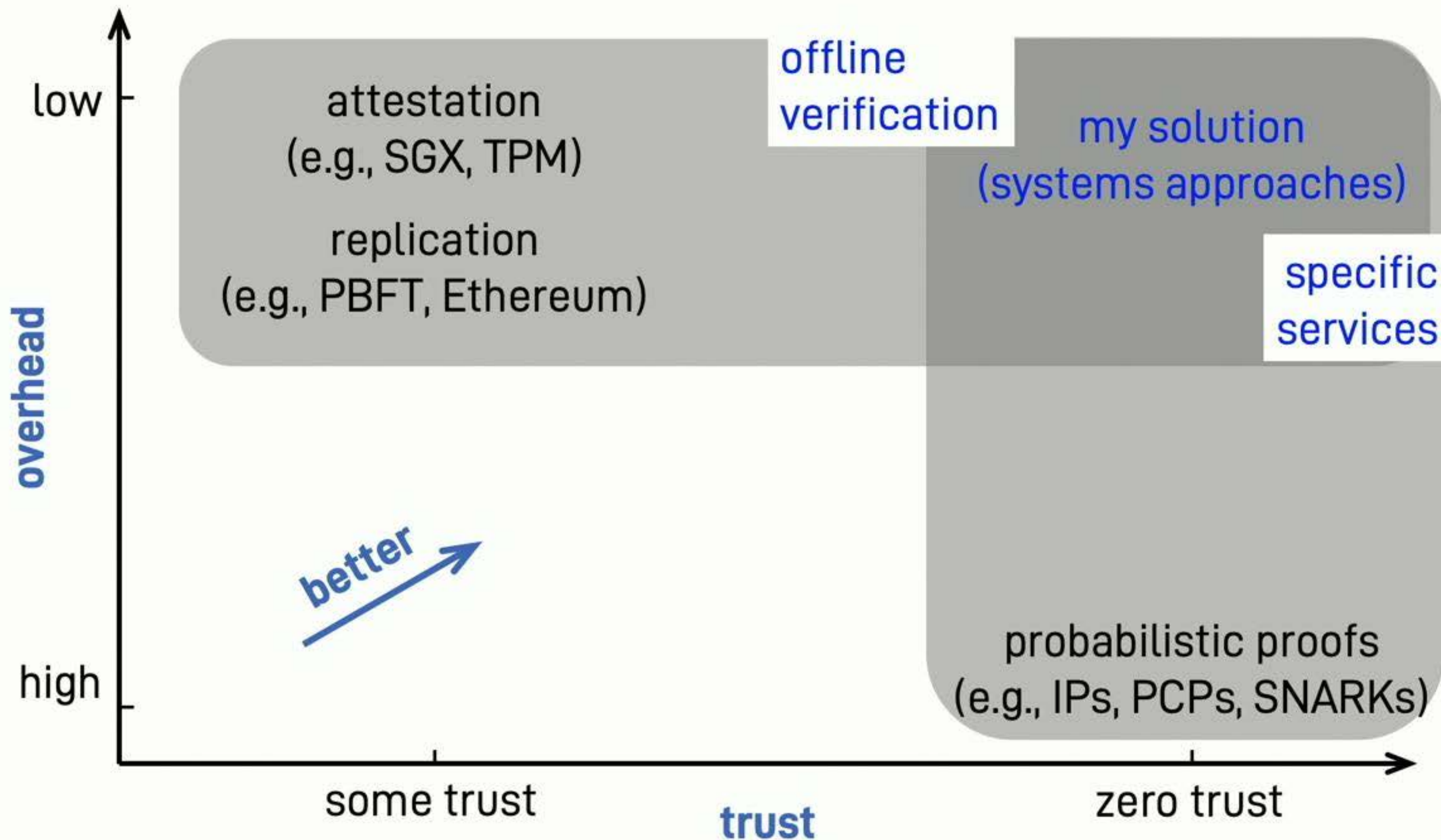




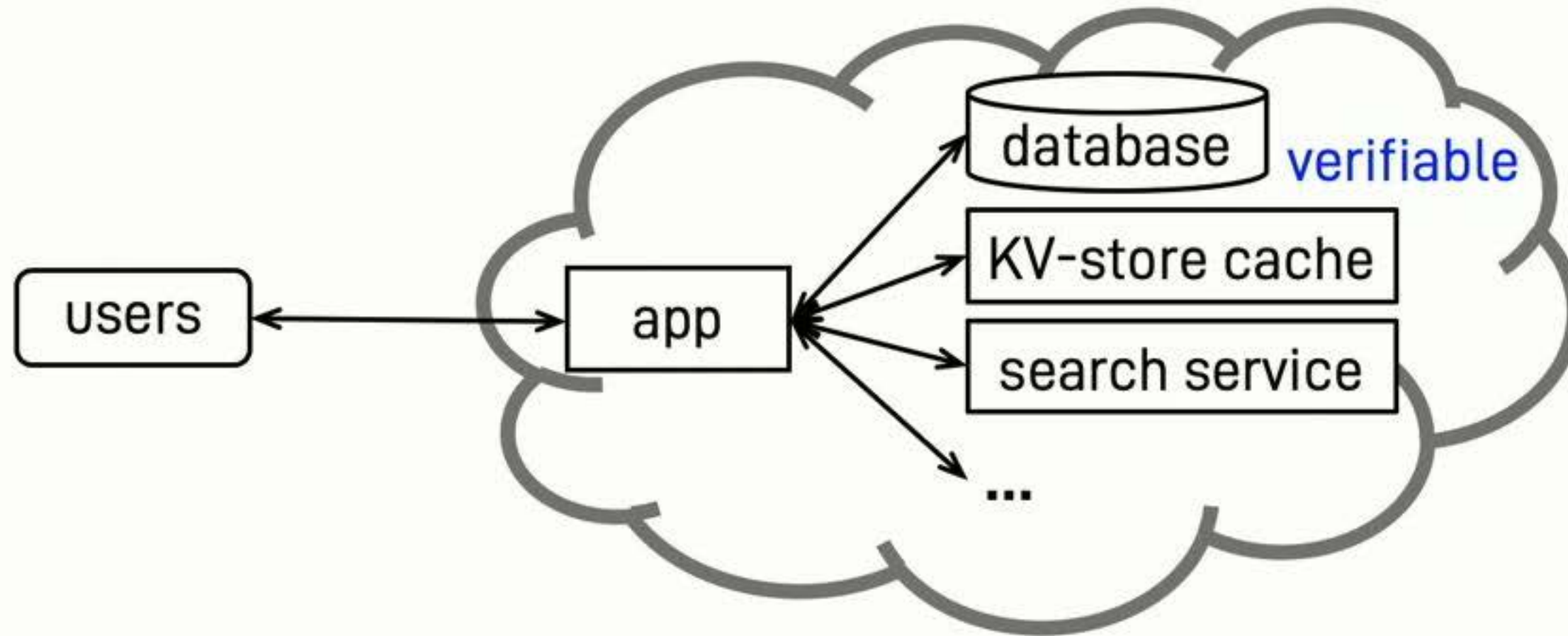




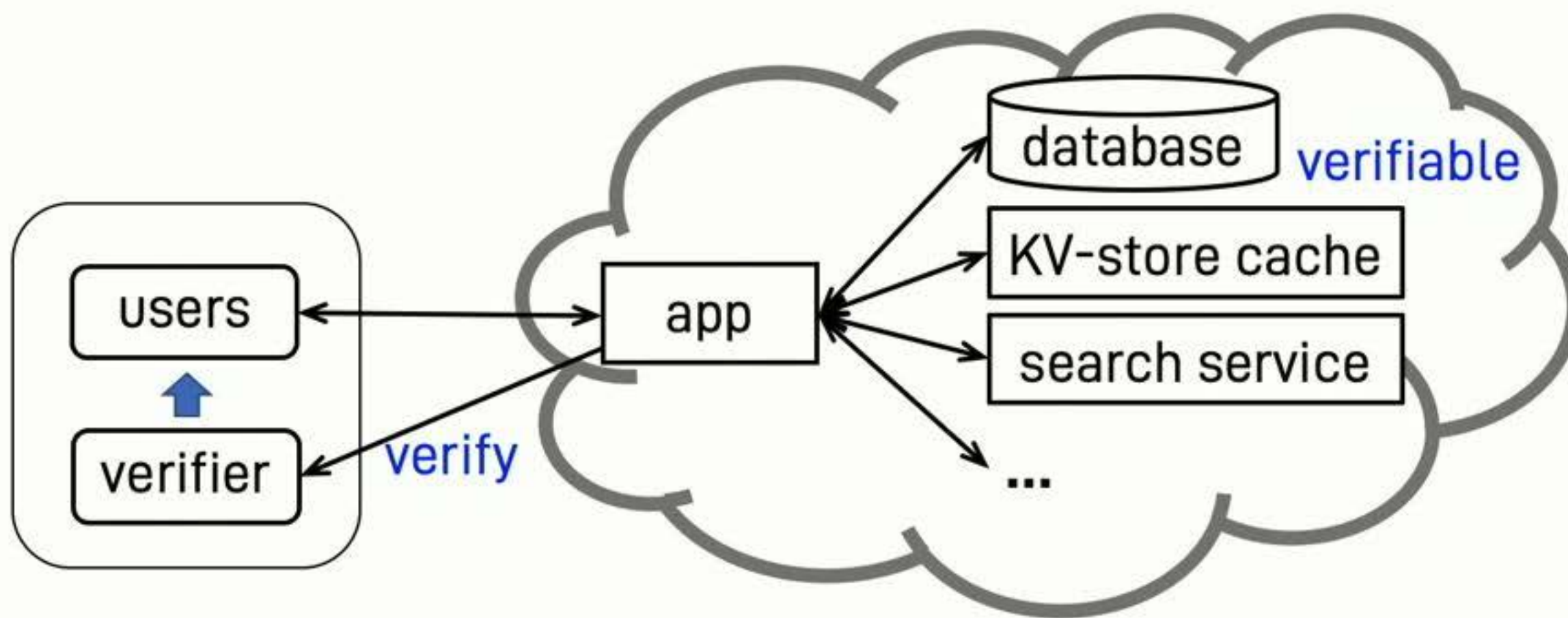




# Rest of the talk: verifiable infrastructure

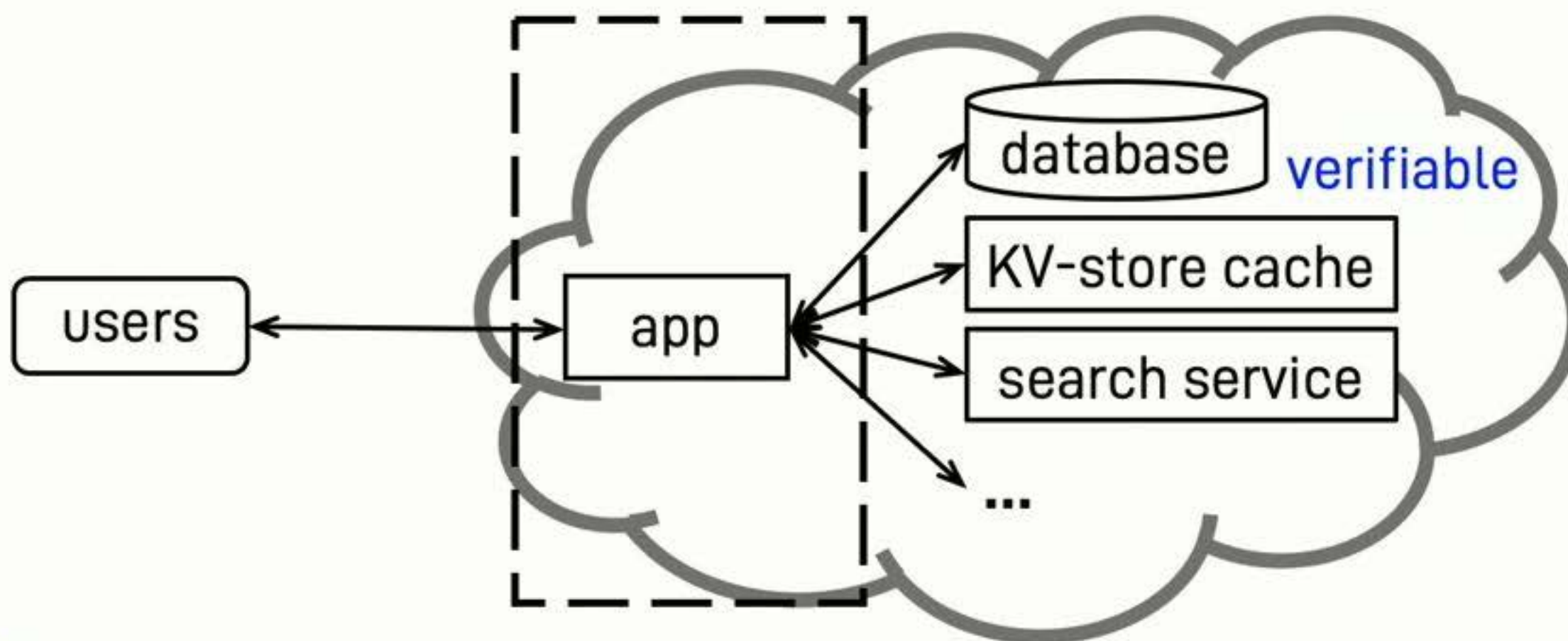


# Rest of the talk: verifiable infrastructure





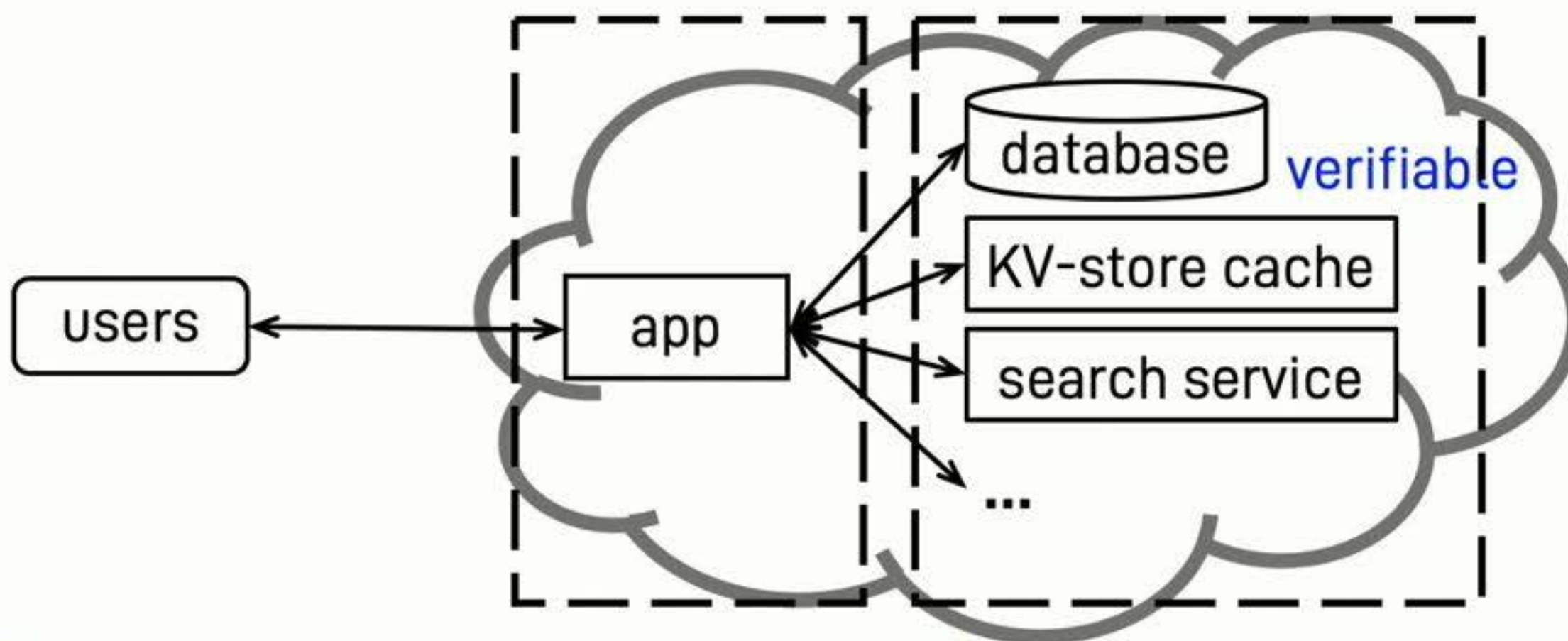
# Rest of the talk: verifiable infrastructure



① verify white-box services

verifier

# Rest of the talk: verifiable infrastructure

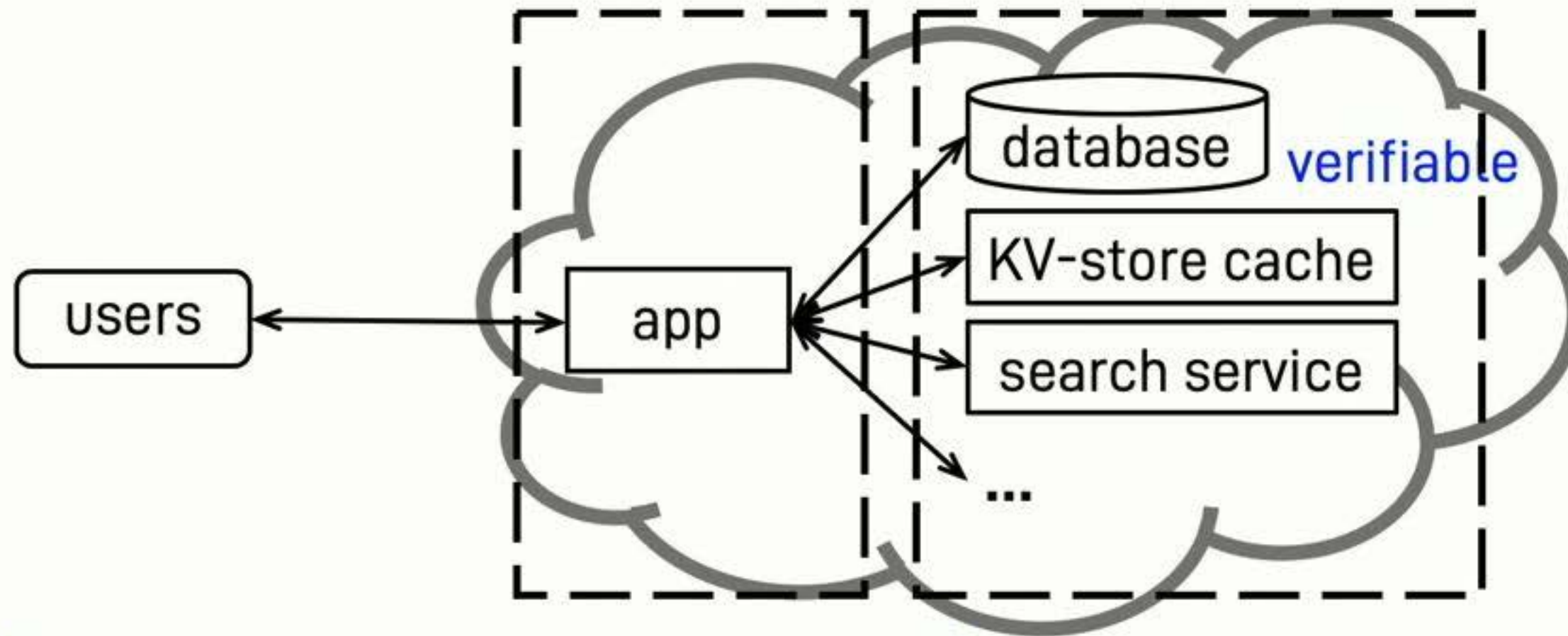


① verify white-box services

② verify black-box services

verifier

# Rest of the talk: verifiable infrastructure



① verify white-box services

② verify black-box services

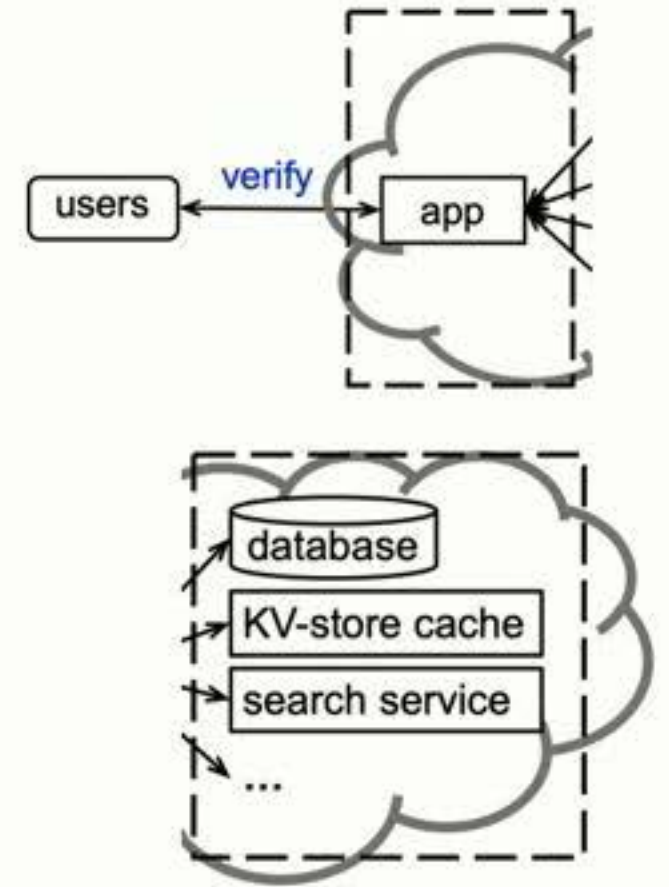
③ compose verifications of multiple services

verifier



# Rest of the talk: verifiable infrastructure

- ① Verify white-box services (Orochi [SOSP'17])
- ② Verify black-box services (Cobra)
- ③ Build composable verifiable framework (future work)
- ④ Other past work
  - Troubleshooting data center networks [NSDI'19]
  - Protecting secret via security-oriented offloading [EuroSys'15]





# Rest of the talk: verifiable infrastructure

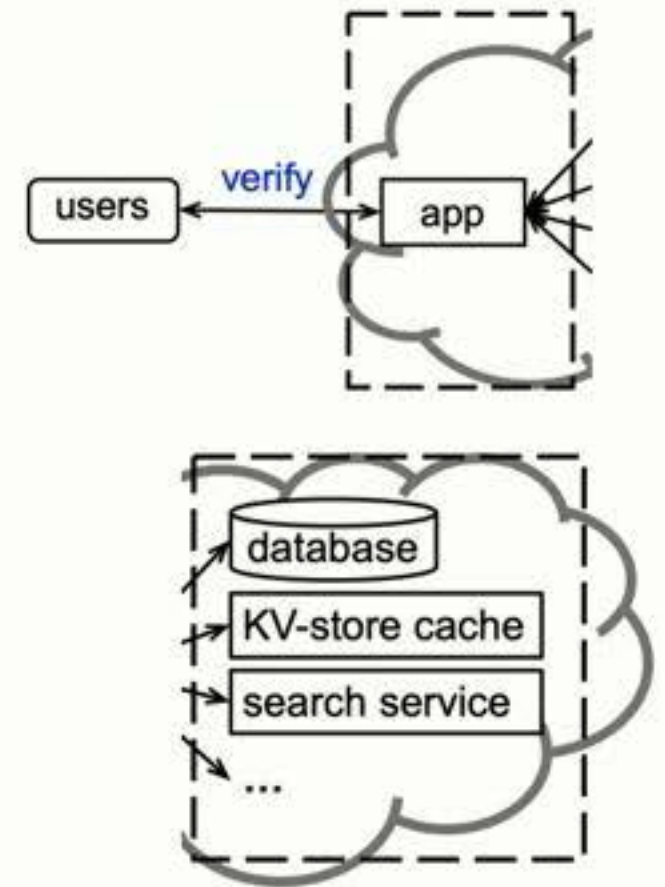
① Verify white-box services (Orochi [SOSP'17])

② Verify black-box services (Cobra)

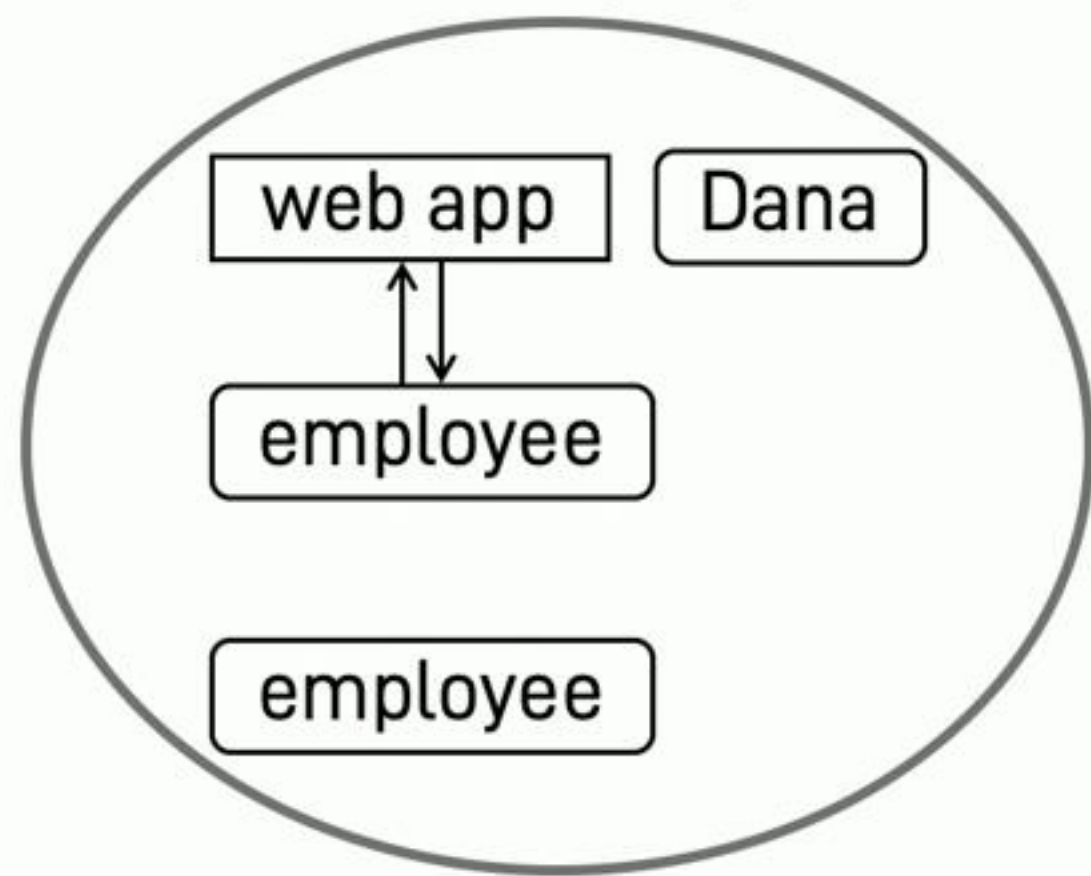
③ Build composable verifiable framework (future work)

④ Other past work

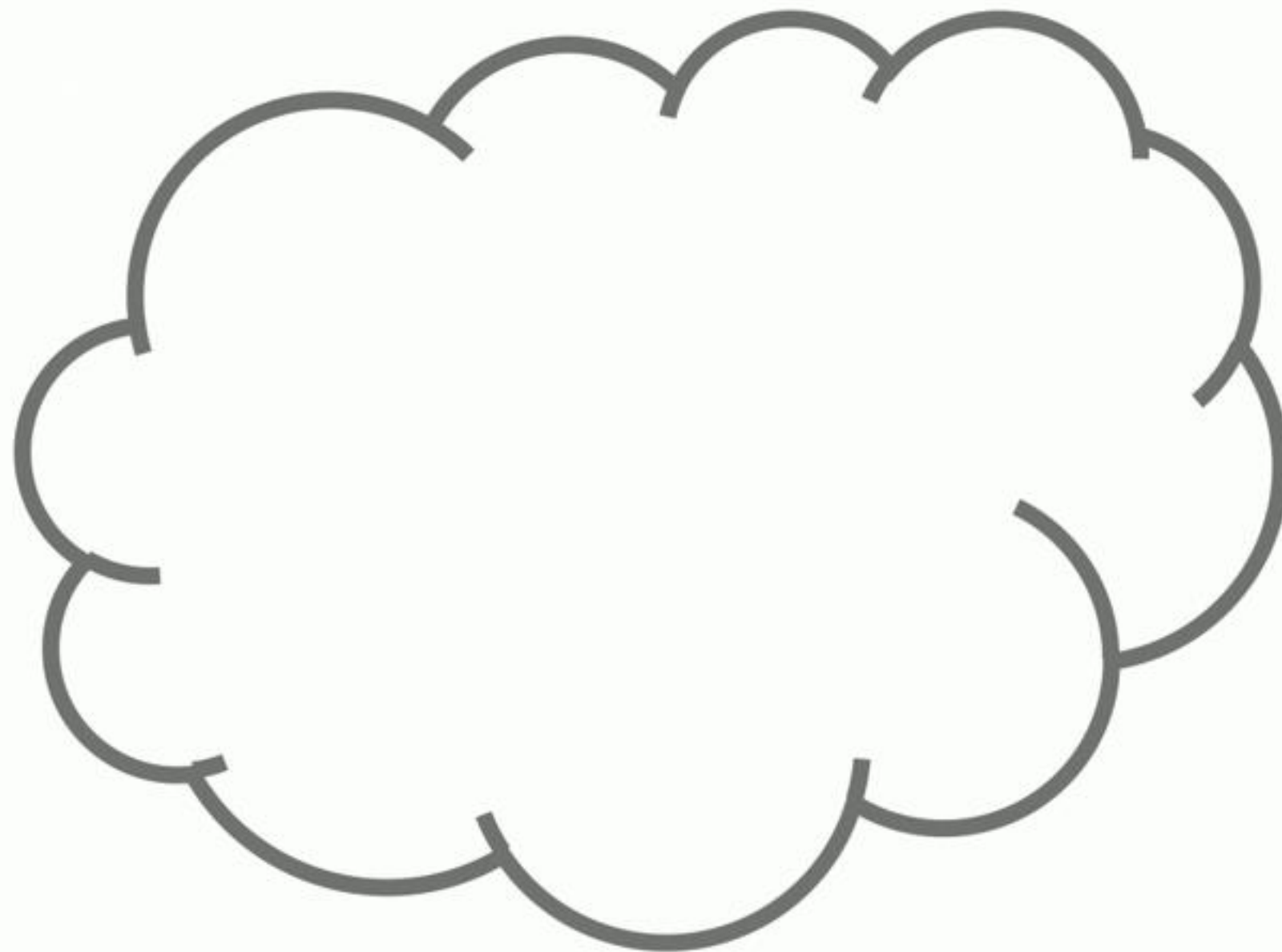
- Troubleshooting data center networks [NSDI'19]
- Protecting secret via security-oriented offloading [EuroSys'15]

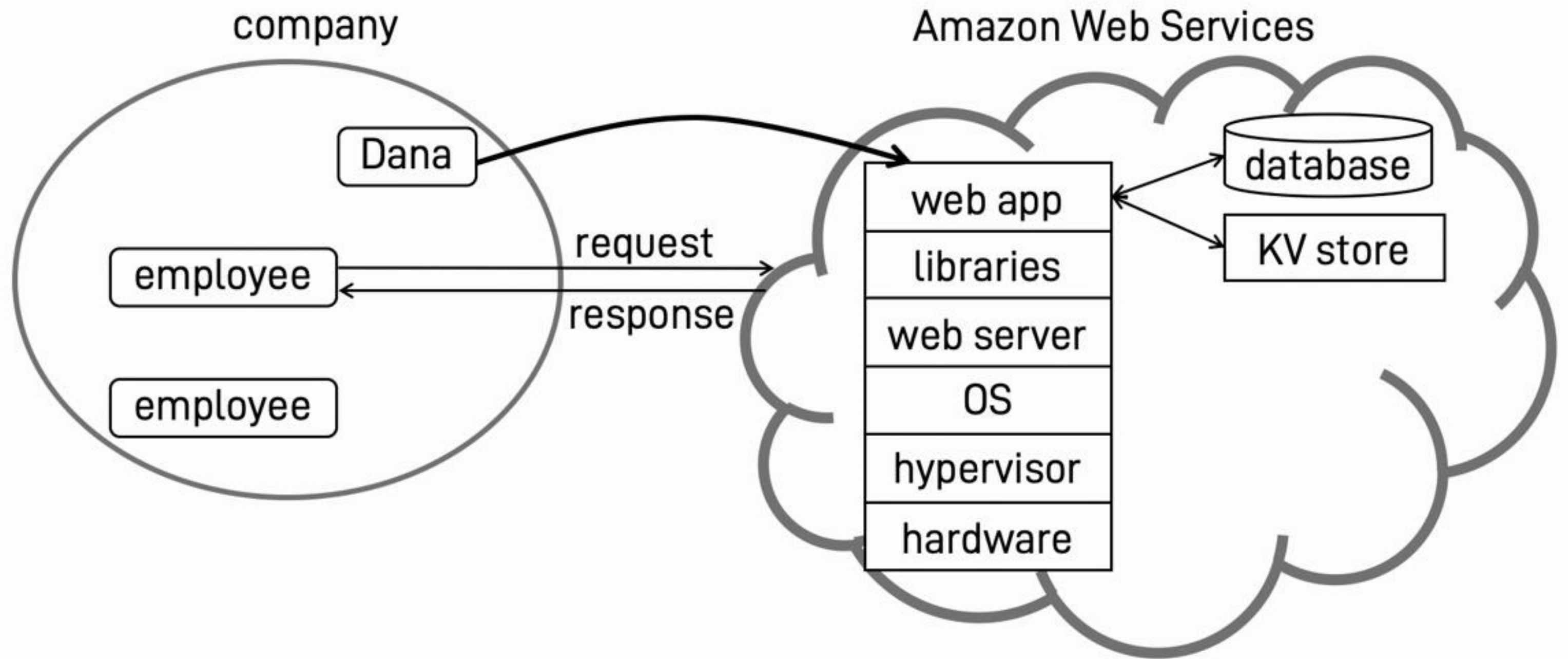


company

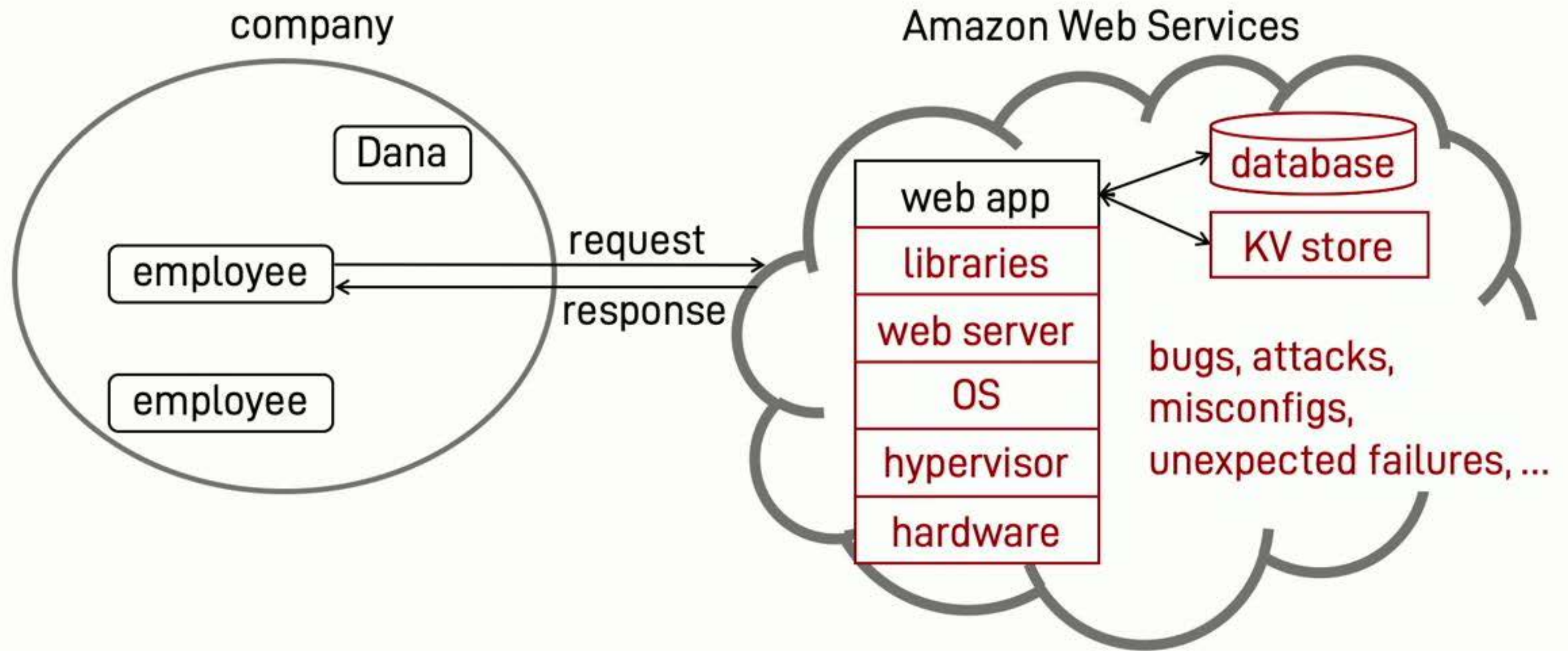


Amazon Web Services



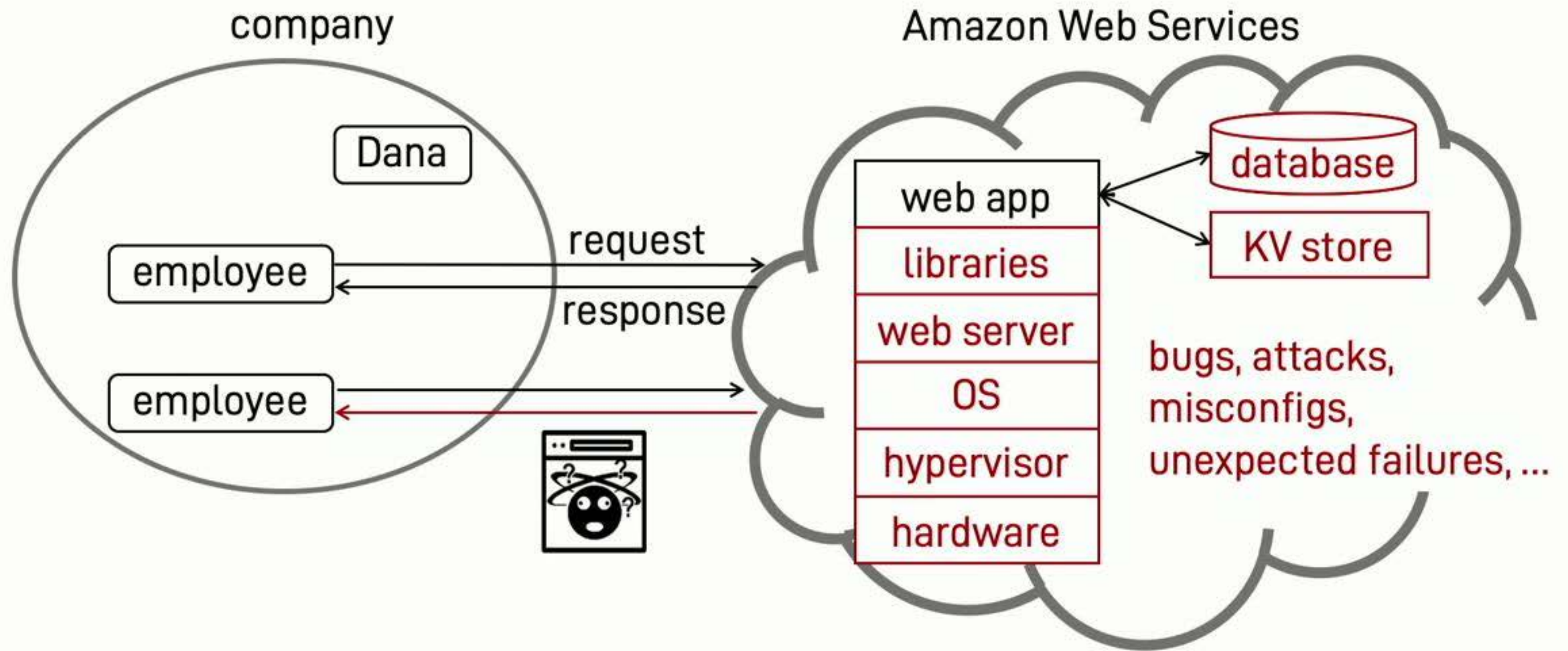




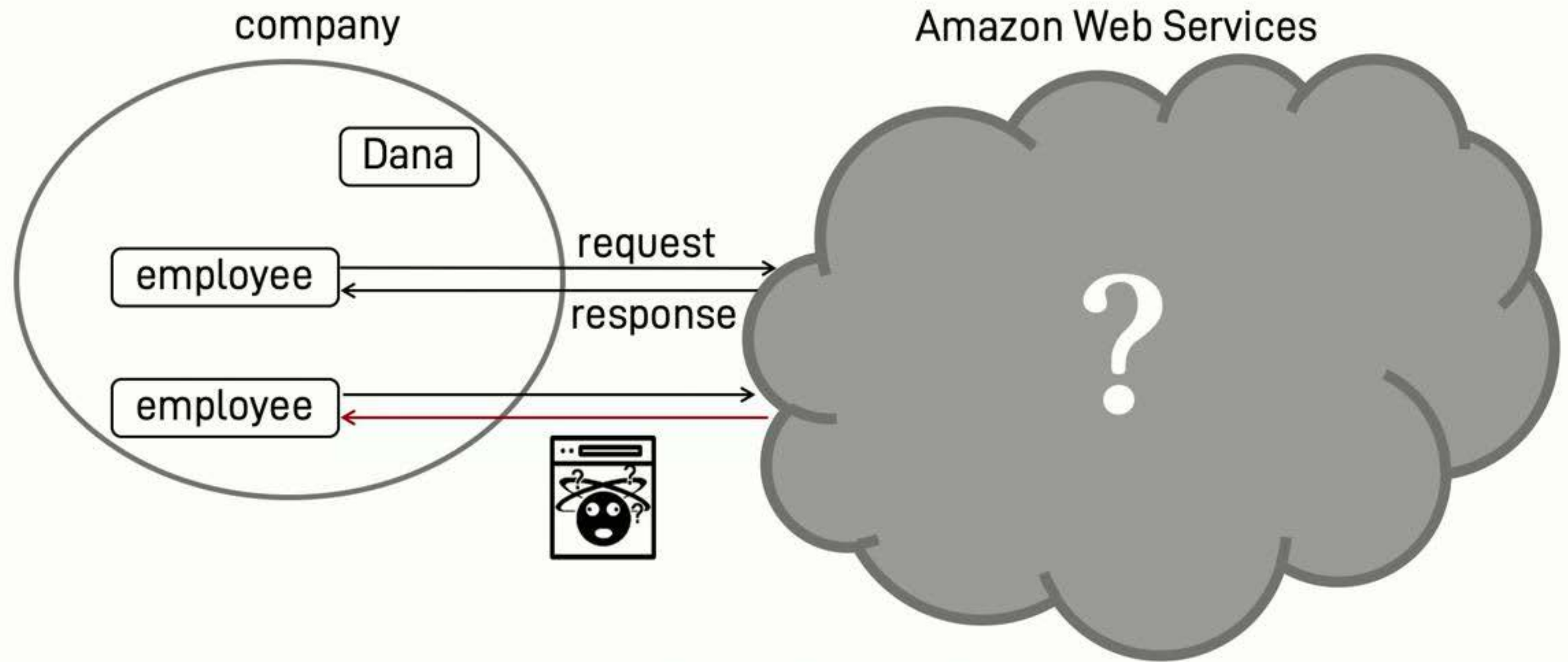


- A lot of things can go wrong...



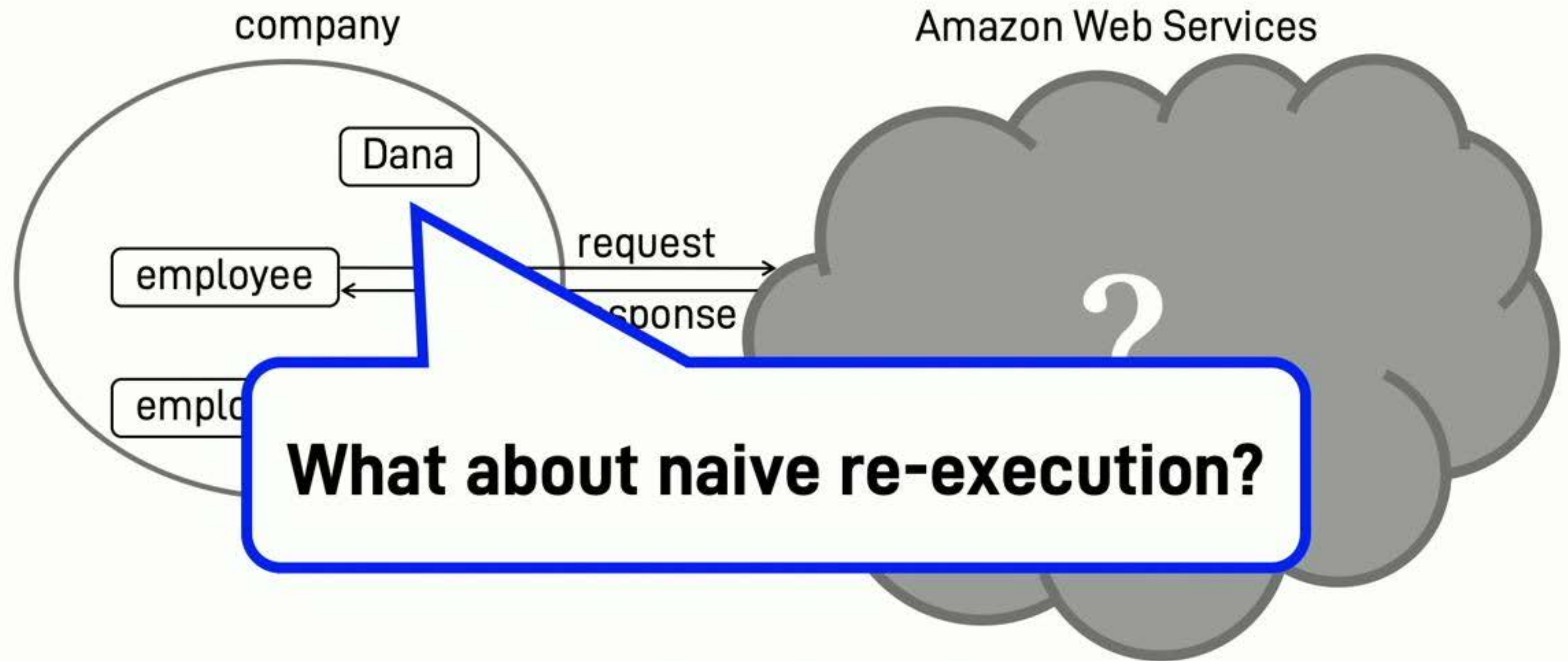


- A lot of things can go wrong...



