

# Information Leakage in Arbiter Protocols

[Nestan Tsiskaridze](#), *Lucas Bang*, *Joseph McMahan*, *Tevfik Bultan* and *Timothy Sherwood*

**University of California Santa Barbara**

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# TIME

Monday, Aug. 13, 1990

## And Bomb The Anchovies

By Paul Gray

Delivery people at various Domino's pizza outlets in and around Washington claim that they have learned to anticipate big news baking at the White House or the Pentagon by the upsurge in takeout orders. Phones usually start ringing some 72 hours before an official announcement. "We know," says one pizza runner. "Absolutely. Pentagon orders doubled up the night before the Panama attack; same thing happened before the Grenada invasion." Last Wednesday, he adds, "we got a lot of orders, starting around midnight. We figured something was up." This time the big news arrived quickly: Iraq's surprise invasion of Kuwait.

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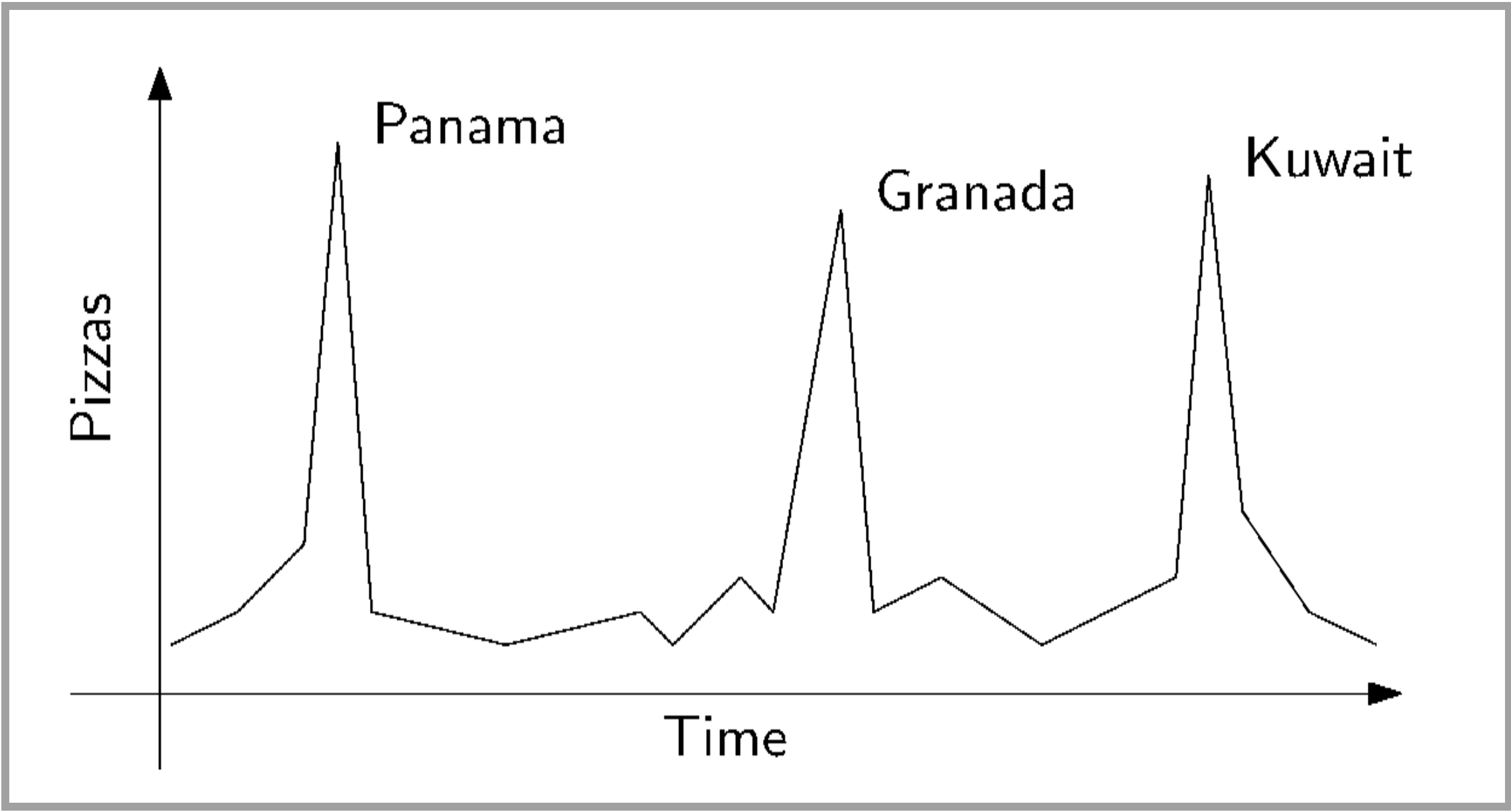
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- Does the **information leak**?

- **How much** information leaks?

- Can we **always prevent** information from crossing from one domain to another?
- Can we **identify** and **quantify** the information leakage?
- Can we **automate**?