- Dana wants to audit the **end-to-end execution**

$$\boxed{\text{responses}} \stackrel{?}{=} \boxed{\text{actual application}} + \boxed{\text{requests}}$$

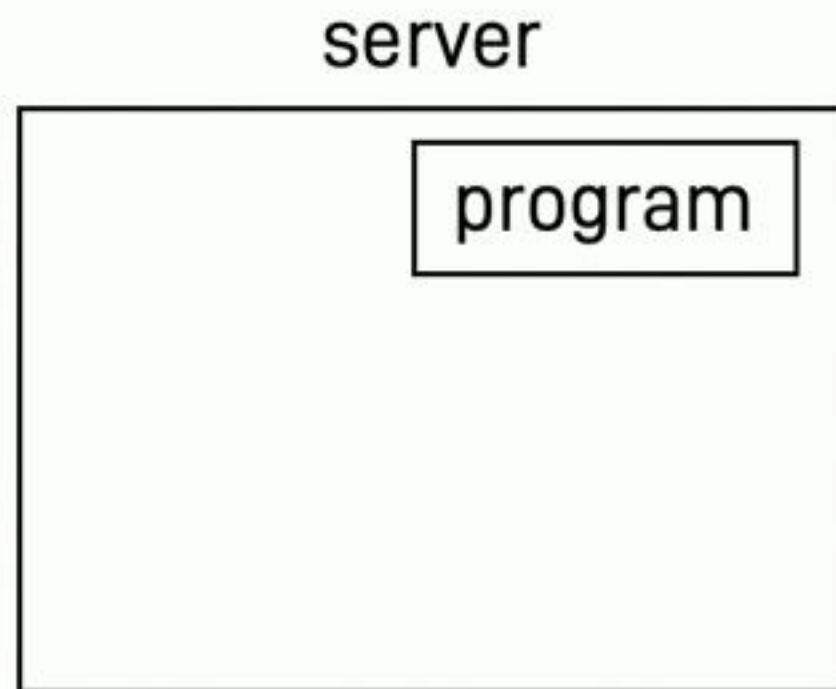


- Dana wants to audit the **end-to-end execution**

$$\boxed{\text{responses}} \stackrel{?}{=} \boxed{\text{actual application}} + \boxed{\text{requests}}$$



# The Efficient Server Audit Problem

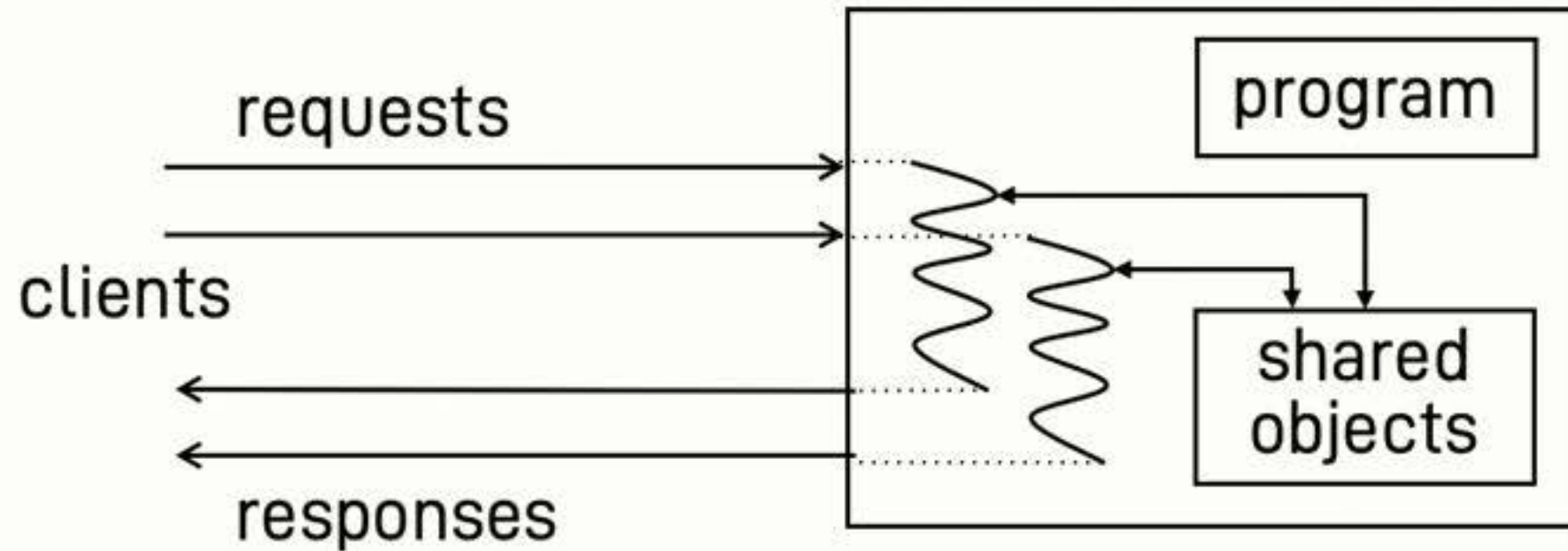




# The Efficient Server Audit Problem

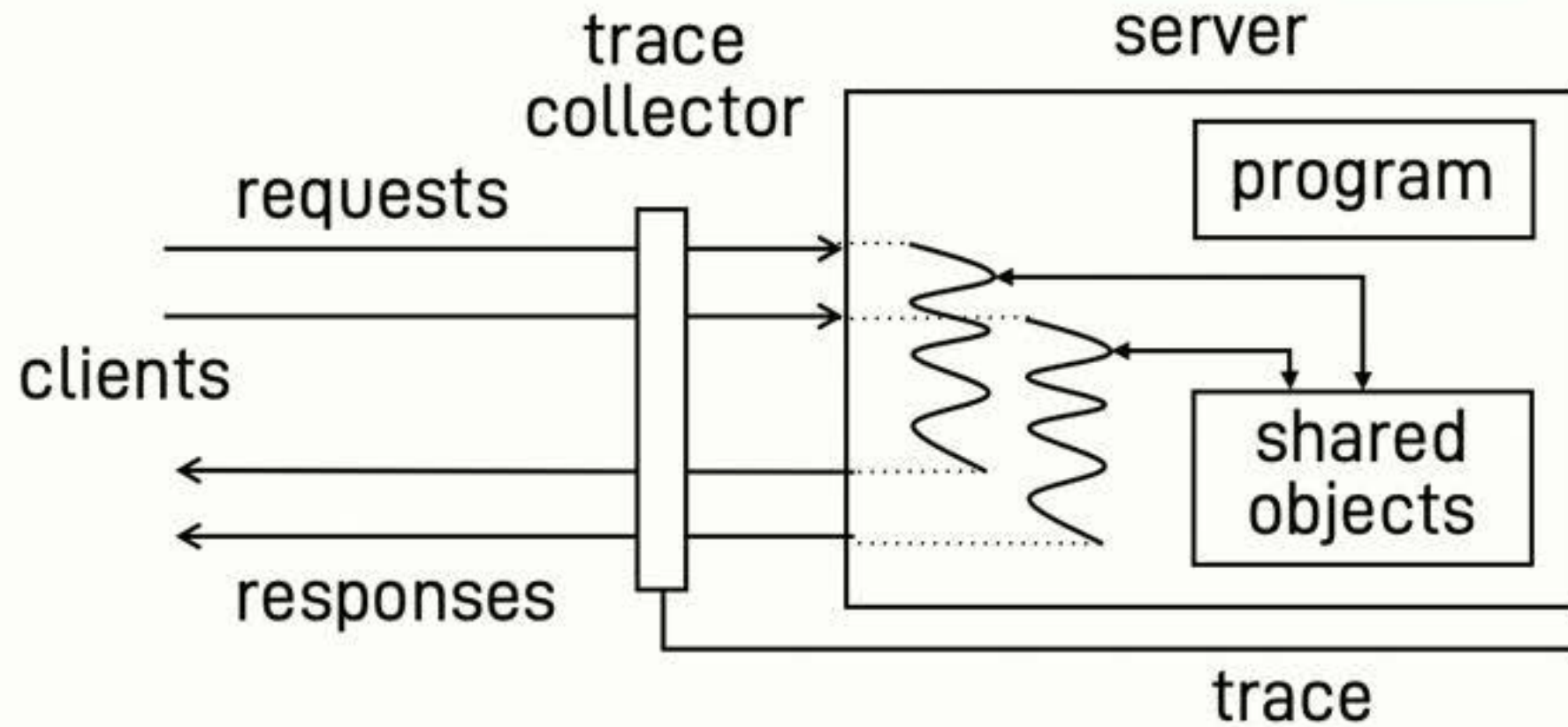
online phase

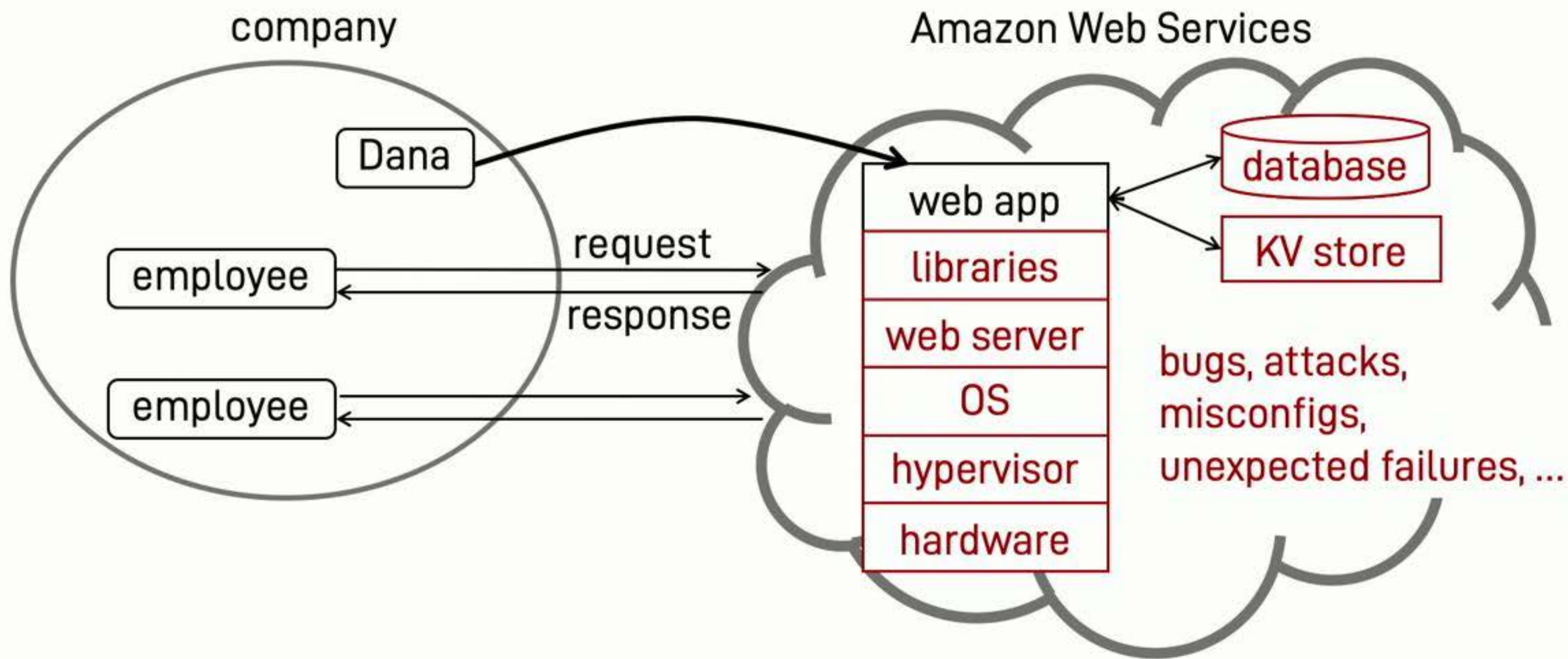
server



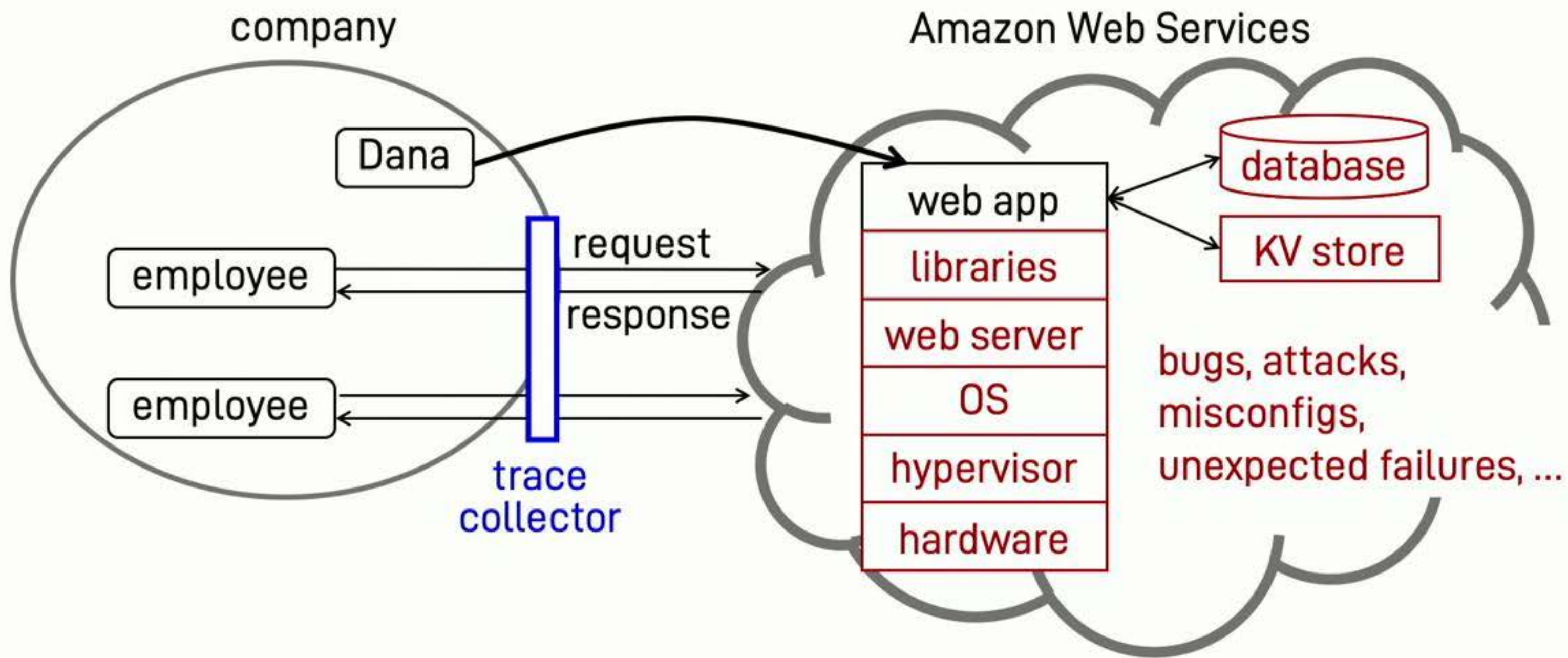
# The Efficient Server Audit Problem

online phase



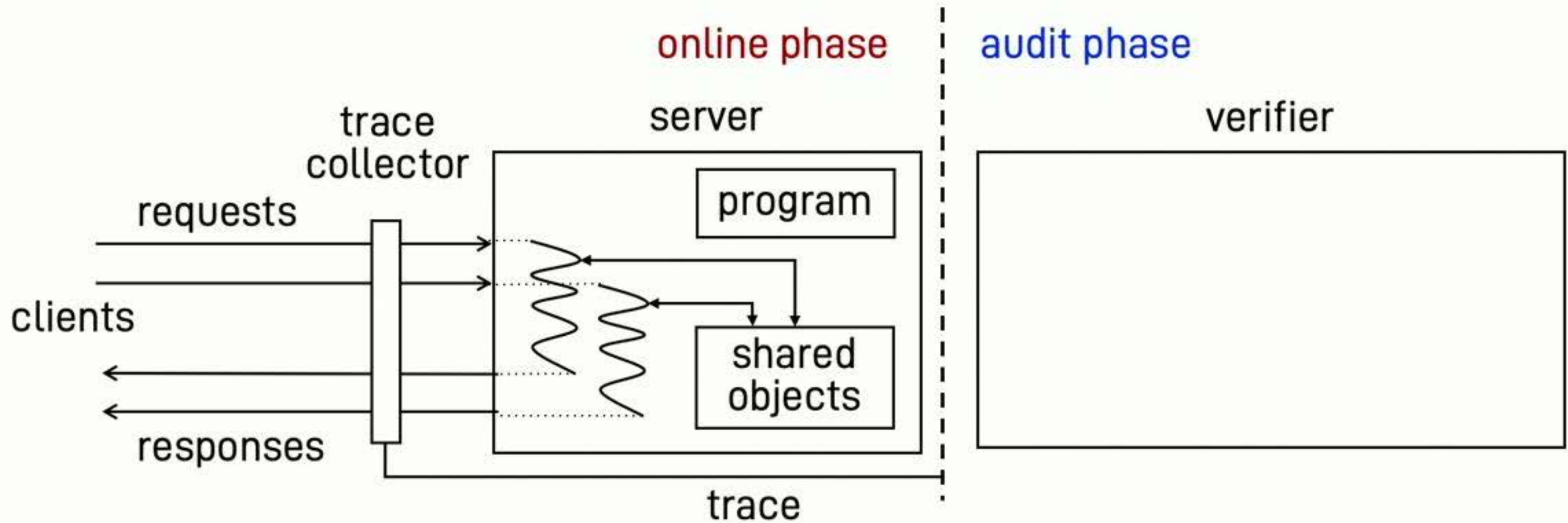




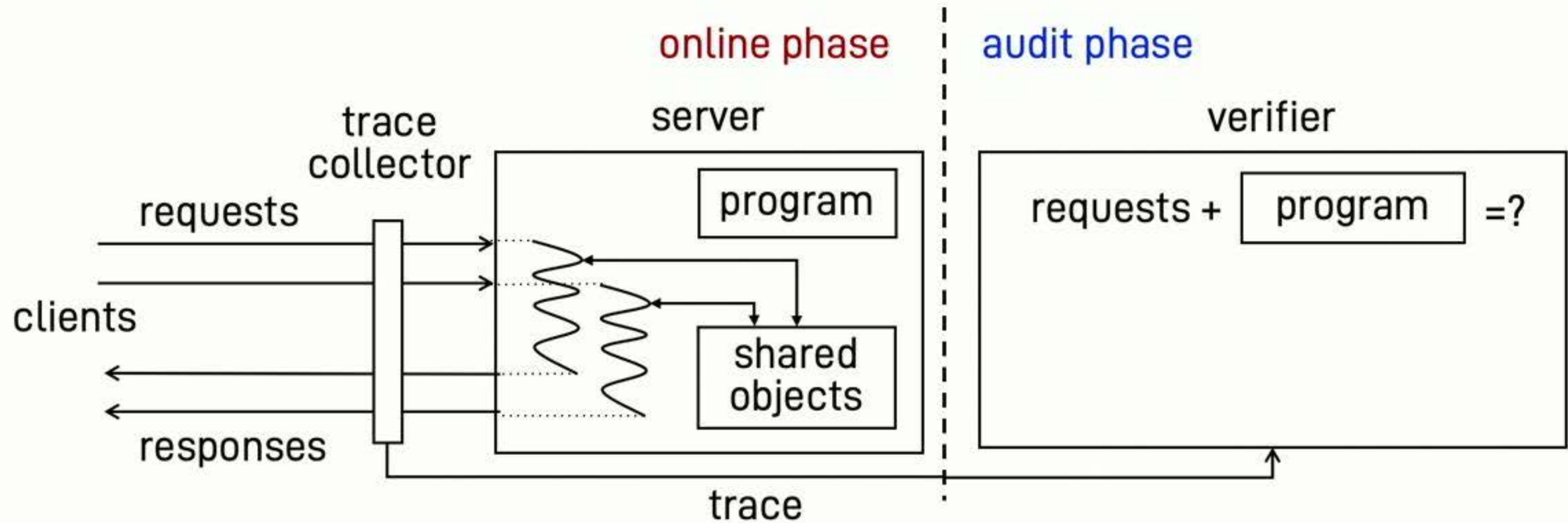




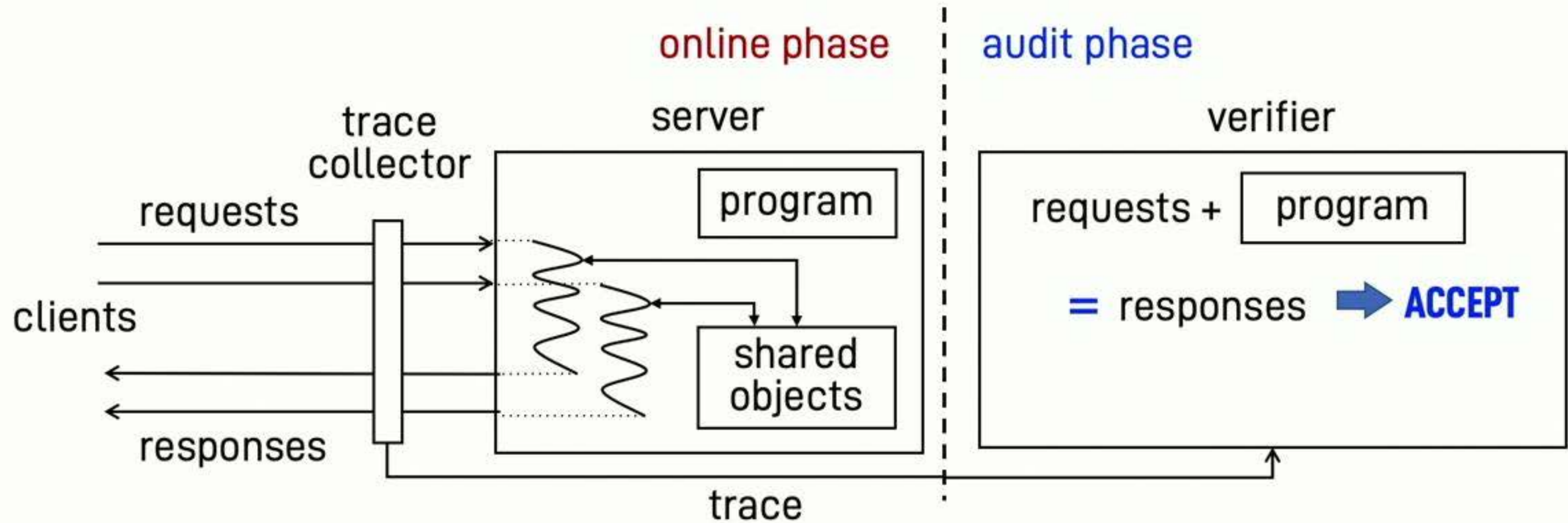
# The Efficient Server Audit Problem



# The Efficient Server Audit Problem

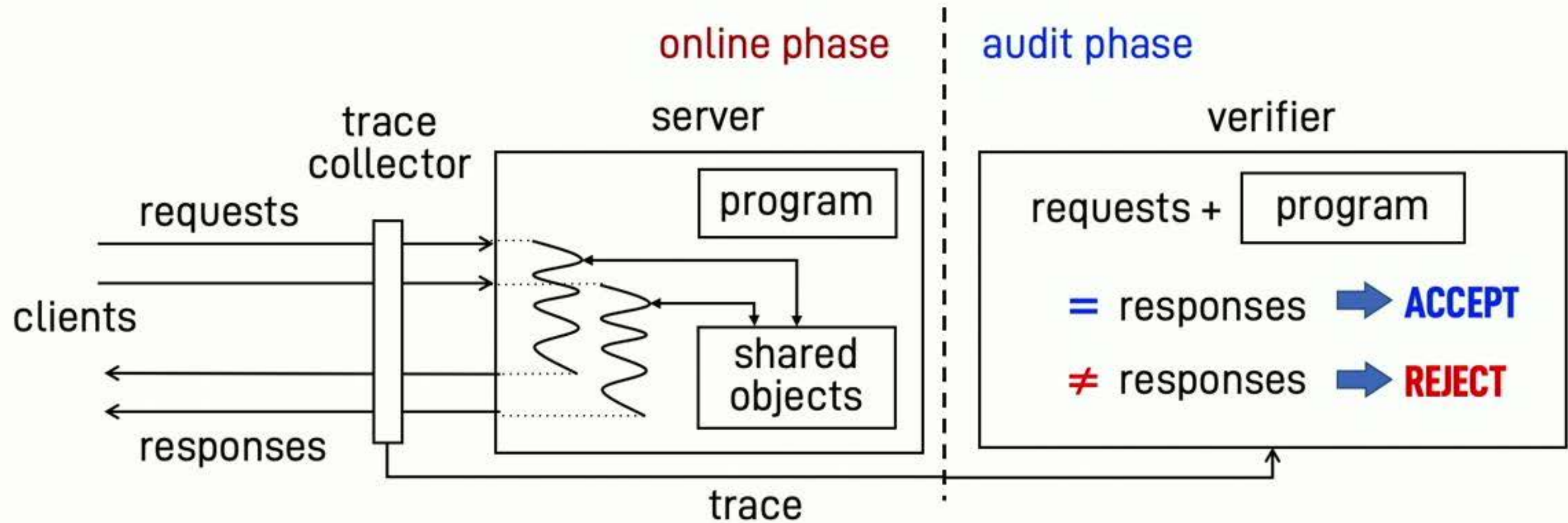


# The Efficient Server Audit Problem

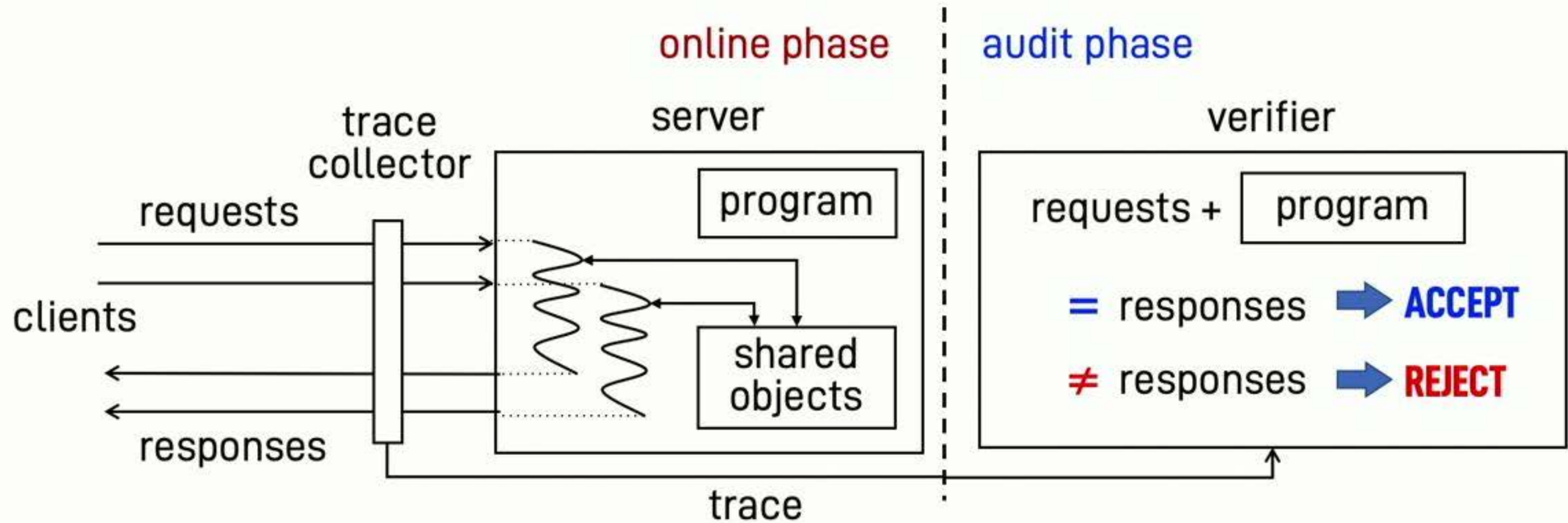




# The Efficient Server Audit Problem

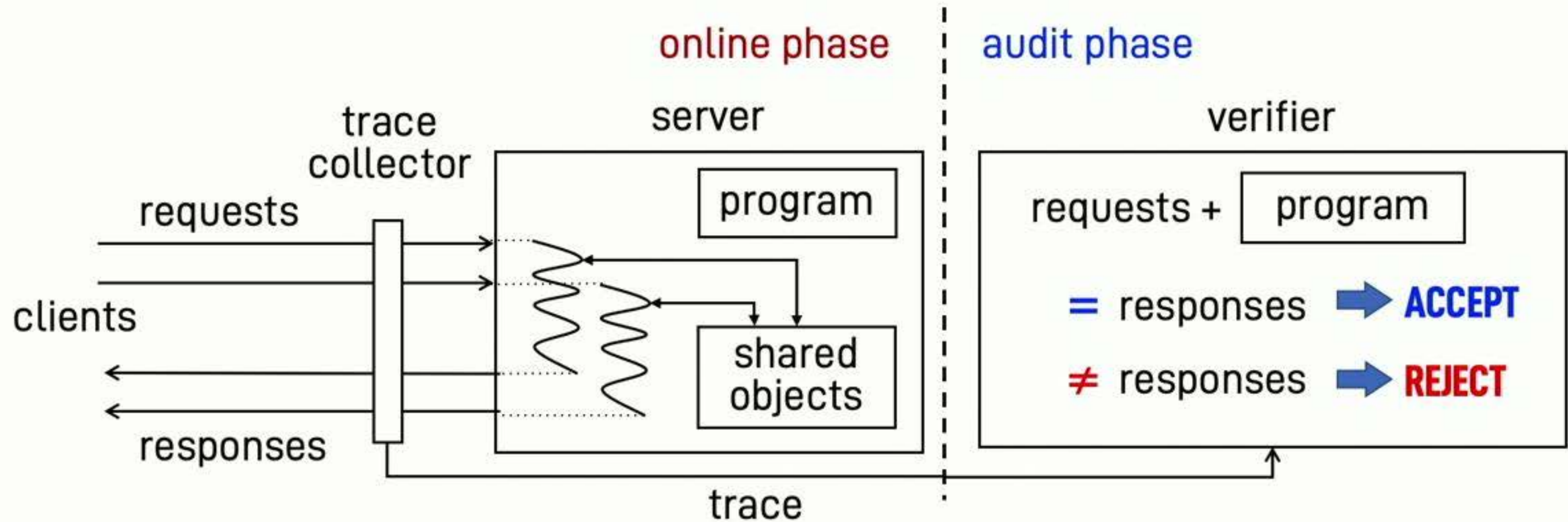


# The Efficient Server Audit Problem



1. server can behave arbitrarily

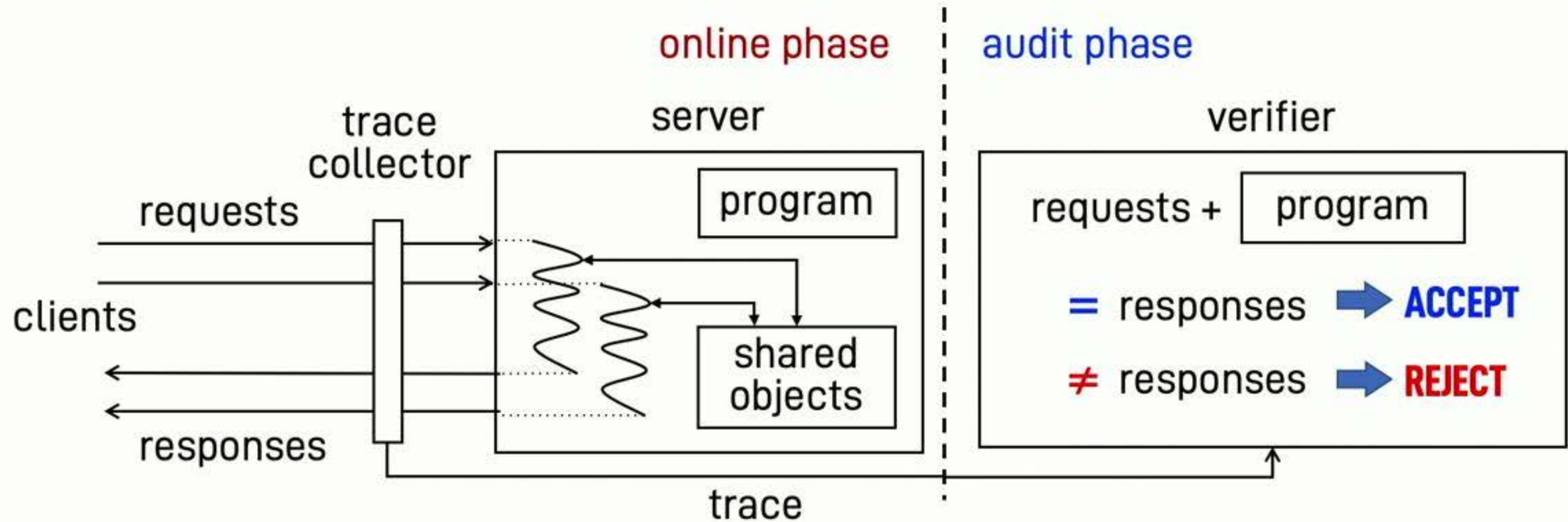
# The Efficient Server Audit Problem



1. server can behave arbitrarily
2. server is concurrent

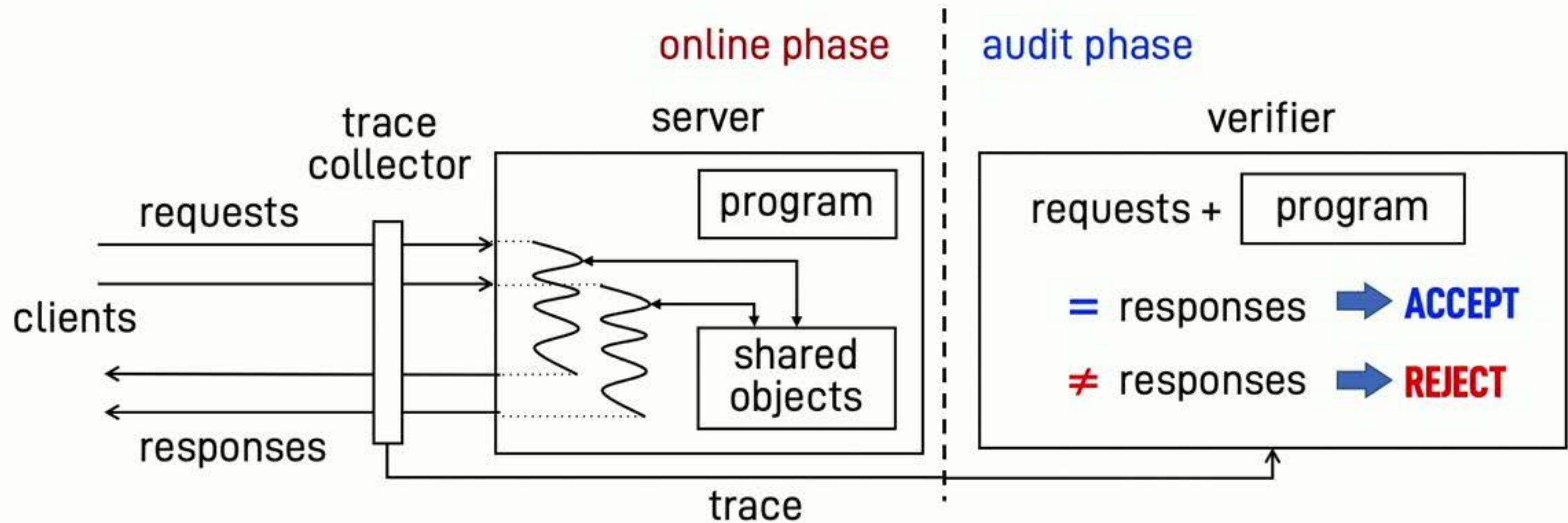


# The Efficient Server Audit Problem



1. server can behave arbitrarily
2. server is concurrent
3. verifier requires less computation power than server

# The Efficient Server Audit Problem

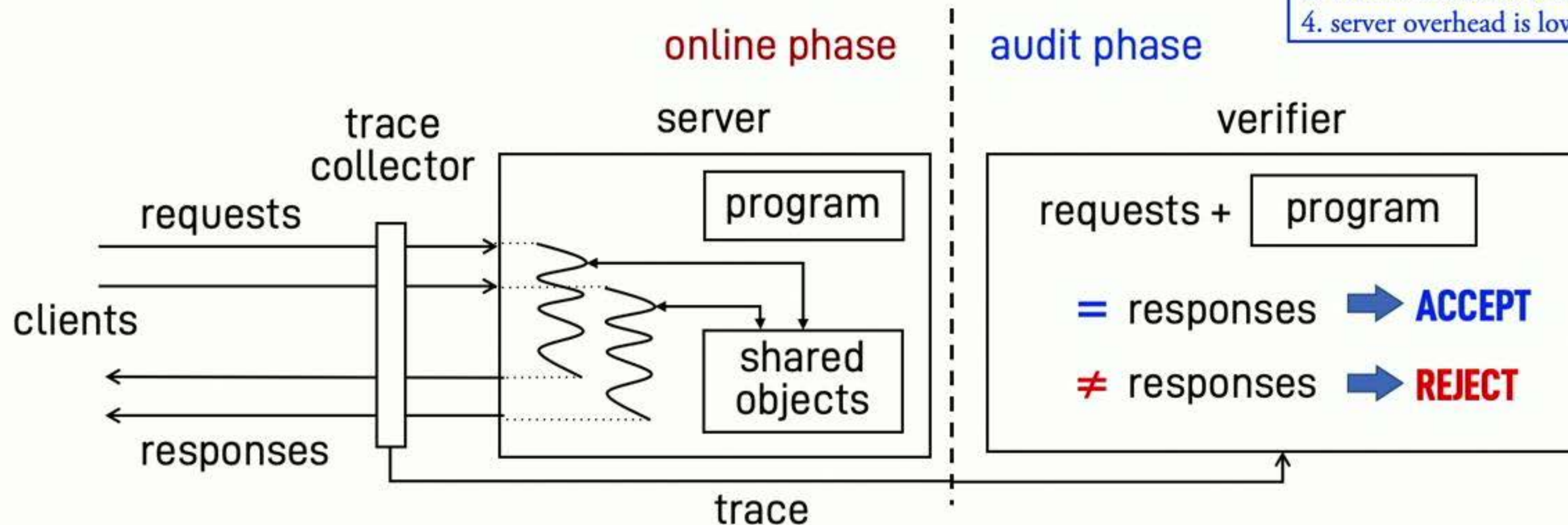


1. server can behave arbitrarily
2. server is concurrent
3. verifier requires less computation power than server
4. server overhead is low; legacy applications supported



# The Efficient Server Audit Problem

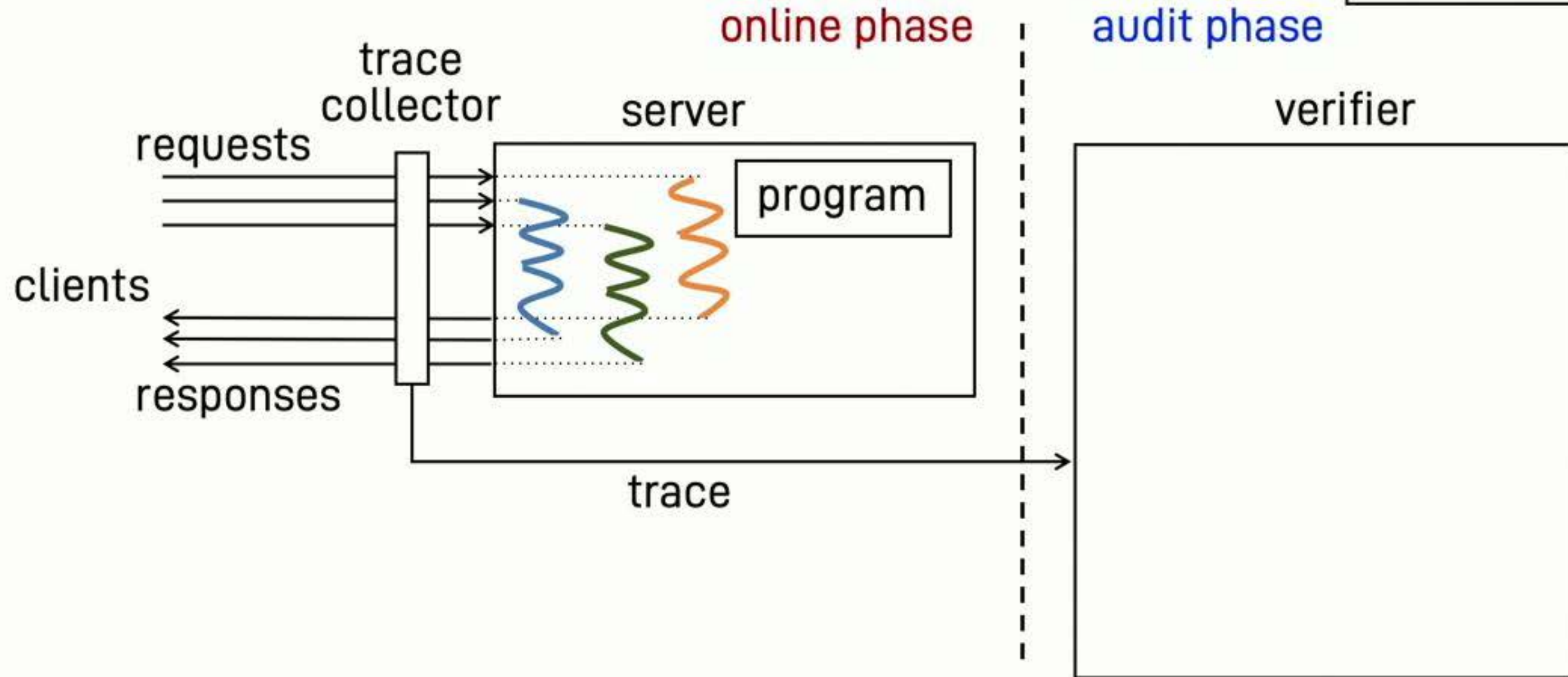
1. server is untrusted...
2. server is concurrent
3. verifier is weaker than server
4. server overhead is low...



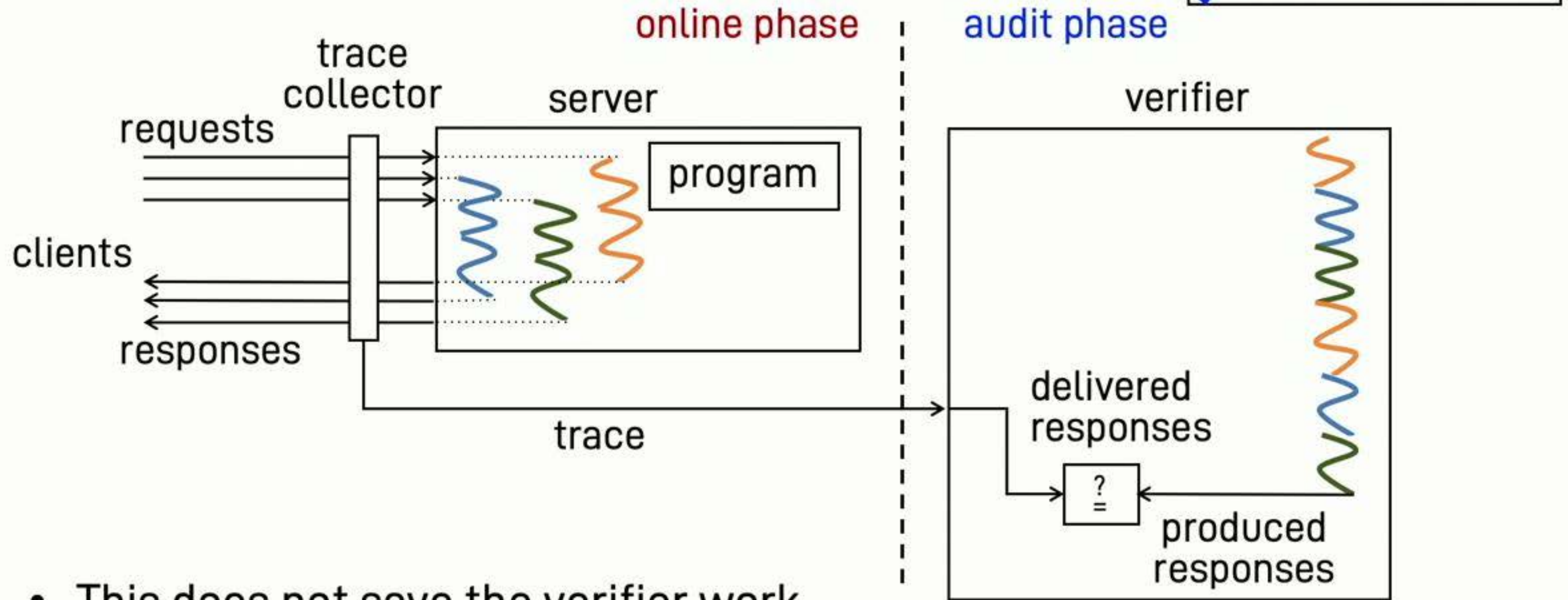


# What about naive re-execution?

1. server is untrusted...
2. server is concurrent
3. verifier is weaker than server
4. server overhead is low...



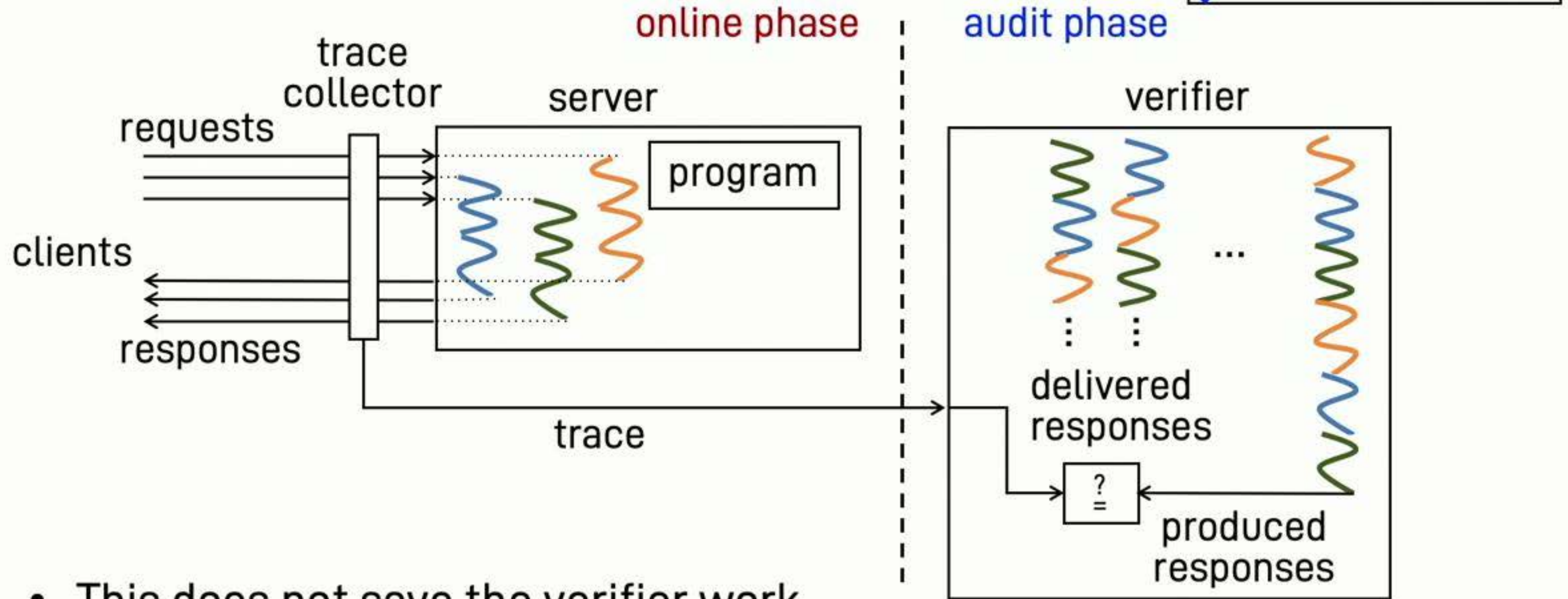
# What about naive re-execution?



- This does not save the verifier work.



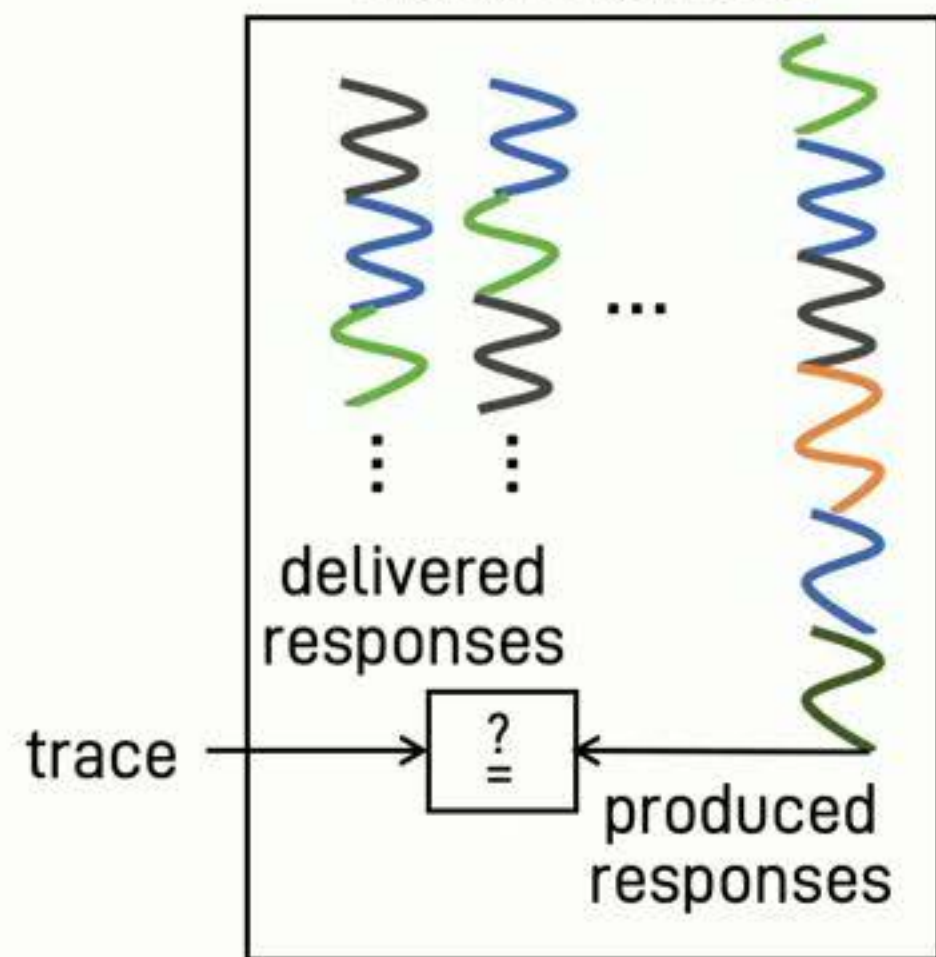
# What about naive re-execution?

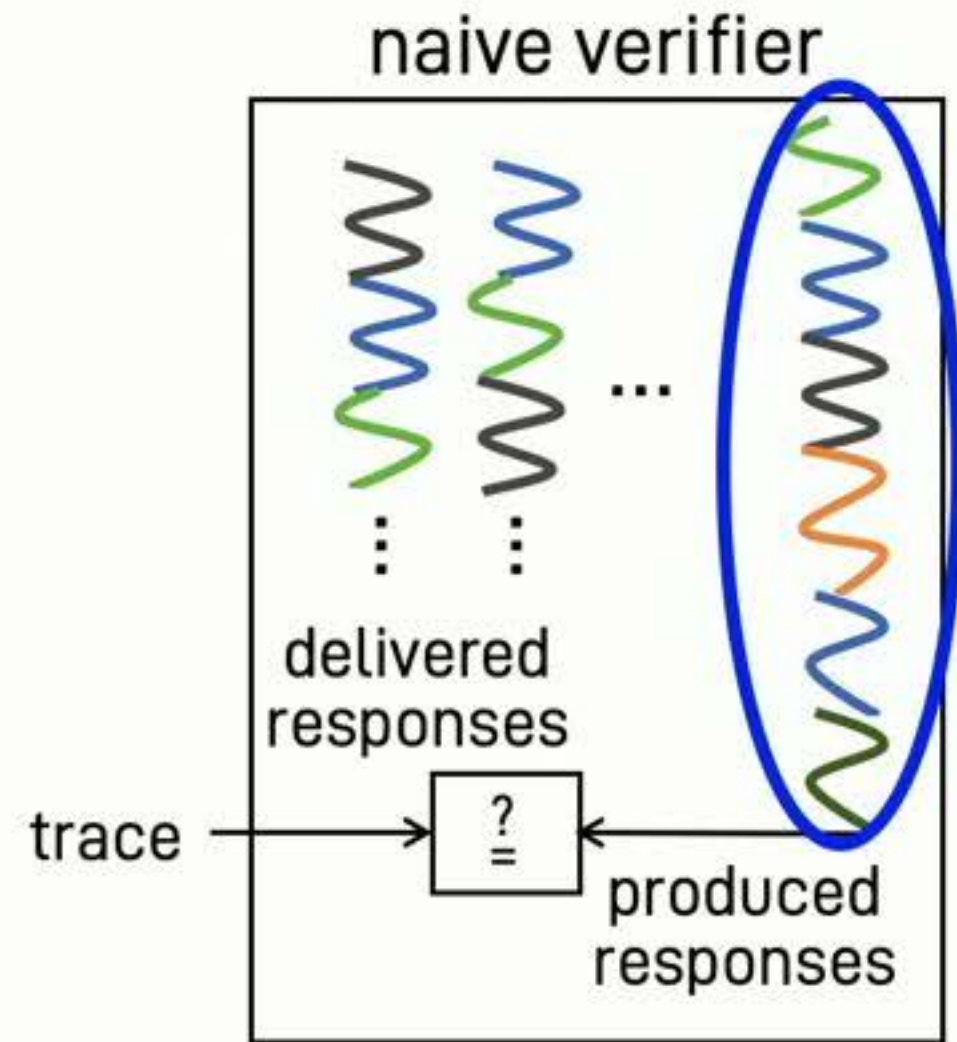


- This does not save the verifier work.
- Due to concurrency, verifier must explore many schedules.



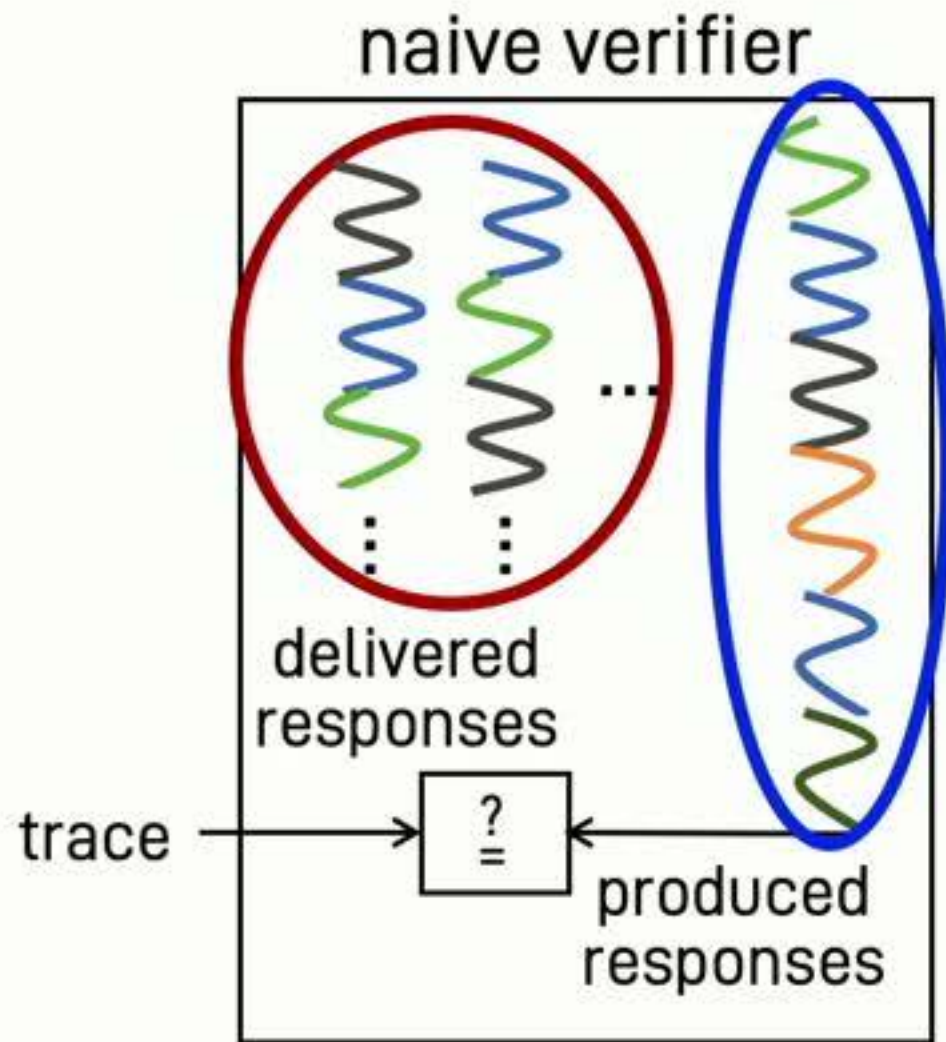
# naive verifier





Problem: naive re-execution doesn't save work

Proposal: (somehow) accelerate re-execution



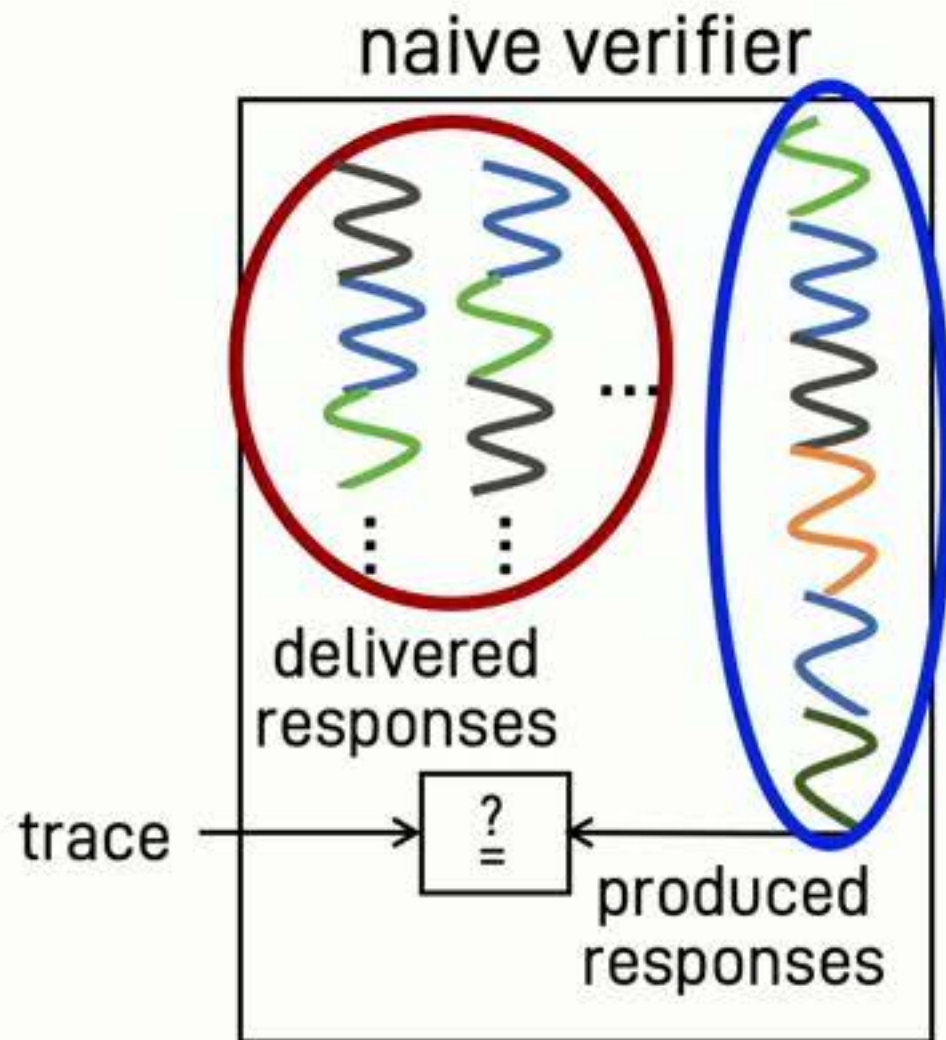
Problem: naive re-execution doesn't save work

Proposal: (somehow) accelerate re-execution

Problem: many schedules to explore

Proposal: ask server for advice, use-and-check it





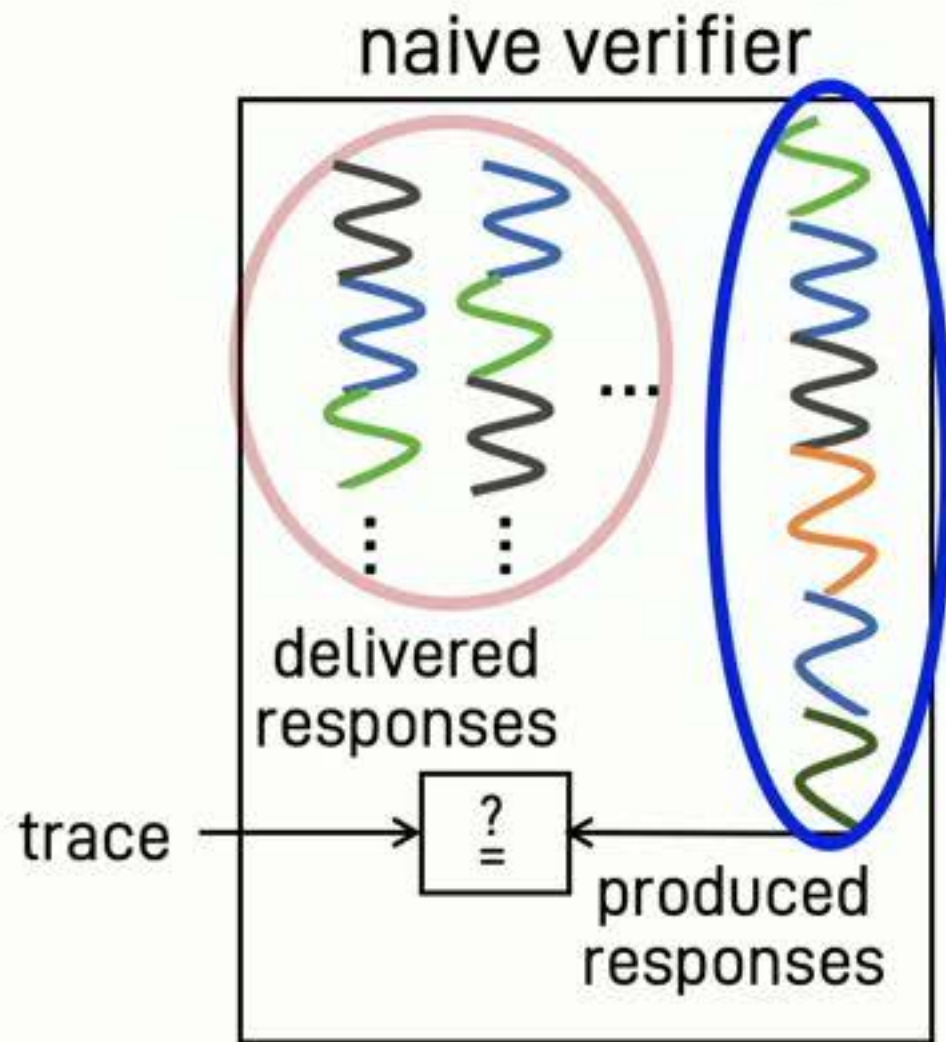
Problem: naive re-execution doesn't save work

Proposal: (somehow) accelerate re-execution



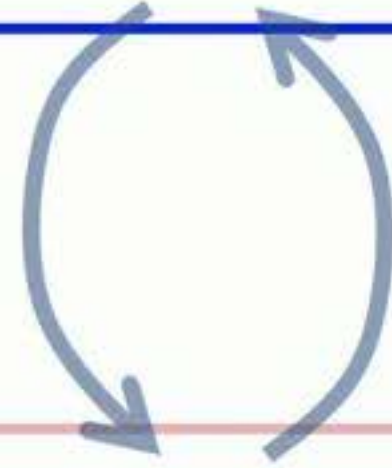
Problem: many schedules to explore

Proposal: ask server for advice, use-and-check it



Problem: naive re-execution doesn't save work

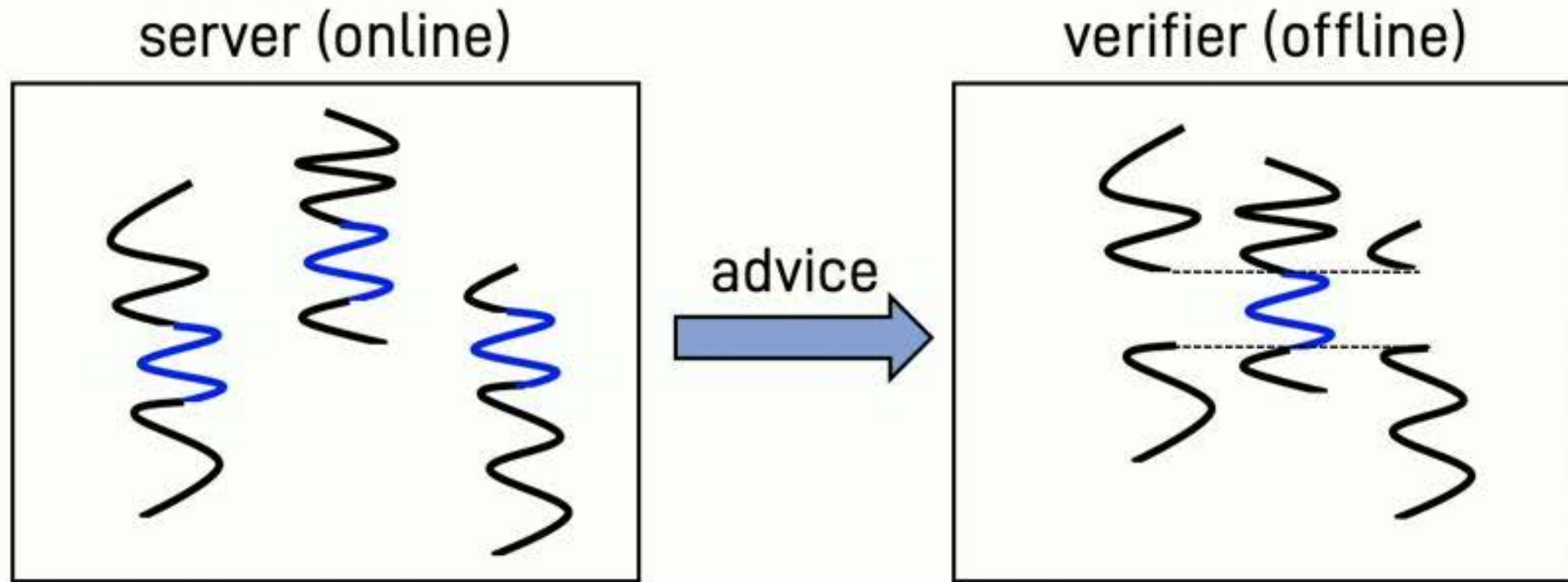
Proposal: (somehow) accelerate re-execution



Problem: many schedules to explore

Proposal: ask server for advice, use-and-check it

# Accelerating re-execution: a 30,000-foot view



deduplicate computation across requests



# An observation: repeated computation

web app:  
HotCRP

page 1

**Title**  
My paper

**Submission** (PDF, max 100MB)  
 400kB ⌚ 9 Oct 2017 1:59:08pm EDT ·


Replace:  No file chosen

**Authors**  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

**Name**  
1.   
2.

page 2

**Title**  
Another Paper

**Submission** (PDF, max 100MB)  
 400kB ⌚ 9 Oct 2017 12:56:56pm EDT ·

Replace:  No file chosen

**Authors**  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

**Name**  
1.   
2.

# An observation: repeated computation

web app:  
HotCRP

page 1

**Title**  
My paper

**Submission** (PDF, max 100MB)  
 400kB ⌚ 9 Oct 2017 1:59:08pm EDT ·

Replace:  No file chosen

**Authors**  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

**Name**

1. Lingfan Yu

2.

page 2

**Title**  
Another Paper

**Submission** (PDF, max 100MB)  
 400kB ⌚ 9 Oct 2017 12:56:56pm EDT ·

Replace:  No file chosen

**Authors**  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

**Name**

1. Cheng Tan

2.

# An observation: repeated computation

web app:  
HotCRP

page 1

**Title**  
My paper

**Submission** (PDF, max 100MB)  
400kB 9 Oct 2017 1:59:08pm EDT

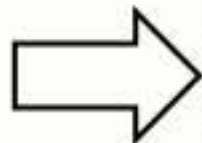
Replace:  No file chosen

**Authors**  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

**Name**

1. Lingfan Yu

2.



```
[4228] RetC    () { /home/cheng/orochi
[4229] PopC     () { /home/cheng/orochi
[4230] FPushClsMethodD () { /home/ch
[4231] FCall    () { /home/cheng/orochi
[4232] String   (Navigation::page) {
[4233] String   (Navigation::page) {
[4234] AGetC    (Navigation::page) { /
[4235] CGetS    (Navigation::page) { /
[4236] RetC     (Navigation::page) { /h
[4237] UnboxR   () { /home/cheng/orochi
[4238] String   () { /home/cheng/orochi
[4239] NSame    () { /home/cheng/orochi
[4240] JmpZ     () { /home/cheng/orochi
[4241] FPushClsMethodD () { /home/ch
[4242] FCall    () { /home/cheng/orochi
[4243] String   (Navigation::page) {
[4244] String   (Navigation::page) {
```

page 2

**Title**  
Another Paper

**Submission** (PDF, max 100MB)  
400kB 9 Oct 2017 12:56:56pm EDT

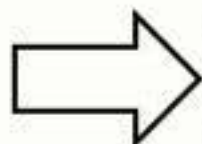
Replace:  No file chosen

**Authors**  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

**Name**

1. Cheng Tan

2.



```
[4228] RetC    () { /home/cheng/orochi
[4229] PopC     () { /home/cheng/orochi
[4230] FPushClsMethodD () { /home/ch
[4231] FCall    () { /home/cheng/orochi
[4232] String   (Navigation::page) {
[4233] String   (Navigation::page) {
[4234] AGetC    (Navigation::page) { /
[4235] CGetS    (Navigation::page) { /
[4236] RetC     (Navigation::page) { /h
[4237] UnboxR   () { /home/cheng/orochi
[4238] String   () { /home/cheng/orochi
[4239] NSame    () { /home/cheng/orochi
[4240] JmpZ     () { /home/cheng/orochi
[4241] FPushClsMethodD () { /home/ch
[4242] FCall    () { /home/cheng/orochi
[4243] String   (Navigation::page) {
[4244] String   (Navigation::page) {
```

have the same control flow



# An observation: repeated computation

web app:  
HotCRP

page 1

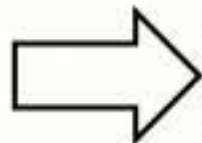
Title  
**My paper**

Submission (PDF, max 100MB)  
400kB 9 Oct 2017 1:59:08pm EDT

Replace:  No file chosen

Authors  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

Name  
1. **Lingfan Yu**  
2.



```
[4228] RetC    () { /home/cheng/orochi  
[4229] PopC    () { /home/cheng/orochi  
[4230] FPushC sMethodD () { /home/ch  
[4231] FCall   () { /home/cheng/orochi  
[4232] String  (Navigation::page) {  
[4233] String  (Navigation::page) {  
[4234] AGetC   (Navigation::page) { /  
[4235] CGetS   (Navigation::page) { /  
[4236] RetC    (Navigation::page) { /h  
[4237] UnboxR  () { /home/cheng/oroch  
[4238] String  () { /home/cheng/oroch  
[4239] NSame   () { /home/cheng/oroch  
[4240] JmpZ    () { /home/cheng/orochi  
[4241] FPushC sMethodD () { /home/ch  
[4242] FCall   () { /home/cheng/oroch  
[4243] String  (Navigation::page) {  
[4244] String  (Navigation::page) {
```

e.g., **opcode** **operands**  
**ADD** **1, 2**

page 2

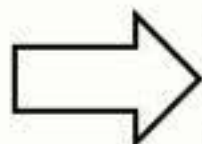
Title  
**Another Paper**

Submission (PDF, max 100MB)  
400kB 9 Oct 2017 12:56:56pm EDT

Replace:  No file chosen

Authors  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

Name  
1. **Cheng Tan**  
2.



```
[4228] RetC    () { /home/cheng/orochi  
[4229] PopC    () { /home/cheng/orochi  
[4230] FPushC sMethodD () { /home/ch  
[4231] FCall   () { /home/cheng/orochi  
[4232] String  (Navigation::page) {  
[4233] String  (Navigation::page) {  
[4234] AGetC   (Navigation::page) { /  
[4235] CGetS   (Navigation::page) { /  
[4236] RetC    (Navigation::page) { /h  
[4237] UnboxR  () { /home/cheng/oroch  
[4238] String  () { /home/cheng/oroch  
[4239] NSame   () { /home/cheng/oroch  
[4240] JmpZ    () { /home/cheng/orochi  
[4241] FPushC sMethodD () { /home/ch  
[4242] FCall   () { /home/cheng/oroch  
[4243] String  (Navigation::page) {  
[4244] String  (Navigation::page) {
```

have the **same control flow**



# An observation: repeated computation

web app:  
HotCRP

page 1

Title  
**My paper**

Submission (PDF, max 100MB)  
400kB 9 Oct 2017 1:59:08pm EDT

Replace:  No file chosen

Authors  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

Name  
1. **Lingfan Yu**  
2.

page 2

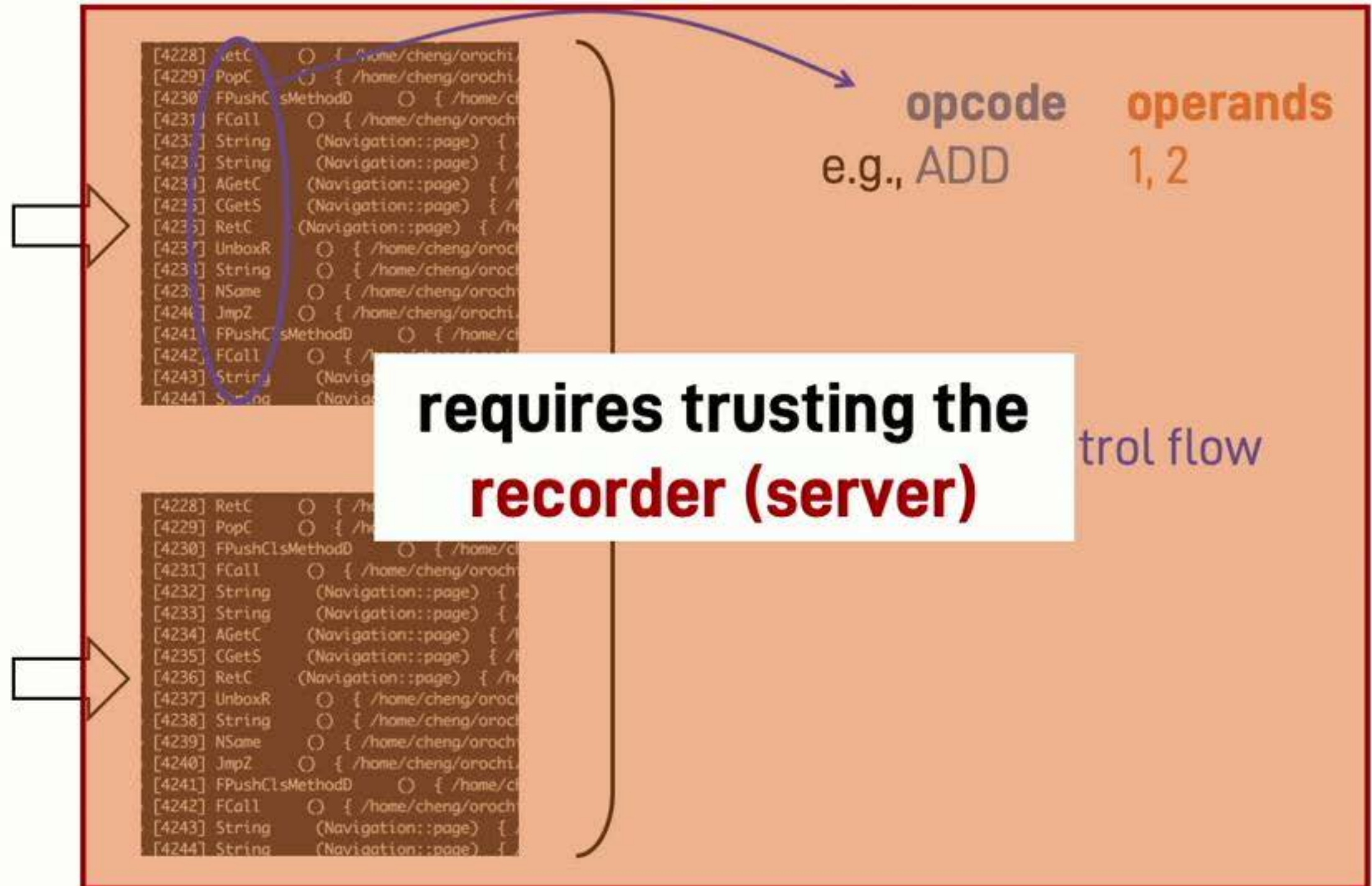
Title  
**Another Paper**

Submission (PDF, max 100MB)  
400kB 9 Oct 2017 12:56:56pm EDT

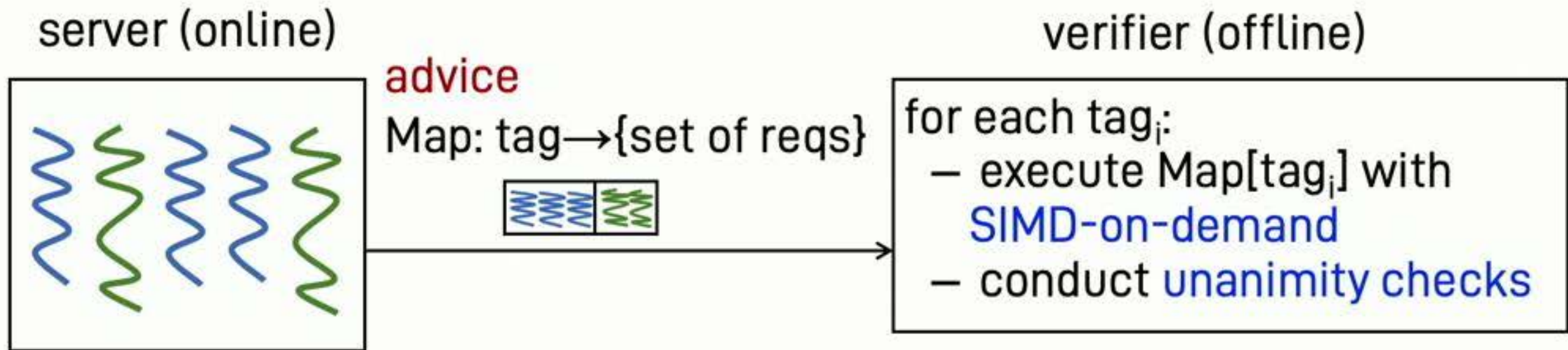
Replace:  No file chosen

Authors  
List the authors one per line, including email address. Reviewers will not be able to see author information. Any author can edit the submission.

Name  
1. **Cheng Tan**  
2.

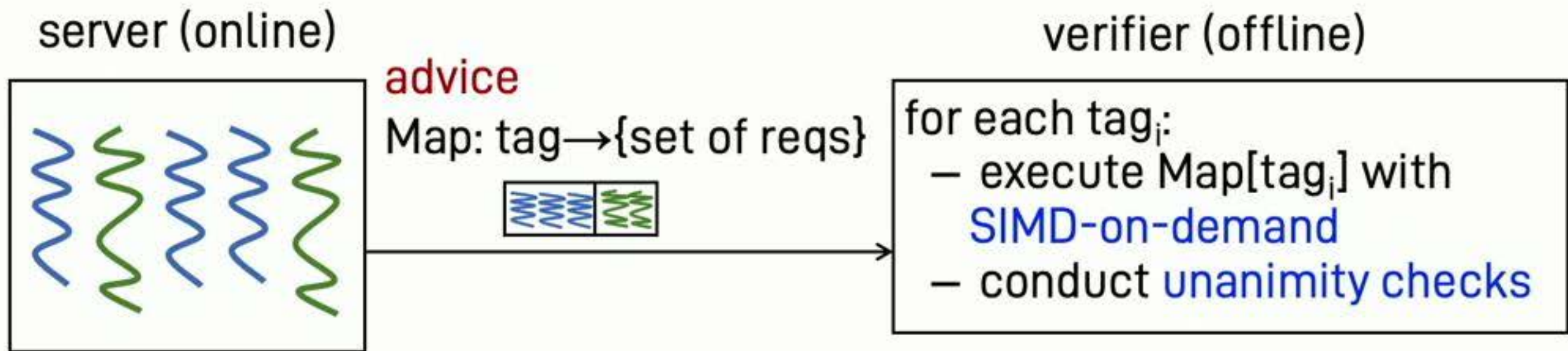


# Accelerate re-execution without trusting the server

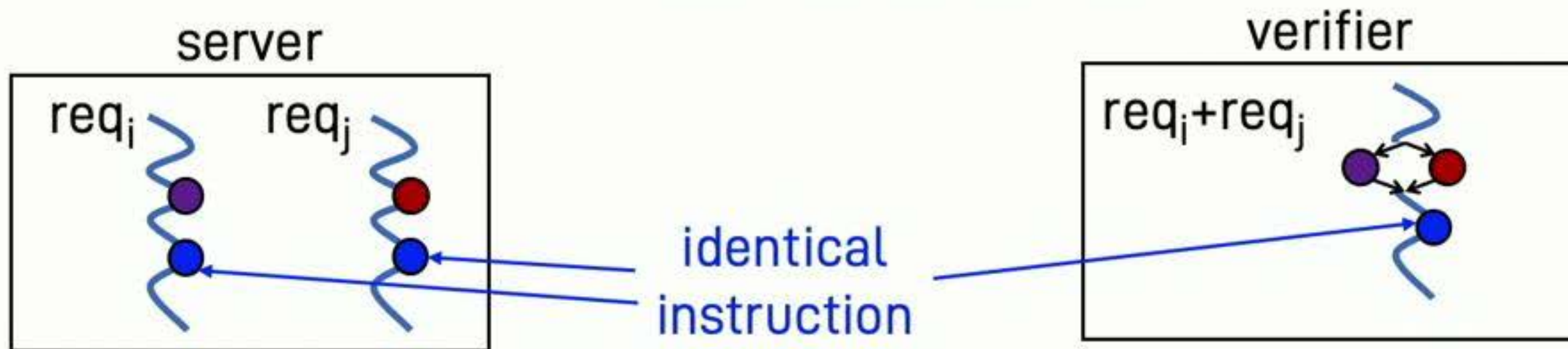




# Accelerate re-execution without trusting the server



- SIMD-on-demand re-executes **identical instructions** once.



# SIMD-on-demand eliminates redundant computation

```
main(a, b):  
  c ← a * b  
  c ← c + 1
```

req<sub>1</sub>: a=1; b=2

req<sub>2</sub>: a=2; b=1

# SIMD-on-demand eliminates redundant computation

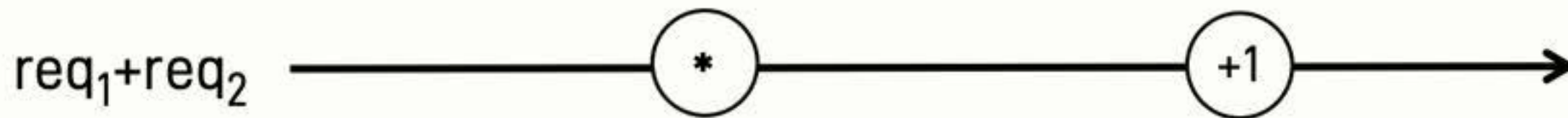
```
main(a, b):
```

```
  c ← a * b
```

```
  c ← c + 1
```

req<sub>1</sub>: a=1; b=2

req<sub>2</sub>: a=2; b=1





# SIMD-on-demand eliminates redundant computation

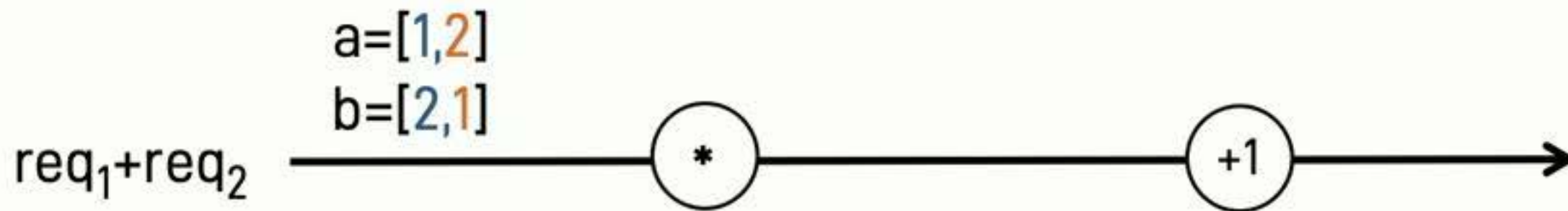
```
main(a, b):
```

```
  c ← a * b
```

```
  c ← c + 1
```

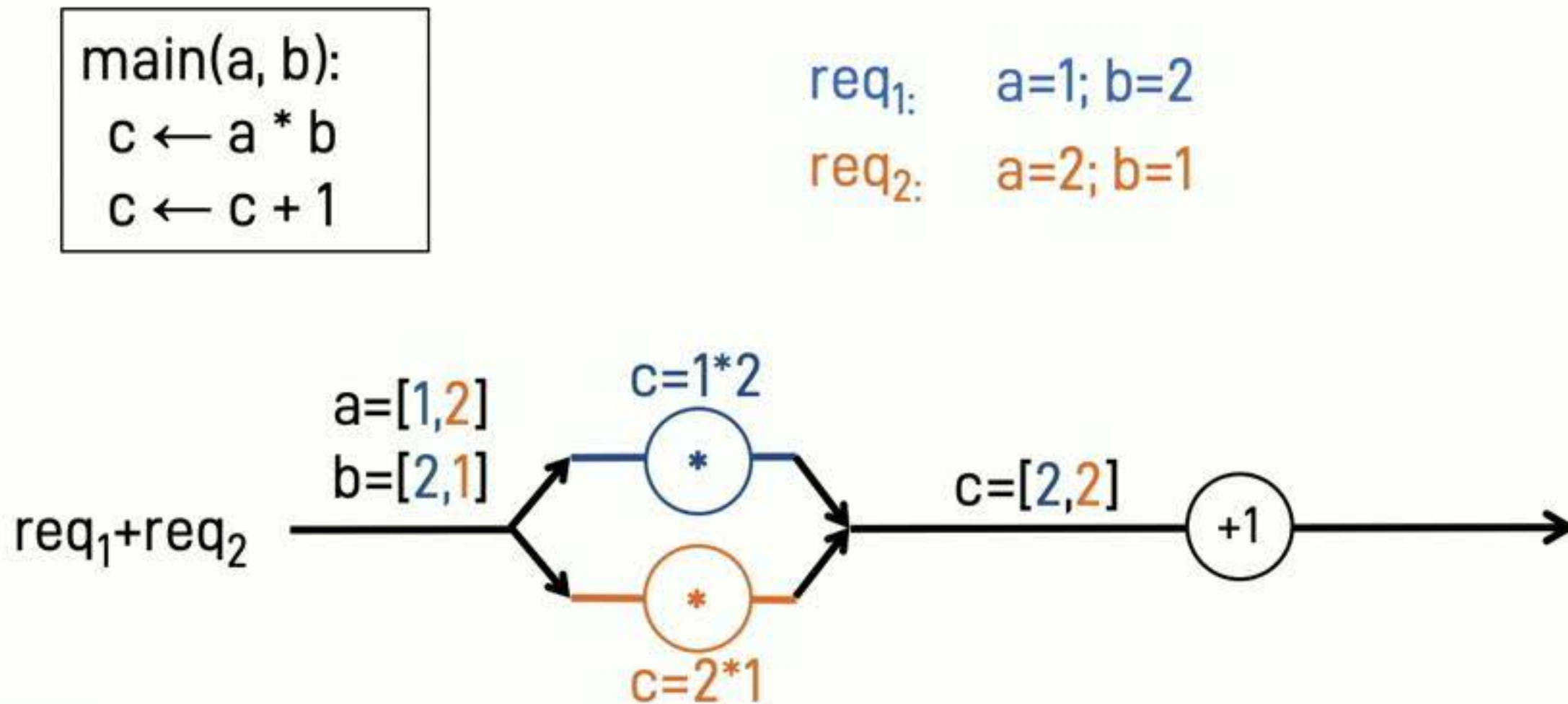
req<sub>1</sub>: a=1; b=2

req<sub>2</sub>: a=2; b=1



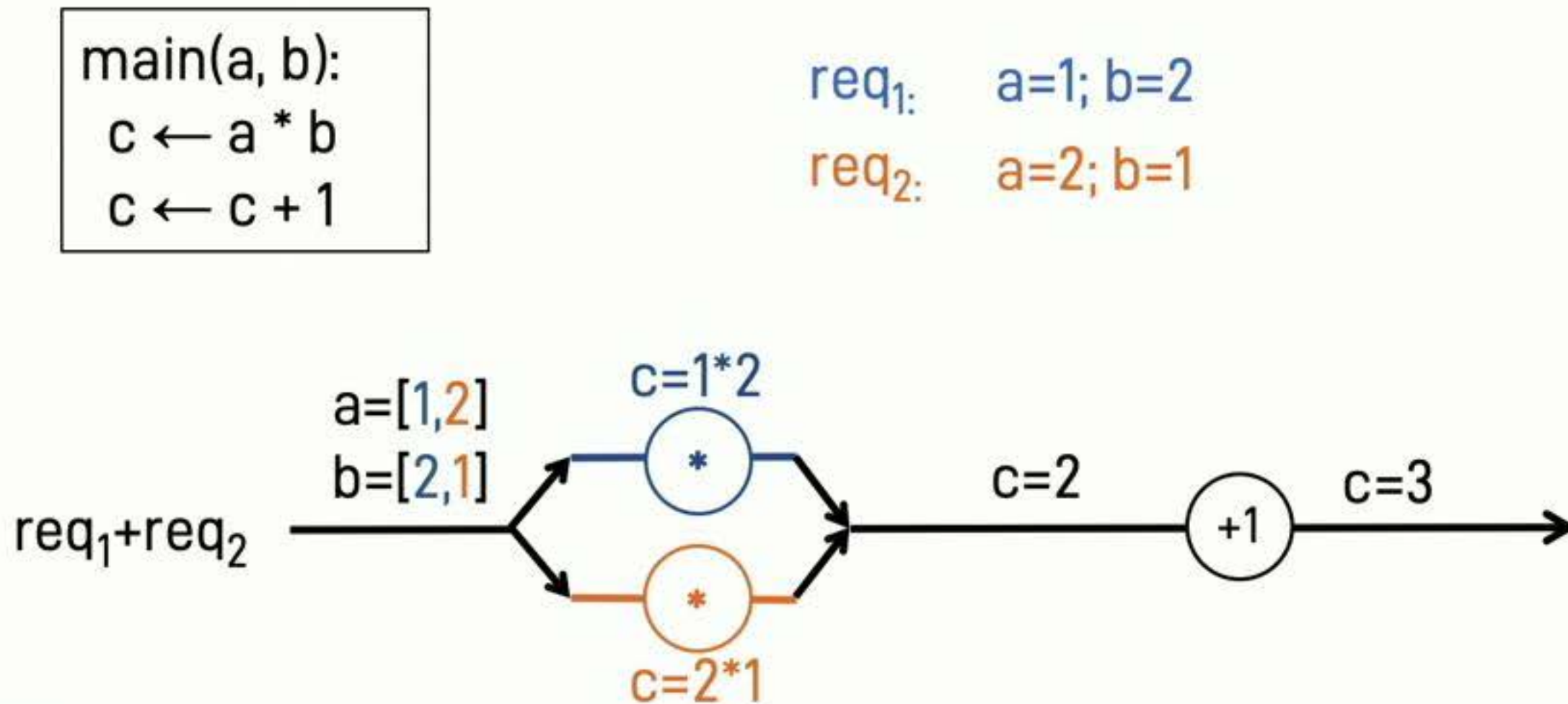
- **Multi-value** represents different values of the same variable.