# Priority Arbiter: process with the lowest ID gets access.

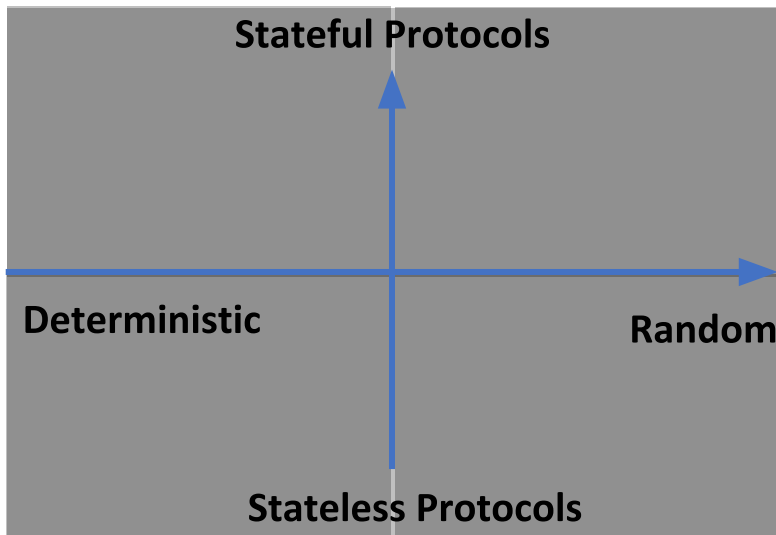




# Arbiter Protocols

## Categories:

How to **resolve concurrent requests**?



Are the **processes stateful/stateless**?

A **process** is **stateless** if *requests* at each round are **independent** from those of the previous rounds; Otherwise, a **process** is **stateful**.

# Stateless Protocols

## Procedure PRIORITY

**Input:**  $R[1..n]$  an array of requests

**Output:**  $G[1..n]$  an array of responses

1:  $G \leftarrow (\perp, \dots, \perp)$

2:  $pid \leftarrow \text{NULL}$

3: **for**  $i \leftarrow 1$  **to**  $n$  **do**

4:     **if**  $R[i] = \top$  **then**

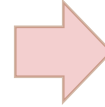
5:          $pid \leftarrow i$

6:         **break**

7:     **end if**

8: **end for**

Select the Process



Grant the Access



9: **if**  $pid \neq \text{NULL}$  **then**

10:      $G[pid] \leftarrow \top$

11: **end if**

12: **return**  $G$

Stateful Protocols



PRIORITY

Stateless Protocols

Deterministic



Random

# Stateless Protocols

## Procedure RANDOM

**Input:**  $R[1..n]$  an array of requests

**Output:**  $G[1..n]$  an array of responses

1:  $G \leftarrow (\perp, \dots, \perp)$

2: **if** ISRACE( $R$ ) **then**

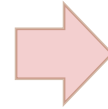
3:      $pid \leftarrow \text{PICKRND}(R)$

4: **else**

5:      $pid \leftarrow \text{FINDREQ}(R)$

6: **end if**

Select the Process

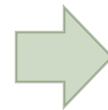


7: **if**  $pid \neq \text{NULL}$  **then**

8:      $G[pid] \leftarrow \top$

9: **end if**

Grant the Access



10: **return**  $G$

Stateful Protocols



Stateless Protocols

Deterministic

PRIORITY

RANDOM

Random



# Stateful Protocols

**Global:**  $tkn$

**Procedure** ROUNDROBIN

**Input:**  $R[1..n]$  an array of requests

**Output:**  $G[1..n]$  an array of responses

1:  $G \leftarrow (\perp, \dots, \perp)$

2: **if**  $tkn = n + 1$  **then**

3:      $tkn \leftarrow 1$

4: **end if**

5:  $pid \leftarrow \text{NULL}$

6: **if**  $R[tkn]$  **then**

7:      $pid \leftarrow tkn$

8: **end if**

9: **if**  $pid \neq \text{NULL}$  **then**

10:      $G[pid] \leftarrow \top$

11: **end if**

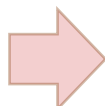
12:  $tkn \leftarrow tkn + 1$

13: **return**  $G$

Update the Global Data



Select the Process



Grant the Access



Update the Global Data



Stateful Protocols



ROUNDROBIN



Deterministic

PRIORITY



RANDOM

Random

Stateless Protocols

# Stateful Protocols

Global:  $tkn$

Procedure ROUNDROBINSKIP

Input:  $R[1..n]$  an array of requests

Output:  $G[1..n]$  an array of responses

1:  $G \leftarrow (\perp, \dots, \perp)$

2: **if**  $tkn = n + 1$  **then**

3:      $tkn \leftarrow 1$

4: **end if**

Update the Global Data

Select the Process

5:  $pid \leftarrow \text{FINDFIRST}(R, tkn)$

Grant the Access

6: **if**  $pid \neq \text{NULL}$  **then**

7:      $G[pid] \leftarrow \top$

Update the Global Data

8:      $tkn \leftarrow pid + 1$

9: **end if**

10: **return**  $G$

Stateful Protocols



ROUNDROBINSKIP

ROUNDROBIN

PRIORITY

RANDOM

Random

Stateless Protocols

Deterministic

# Stateful Protocols

**Global:**  $W[1..n]$  an array of wait-times

**Procedure** LOTTERY

**Input:**  $R[1..n]$  an array of requests

**Output:**  $G[1..n]$  an array of responses

1:  $G \leftarrow (\perp, \dots, \perp)$

2: **for**  $i \leftarrow 1$  **to**  $n$  **do**

3:     **if**  $R[i] = \top$  **then**

4:          $W[i] \leftarrow W[i] + 1$

5:     **else**

6:          $W[i] \leftarrow 0$

7:     **end if**

8: **end for**

9: **if** ISRACE( $R$ ) **then**

10:      $pid \leftarrow \text{PICKRND}(W)$

11: **else**

12:      $pid \leftarrow \text{FINDREQ}(R)$

13: **end if**

14: **if**  $pid \neq \text{NULL}$  **then**

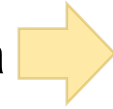
15:      $G[pid] \leftarrow \top$

16:      $W[pid] \leftarrow 0$

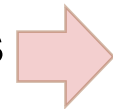
17: **end if**

18: **return**  $G$

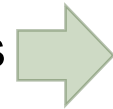
Update the Global Data



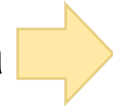
Select the Process



Grant the Access



Update the Global Data



Stateful Protocols

ROUNDROBINSKIP

ROUNDROBIN

LOTTERY

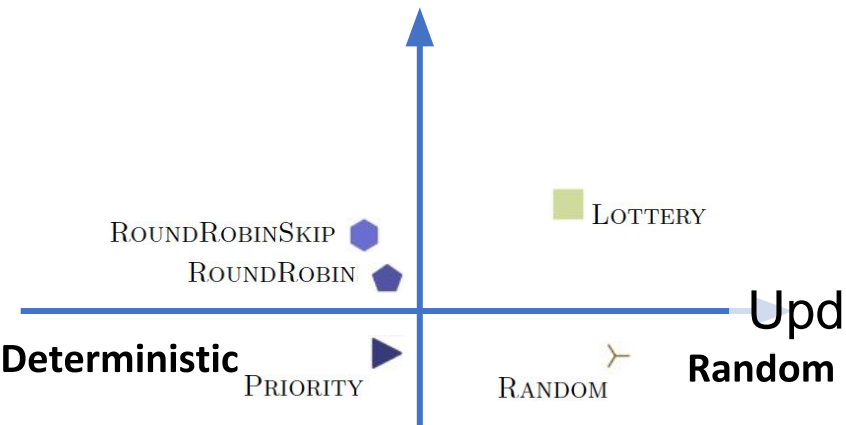
PRIORITY

RANDOM

Random

Stateless Protocols

Deterministic



# Stateful Protocols

Global:  $W[1..n]$  an array of wait-times

Procedure FCFS

Input:  $R[1..n]$  an array of requests

Output:  $G[1..n]$  an array of responses

1:  $G \leftarrow (\perp, \dots, \perp)$

2: for  $i \leftarrow 1$  to  $n$  do

3:   if  $R[i] = \top$  then

4:      $W[i] \leftarrow W[i] + 1$

5:   else

6:      $W[i] \leftarrow 0$

7:   end if

8: end for

Update the Global Data



9: if ISRACE( $R$ ) then

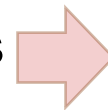
10:    $pid \leftarrow \text{PICKONE}(\text{ALLMAX}(W))$

11: else

12:    $pid \leftarrow \text{FINDREQ}(R)$

13: end if

Select the Process



14: if  $pid \neq \text{NULL}$  then

15:    $G[pid] \leftarrow \top$

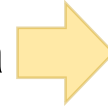
16:    $W[pid] \leftarrow 0$

17: end if

Grant the Access

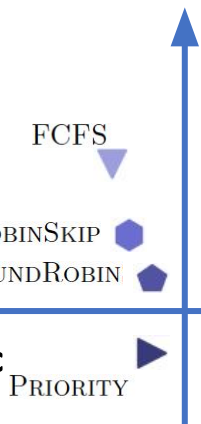


Update the Global Data



18: return  $G$

Stateful Protocols



ROUNDROBINSKIP

ROUNDROBIN

LOTTERY

PRIORITY

RANDOM

Stateless Protocols

Deterministic

Random



# Stateful Protocols

Global:  $I[1..n]$  an array of idle-times

Procedure LONGESTIDLE

Input:  $R[1..n]$  an array of requests

Output:  $G[1..n]$  an array of responses

1:  $G \leftarrow (\perp, \dots, \perp)$

2: for  $i \leftarrow 1$  to  $n$  do

3:     if  $R[i] = \perp$  then

4:          $I[i] \leftarrow I[i] + 1$

5:     end if

6: end for

Update the Global Data



7: if ISRACE( $R$ ) then

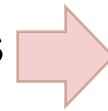
8:      $pid \leftarrow \text{PICKONE}(\text{ALLMAX}(I))$

9: else

10:      $pid \leftarrow \text{FINDREQ}(R)$

11: end if

Select the Process



12: if  $pid \neq \text{NULL}$  then

13:      $G[pid] \leftarrow \top$

14:      $I[pid] \leftarrow 0$

15: end if

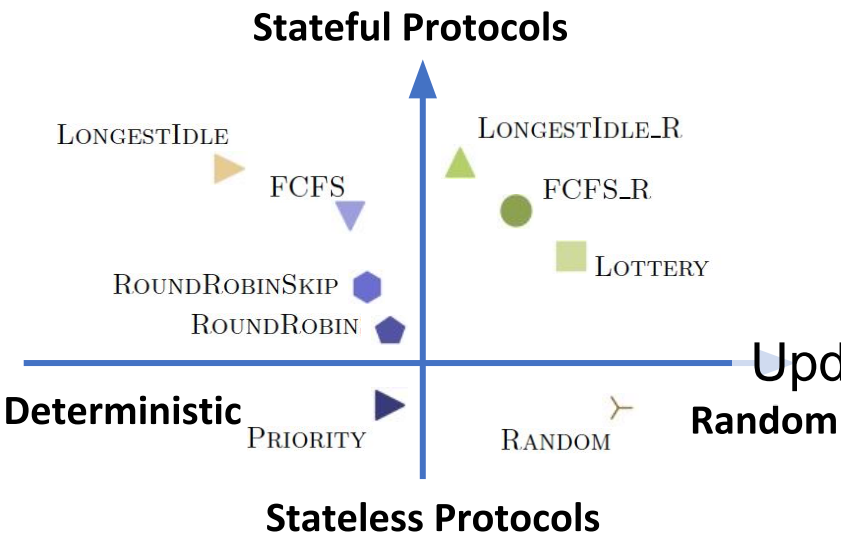
Grant the Access



Update the Global Data



16: return  $G$





# **Information Leakage** in **Arbiter Protocols**

# Arbiter Protocol Model

$H$  – a **secret/private input, high-security** input: **Victim's Requests**  $\{R1, R2, \dots, Rn\}$ ;

$L$  – a **public input, the low security** input: **Adversary's Requests**:  $\{R1, R2, \dots, Rn\}$ ;

$O$  – a **output observation**: **Adversary's Access Grants**:  $\{G1, G2, \dots, Gn\}$ ;

**Before invoking** the system: the adversary has some **initial uncertainty** about the value of  $H$ .

**After observing**  $O$ : some amount of information is **leaked**,  
the adversary's **uncertainty** about  $H$  is **reduced**.