# SIMD-on-demand eliminates redundant computation



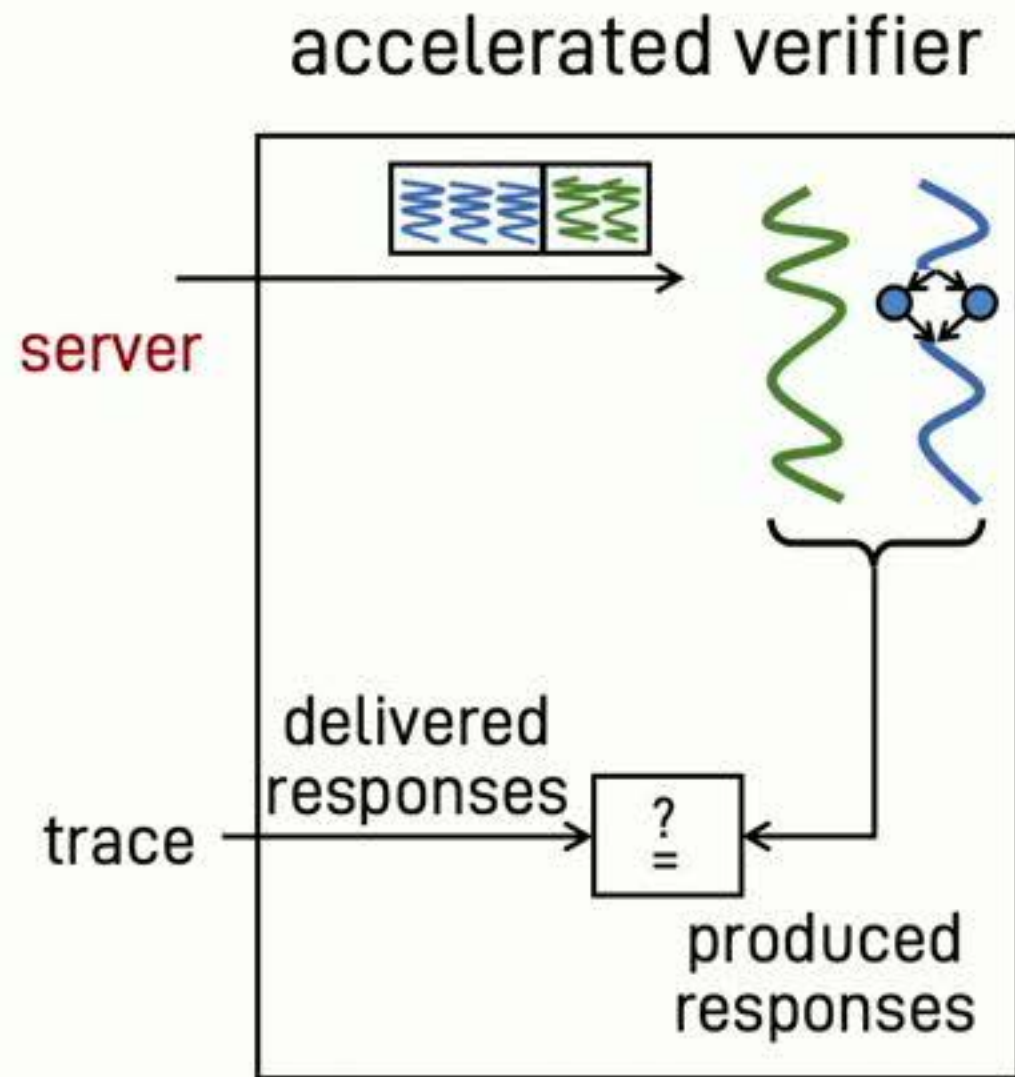
- **Multi-value** represents different values of the same variable.

# SIMD-on-demand eliminates redundant computation



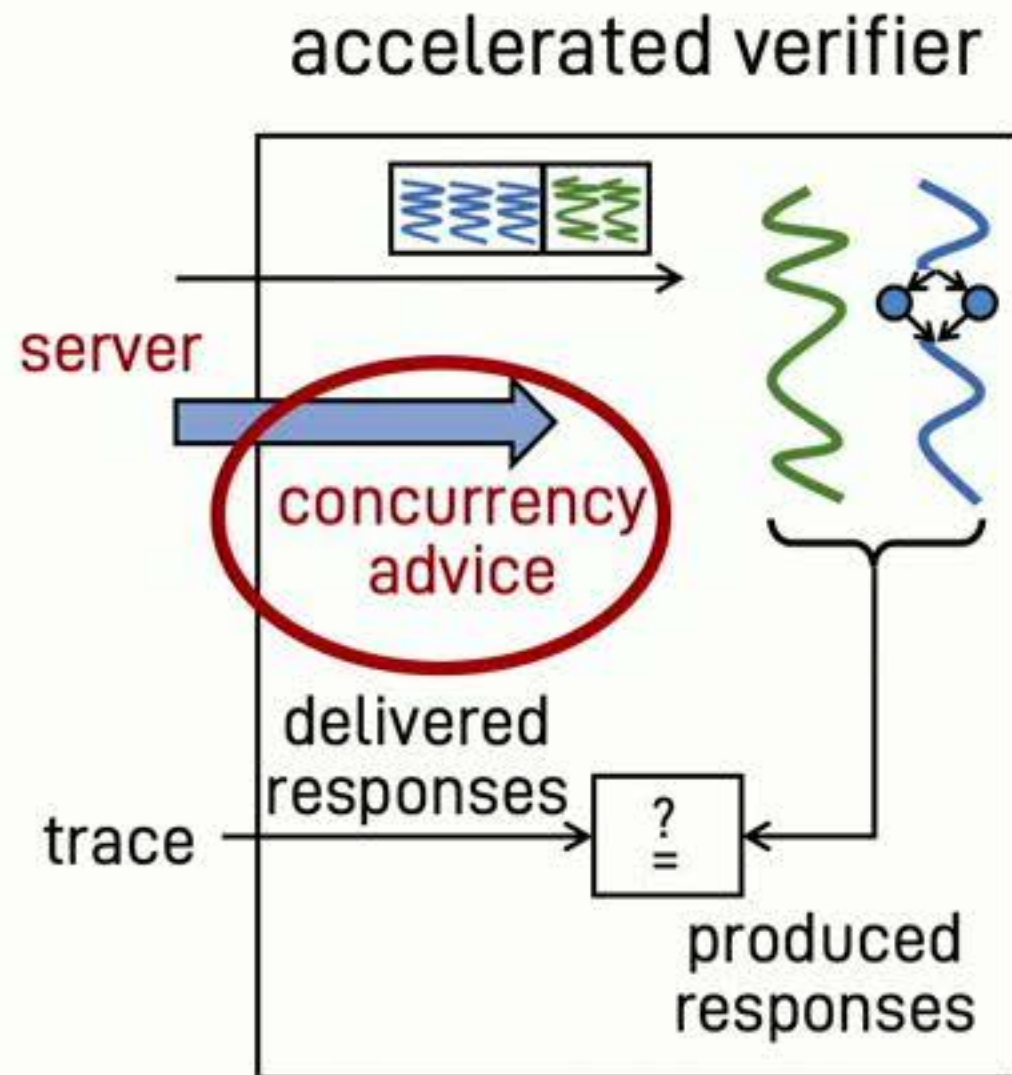
- **Multi-value** represents different values of the same variable.
- Verifier **collapses** multi-value to scalar if possible.





Problem: naive re-execution doesn't save work

Solution: deduplicated re-execution



Problem: naive re-execution doesn't save work

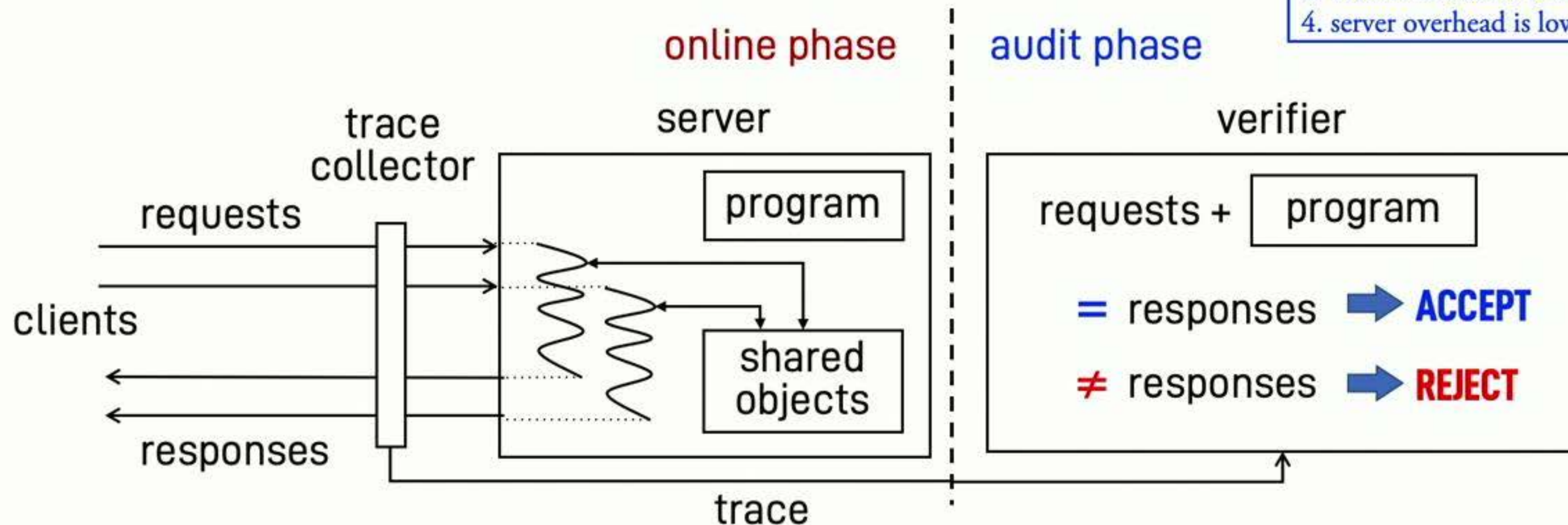
Solution: deduplicated re-execution

Problem: many schedules to explore

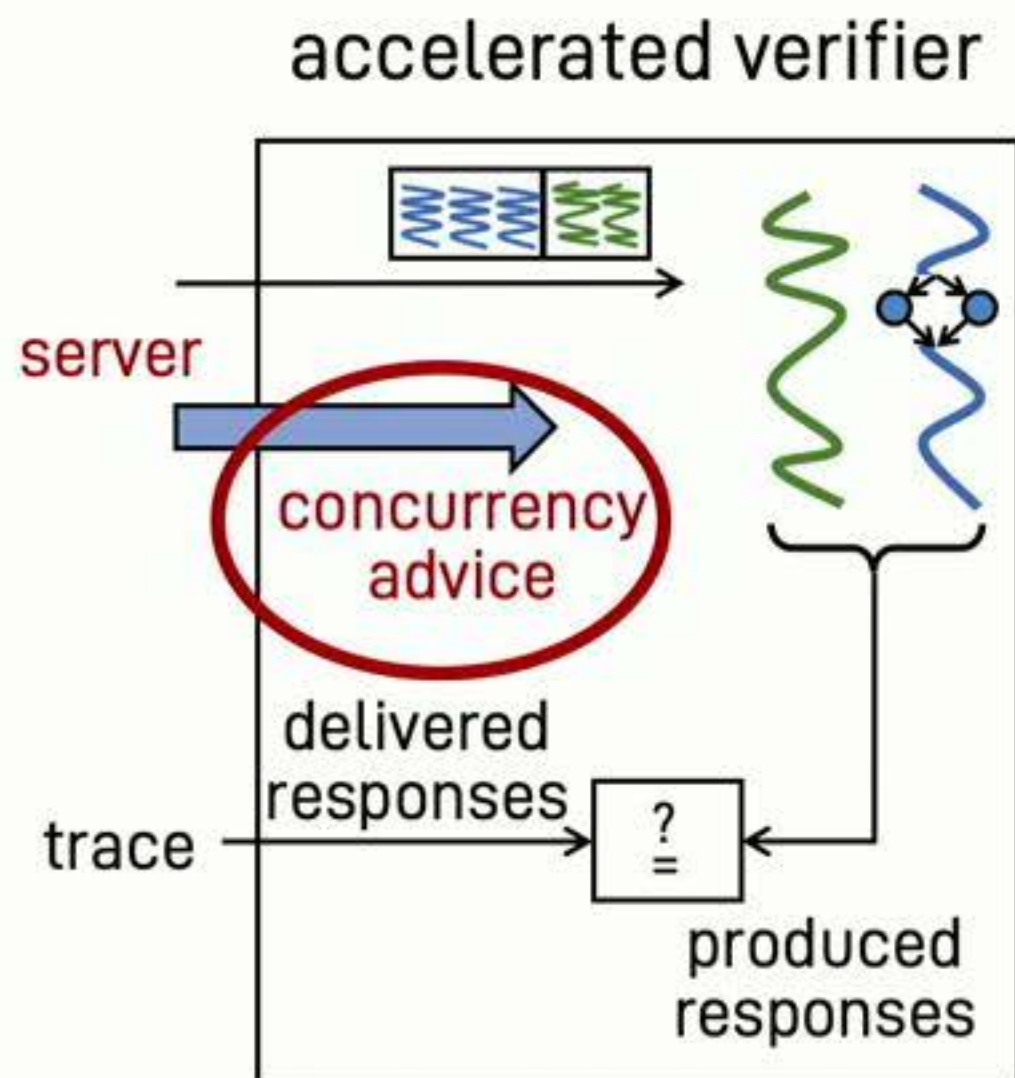
Proposal: (somehow) use but don't trust advice

# The Efficient Server Audit Problem

1. server is untrusted...
2. server is concurrent
3. verifier is weaker than server
4. server overhead is low...







Problem: naive re-execution doesn't save work

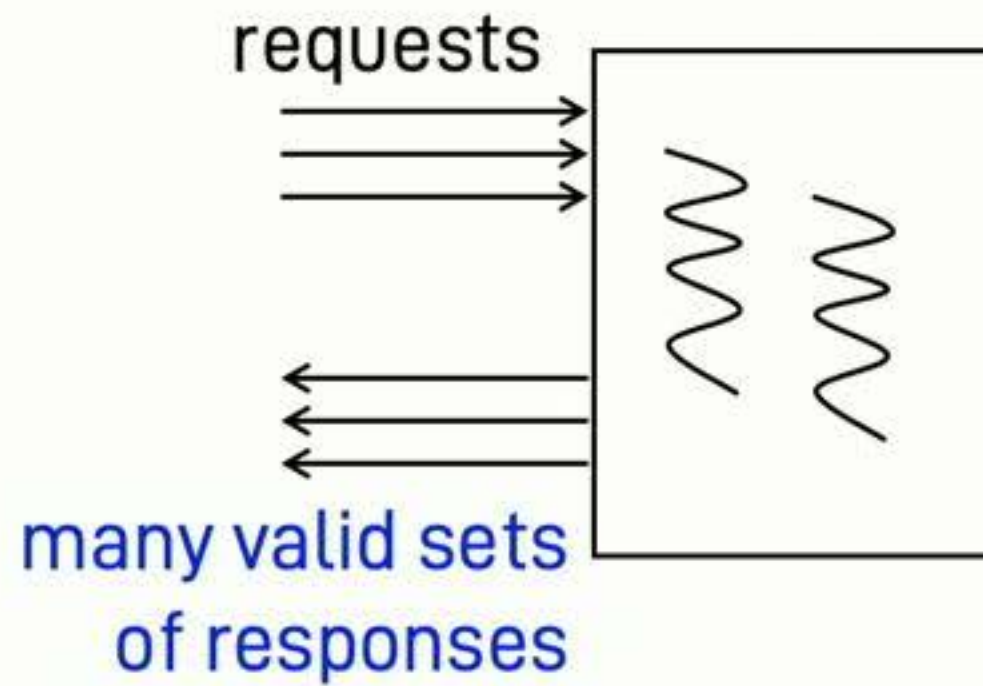
Solution: deduplicated re-execution

Problem: many schedules to explore

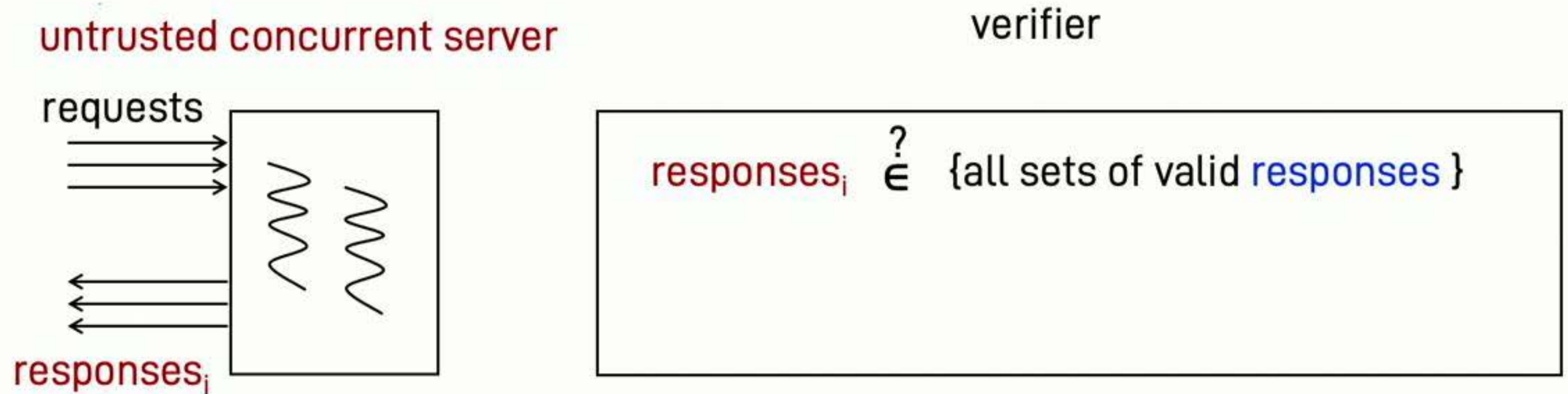
Proposal: (somehow) use but don't trust advice

# Concurrency and **untrusted server** are in tension

honest concurrent server

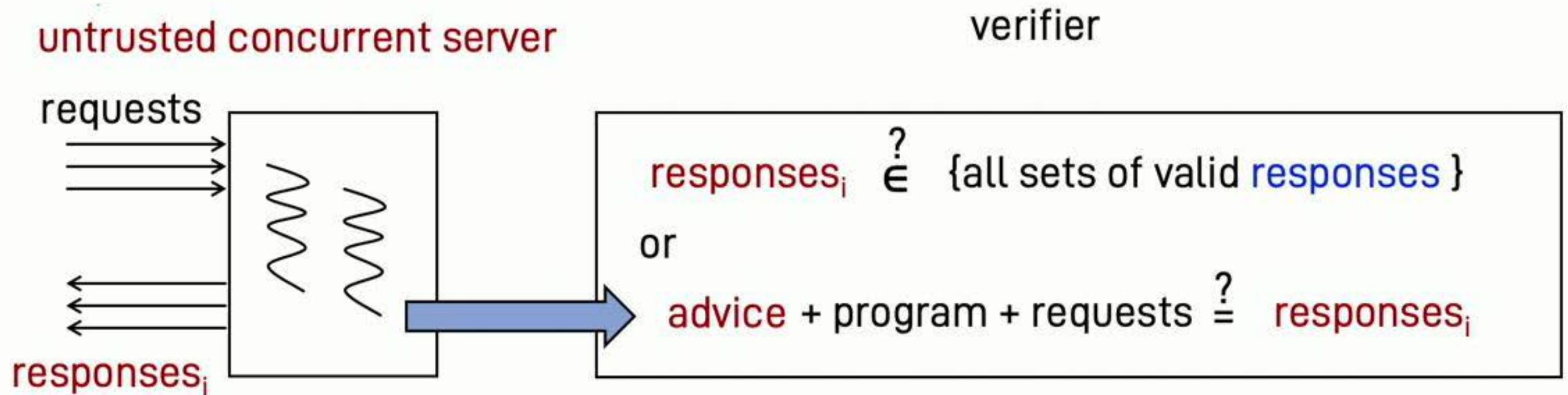


# Concurrency and **untrusted server** are in tension

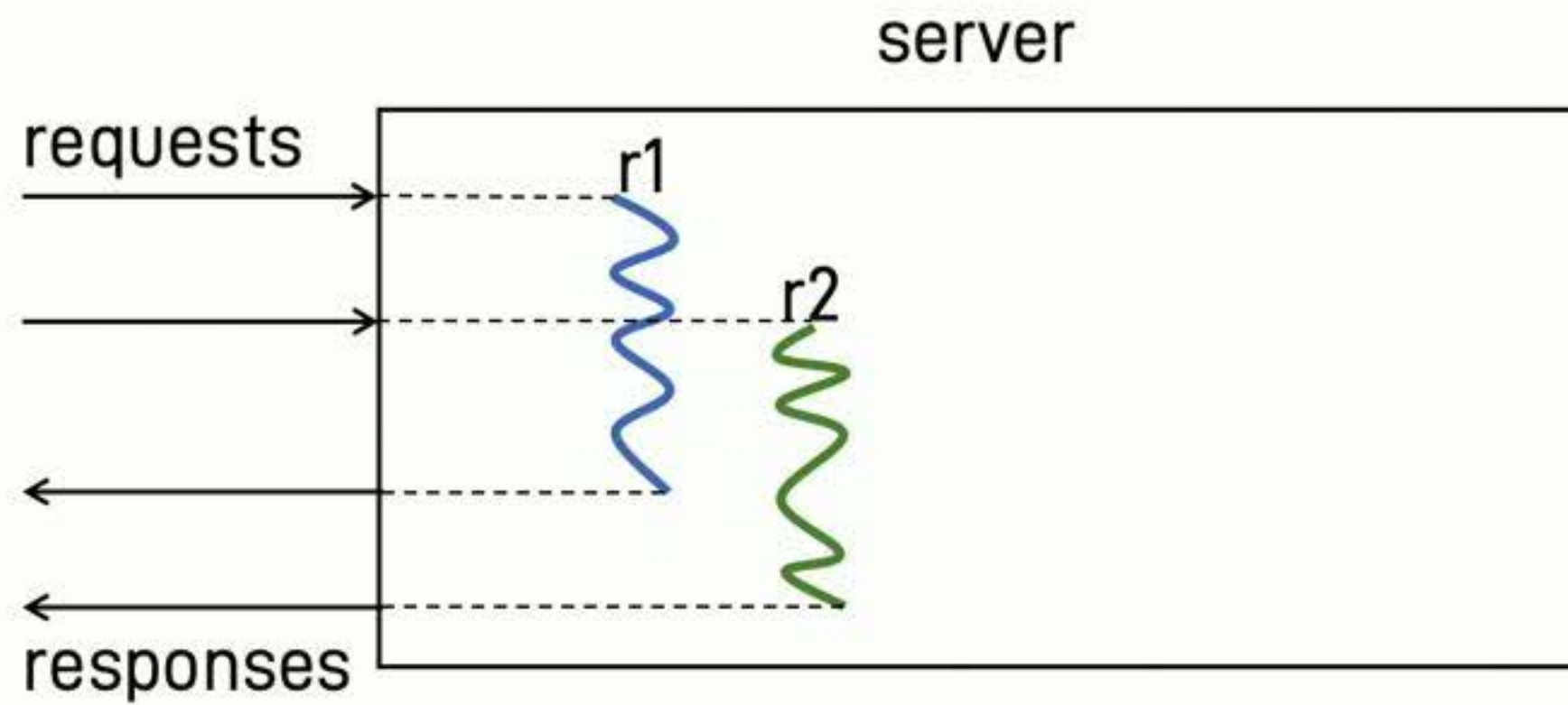




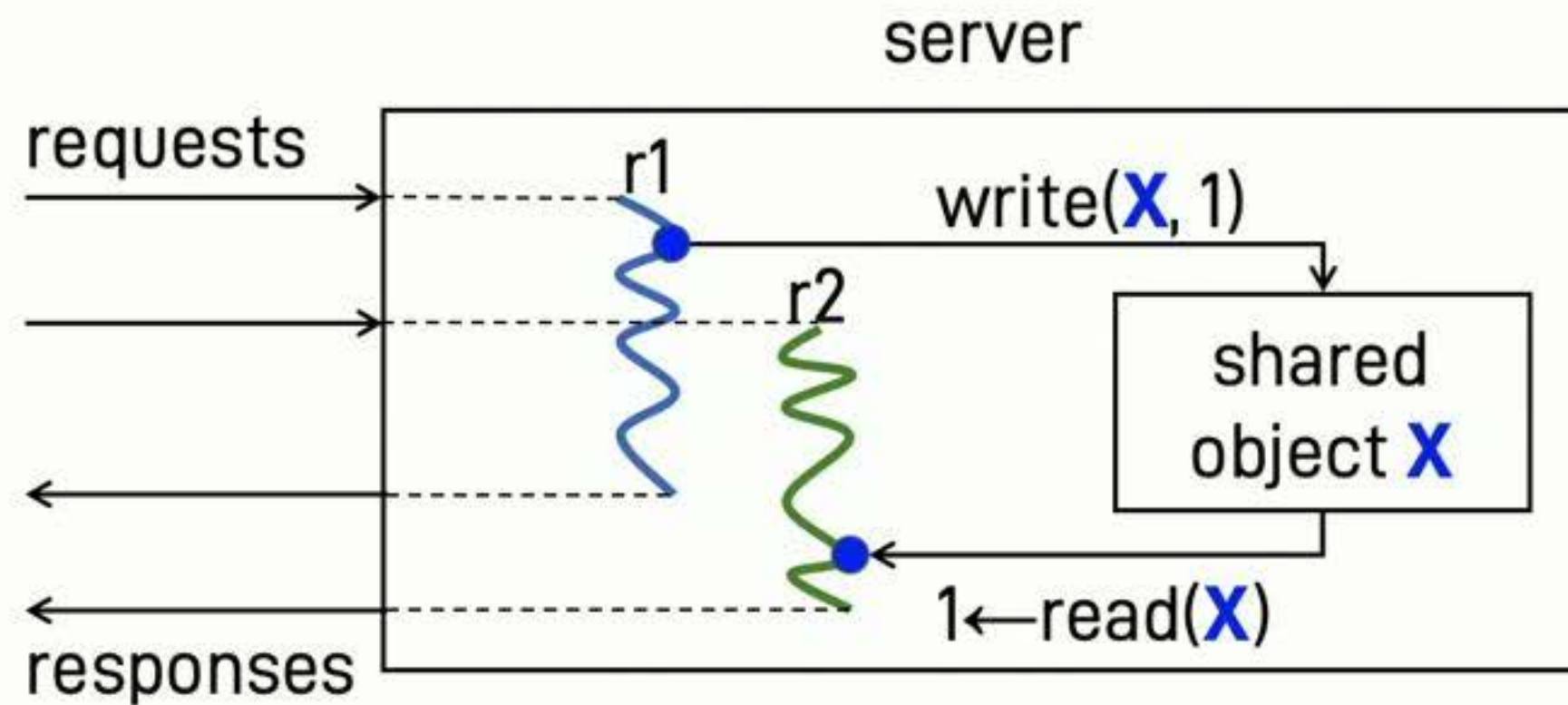
# Concurrency and **untrusted server** are in tension



# Concurrency model

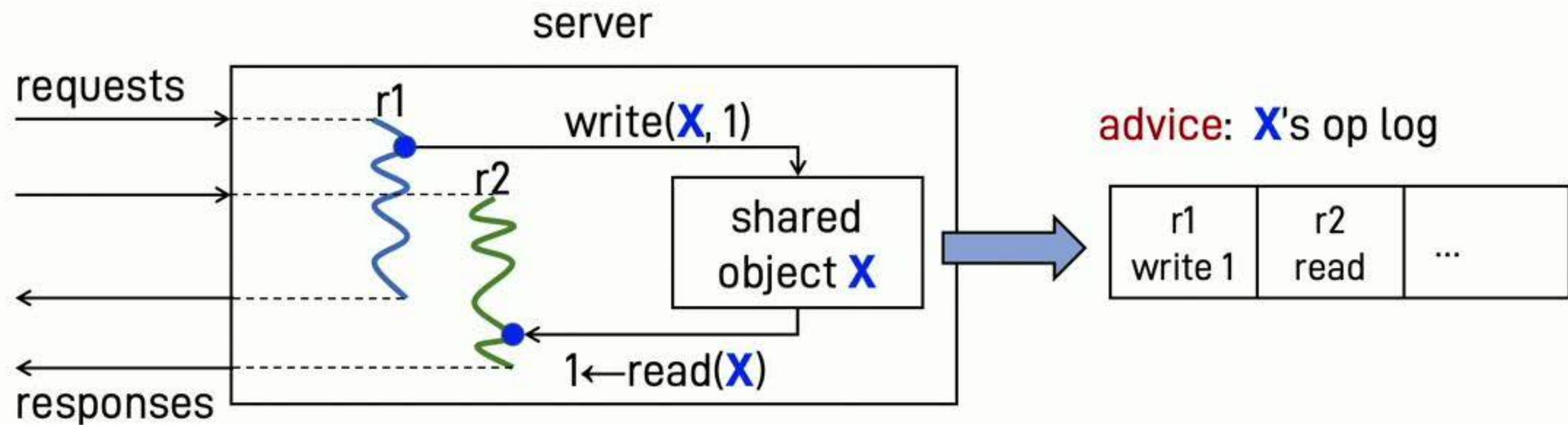


# Concurrency model

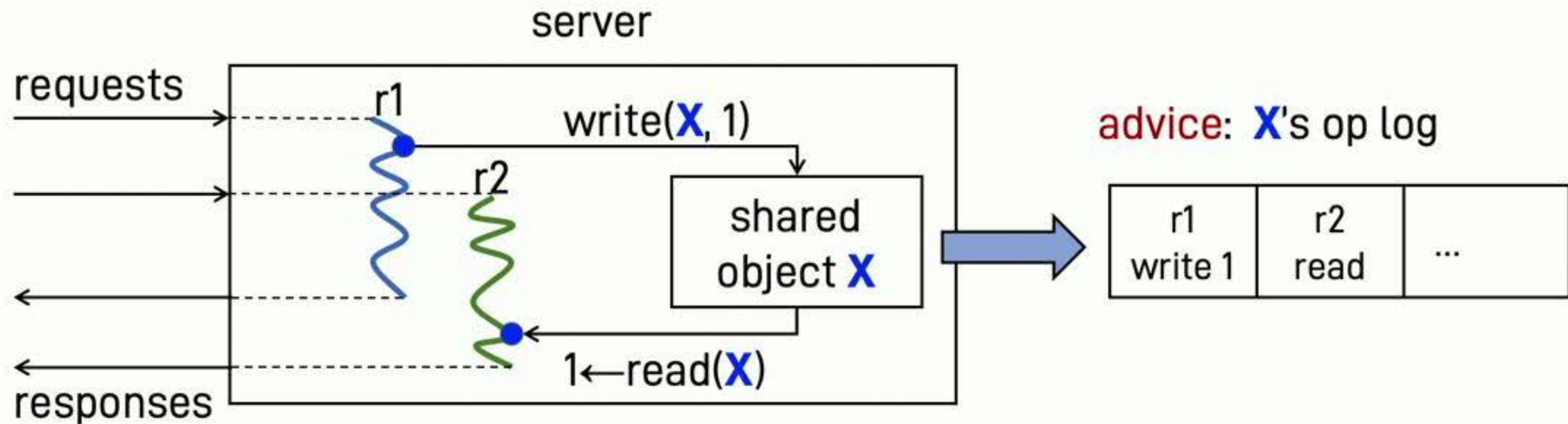




# Concurrency model



# Concurrency model



- What about simple re-execution according to op logs?

**X**=0, **Y**=0

trace

r1



```
...  
write(X, 1)  
...  
read(Y) → y  
...  
output(y)
```

server

r2



```
...  
write(Y, 1)  
...  
read(X) → x  
...  
output(x)
```



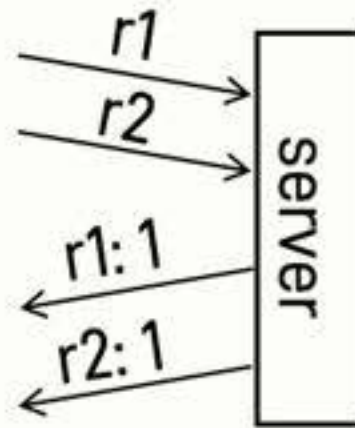
**X**=0, **Y**=0

r1



```
...  
write(X, 1)  
...  
read(Y) → y  
...  
output(y)
```

trace



r2



```
...  
write(Y, 1)  
...  
read(X) → x  
...  
output(x)
```

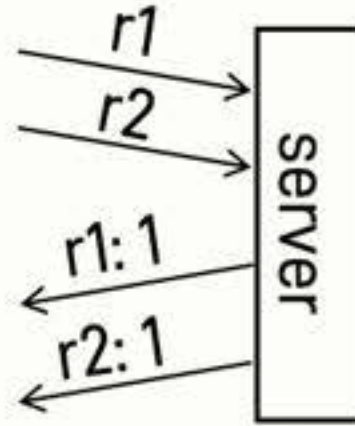
$X=0, Y=0$

r1



```
...  
write( $X$ , 1)  
...  
read( $Y$ )  $\rightarrow$  y  
...  
output(y)
```

trace



$X = 0, Y = 0$

**Accept**

r2



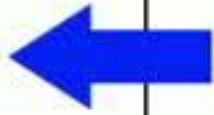
```
...  
write( $Y$ , 1)  
...  
read( $X$ )  $\rightarrow$  x  
...  
output(x)
```

$X=0, Y=0$

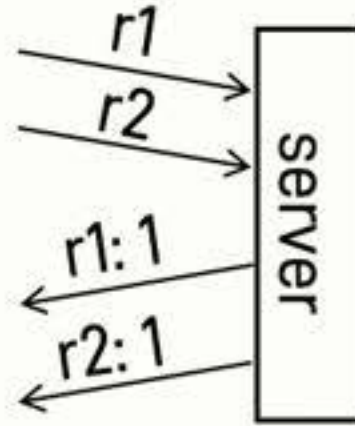
r1



```
...  
write(X, 1)  
...  
read(Y) → y  
...  
output(y)
```



trace



$X = 1, Y = 0$

**Accept**

r2

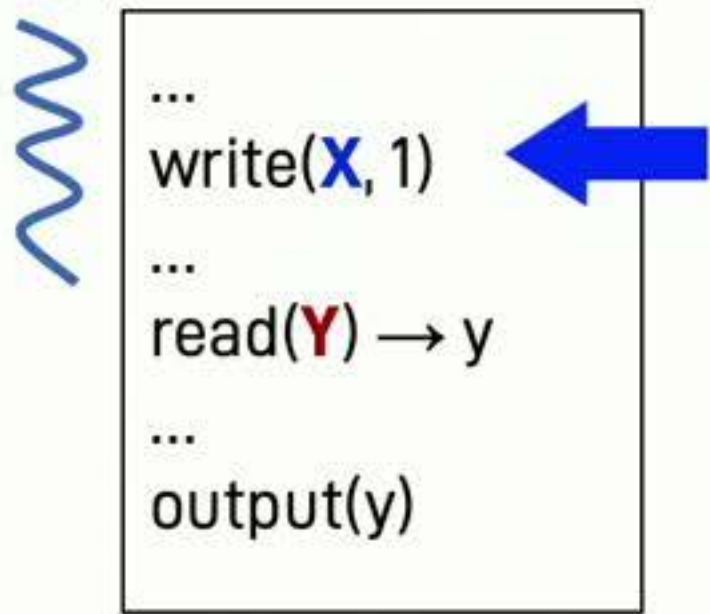


```
...  
write(Y, 1)  
...  
read(X) → x  
...  
output(x)
```

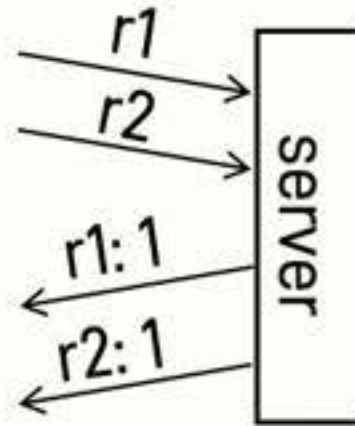


$X=0, Y=0$

r1



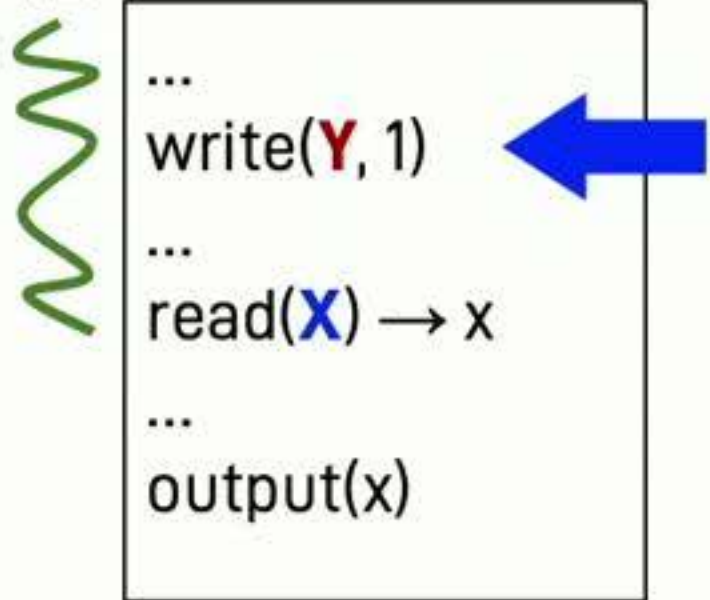
trace



$X = 1, Y = 1$

Accept

r2

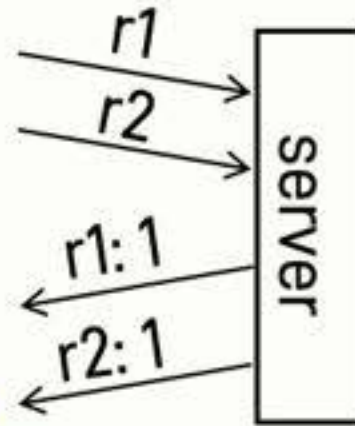


$X=0, Y=0$

trace

r1

```
...  
write( $X$ , 1)  
...  
read( $Y$ )  $\rightarrow$  y  
...  
output(y)
```



$X = 1, Y = 1$

Accept

r2

```
...  
write( $Y$ , 1)  
...  
read( $X$ )  $\rightarrow$  x  
...  
output(x)
```

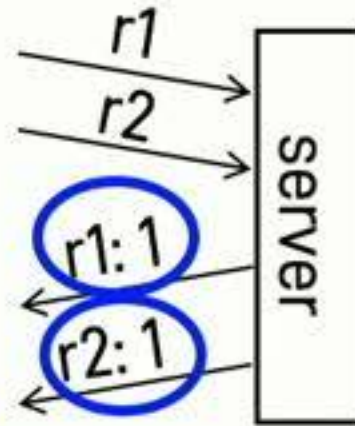
output 1

$X=0, Y=0$

trace

r1

```
...  
write( $X$ , 1)  
...  
read( $Y$ )  $\rightarrow$  y  
...  
output(y)
```



$X = 1, Y = 1$

Accept

(a)

r2

```
...  
write( $Y$ , 1)  
...  
read( $X$ )  $\rightarrow$  x  
...  
output(x)
```

output 1



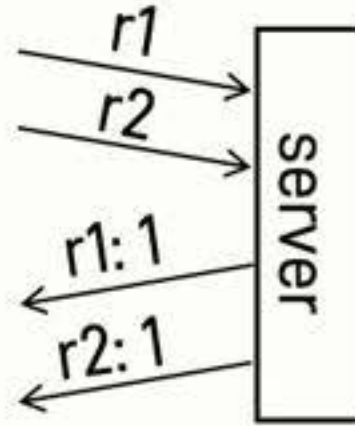
$X=0, Y=0$

r1



```
...  
write( $X$ , 1)  
...  
read( $Y$ )  $\rightarrow$  y  
...  
output(y)
```

trace



$X = 1, Y = 1$

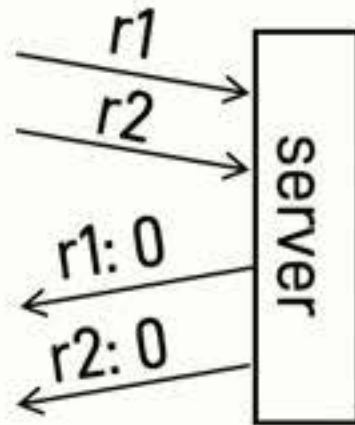
**Accept**

**(a)**

r2



```
...  
write( $Y$ , 1)  
...  
read( $X$ )  $\rightarrow$  x  
...  
output(x)
```



?