**Information Entropy** as a measurement of **uncertainty**

# Shannon Entropy

Quantifies Information Gain:

$$\mathcal{H}(H \mid O, L)$$


High-security Secret:

Victim's Request

Observations:

Adversary's Access  
Grant

Low-security input:

Adversary's Request

## Shannon Entropy

$$\mathcal{H}(H \mid O, L) = \sum_{\omega, l} P(\omega \mid l) \sum_h P(h \mid \omega, l) \log_2 \frac{1}{P(h \mid \omega, l)}$$

**Expected maximal amount of information leaked:**

$$\mathcal{I}(H, O, L) = \max_l (\mathcal{H}_{init}(H \mid l) - \mathcal{H}_{fin}(H \mid O, l))$$

$$\mathcal{H}_{init}(H \mid l) = \sum_h P(h \mid l) \log_2 \frac{1}{P(h \mid l)}$$

$$\mathcal{H}_{fin}(H \mid O, l) = \sum_{\omega} P(\omega \mid l) \sum_h P(h \mid \omega, l) \log_2 \frac{1}{P(h \mid \omega, l)}$$

# Information Entropy as a measurement of uncertainty



- **How** do we capture **all behaviors** of a protocol?

# Symbolic Execution

**Extracts path constraints** from a system by executing it on symbolic inputs, as opposed to concrete inputs.

We **adopt** and **extend symbolic execution** techniques to **automatically extract constraints** that relate **secret values** with **adversary's observations**.



# Symbolic Execution

$\phi(H, L)$  – a **path constraint** from a **traditional Symbolic Execution** tool.

**Extend**  $\phi(H, L)$  with an **event constraint**:

- **How** do we **handle random** components in **symbolic analysis**?

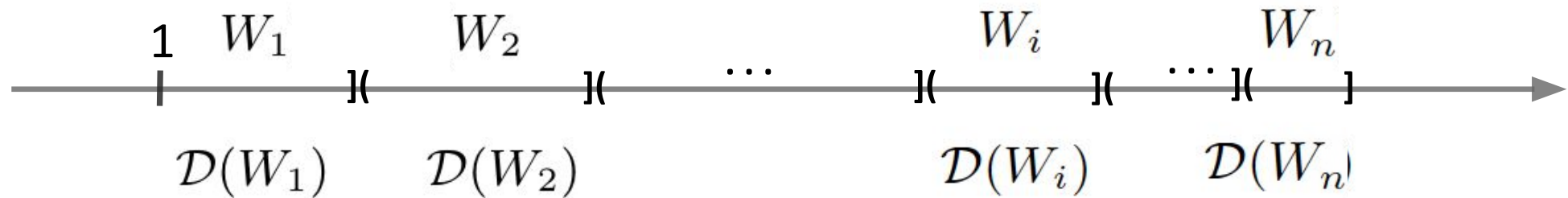
# Random in Symbolic Analysis

$R$  – a **random variable**;

$(R_1, \dots, R_n)$  – the **domain** of  $R$ .

$W = (W_1, \dots, W_n)$  – **probability weights** for  $R$ , with  $W_i \in \mathbb{Z}^+$ .

## Domain Interval



$$\mathcal{D}(W_i) = \begin{cases} [1, W_i], & i = 1 \\ \left( \sum_{j=1}^{i-1} W_j, \sum_{j=1}^i W_j \right], & 1 < i \leq n \end{cases}$$

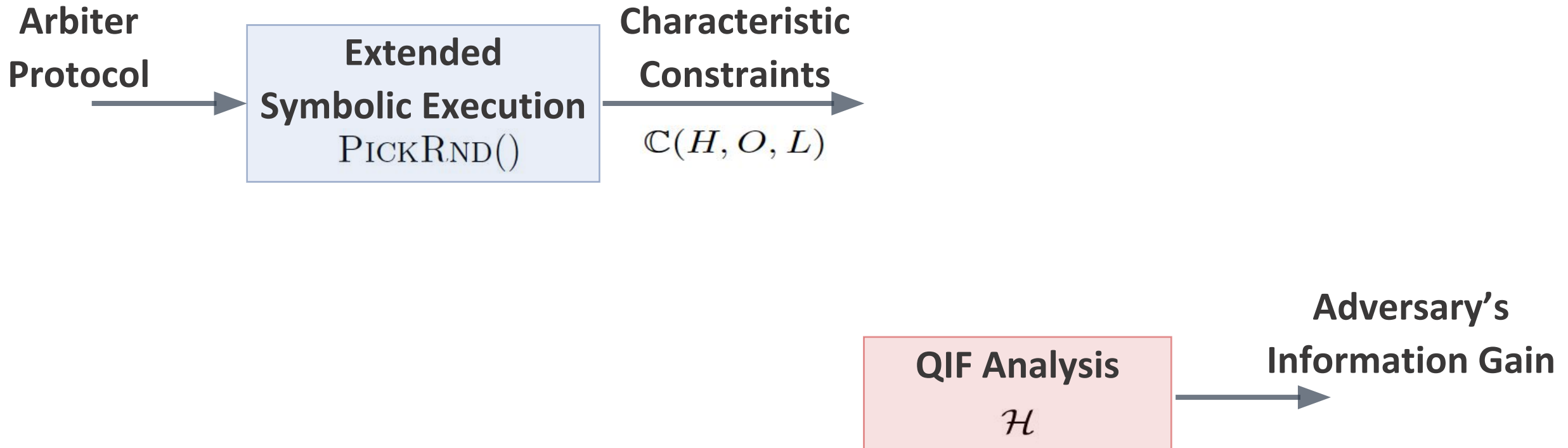
# Random in Symbolic Analysis

*sym\_R* – a fresh symbolic integer variable;

PICKRND() – **Selects a value** from a domain with a weighted-random distribution;  
**Simulates** the desired random generator behavior;  
**Extends path constraints** to reflect the relation between *sym\_R* and *R*.

```
1: for  $id \leftarrow 1$  to  $id \leq n$  do
2:   if  $W[id] > 0$  and  $sym\_R \in \mathcal{D}(W[id])$  then
3:     return  $id$ 
4:   end if
5: end for
6: return NULL
```

- How do we **handle random** components in **symbolic analysis**?
- How do we capture **all behaviors** of a protocol?



- **How** do we **compute** the **probabilities**?

# Model Counting

$$P(\omega|l) = \frac{\text{\# cases adversary **observes** } \omega \text{ after **requesting** } l}{\text{Total \# cases when adversary **requests** } l}$$

$$P(h | \omega, l) = \frac{\text{\# cases the **secret is** } h \text{ when adversary **observes** } \omega \text{ after **requesting** } l}{\text{Total \# cases when adversary **observes** } \omega \text{ after **requesting** } l}$$

# Model Counting: Range Constraints $\mathcal{RC}$

## Grammar

$$\mathcal{C} \rightarrow \mathcal{C} \wedge \mathcal{C} \mid \mathcal{R}$$

$$\mathcal{R} \rightarrow \mathcal{B} = \top \mid \mathcal{B} = \perp \mid \mathcal{I} \in [a, b]$$

$\mathcal{B}$  - **Boolean** variables

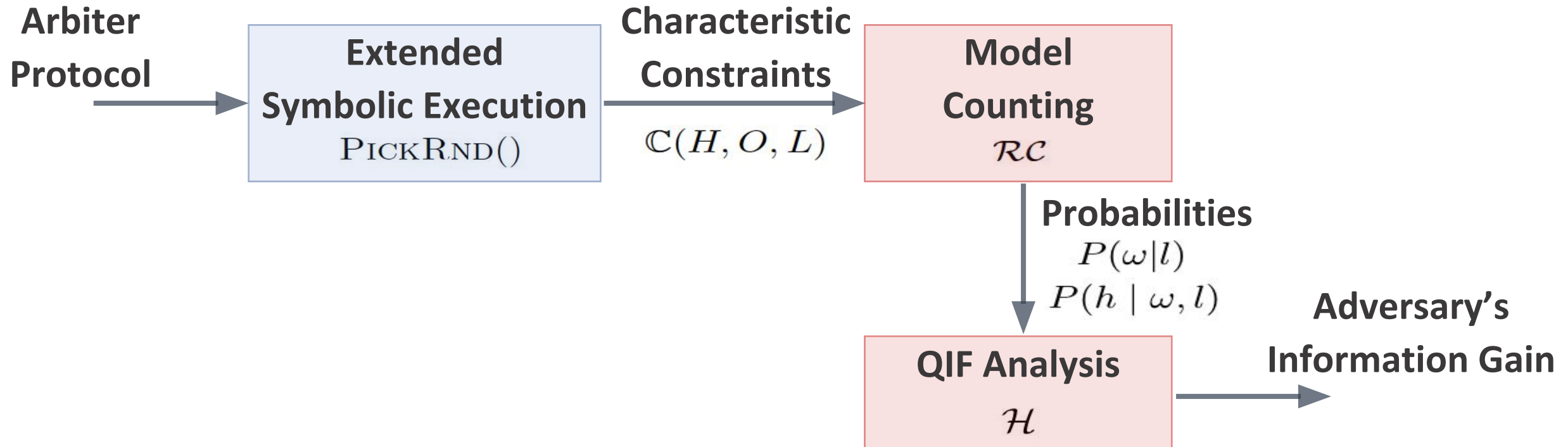
$\mathcal{I}$  - **Integer** variables

## Model Counter

- 1: **for each**  $\mathbb{C}_\phi$  **in**  $\mathbb{C}$  **do**
- 2:      $m \leftarrow \#\text{FREEVARS}(\mathbb{C}_\phi, P_{\mathcal{V}}, P_{\mathcal{A}})$
- 3:      $s \leftarrow 2^m$
- 4:     **for each**  $(r \in [a, b])$  **in**  $I$  **do**
- 5:          $s \leftarrow (b - a + 1) \times s$
- 6:     **end for**
- 7: **end for**