**(b)**

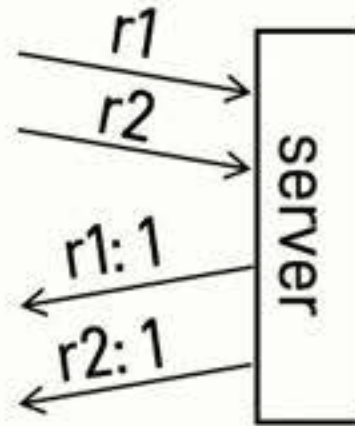
$X=0, Y=0$

r1



```
...  
write( $X$ , 1)  
...  
read( $Y$ )  $\rightarrow$  y  
...  
output(y)
```

trace



$X = 1, Y = 1$

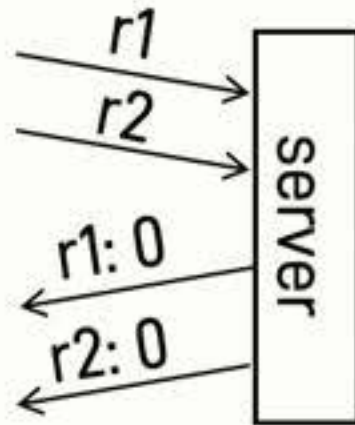
**Accept**

**(a)**

r2



```
...  
write( $Y$ , 1)  
...  
read( $X$ )  $\rightarrow$  x  
...  
output(x)
```

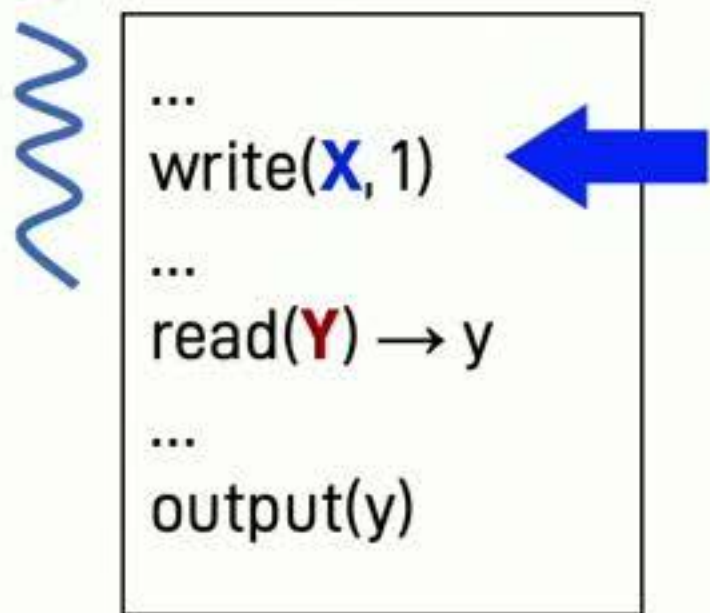


**Reject**

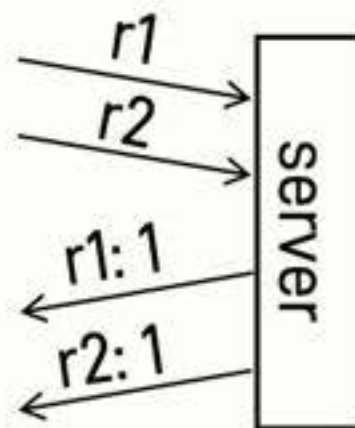
**(b)**

$X=0, Y=0$

r1



trace

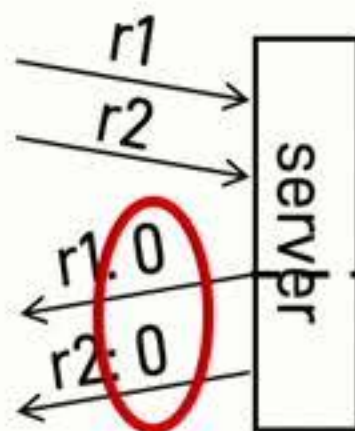
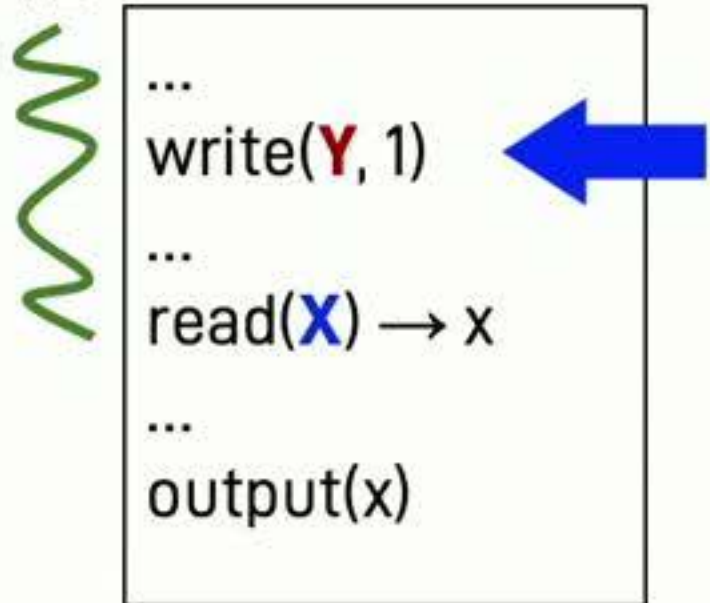


$X = 1, Y = 1$

**Accept**

**(a)**

r2



$X = 1$  or  $Y = 1$

**Reject**

**(b)**



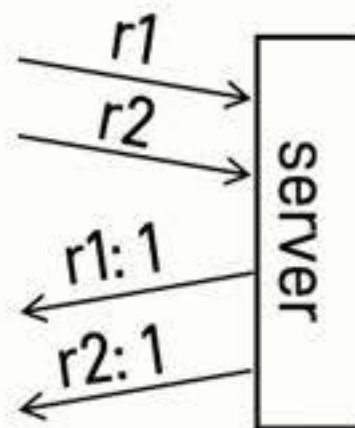
**X**=0, **Y**=0

r1



```
...  
write(X, 1)  
...  
read(Y) → y  
...  
output(y)
```

trace



op logs

**X**'s log

r1 write 1	r2 read	...
---------------	------------	-----

**Y**'s log

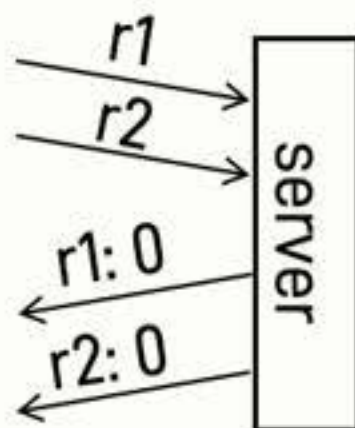
r2 write 1	r1 read	...
---------------	------------	-----

**(a)**

r2



```
...  
write(Y, 1)  
...  
read(X) → x  
...  
output(x)
```



**X**'s log

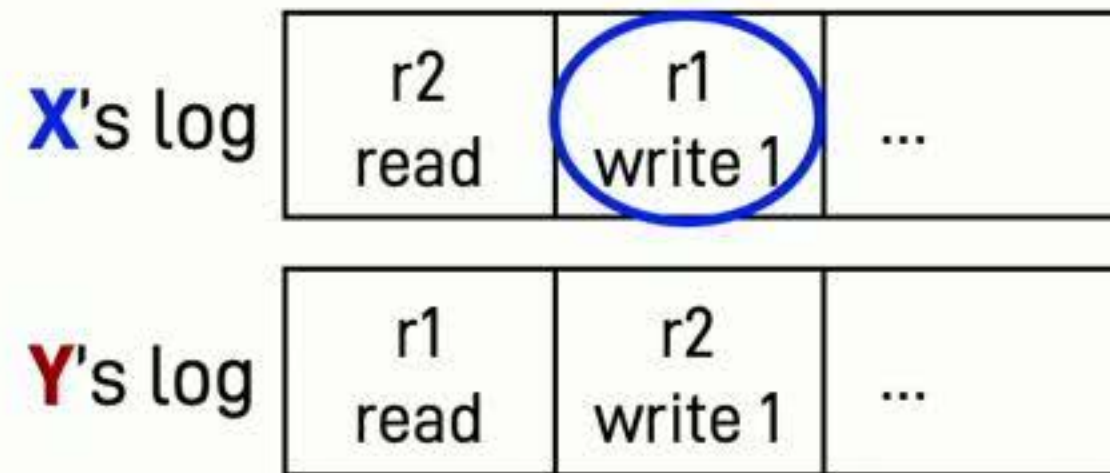
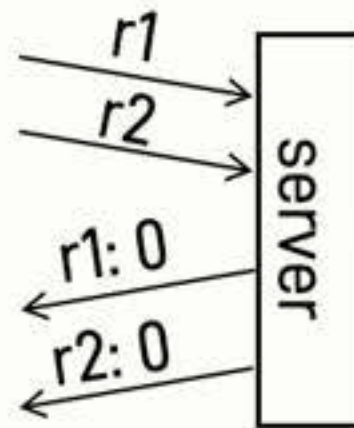
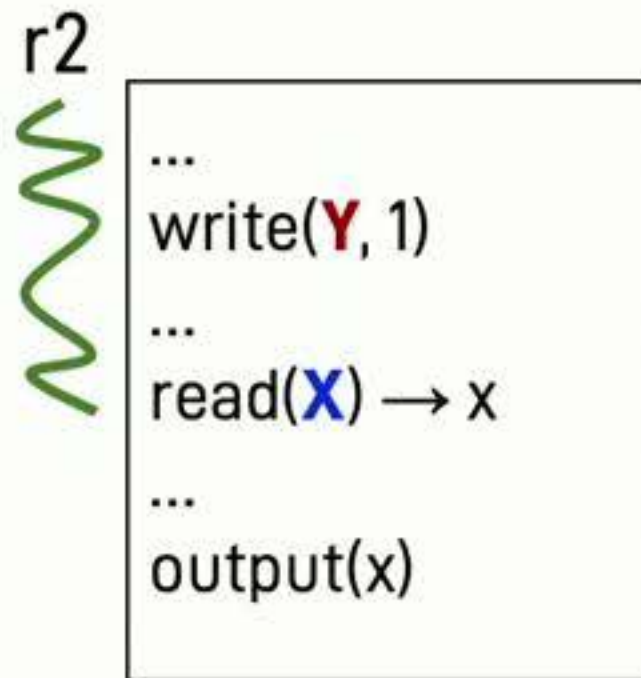
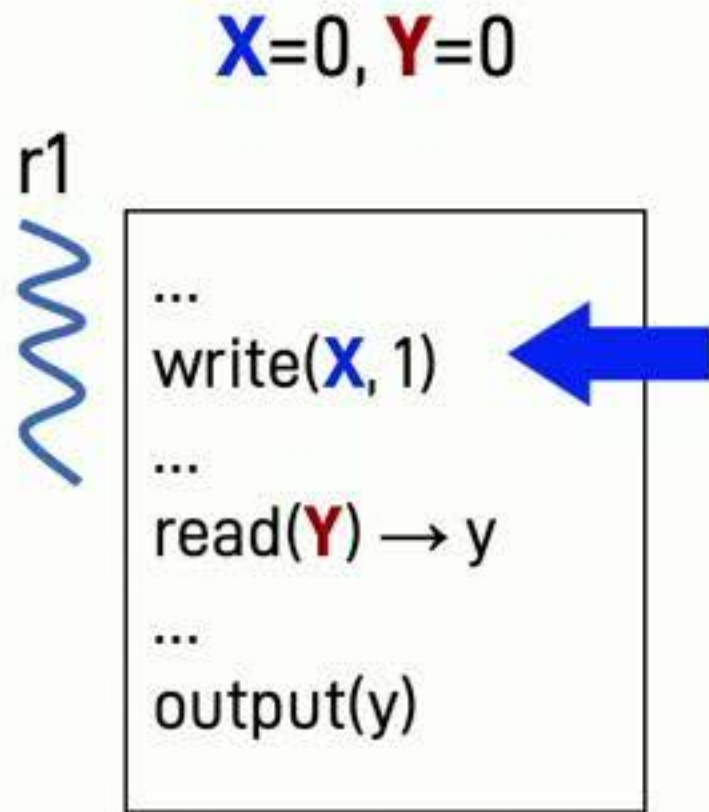
r2 read	r1 write 1	...
------------	---------------	-----

**Y**'s log

r1 read	r2 write 1	...
------------	---------------	-----

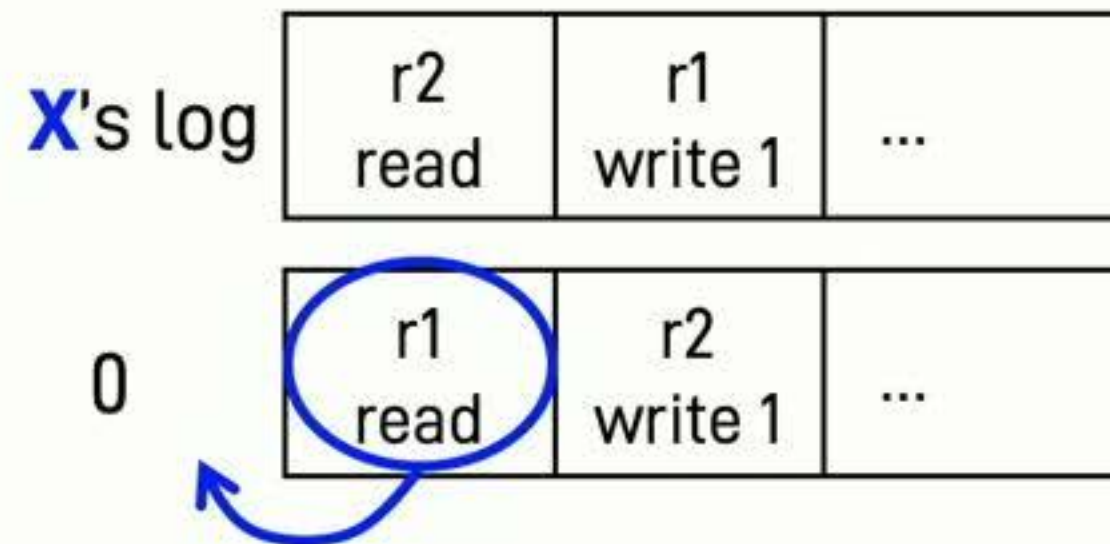
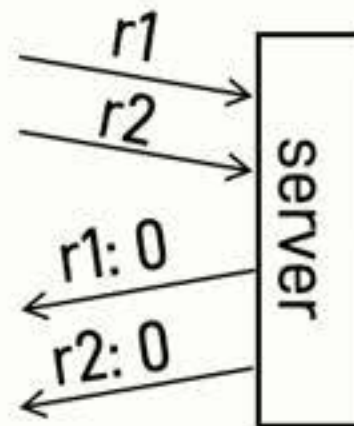
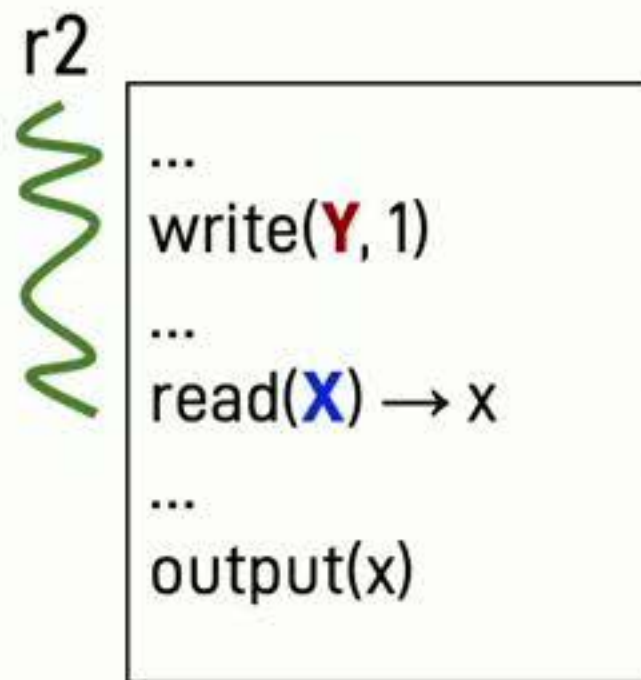
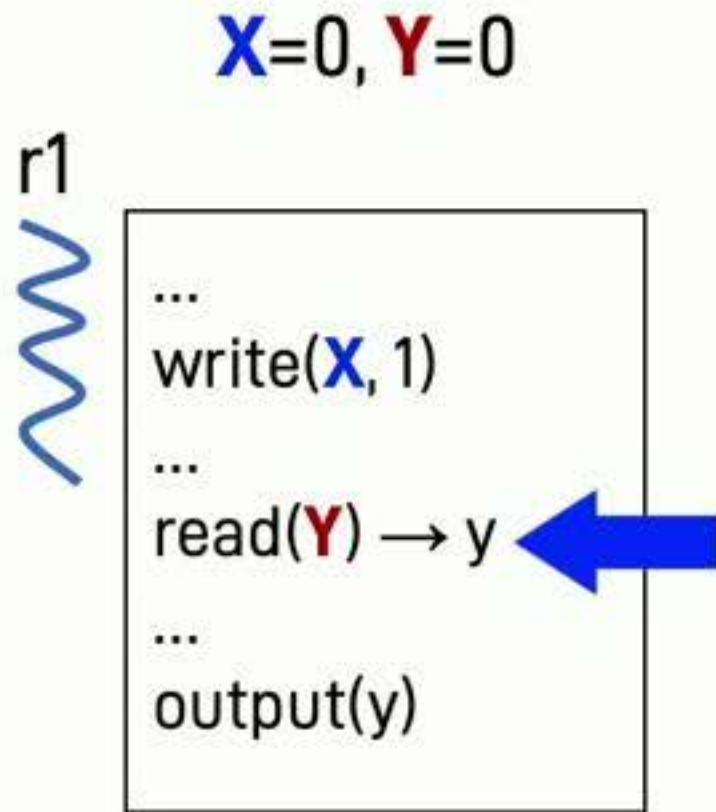
**(b)**

# Re-execution according to op logs wrongly accepts (b)



(b)

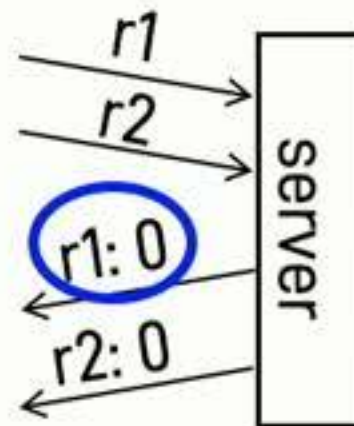
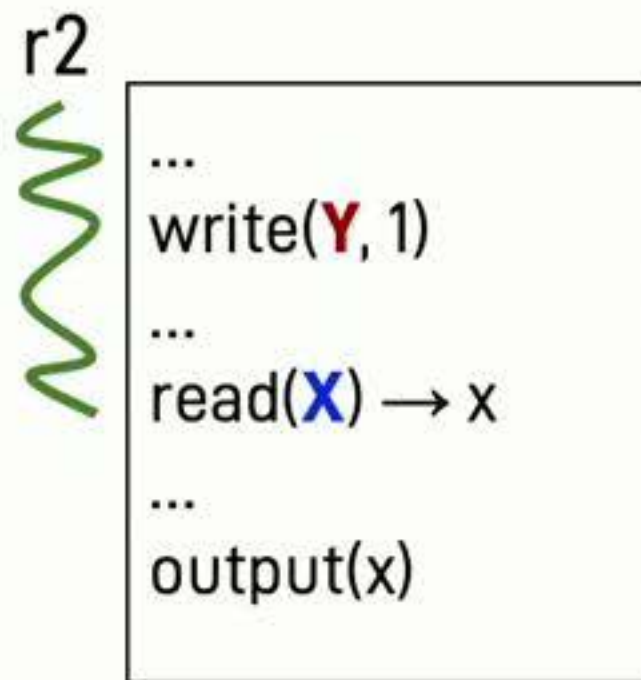
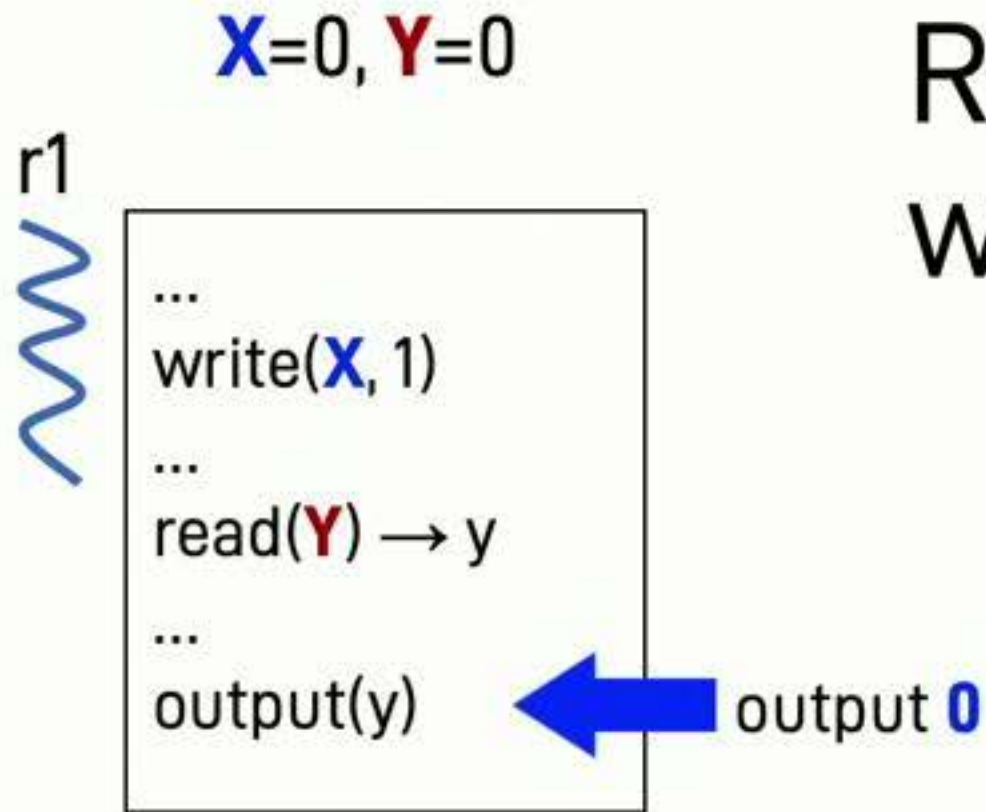
# Re-execution according to op logs wrongly accepts (b)



(b)



# Re-execution according to op logs wrongly accepts (b)



$X$ 's log

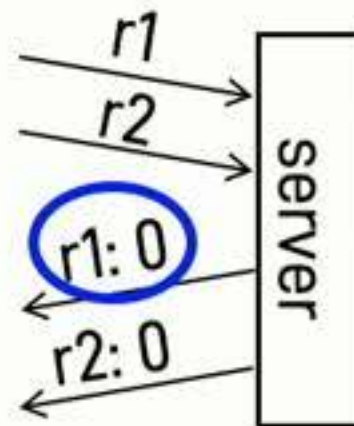
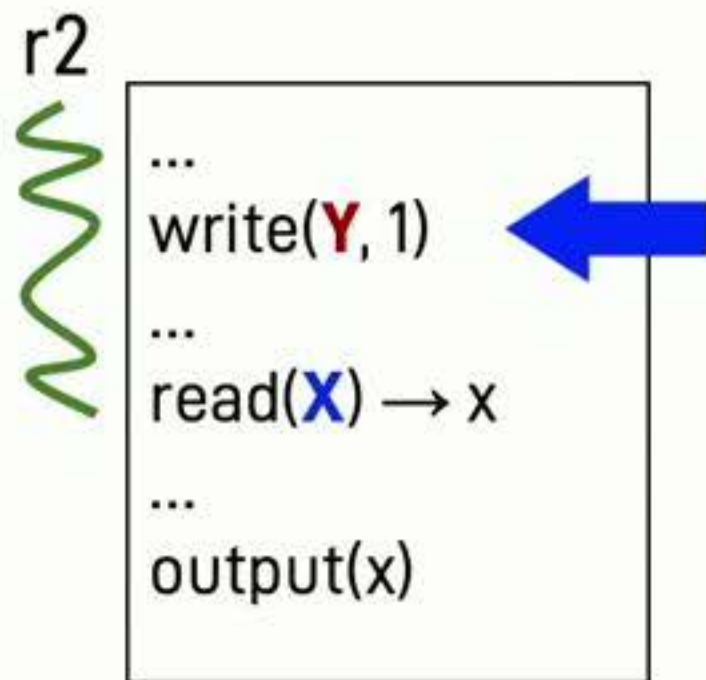
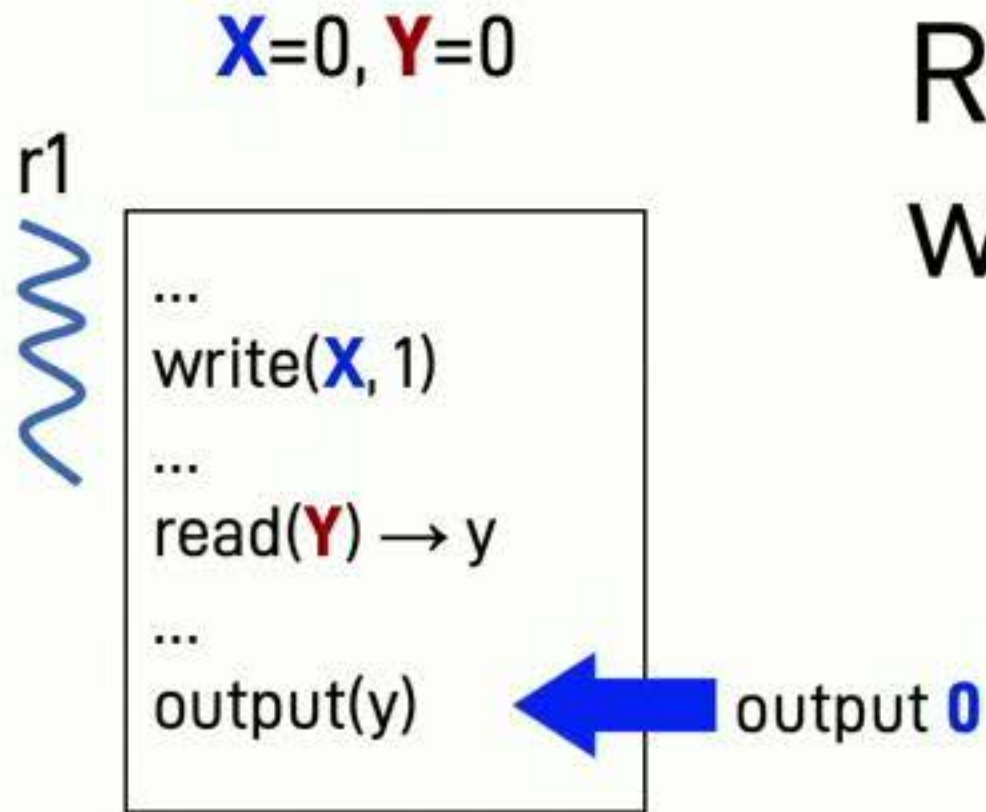
r2 read	r1 write 1	...
------------	---------------	-----

$Y$ 's log

r1 read	r2 write 1	...
------------	---------------	-----

(b)

# Re-execution according to op logs wrongly accepts (b)



$X$ 's log

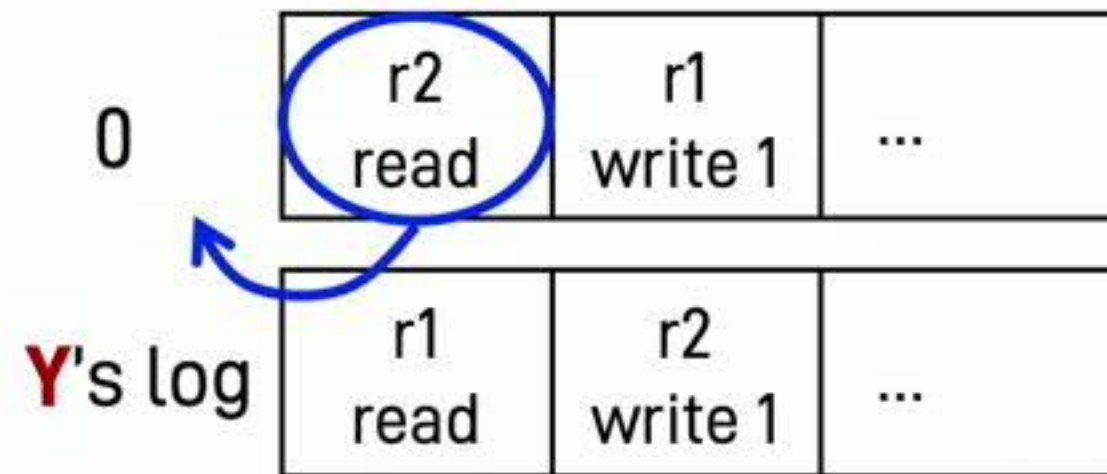
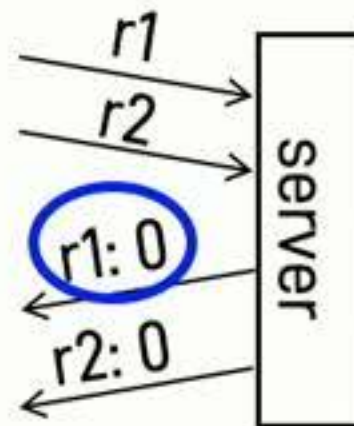
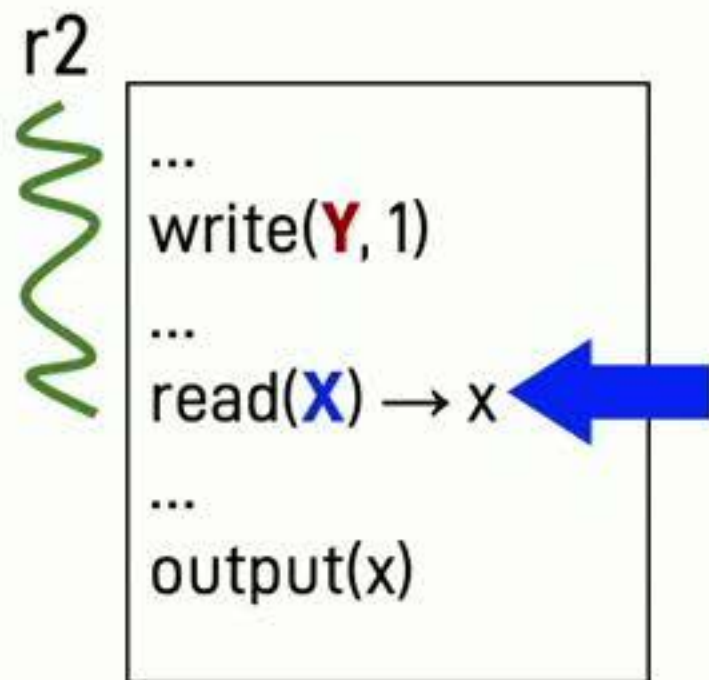
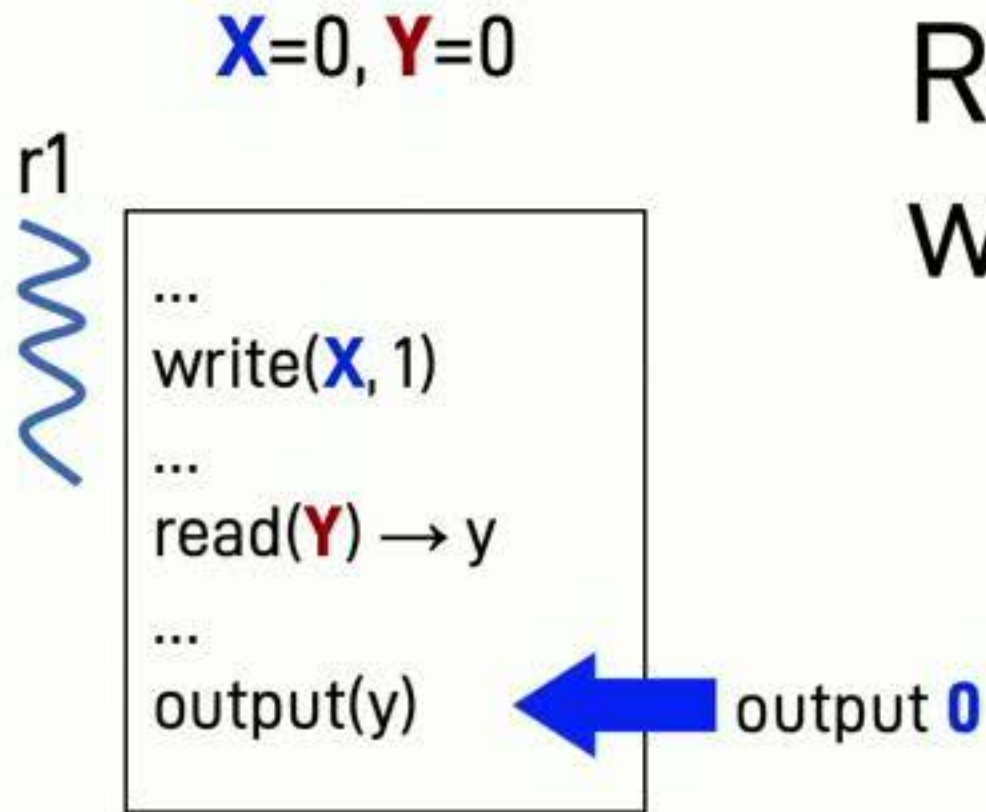
r2 read	r1 write 1	...
------------	---------------	-----

$Y$ 's log

r1 read	r2 write 1	...
------------	---------------	-----

(b)

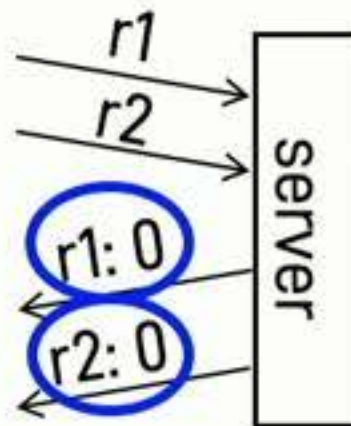
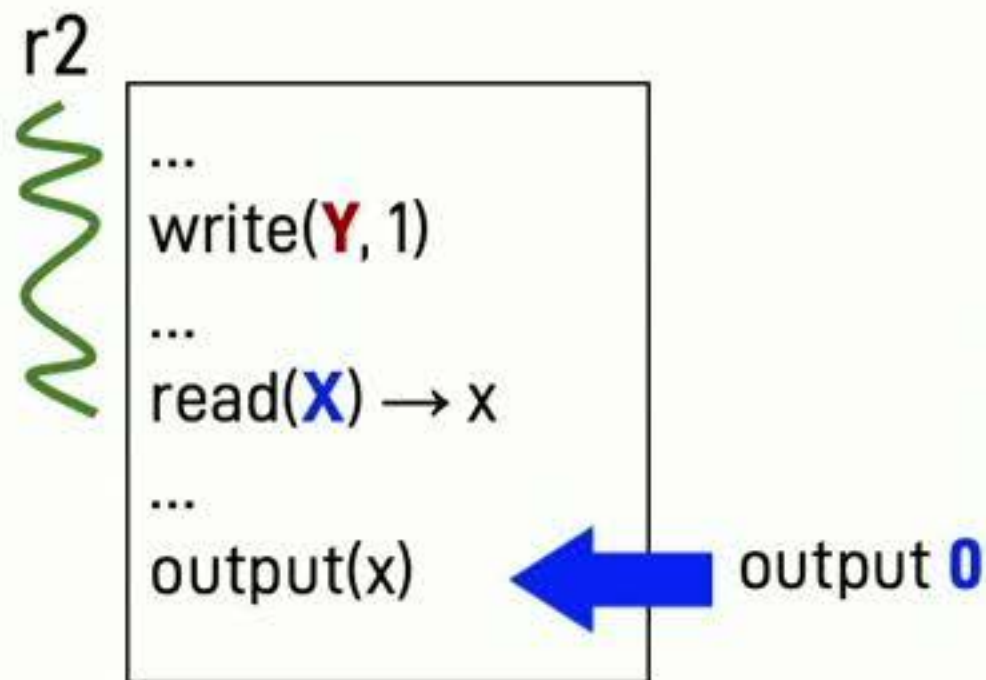
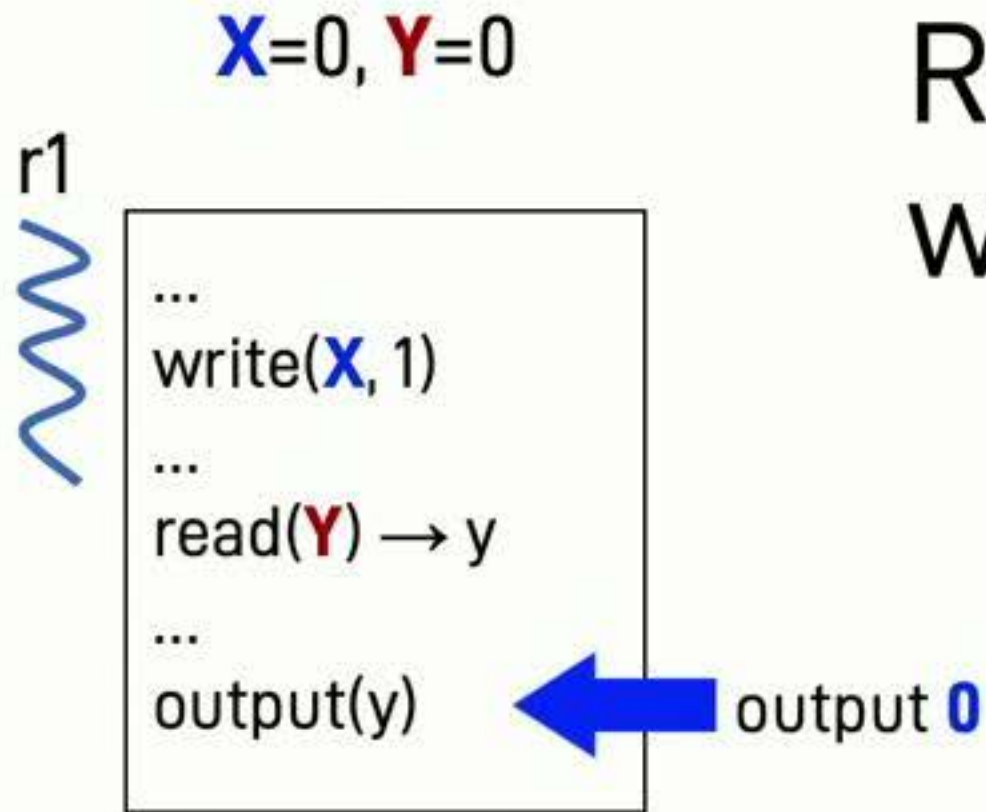
# Re-execution according to op logs wrongly accepts (b)



(b)



# Re-execution according to op logs wrongly accepts (b)



$X$ 's log

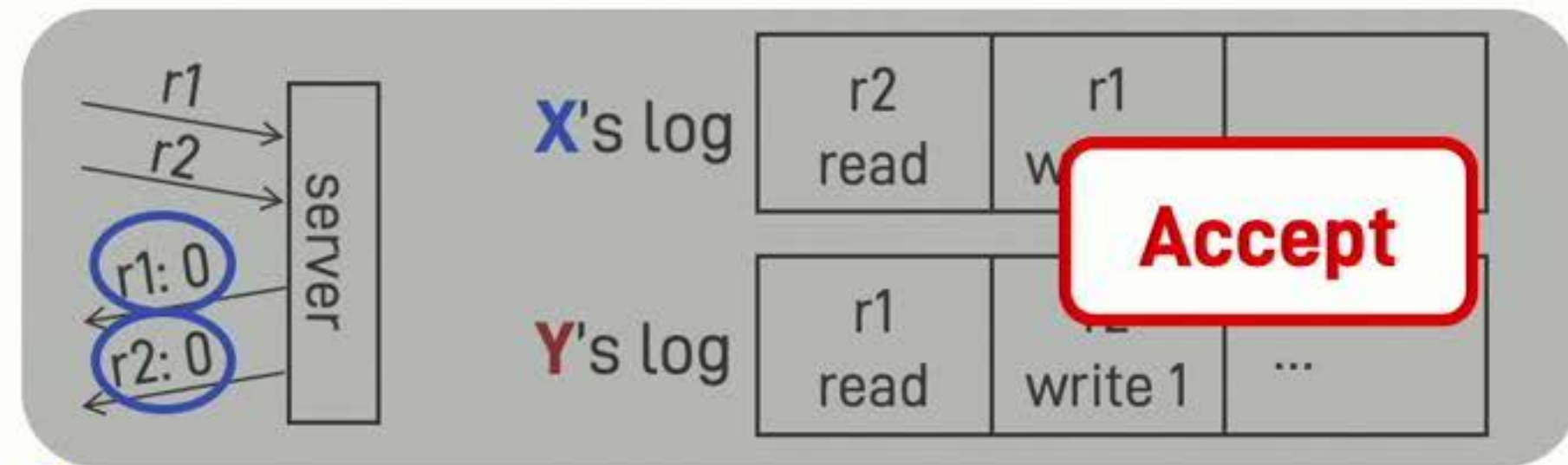
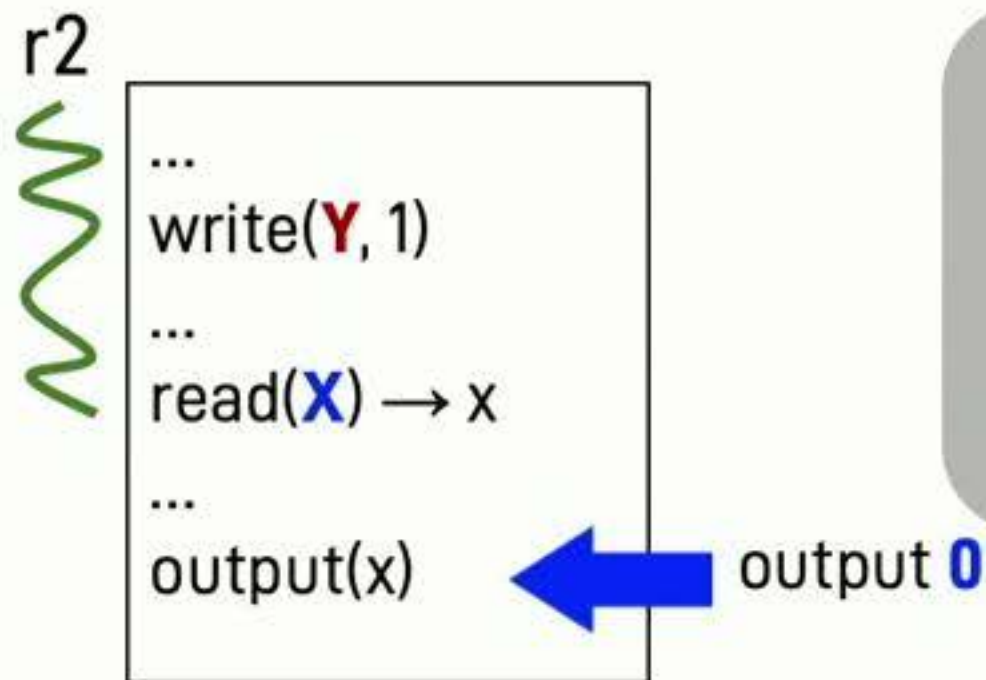
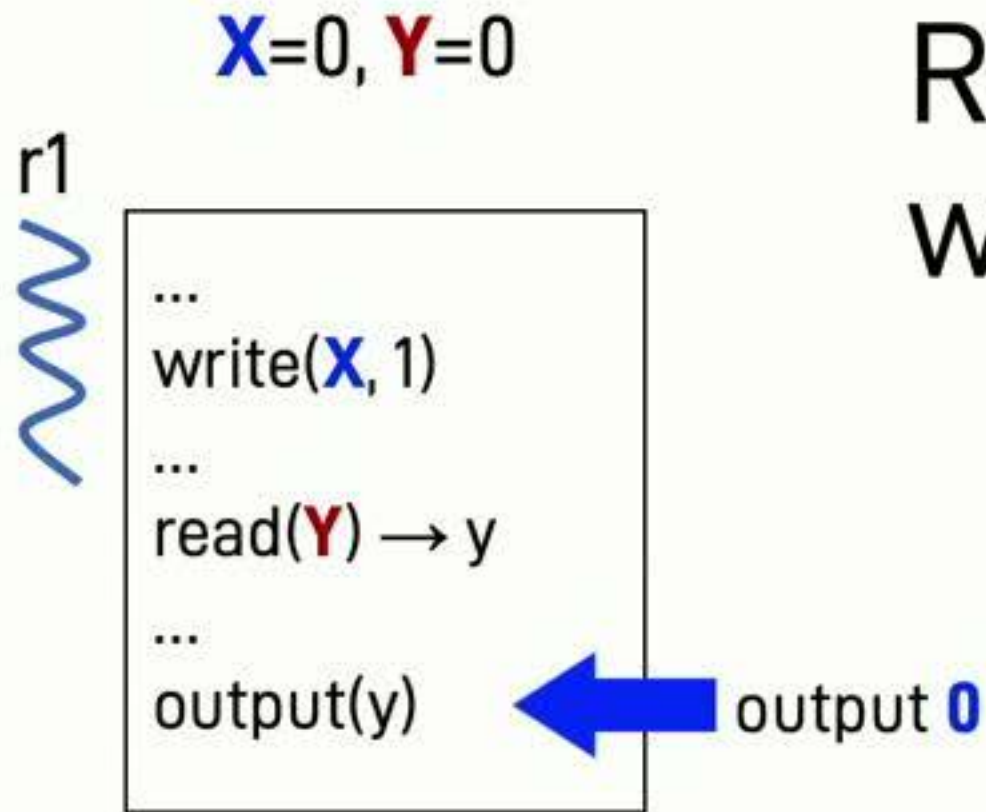
r2 read	r1 write 1	...
------------	---------------	-----

$Y$ 's log

r1 read	r2 write 1	...
------------	---------------	-----

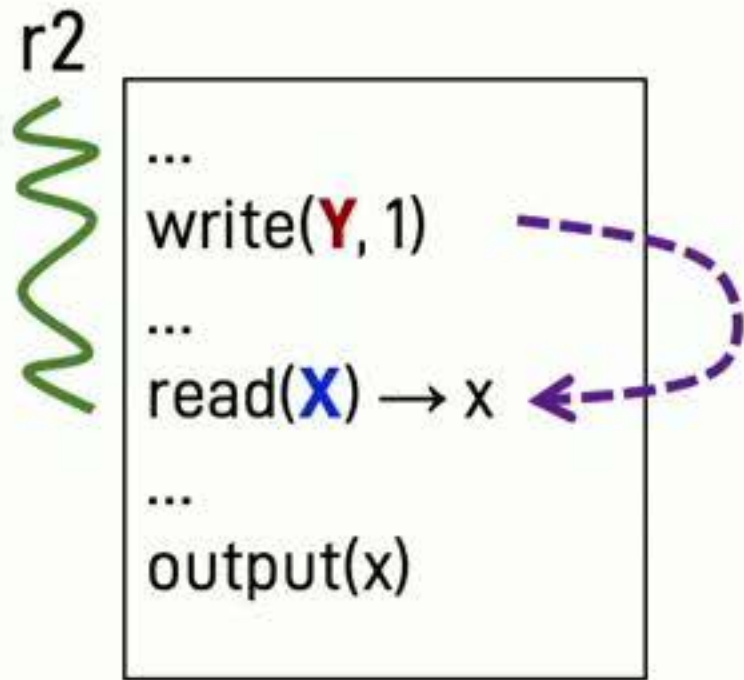
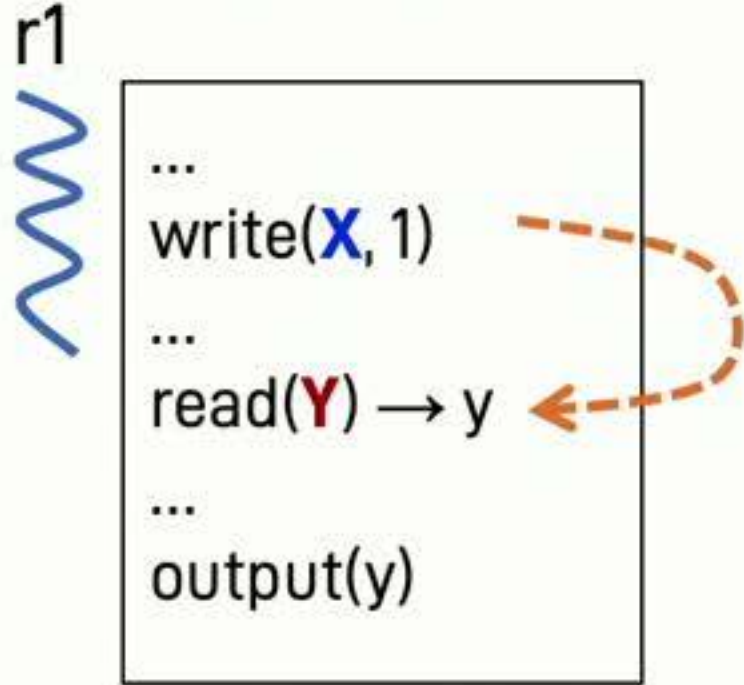
(b)