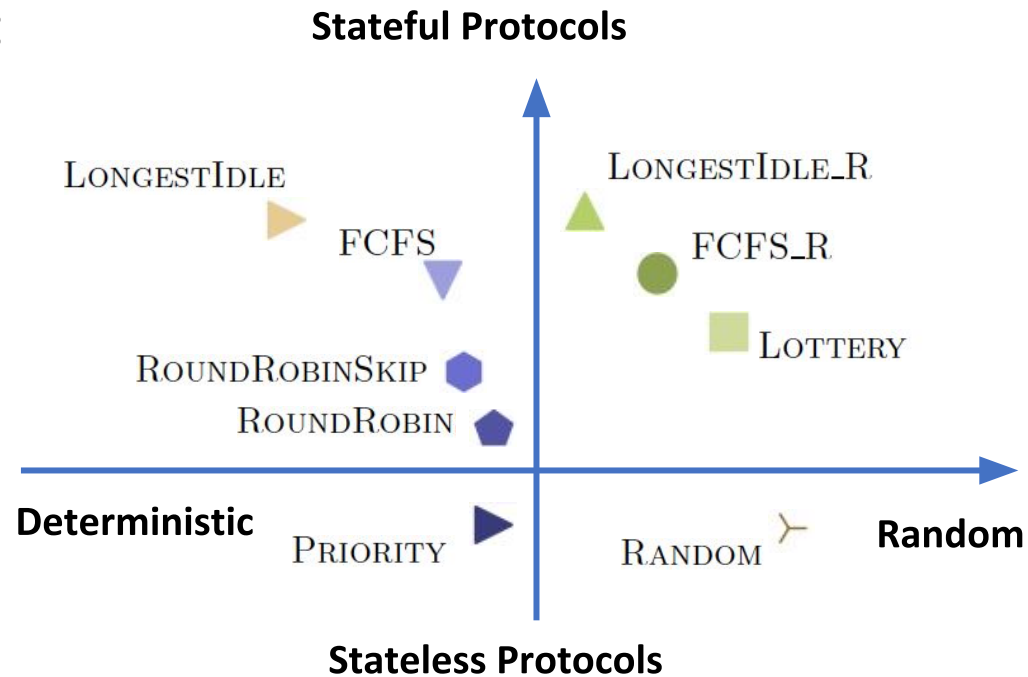


- How do we **compute** the **probabilities**?



# Experiments

- **Arbiter Protocols (in Java):**



- **Processes:** **Victim Process**, **Adversary Process**, **Benign Process**.

- **Rounds:** **1 to 6**.

We **extended** SPF (Symbolic Java PathFinder). **Implemented** `PICKRND()` and *RC*.

# Max Leakage (bits) and Execution Time (seconds)

$RC/EC \sim 1.4x - 2,647x$  faster.

Avg. speedup: 250x (excluding  $EC$  time outs).