# Re-execution according to op logs wrongly accepts (b)

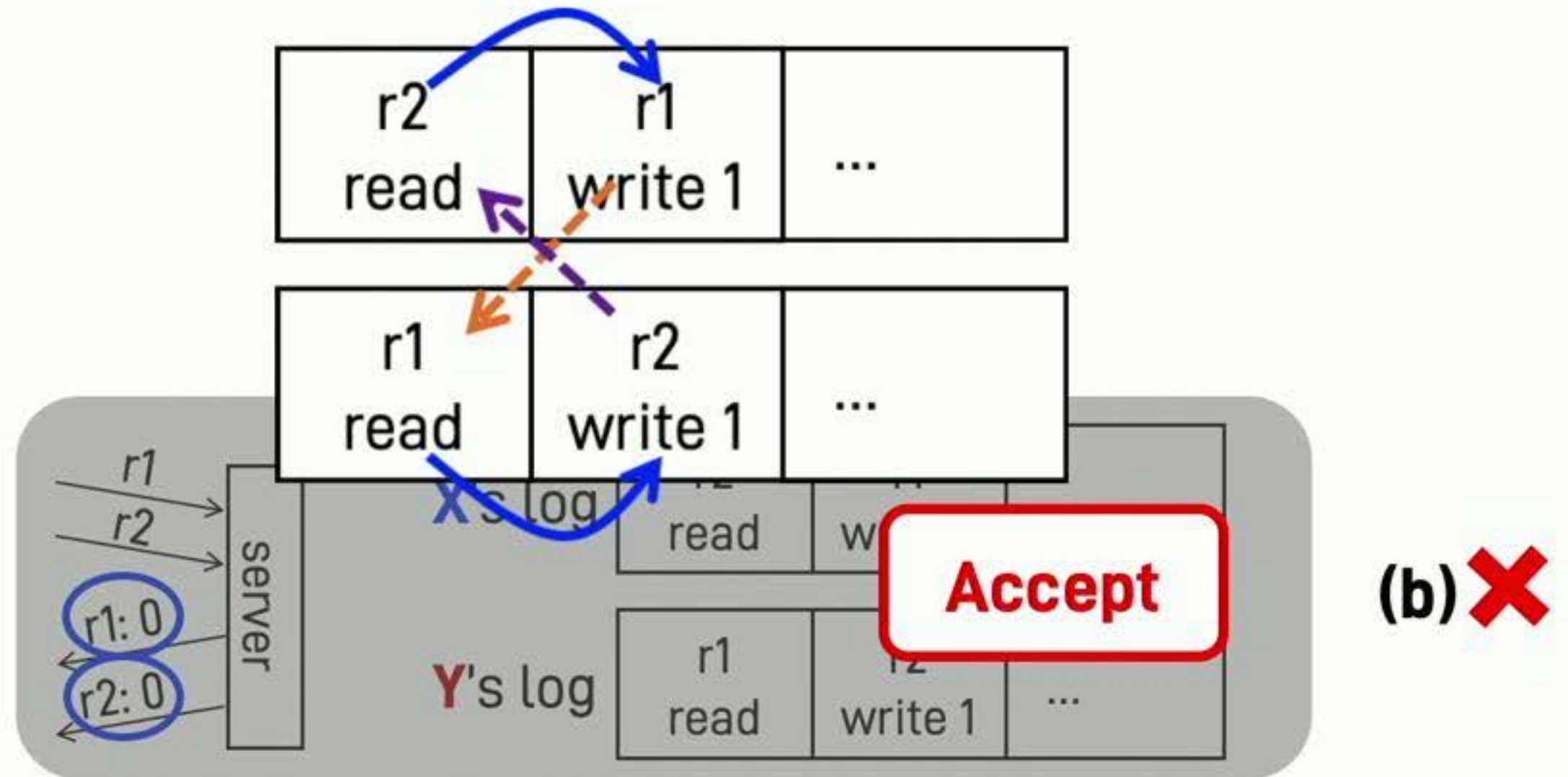


(b) **✗**

$X=0, Y=0$



# Re-execution according to op logs wrongly accepts (b)

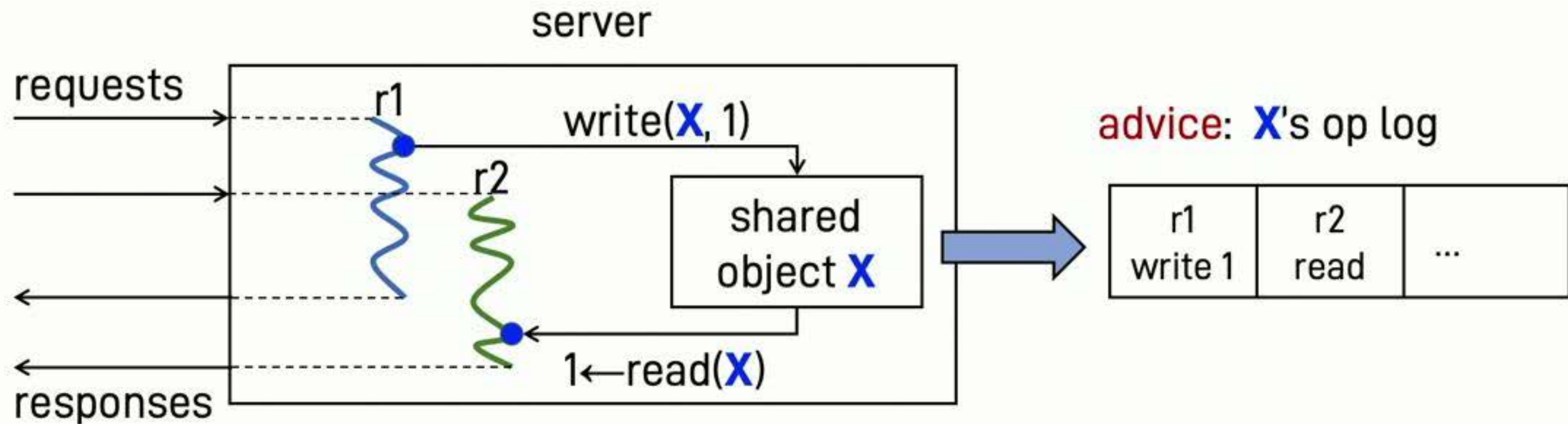




# Solution must consider trace and program

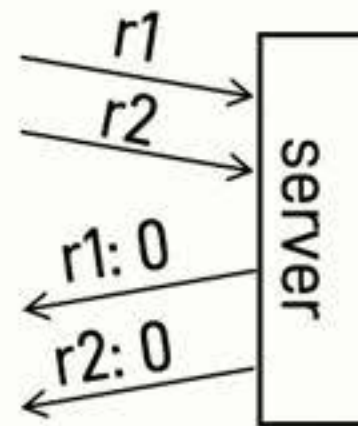
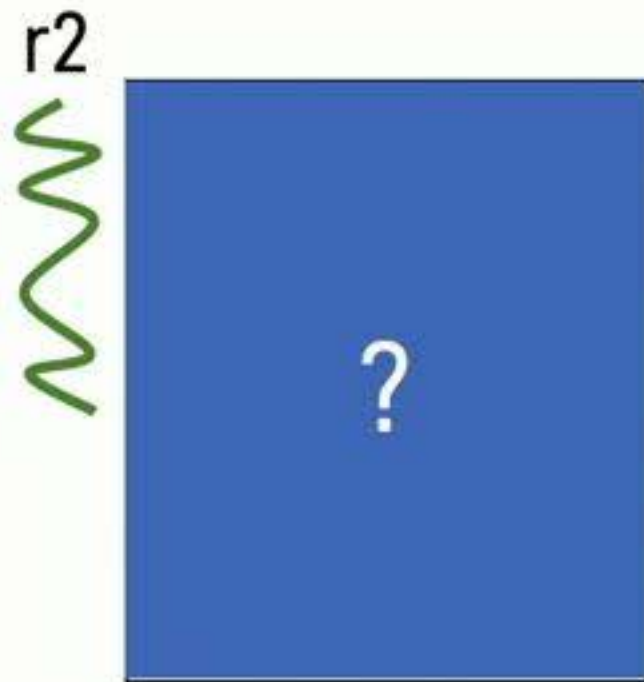
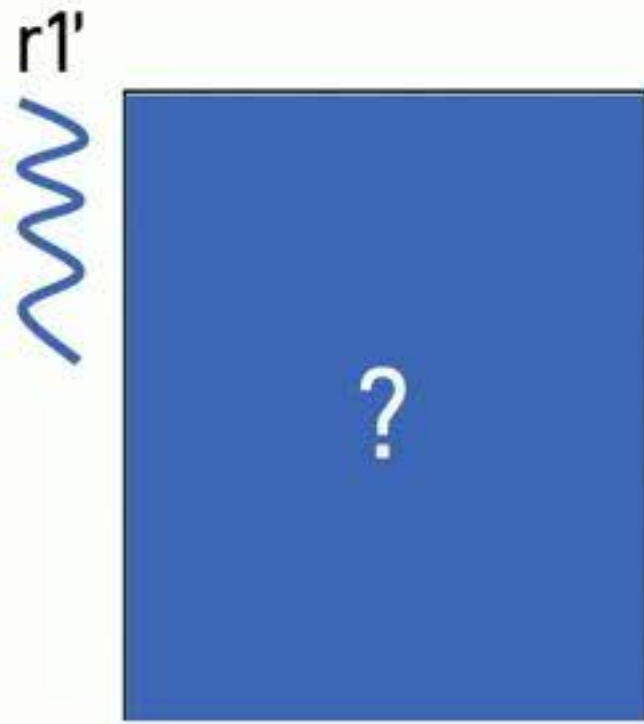
- Validating the **alleged op logs** requires
  - request order (from trace)
  - program order (from program)
  - operation order (from **op logs**)
- **Consistent ordering verification** builds a graph...  
...that includes all info above and check acyclicity

# Concurrency model



- What about simple re-execution according to op logs?

# However, the actual problem is harder



**X's** log

$r2$ read	$r1$ write 1	...
--------------	-----------------	-----

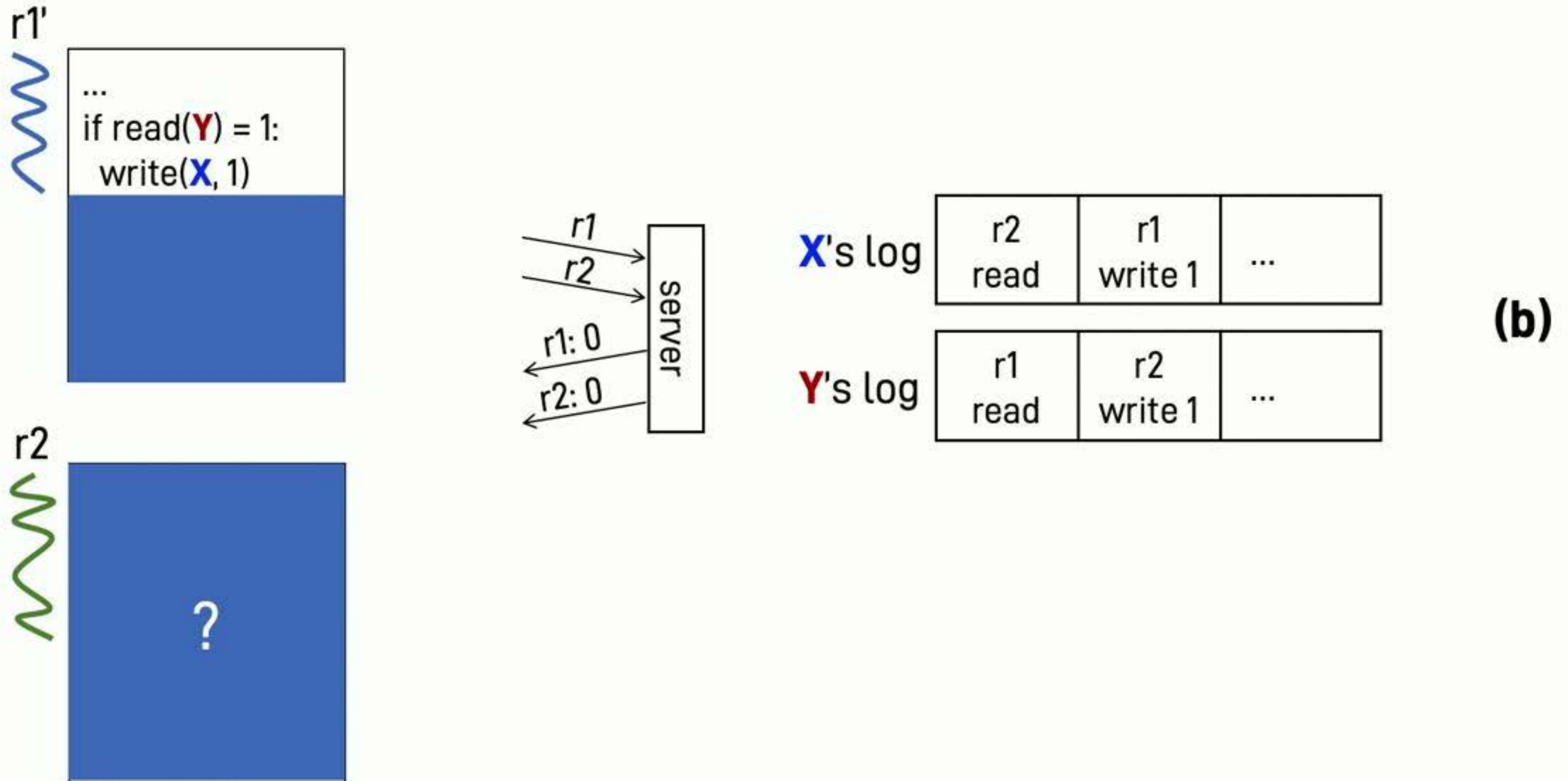
**Y's** log

$r1$ read	$r2$ write 1	...
--------------	-----------------	-----

**(b)**



# However, the actual problem is harder

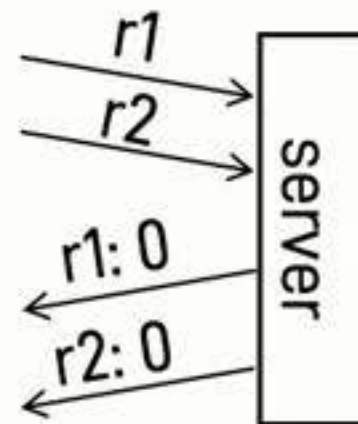


# However, the actual problem is harder

r1'

```
...  
if read(Y) = 1:  
  write(X, 1)  
...  
read(Y) → x  
...  
output(x)
```

r2



X's log

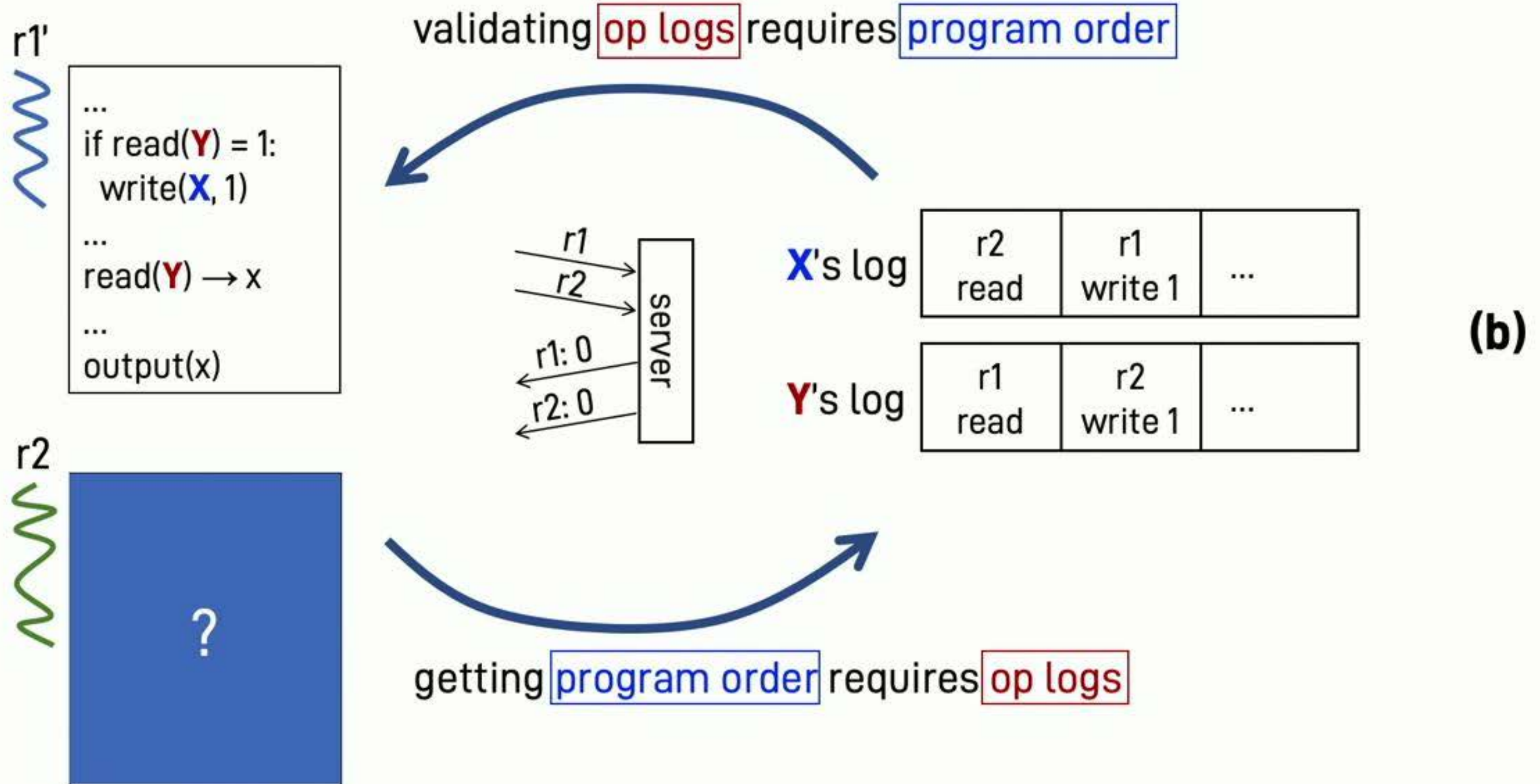
r2 read	r1 write 1	...
------------	---------------	-----

Y's log

r1 read	r2 write 1	...
------------	---------------	-----

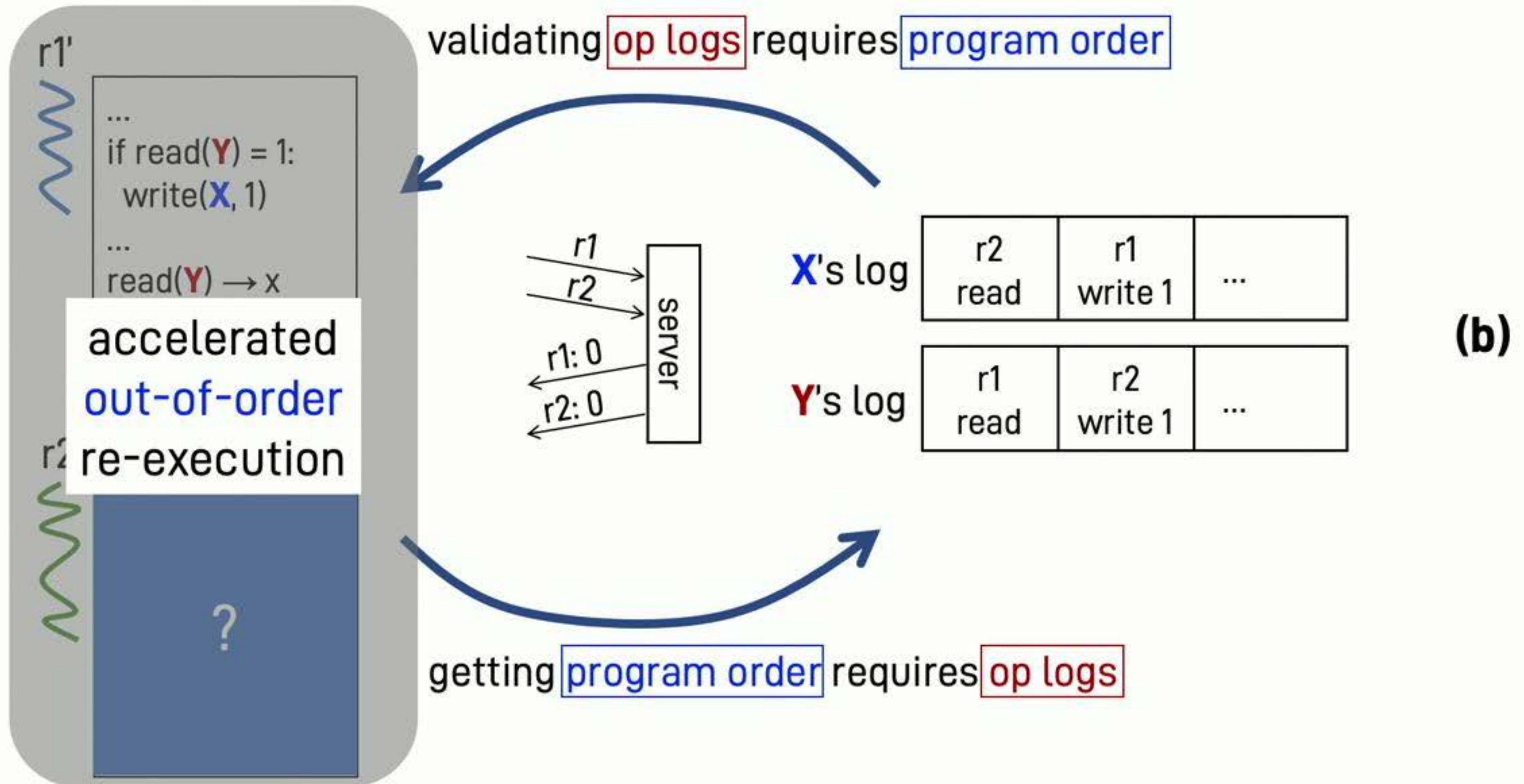
**(b)**

# However, the actual problem is harder

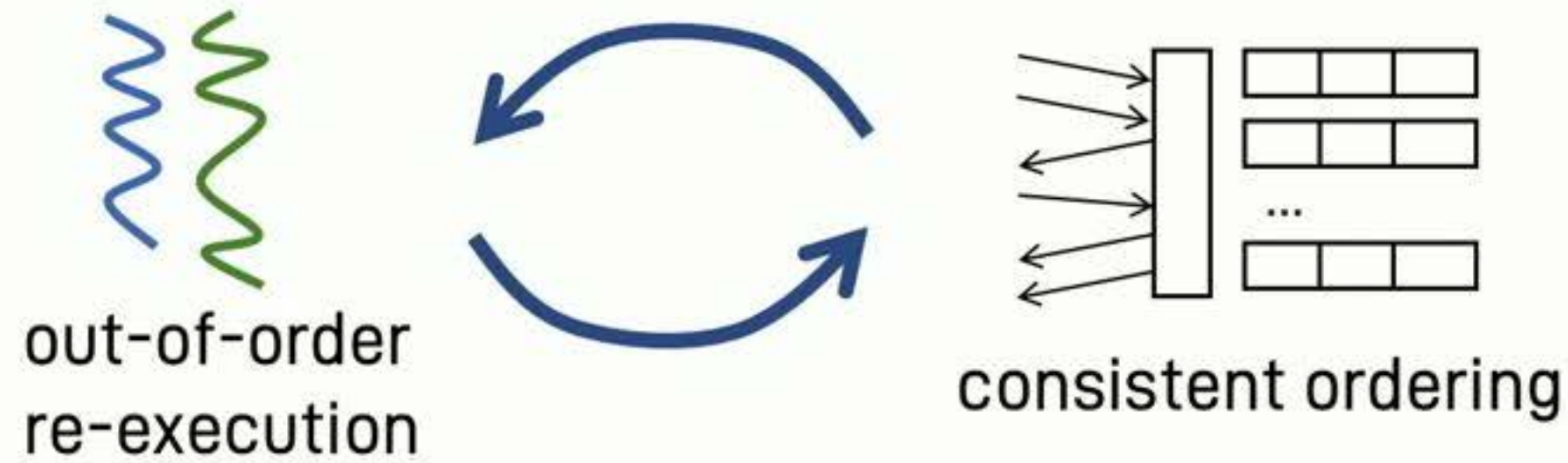




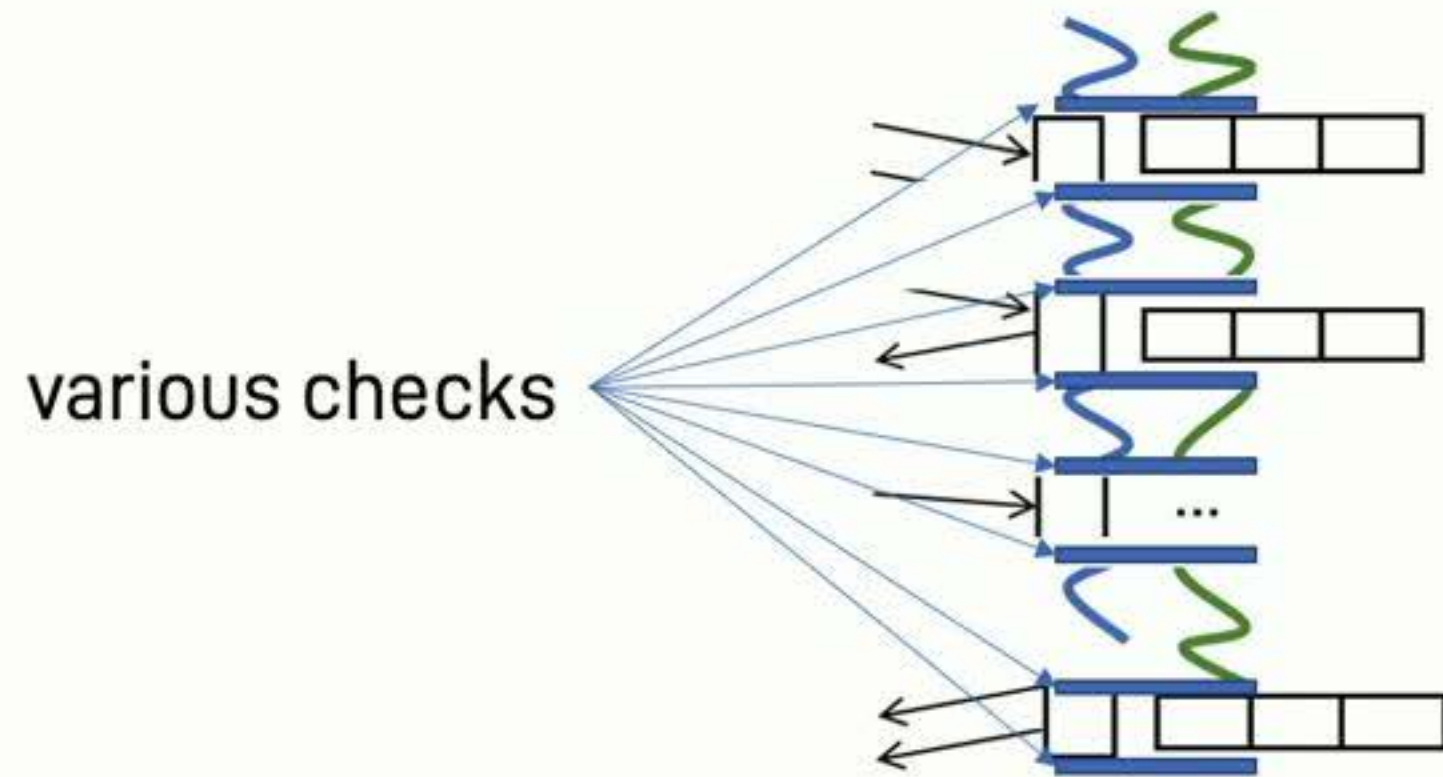
# However, the actual problem is harder



# Orochi has a co-designed verification protocol



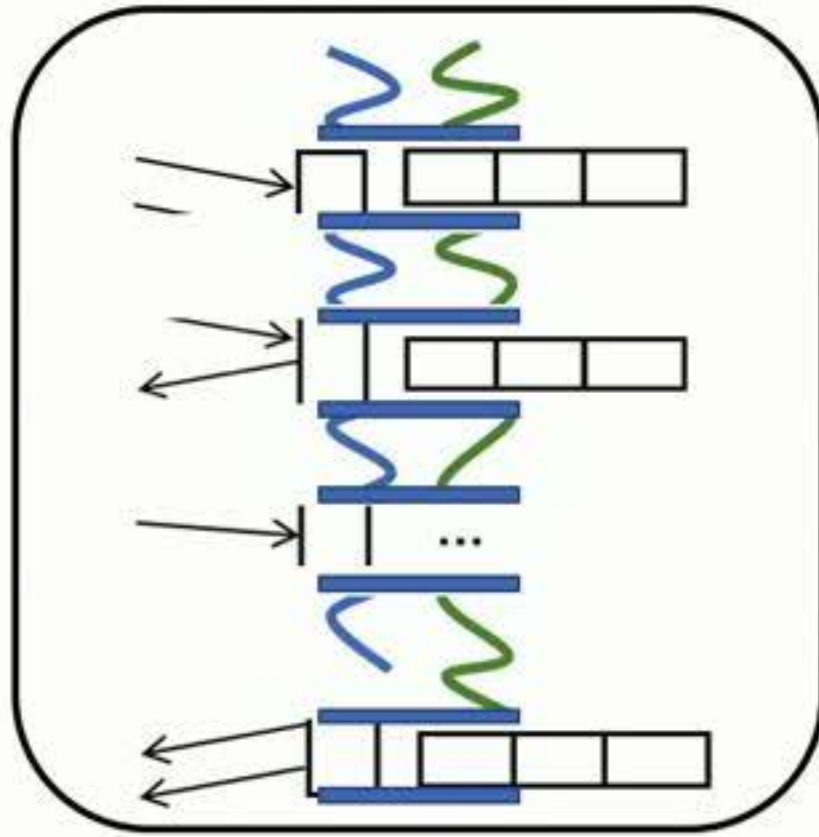
# Orochi has a co-designed verification protocol



re-execution + consistent ordering



# Orochi has a co-designed verification protocol



- Verification protocol is proved to be **correct** ...

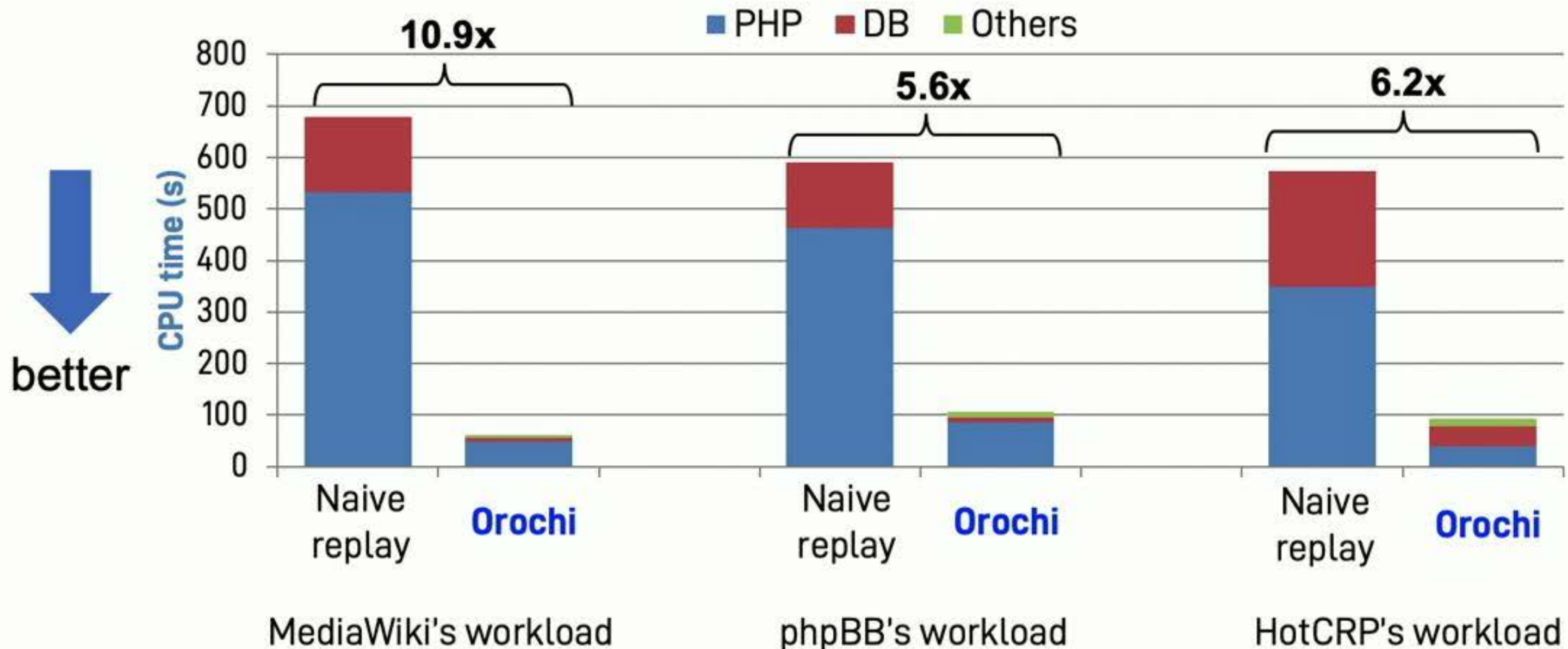
... meaning {  
Completeness: honest server  $\Rightarrow$  verifier accepts  
Soundness: verifier accepts  $\Rightarrow$  honest server

# Evaluation setup

- Applications:
  - MediaWiki, phpBB and HotCRP
- Workloads:
  - MediaWiki: Wikipedia 2007 trace
  - phpBB: 7-day's posts from CentOS forum
  - HotCRP: Simulation of SIGCOMM'09

# Is the verifier efficient?

Orochi's verifier achieves speedups compared to naive replay





# What are the (server's) CPU/network/storage costs?

CPU
MediaWiki's workload
4.7%

# What are the (server's) CPU/network/storage costs?

CPU	Network		
MediaWiki's workload	trace (per req)	advice (per req)	Orochi's overhead
4.7%	MediaWiki's workload		
	7.1KB	1.7KB	11.4%

# What are the (server's) CPU/network/storage costs?

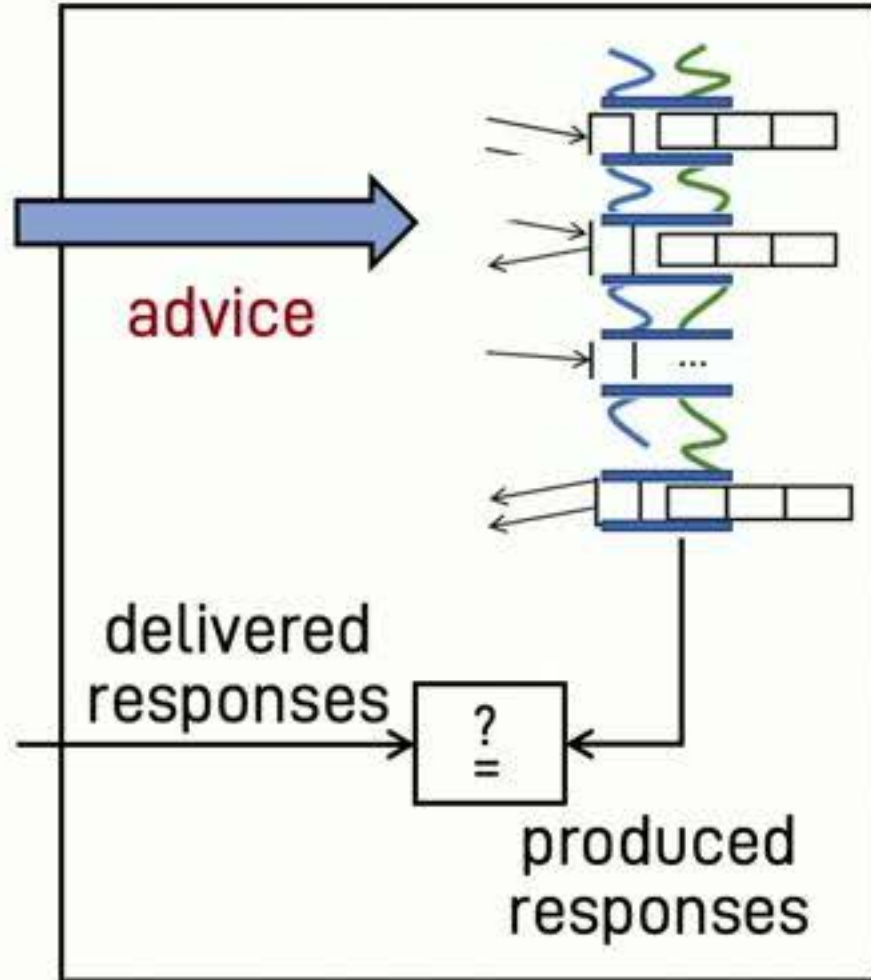
CPU	Network			Storage
MediaWiki's workload	trace (per req)	advice (per req)	Orochi's overhead	MediaWiki's workload
4.7%	MediaWiki's workload			1.0x
	7.1KB	1.7KB	11.4%	



# What are the (server's) CPU/network/storage costs?

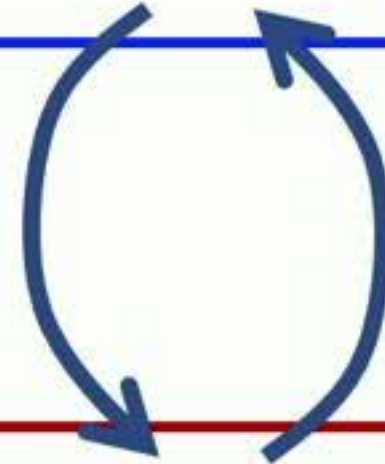
CPU	Network			Storage
MediaWiki's workload	trace (per req)	advice (per req)	Orochi's overhead	MediaWiki's workload
4.7%	MediaWiki's workload			1.0x
phpBB's workload	7.1KB	1.7KB	11.4%	phpBB's workload
8.6%	phpBB's workload			1.7x
HotCRP's workload	5.7KB	0.3KB	2.7%	HotCRP's workload
5.9%	HotCRP's workload			1.5x
	3.2KB	0.4KB	10.9%	

## Orochi's verifier



Problem: naive re-execution doesn't save work

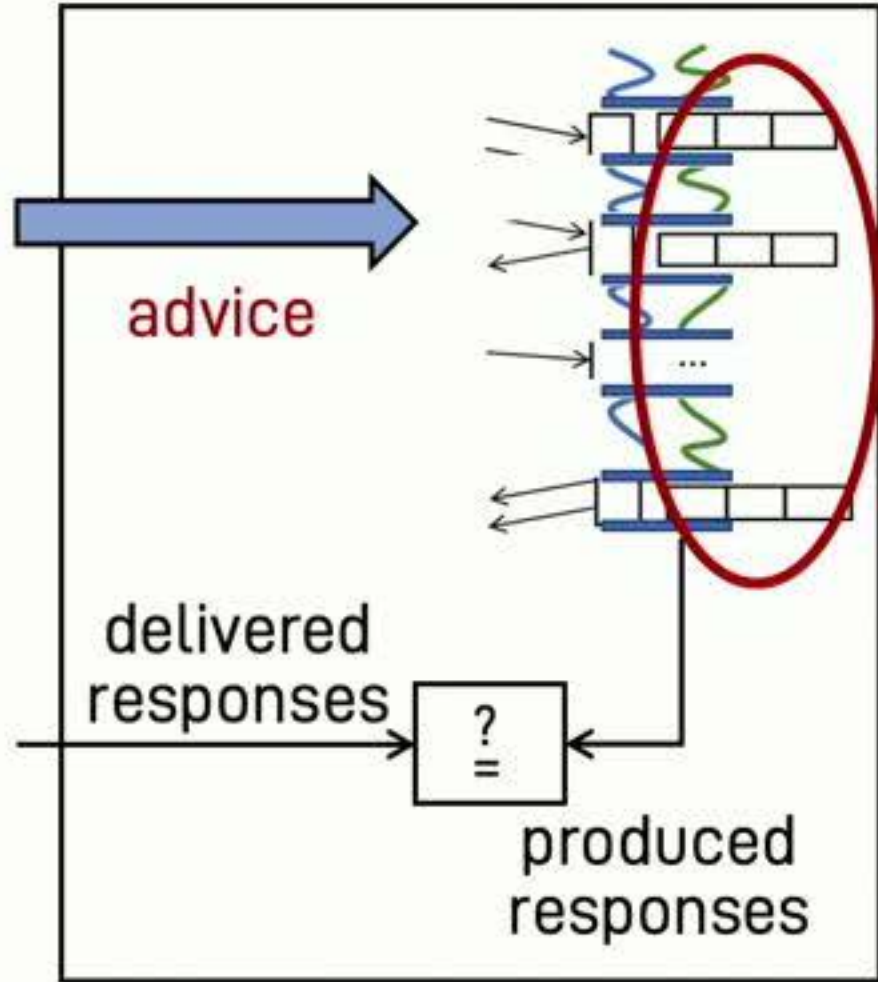
Solution: deduplicated re-execution



Problem: concurrent and untrusted server

Solution: co-design verification protocol

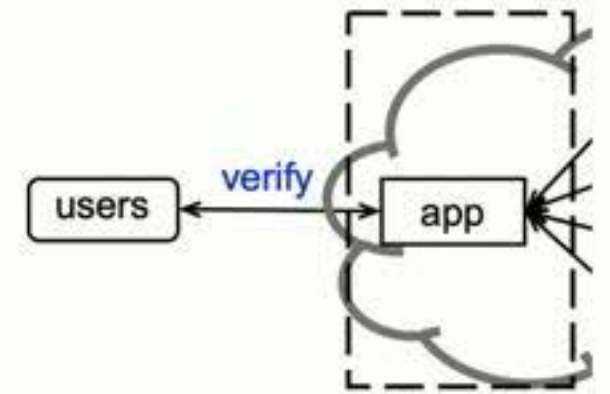
## Orochi's verifier



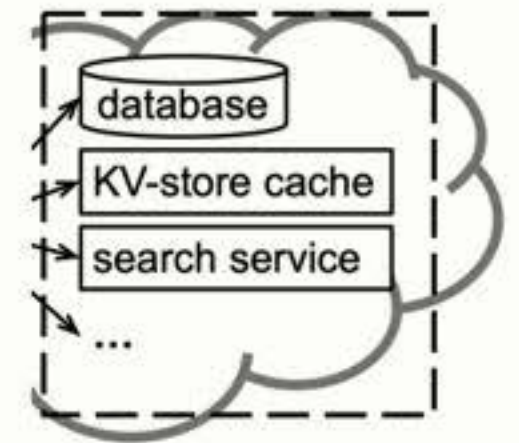
op logs may be **unavailable** (e.g., black-box databases)



① Verify white-box services (Orochi [SOSP'17])



② Verify black-box services (Cobra: verify Serializability)



③ Build composable verifiable framework (future work)

④ Other past work

- Troubleshooting data center networks [NSDI'19]
- Protecting secret via security-oriented offloading [EuroSys'15]

# Why Serializability (SER)?

gold standard  
isolation level



CockroachDB  
(2015)



Amazon Aurora  
(2015)



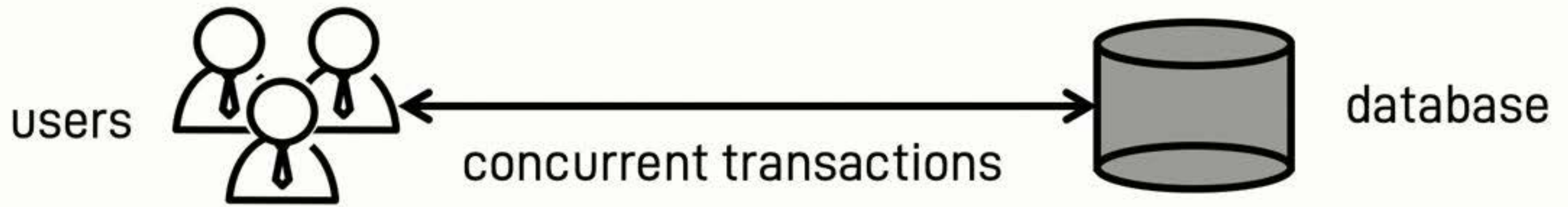
Google Spanner  
(2017)



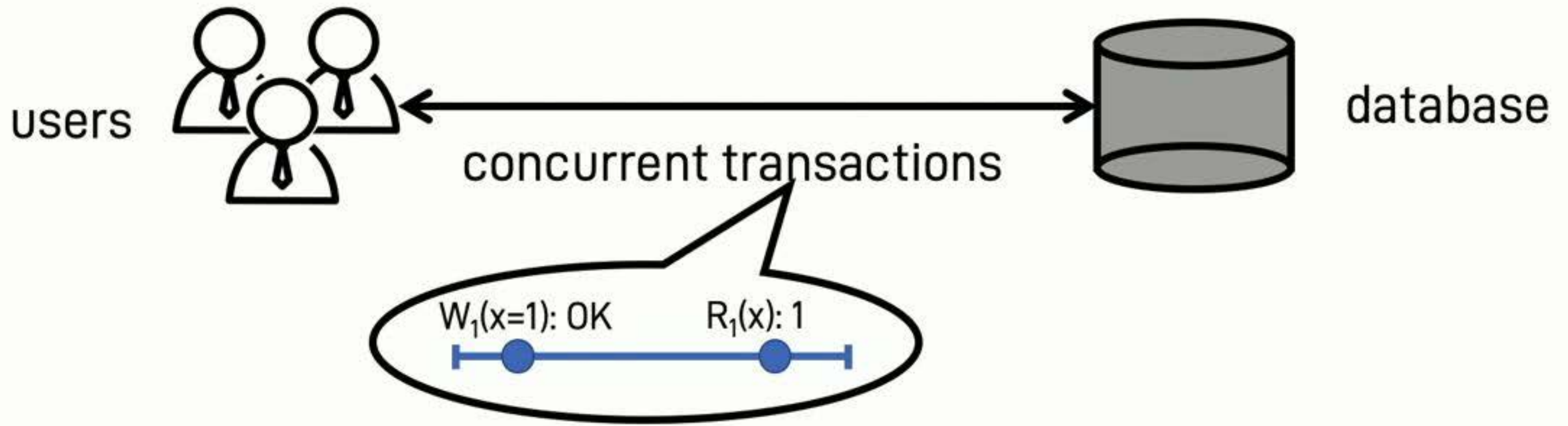
YugaByteDB  
(2017)

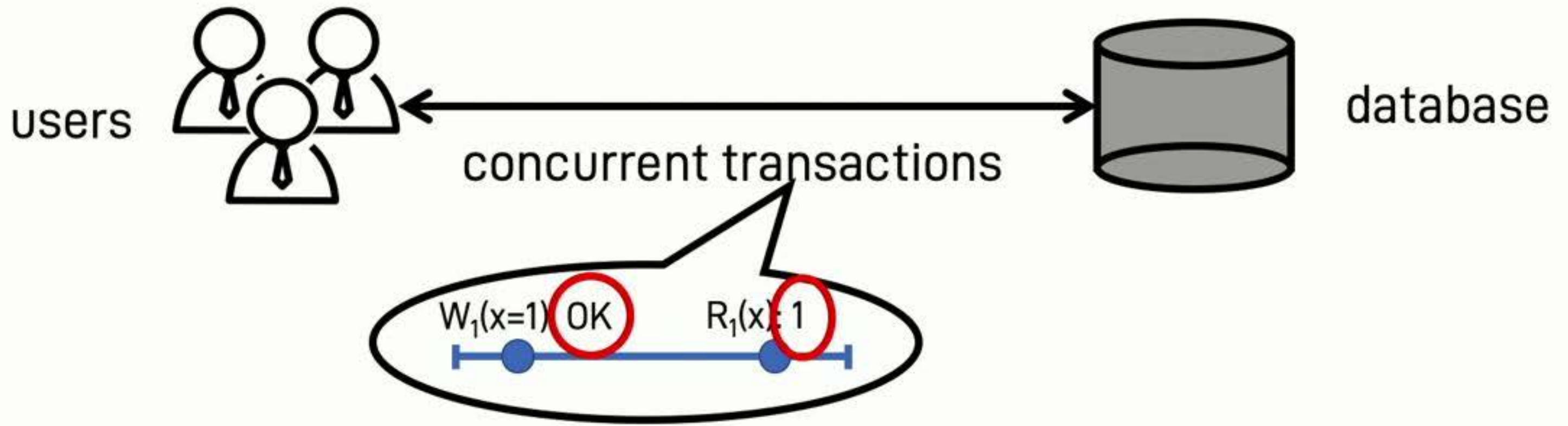
...