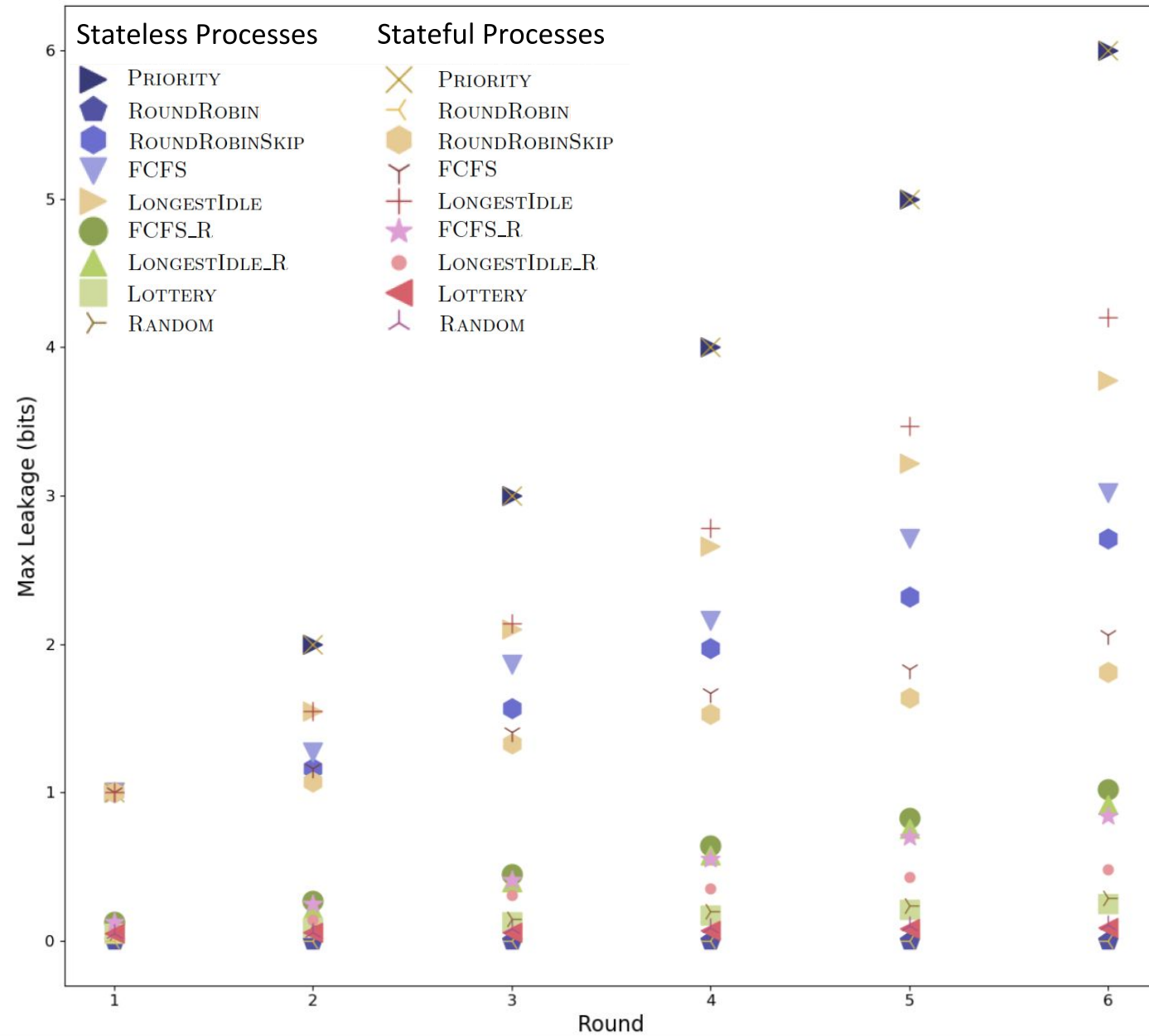
Protocol	1 Round			2 Rounds			3 Rounds			4 Rounds			5 Rounds			6 Rounds		
	<i>max bit</i>	$RC$ sec	$EC$ sec	<i>max bit</i>	$RC$ sec	$EC$ sec	<i>max bit</i>	$RC$ sec	$EC$ sec	<i>max bit</i>	$RC$ sec	$EC$ sec	<i>max bit</i>	$RC$ sec	$EC$ sec	<i>max bit</i>	$RC$ sec	$EC$ sec
PRIORITY	1.00	0.1	0.3	2.00	0.2	0.7	3.00	0.2	10.2	4.00	0.3	346.4	5.00	0.5	-	6.00	1.5	-
ROUNDROBIN	0.00	0.2	0.4	0.00	0.1	0.3	0.00	0.2	1.2	0.00	0.3	10.3	0.00	0.3	225.0	0.00	0.8	-
ROUNDROBINSKIP	1.00	0.2	0.3	1.16	0.2	0.6	1.57	0.1	10.3	1.97	0.3	337.9	2.32	0.5	-	2.71	1.5	-
FCFS	1.00	0.2	0.3	1.27	0.2	1.2	1.86	0.4	53.2	2.16	0.7	-	2.71	4.8	-	3.02	44.1	-
LONGESTIDLE	1.00	0.1	0.3	1.55	0.2	1.0	2.10	0.3	53.7	2.66	0.8	-	3.22	5.1	-	3.78	45.7	-
FCFS_R	0.13	0.1	3.2	0.27	0.3	11.5	0.45	0.5	439.1	0.64	4.9	-	0.83	74.3	-	1.02	1121.1	-
LONGESTIDLE_R	0.05	0.1	2.7	0.21	0.1	10.0	0.40	0.4	241.8	0.58	1.9	-	0.76	19.5	-	0.92	200.3	-
LOTTERY	0.05	0.2	2.7	0.09	0.2	13.2	0.13	0.5	399.7	0.17	4.2	-	0.21	65.2	-	0.25	981.2	-
RANDOM	0.05	0.1	4.8	0.10	0.2	10.6	0.15	0.5	372.2	0.20	4.2	-	0.24	66.2	-	0.29	983.1	-
PRIORITY_S	1.00	0.1	0.3	2.00	0.2	0.9	3.00	0.3	18.9	4.00	0.4	-	5.00	0.8	-	6.00	4.4	-
ROUNDROBIN_S	0.00	0.1	0.3	0.00	0.2	0.5	0.00	0.3	5.2	0.00	0.3	260.8	0.00	0.4	-	0.00	1.2	-
ROUNDROBINSKIP_S	1.00	0.2	0.4	1.07	0.1	1.1	1.33	0.2	17.6	1.53	0.4	979.5	1.64	0.8	-	1.81	3.2	-
FCFS_S	1.00	0.1	0.4	1.16	0.1	1.0	1.41	0.3	32.4	1.67	0.4	-	1.83	1.2	-	2.06	6.4	-
LONGESTIDLE_S	1.00	0.2	0.4	1.55	0.2	1.2	2.14	0.3	36.7	2.78	0.4	-	3.47	1.3	-	4.20	6.6	-
FCFS_RS	0.13	0.2	4.3	0.25	0.1	17.3	0.41	0.4	283.2	0.55	1.3	-	0.70	9.5	-	0.84	79.2	-
LONGESTIDLE_RS	0.05	0.2	4.1	0.14	0.2	15.7	0.31	0.3	184.0	0.35	0.6	-	0.43	3.1	-	0.48	20.5	-
LOTTERY_S	0.05	0.2	4.6	0.06	0.3	22.1	0.06	0.4	312.6	0.07	1.2	-	0.08	10.2	-	0.09	88.2	-
RANDOM_S	0.05	0.1	2.9	0.06	0.2	18.8	0.08	0.3	290.8	0.09	1.3	-	0.10	10.2	-	0.11	88.9	-

$RC$  – with the Range-Constraint Counting,  $EC$  – with the Enumerative Counting methods;