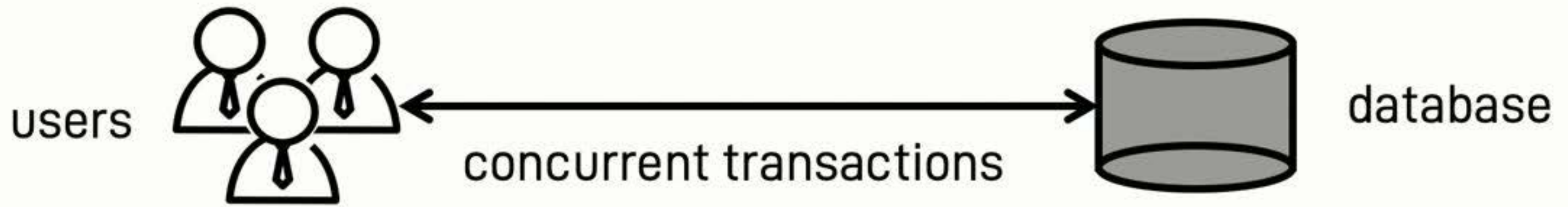
fundamental  
and  
challenging











concurrent transactions  $\stackrel{?}{=}$  sequential execution of these transactions

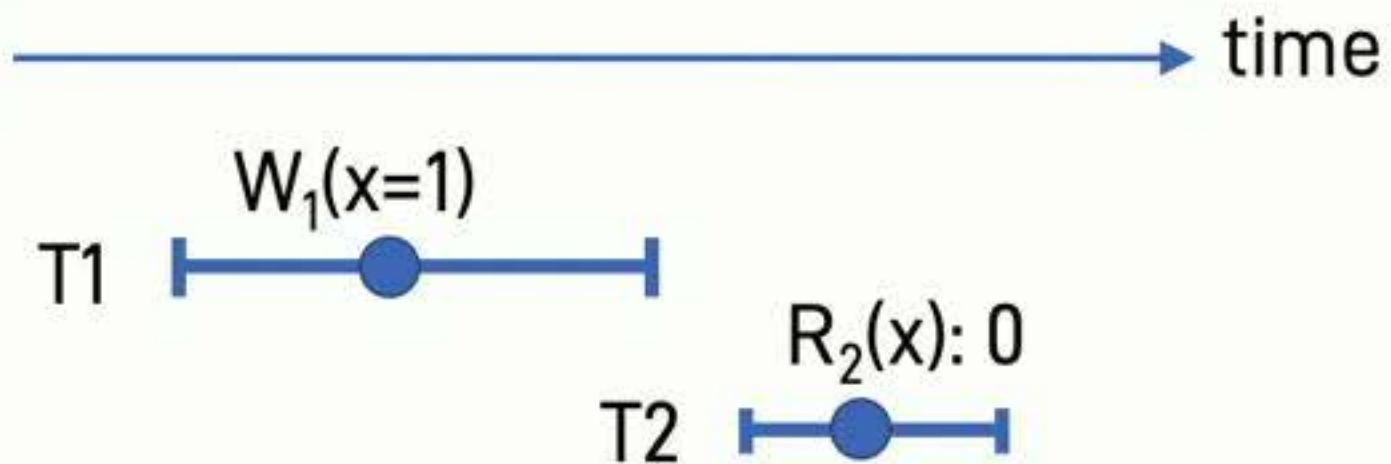


concurrent transactions  $\stackrel{?}{=}$  sequential execution  
of these transactions

- Checking view-SER is an NP-complete problem [Papadimitriou 79]

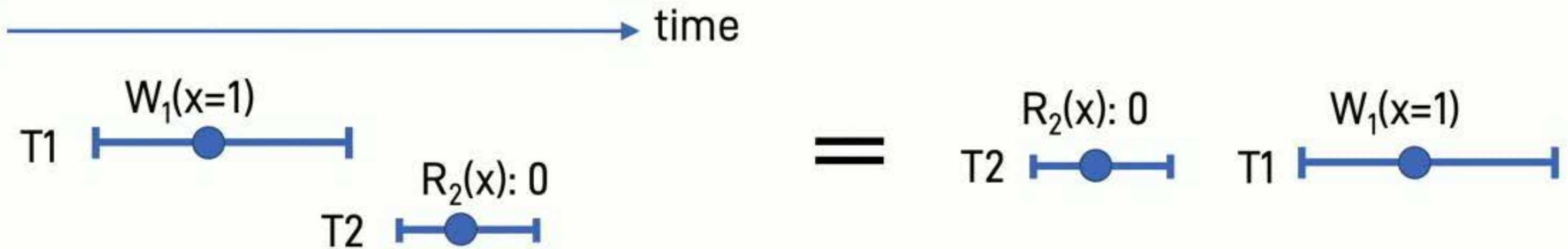
concurrent transactions  $\stackrel{?}{=}$  sequential execution  
of these transactions

- Checking **view**-SER is an NP-complete problem [Papadimitriou 79]
- Challenge: SER doesn't respect real-time order



concurrent transactions  $\stackrel{?}{=}$  sequential execution  
of these transactions

- Checking **view**-SER is an NP-complete problem [Papadimitriou 79]
- Challenge: SER doesn't respect real-time order



# Cobra aims at real-world workloads

- Intuition: advances of SAT/SMT solvers



# Cobra aims at real-world workloads

- Intuition: advances of SAT/SMT solvers
- Starting point (Papadimitriou's construction):

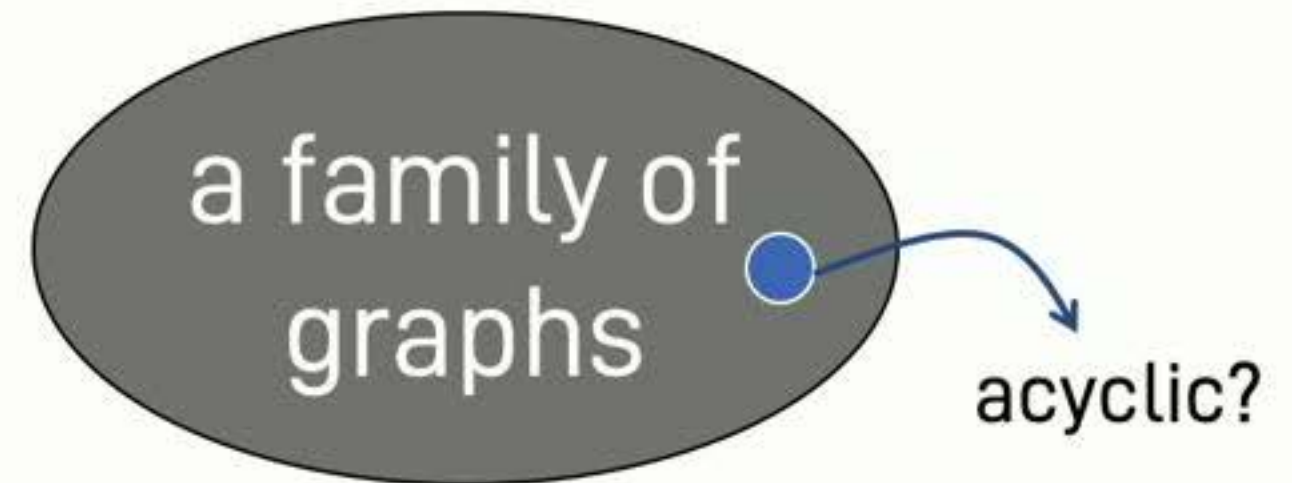
# Cobra aims at real-world workloads

- Intuition: advances of SAT/SMT solvers
- Starting point (Papadimitriou's construction):

concurrent transactions

**?  
=**

sequential execution  
of these transactions



# Cobra aims at real-world workloads

- Intuition: advances of SAT/SMT solvers
- Starting point (Papadimitriou's construction):

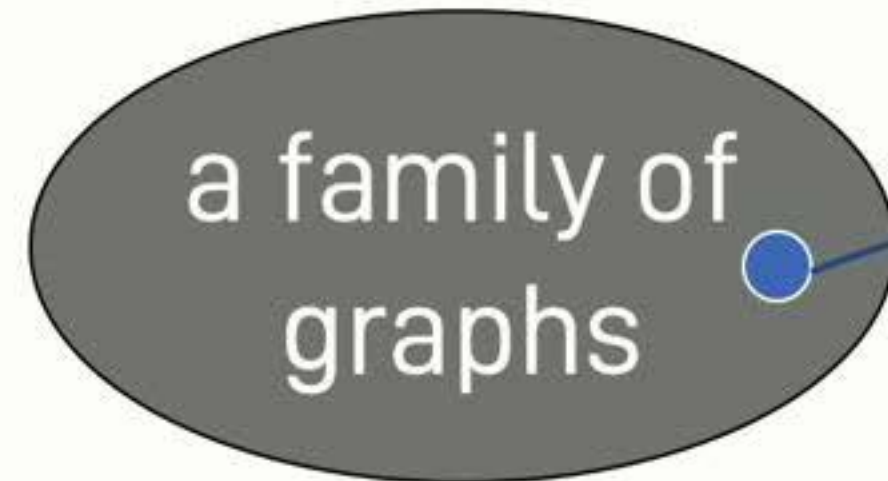
concurrent transactions

**?  
=**

sequential execution  
of these transactions



equivalent



acyclic?

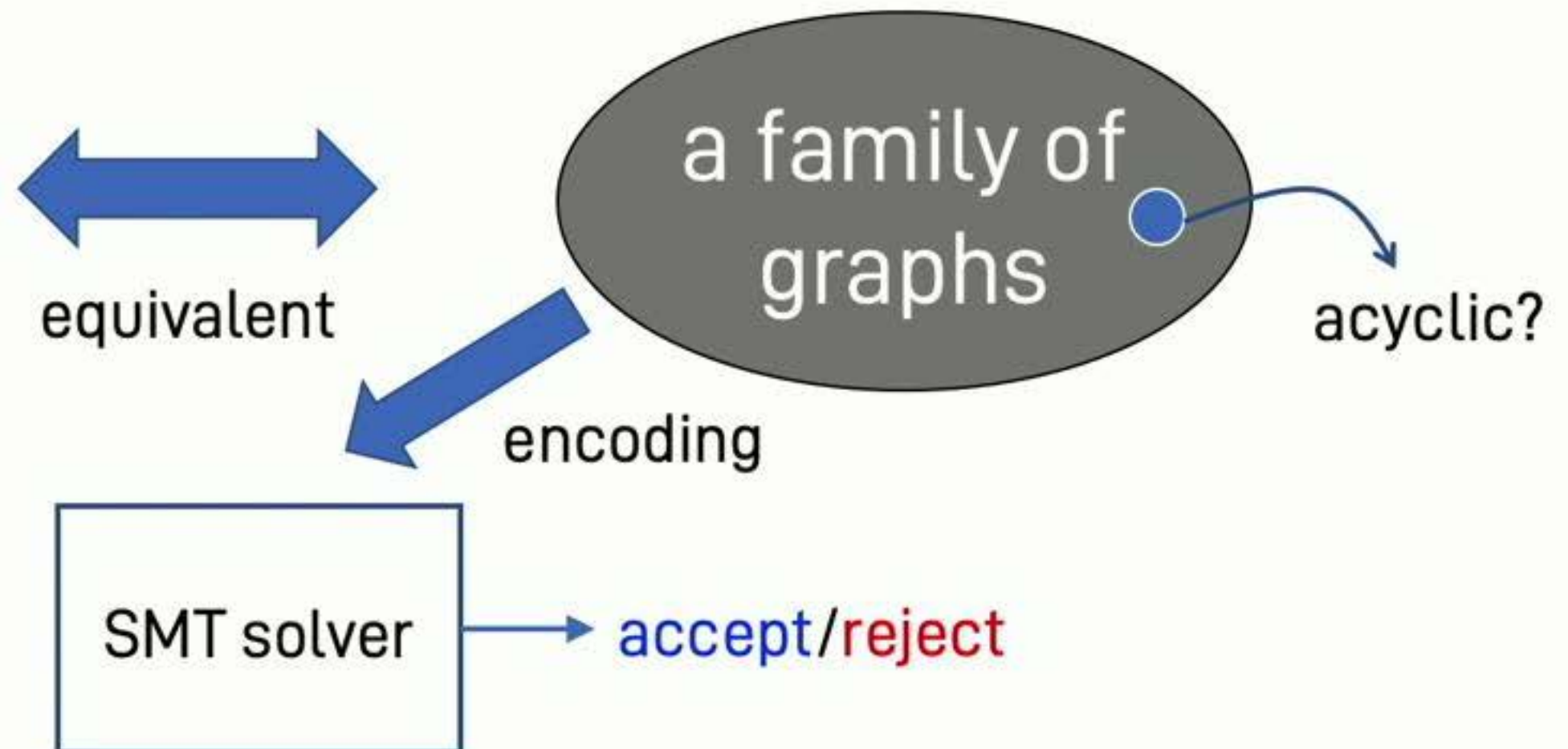
# Cobra aims at real-world workloads

- Intuition: advances of SAT/SMT solvers
- Starting point (Papadimitriou's construction):

concurrent transactions

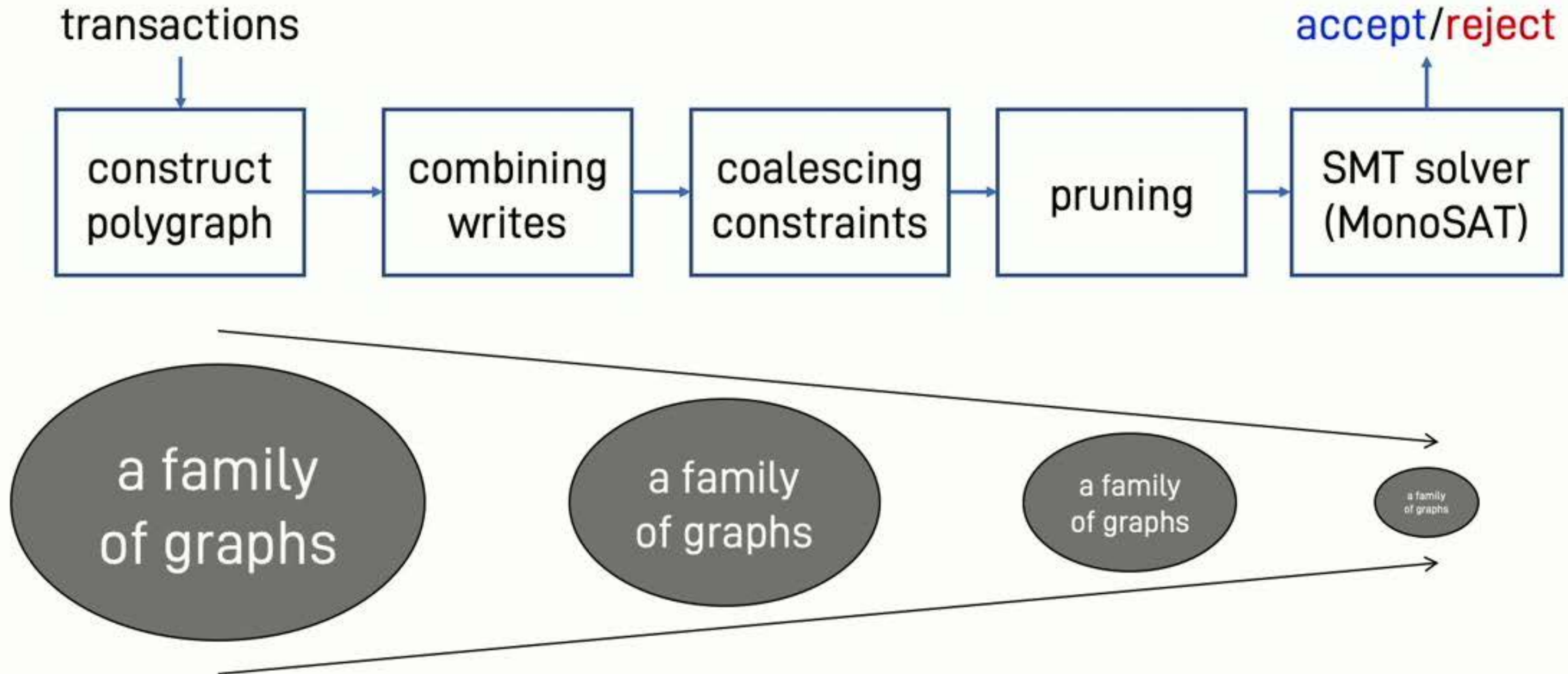
**?  
=**

sequential execution  
of these transactions

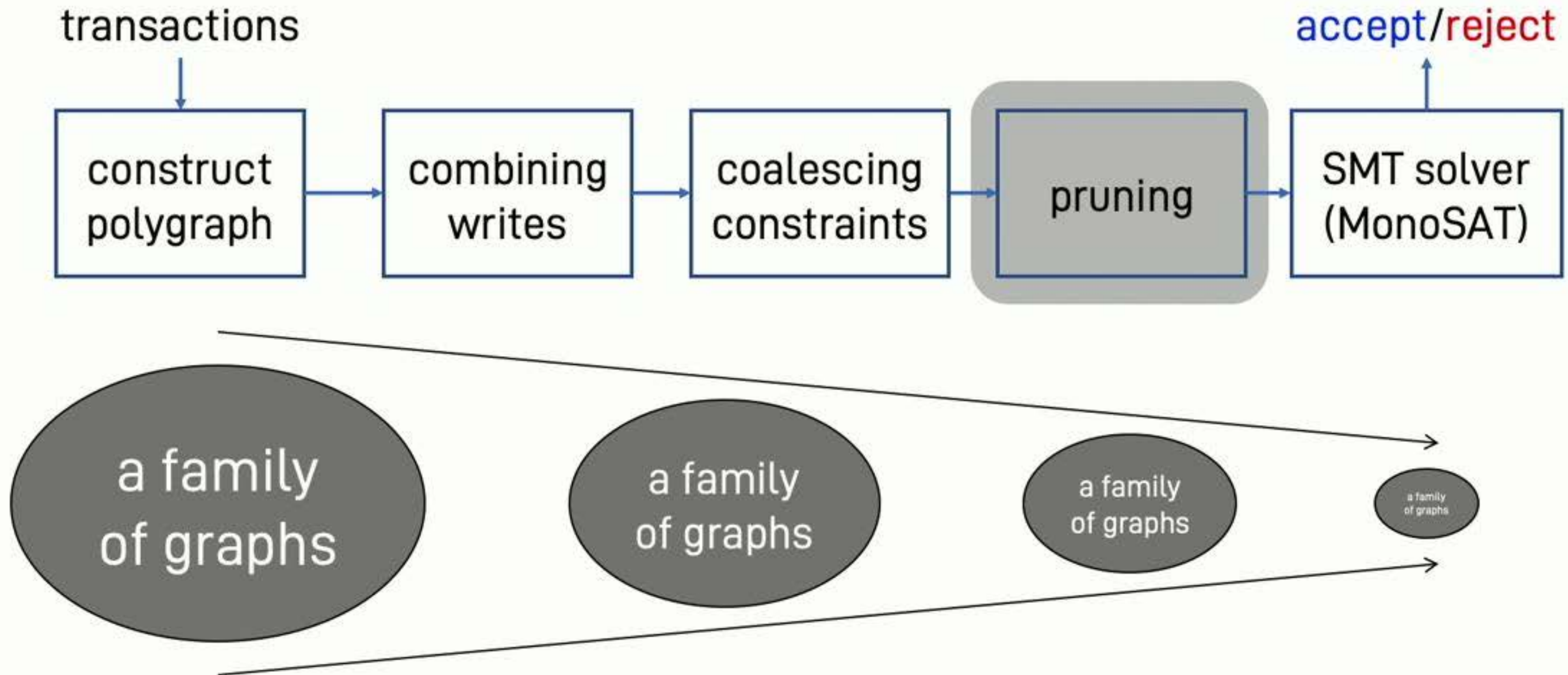




# Cobra: narrowing the search space



# Cobra: narrowing the search space



# Pruning via graph paths (reachability)

- idea: reduce #graphs by adding constraints to the family

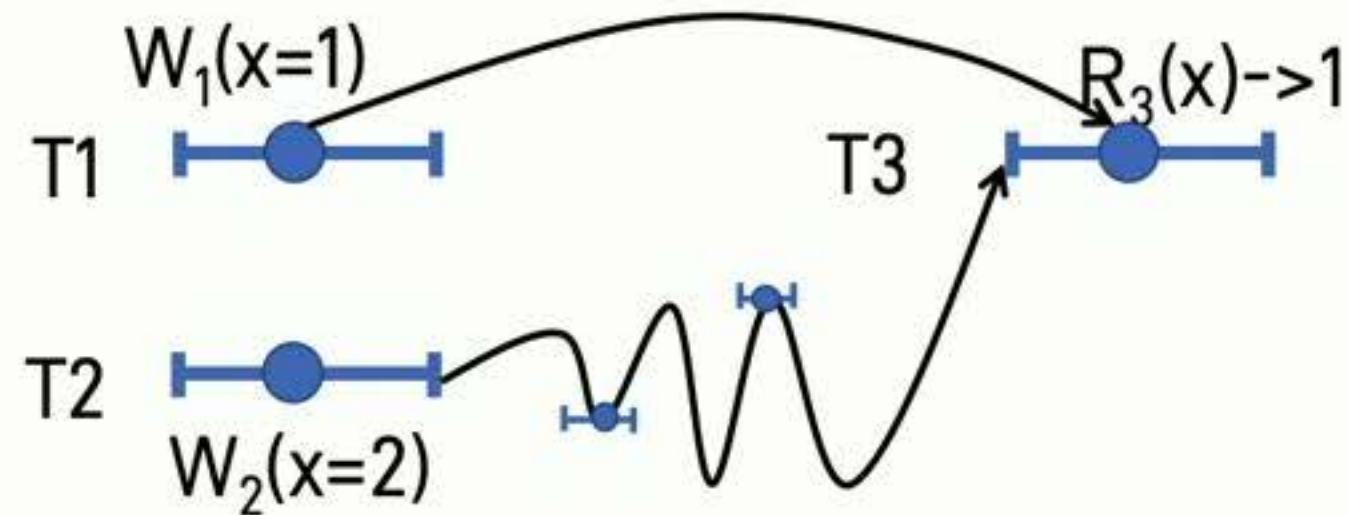
# Pruning via graph paths (reachability)

- idea: reduce #graphs by adding constraints to the family
  - 1) what constraints can be inferred from reachability?
  - 2) how to get reachability efficiently?



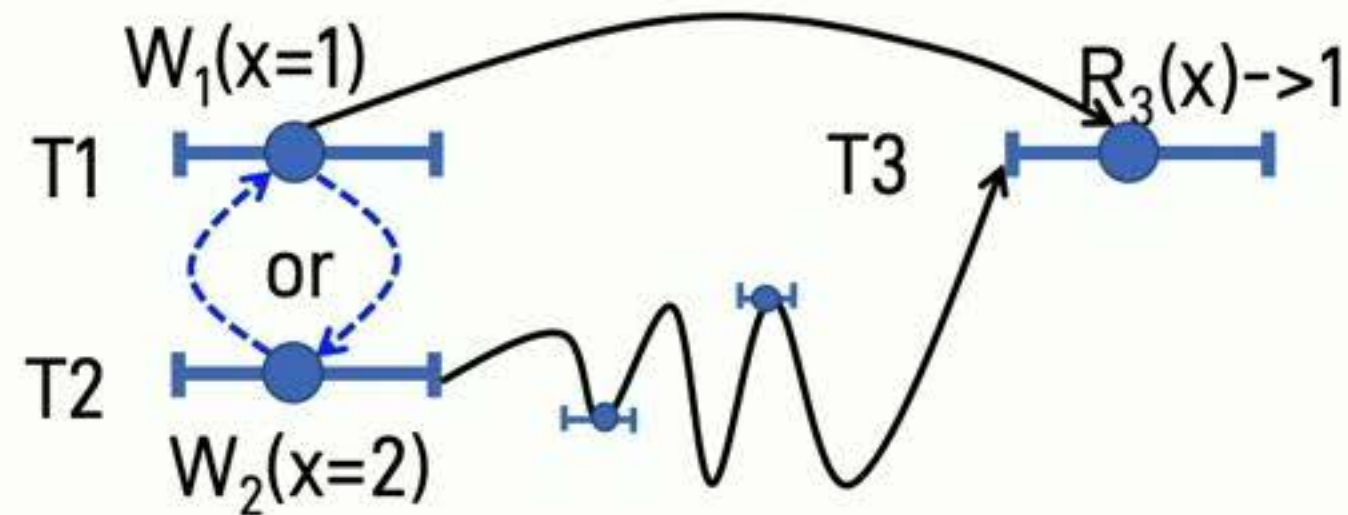
# Pruning via graph paths (reachability)

- idea: reduce #graphs by adding constraints to the family
  - 1) what constraints can be inferred from reachability?
  - 2) how to get reachability efficiently?



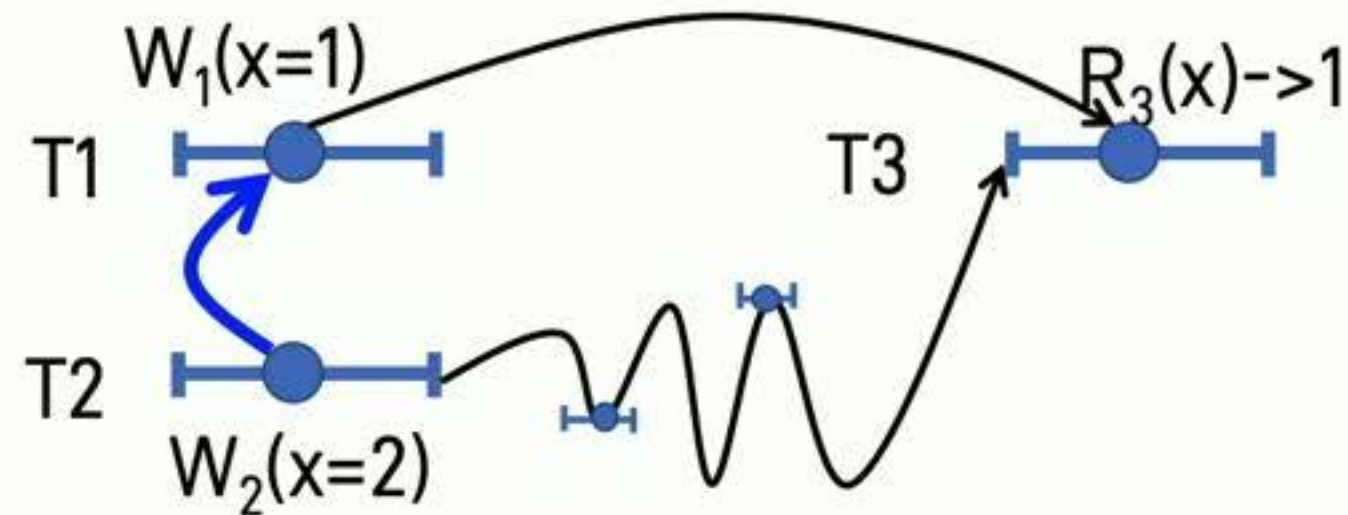
# Pruning via graph paths (reachability)

- idea: reduce #graphs by adding constraints to the family
  - 1) what constraints can be inferred from reachability?
  - 2) how to get reachability efficiently?



# Pruning via graph paths (reachability)

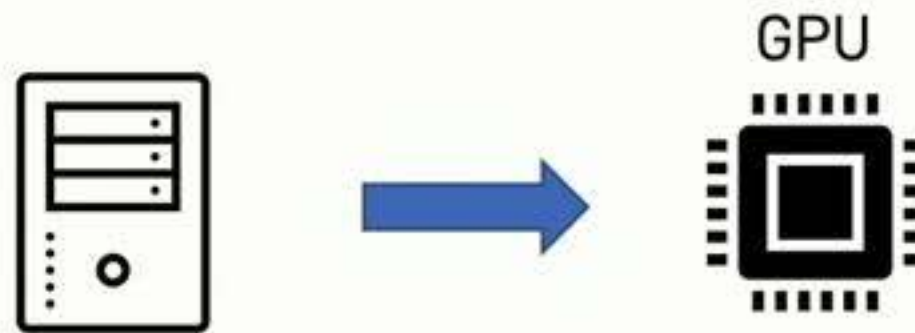
- idea: reduce #graphs by adding constraints to the family
  - 1) what constraints can be inferred from reachability?
  - 2) how to get reachability efficiently?





# Pruning via graph paths (reachability)

- idea: reduce #graphs by adding constraints to the family
  - 1) what constraints can be inferred from reachability?
  - 2) how to get reachability efficiently?

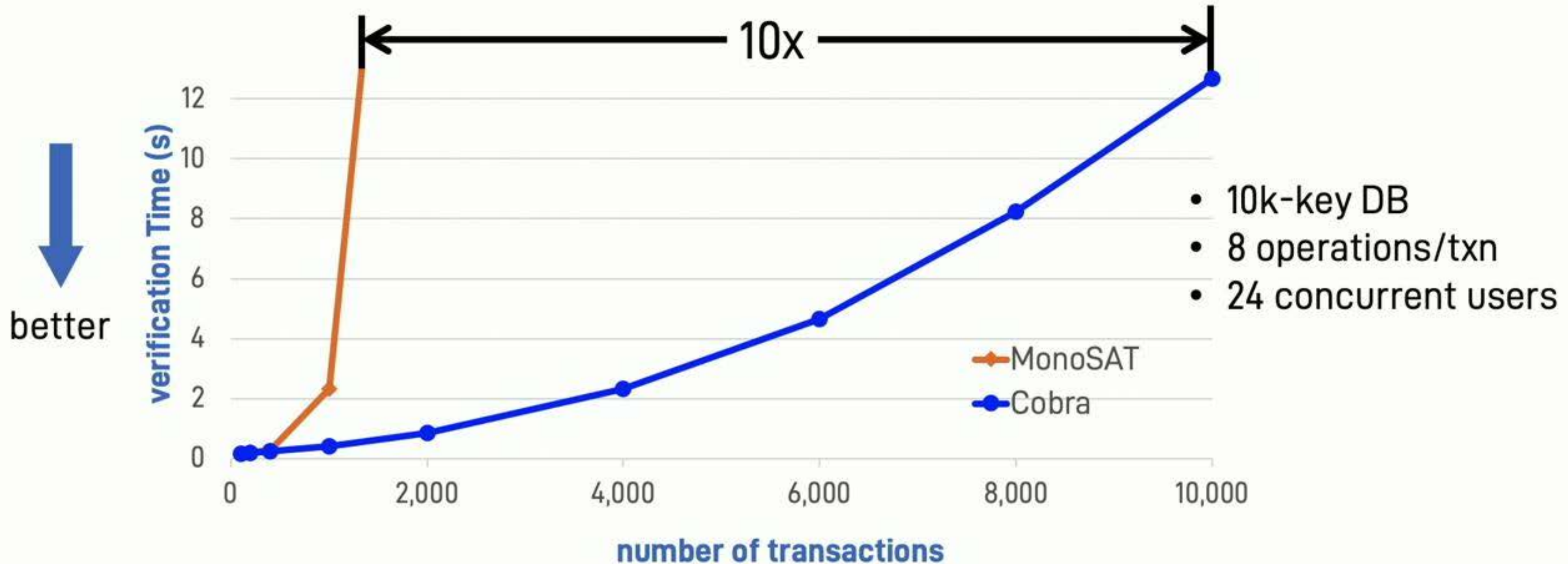


calculating reachability  
using [Matrix Multiplication](#)

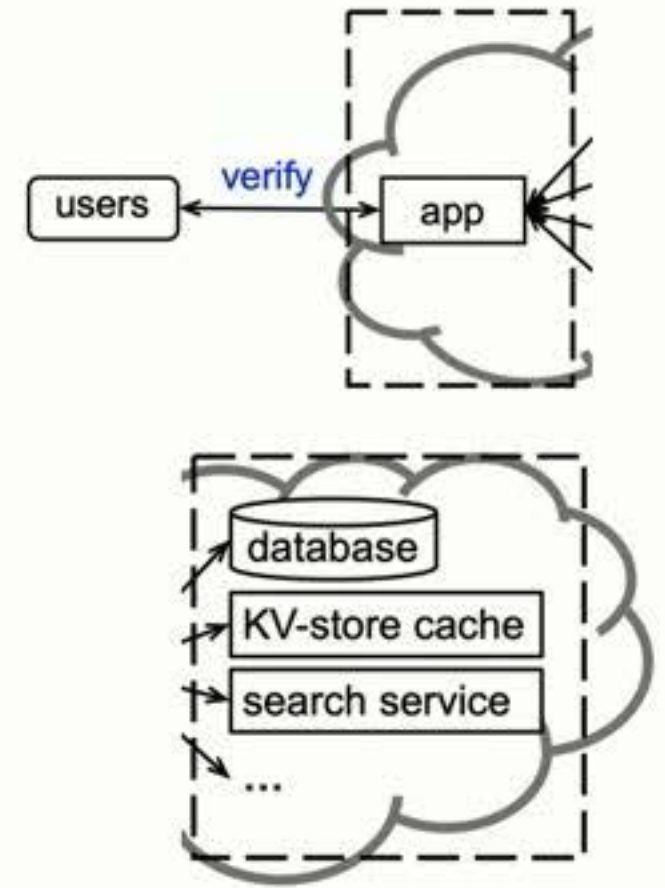


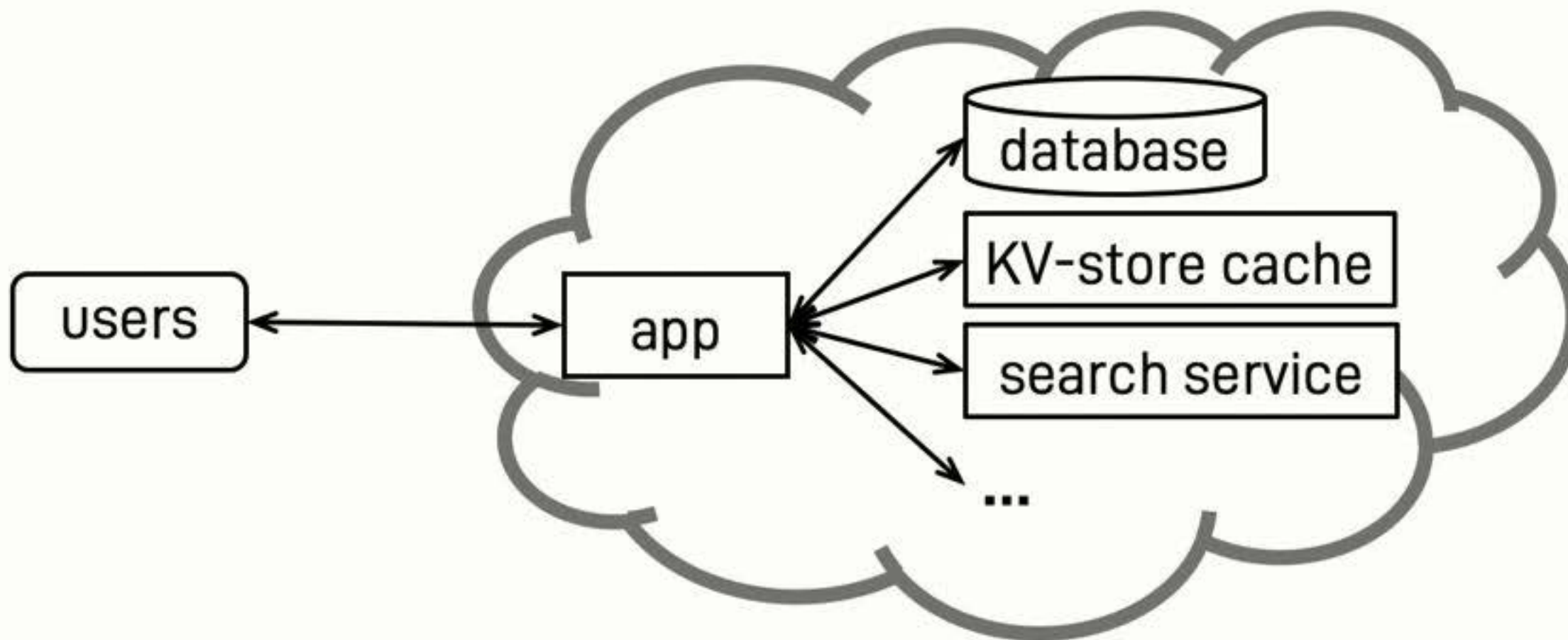
# Cobra can handle 10x larger workloads

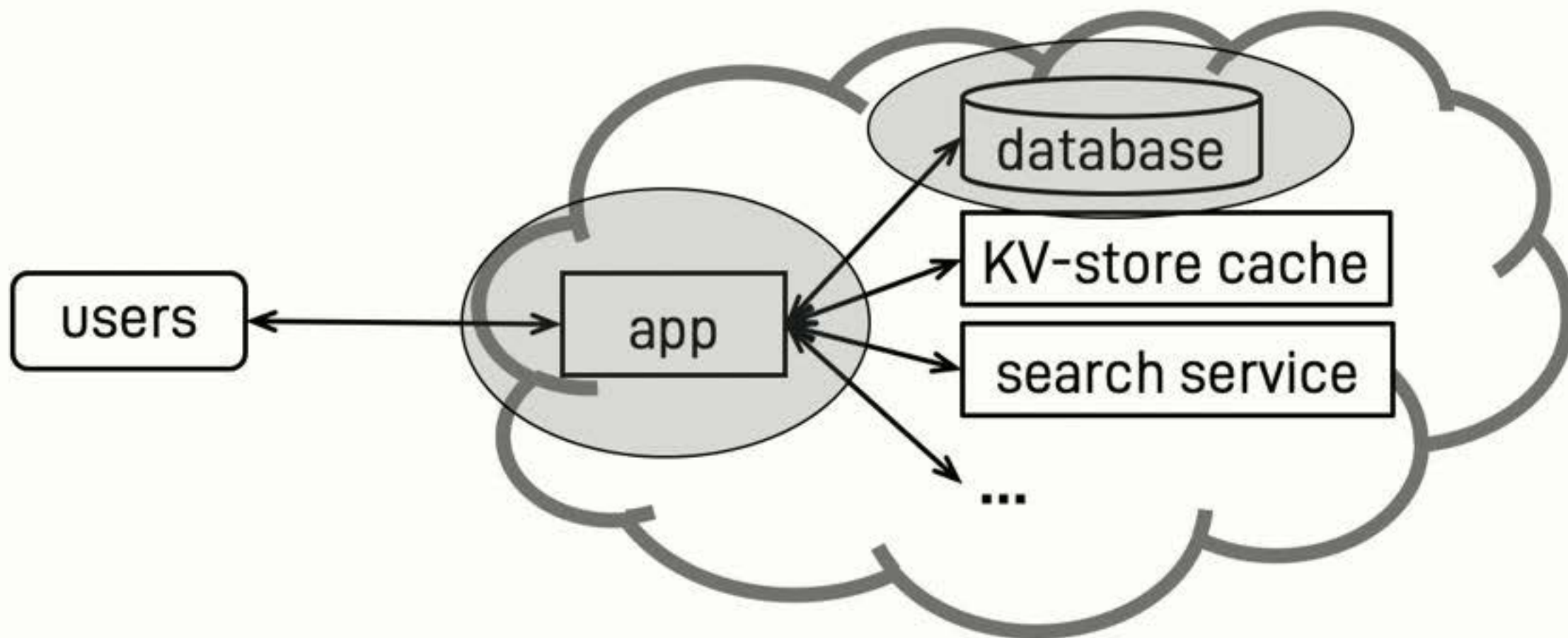
RW benchmark: read-only and write-only transactions (50:50)



- ① Verify white-box services (Orochi [SOSP'17])
- ② Verify black-box services (Cobra: verify Serializability)
- ③ Build composable verifiable framework (future work)
- ④ Other past work
  - Troubleshooting data center networks [NSDI'19]
  - Protecting secret via security-oriented offloading [EuroSys'15]



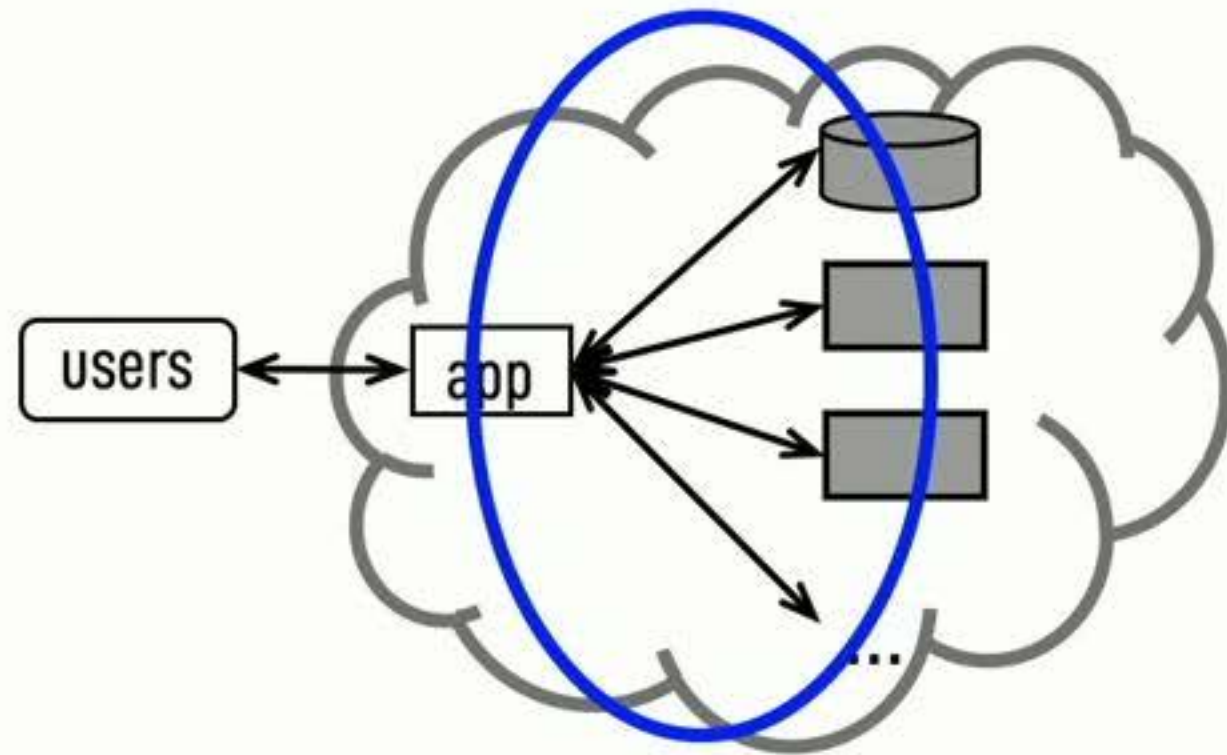






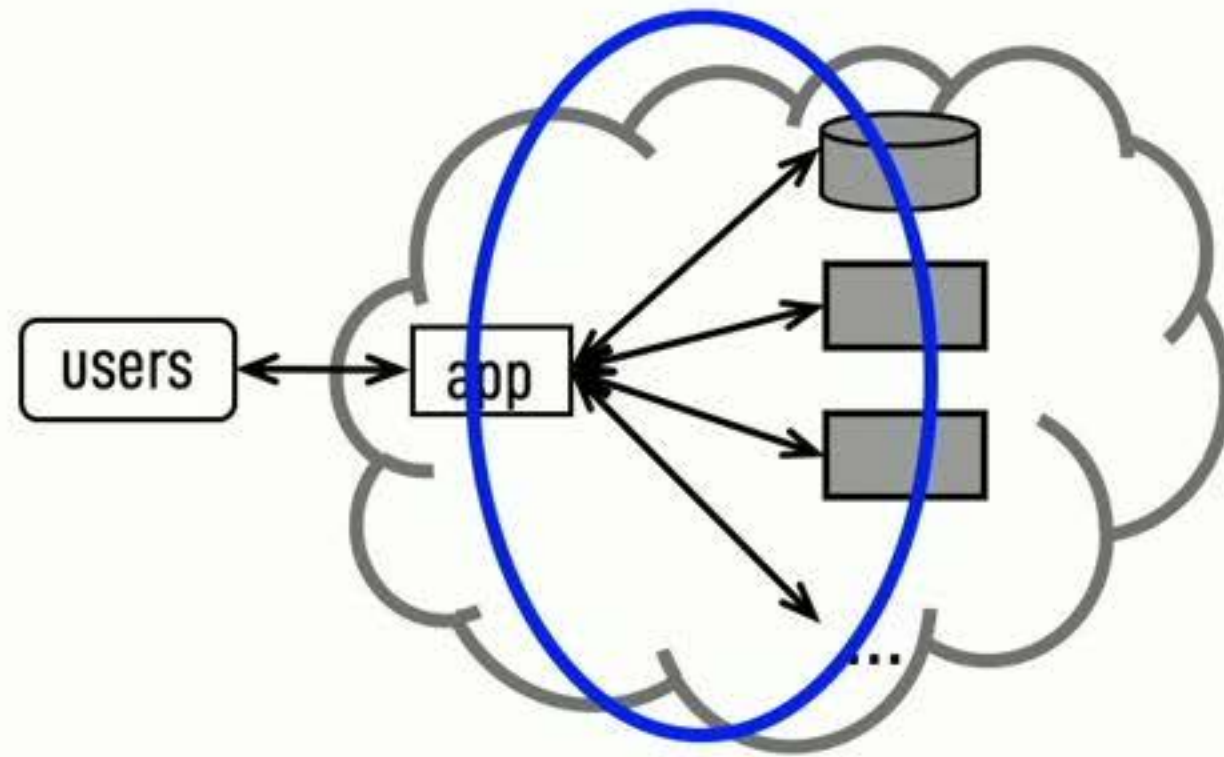
# Question #1:

## How to compose verifications of multiple services?

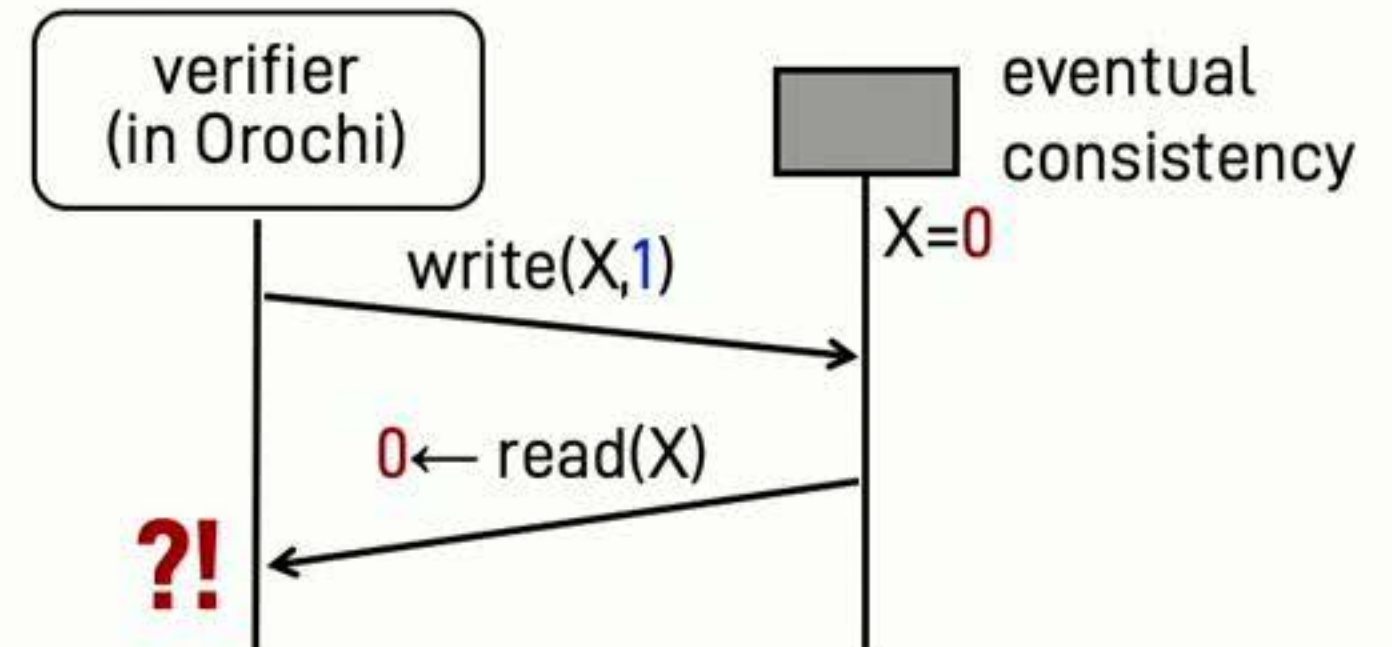


# Question #1:

## How to compose verifications of multiple services?

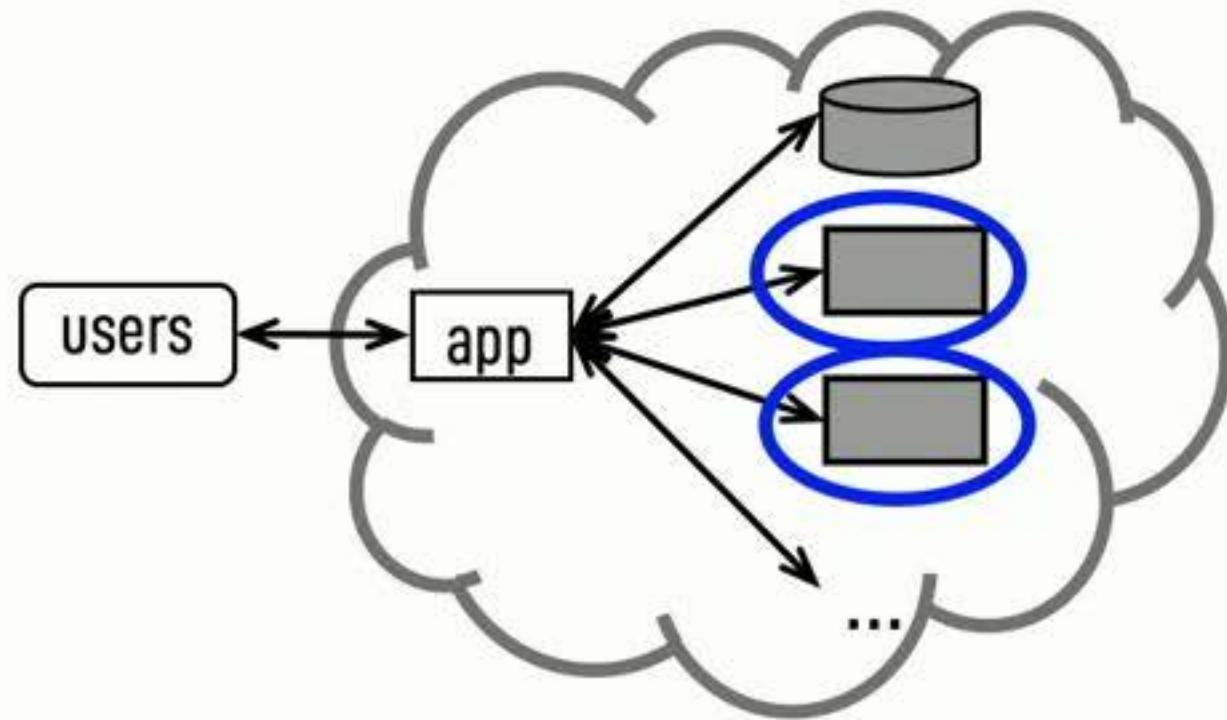


- **Challenge:** some services do not respect real-time order

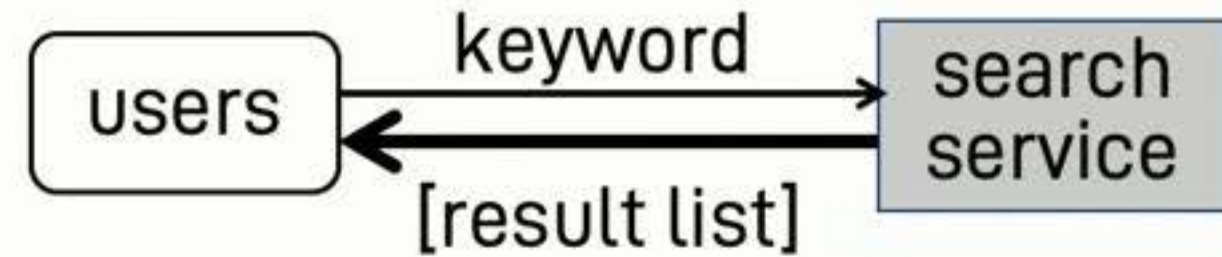


## Question #2:

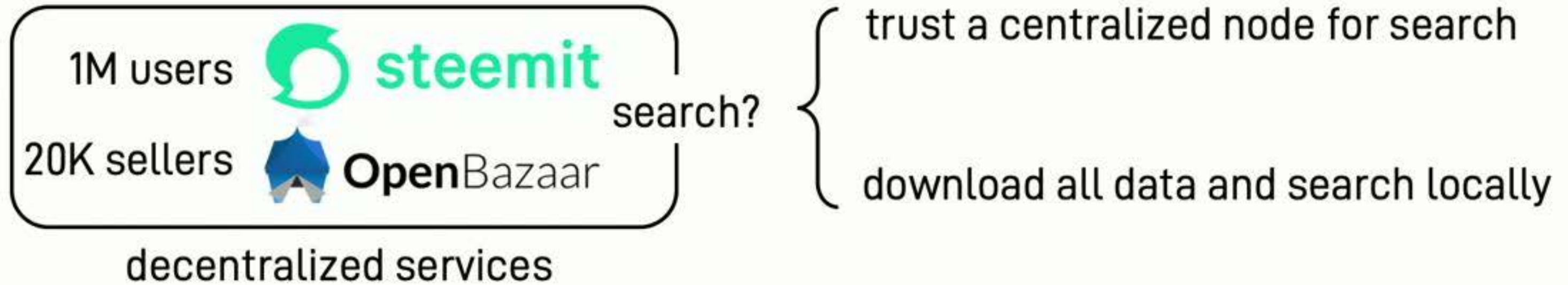
How to verify various black-box services?



for example, a search service

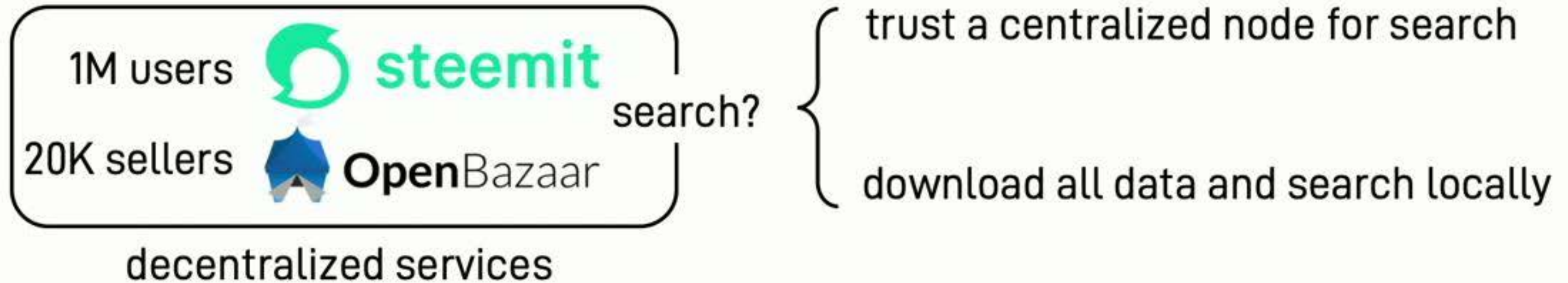


# Verifiable search engine

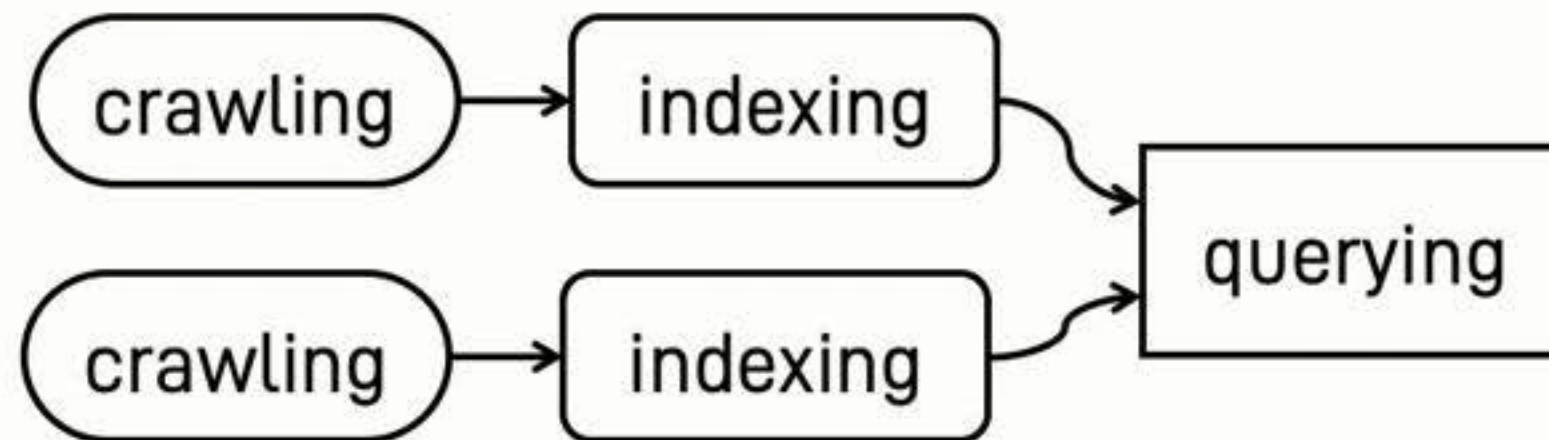




# Verifiable search engine

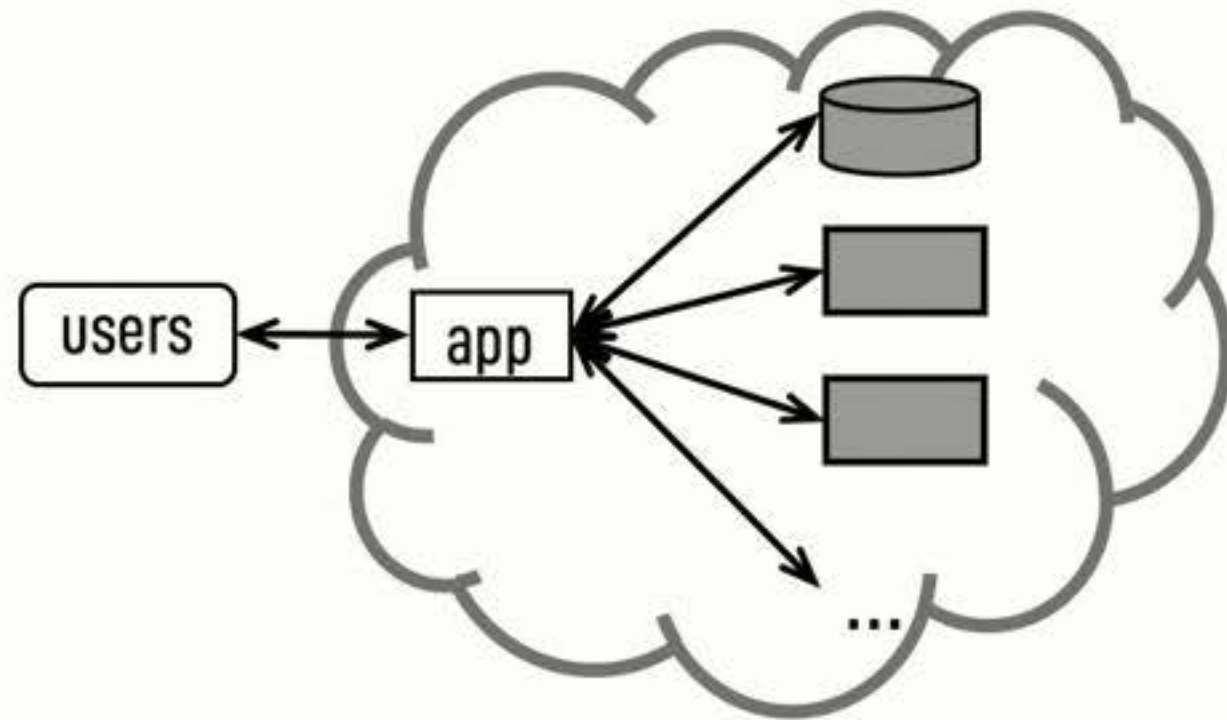


- Requirement (challenge): whole search pipeline needs to be verifiable



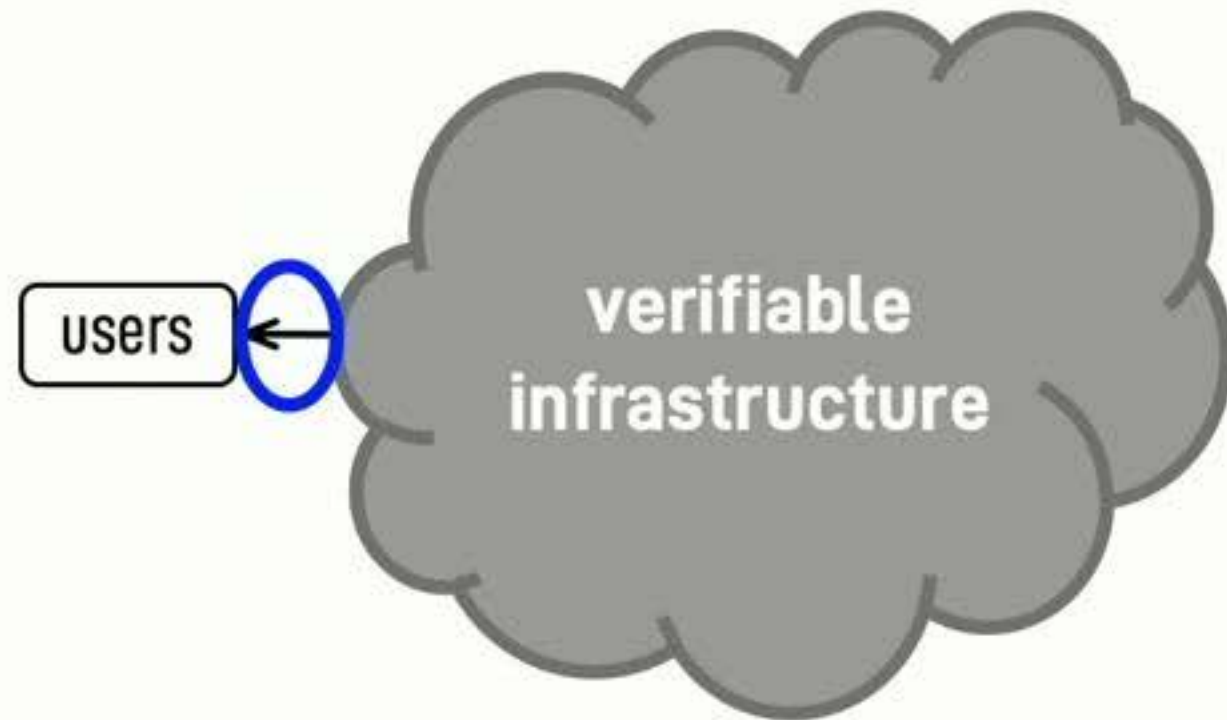
## Question #3:

How to verify properties other than execution integrity?



## Question #3:

How to verify properties other than execution integrity?

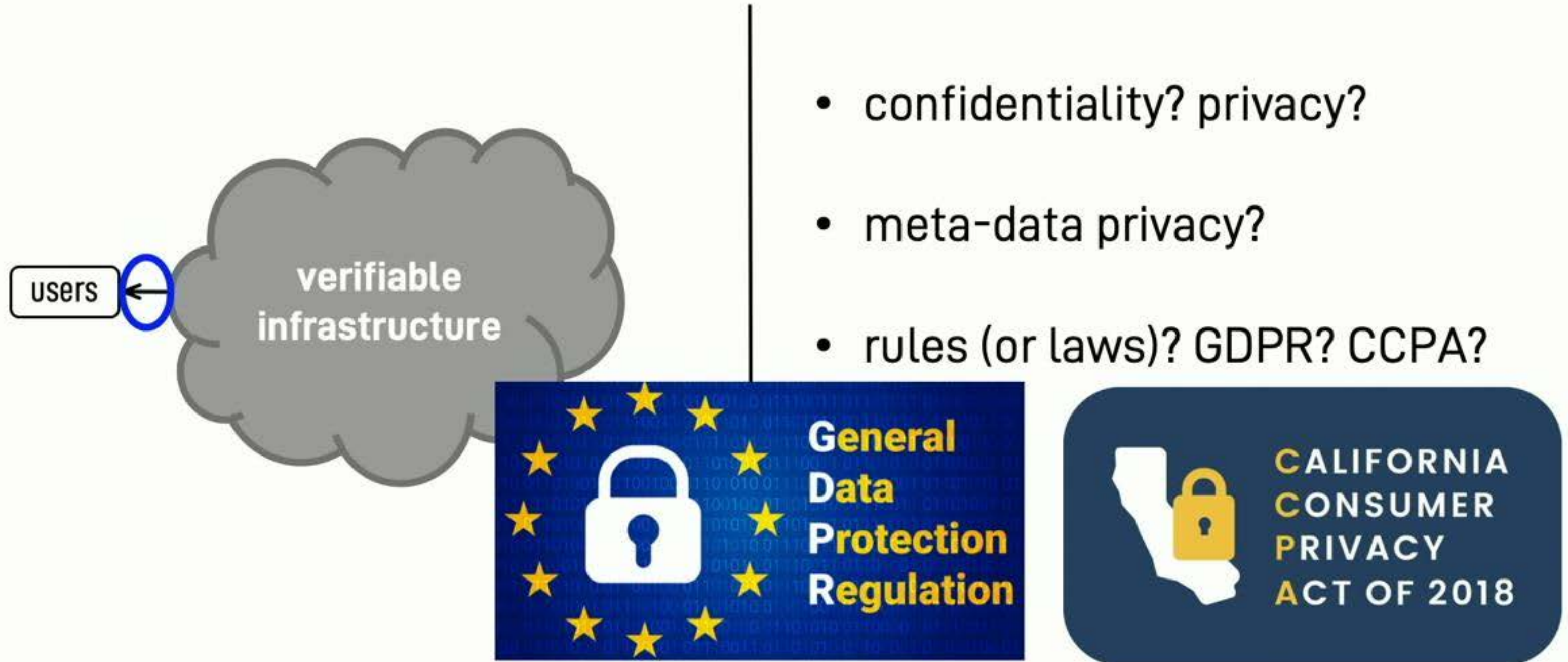


- confidentiality? privacy?
- meta-data privacy?



# Question #3:

How to verify properties other than execution integrity?





# A provable GDPR framework for web apps

- Motivation



GDPR compliance?

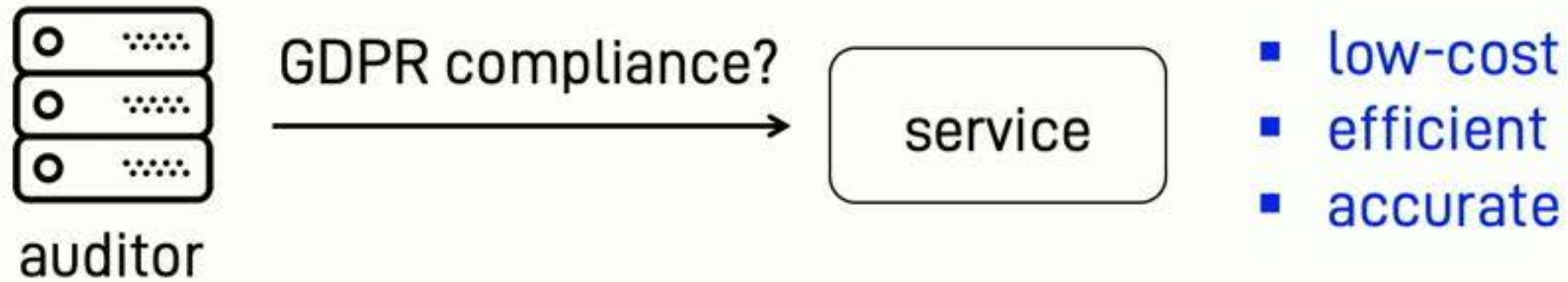


service

- expensive
- time consuming
- error-prone

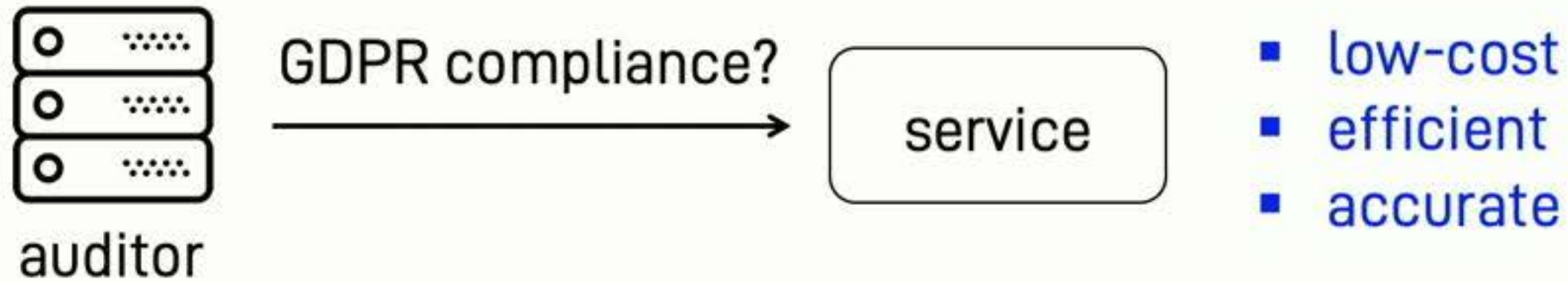
# A provable GDPR framework for web apps

- Motivation



# A provable GDPR framework for web apps

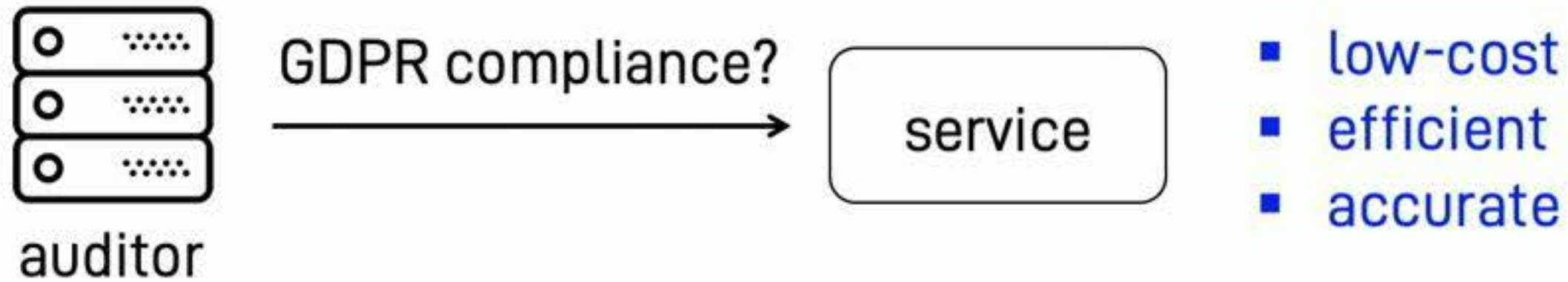
- Motivation



- Requirements (challenges):
  - a machine-checkable GDPR definition
  - audit puts zero trust on the service
  - audit must be efficient

# A provable GDPR framework for web apps

- Motivation



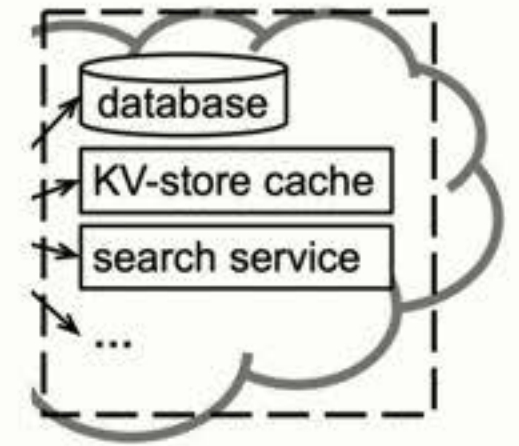
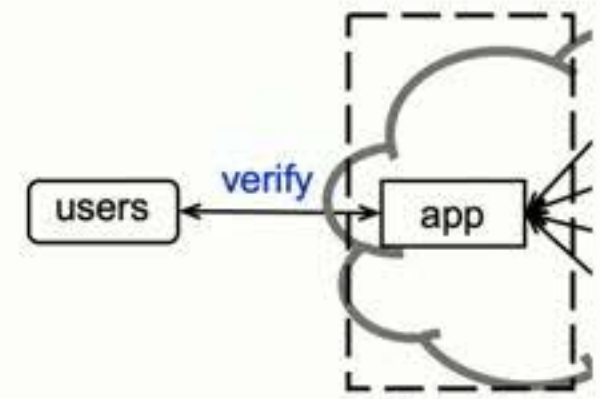
- Requirements (challenges):

- a machine-checkable GDPR definition
- audit puts zero trust on the service
- audit must be efficient

} Orochi and Cobra can help.



- ① Verify white-box services (Orochi [SOSP'17])
- ② Verify black-box services (Cobra: verify Serializability)
- ③ Build composable verifiable framework (future work)

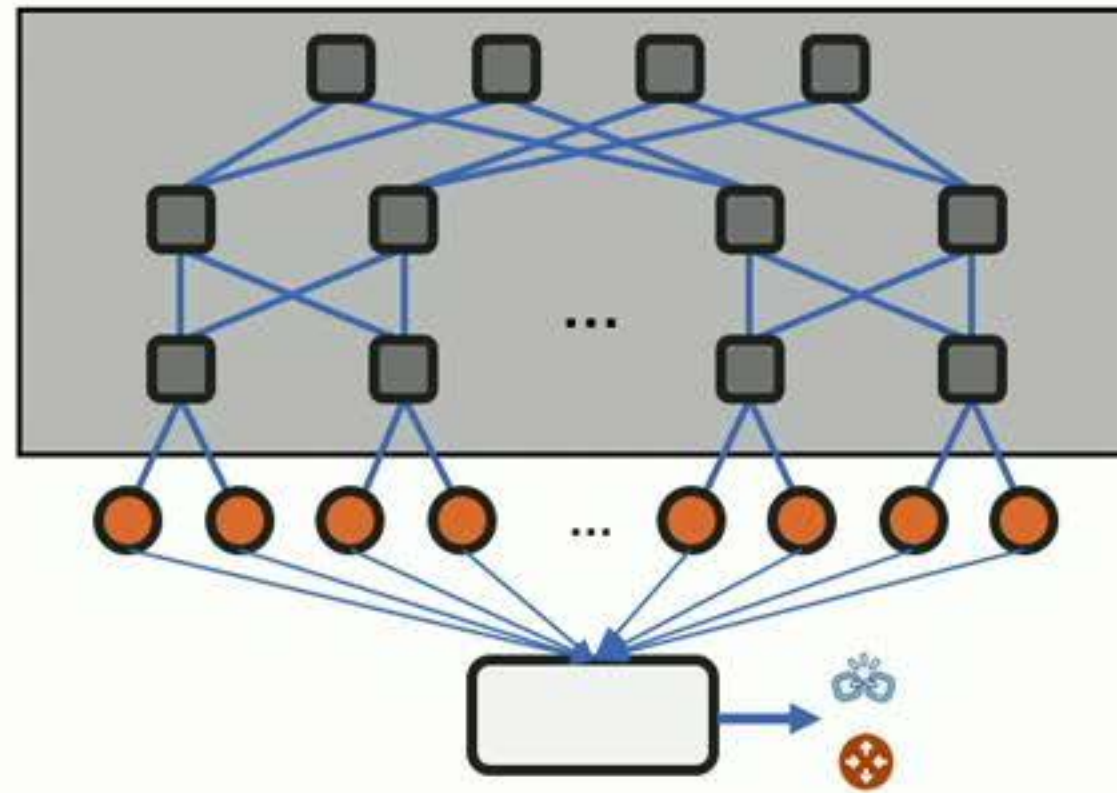


- ④ Other past work
  - Troubleshooting data center networks [NSDI'19]
  - Protecting secret via security-oriented offloading [EuroSys'15]

# NetBouncer [TJGZWDBX, NSDI'19]

## localizing failures in data center networks

without trusting any  
failure information from network



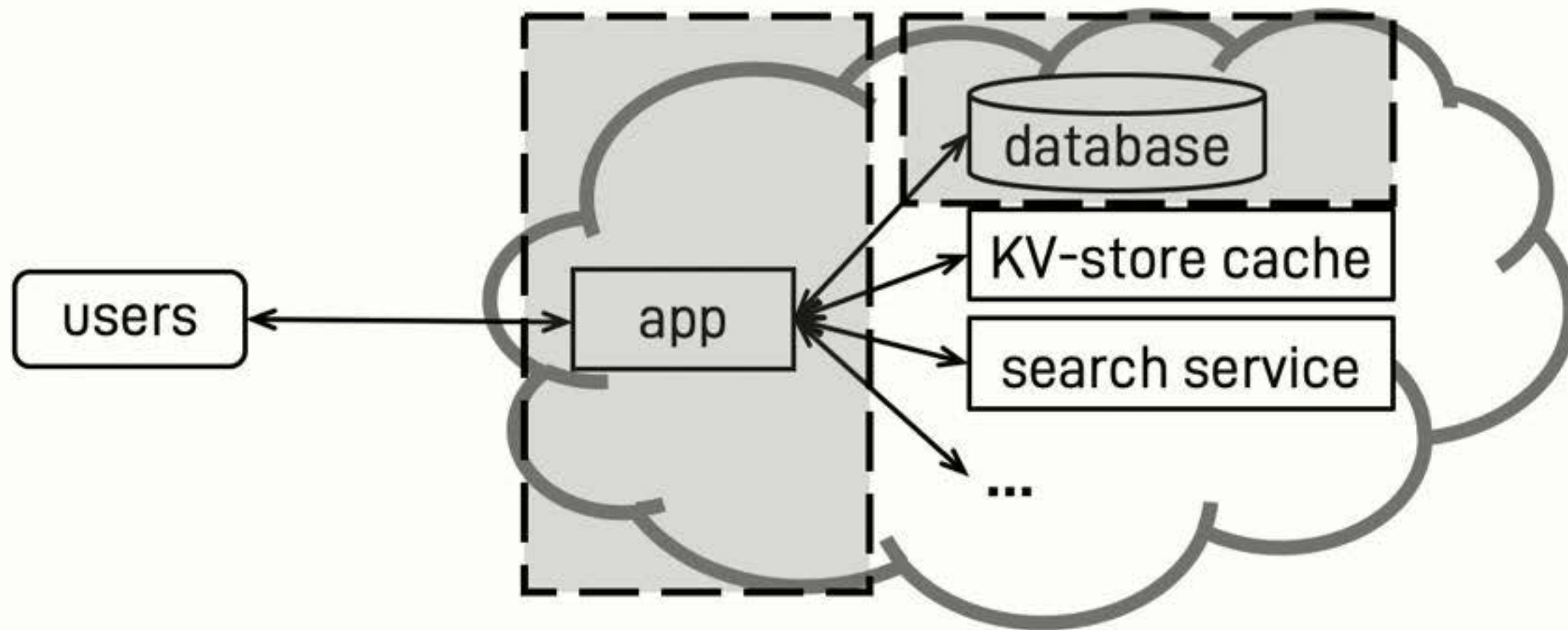
infer failures with end-to-end  
observation of network packet loss

- deployed in Microsoft Azure
- detected overlooked failures



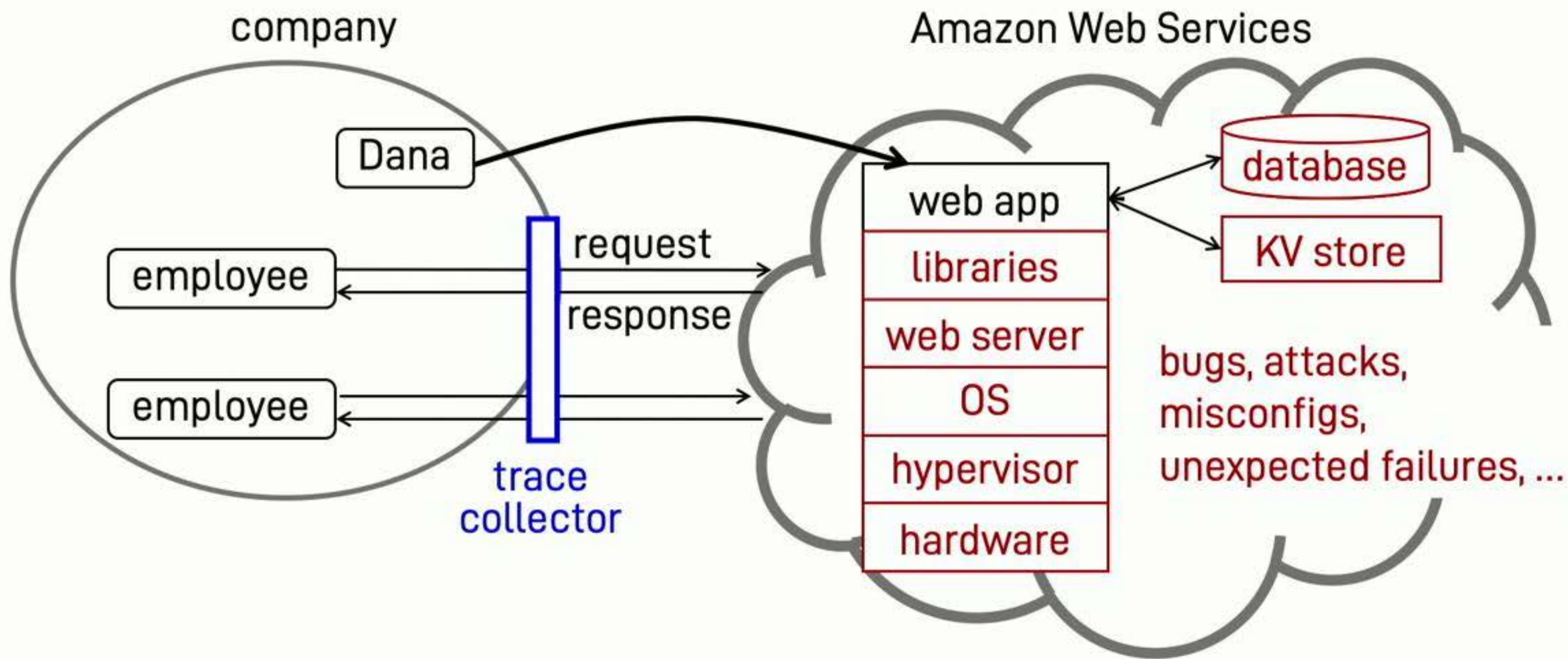
# Verifiable infrastructure

... enables users to verify outsourced services.



Orochi:  
verifying white-box services

Cobra:  
verifying black-box databases





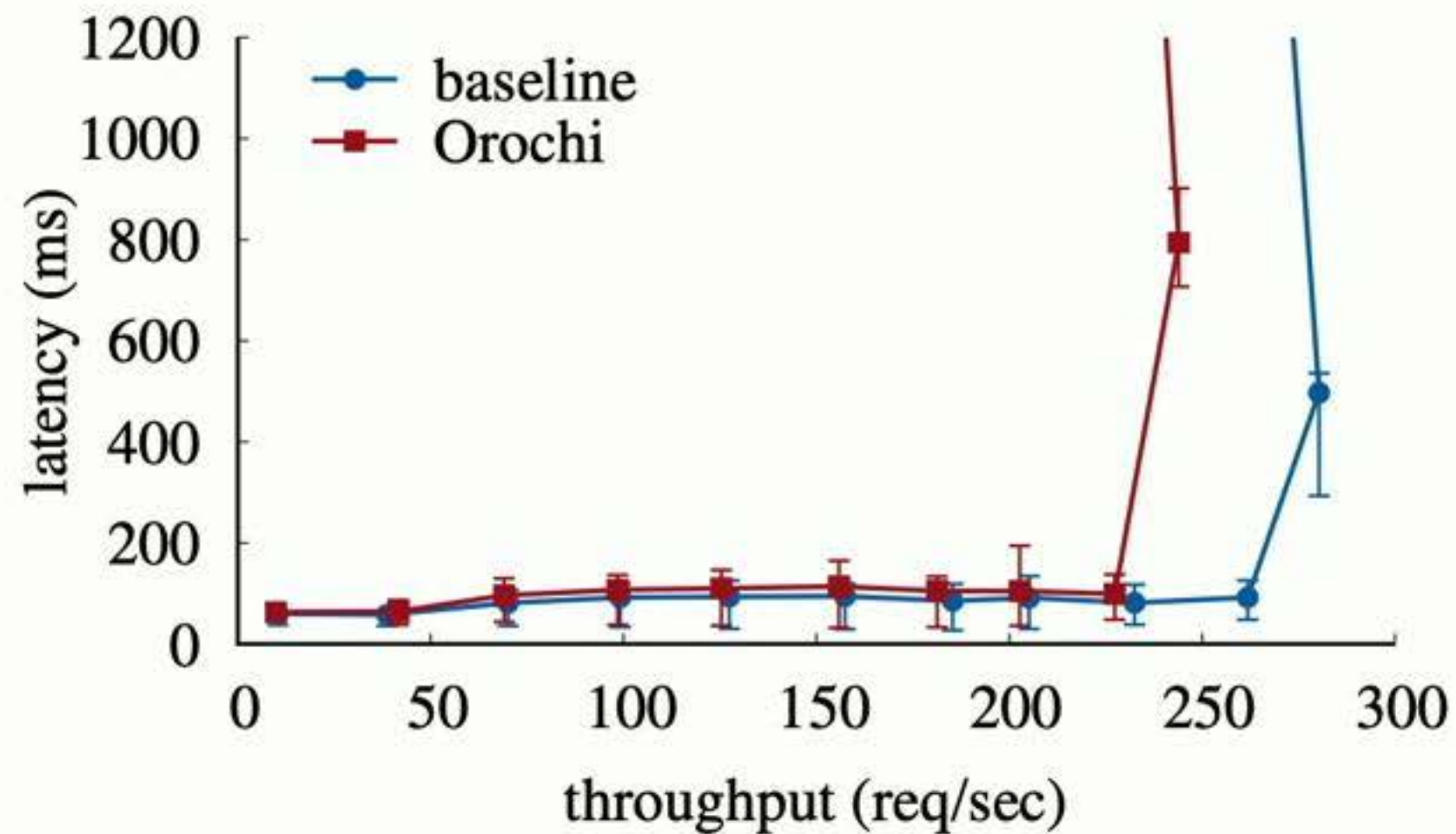
# What are the (server's) CPU/network/storage costs?

CPU	Network			Storage
MediaWiki's workload	trace (per req)	advice (per req)	Orochi's overhead	MediaWiki's workload
4.7%	MediaWiki's workload			1.0x
	7.1KB	1.7KB	11.4%	

# What are the (server's) CPU/network/storage costs?

CPU	Network			Storage
MediaWiki's workload	trace (per req)	advice (per req)	Orochi's overhead	MediaWiki's workload
4.7%	MediaWiki's workload			1.0x
phpBB's workload	7.1KB	1.7KB	11.4%	phpBB's workload
8.6%	phpBB's workload			1.7x
HotCRP's workload	5.7KB	0.3KB	2.7%	HotCRP's workload
5.9%	HotCRP's workload			1.5x
	3.2KB	0.4KB	10.9%	

## Orochi imposes small overheads on throughput and latency



phpBB's workload



# Why Serializability (SER)?

gold standard  
isolation level



CockroachDB  
(2015)



Amazon Aurora  
(2015)



Google Spanner  
(2017)



YugaByteDB  
(2017)

...

fundamental  
and  
challenging