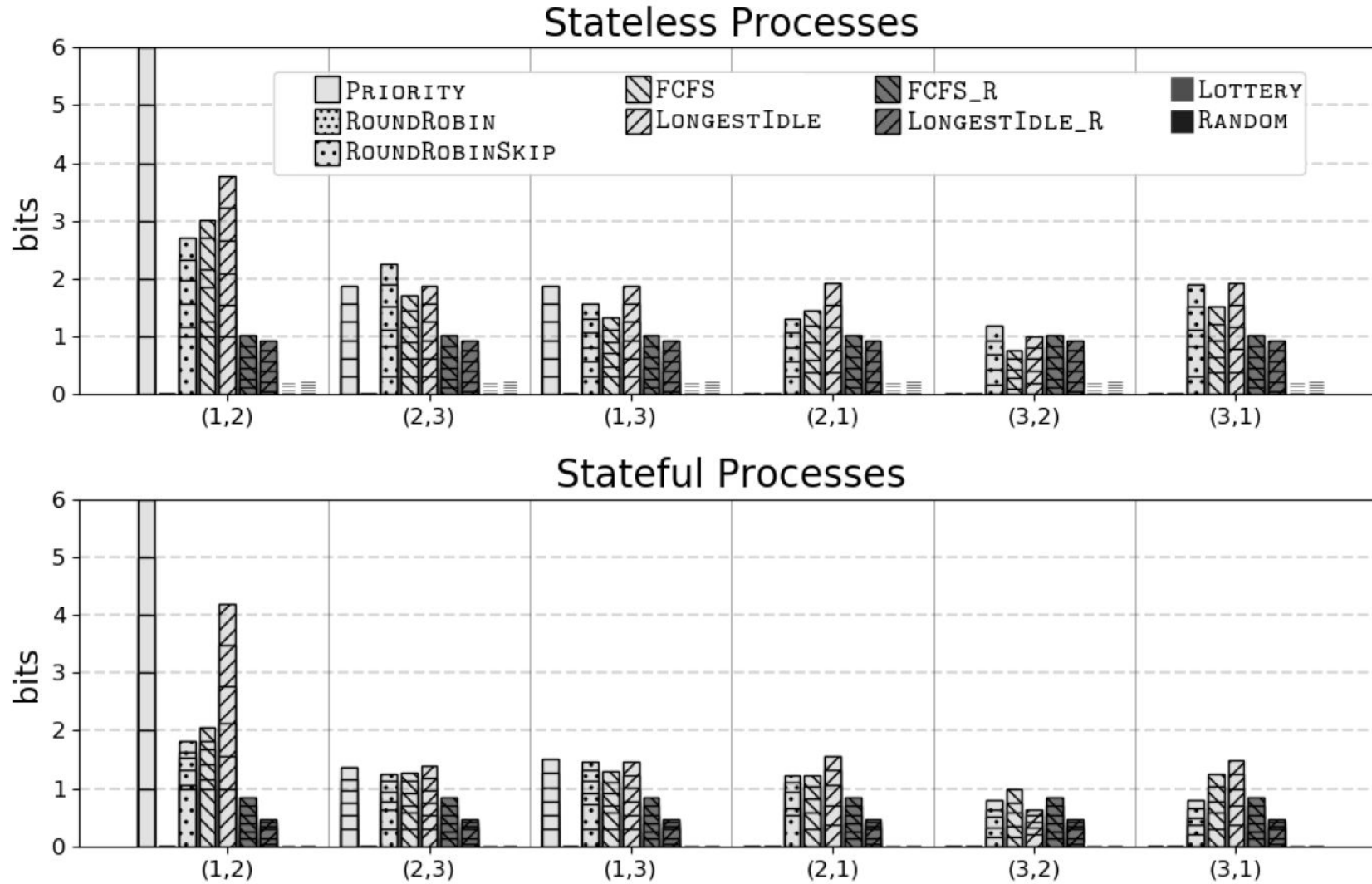
Timeout – 20 minutes (1200 s);

(S) – **stateful processes**; (R) – resolving wait-time and idle-time concurrences randomly.

# Worst-case Leakage (*bits*) for each protocol as a function of the round number.



# Leakage (in bits) for each protocol per rounds 1-6



Leakage for each (victim; adversary) process pair.

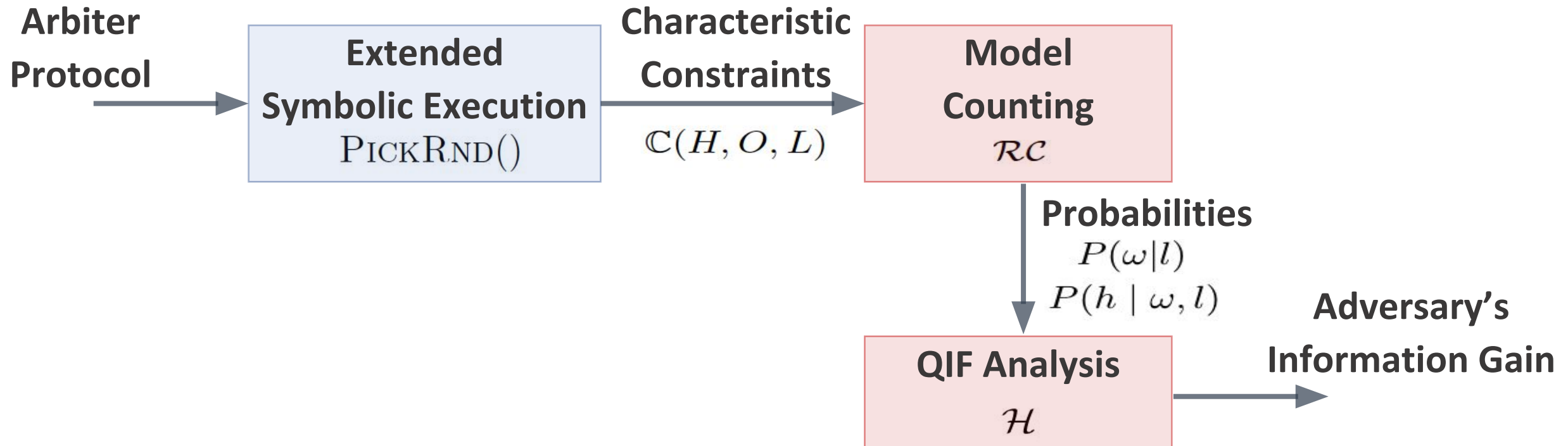
**Cumulative leakage** is shown for 6 rounds.



# Summary

A new approach for **automatically identifying** and **quantifying** the **information leakage** in protocols that **arbitrate** utilization of **shared resources** between processes.

**Provides** protocol designers and users a **new dimension** in **assessment** and **comparison** of protocols in terms of the **amount of information leaked over time**.



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## The novel QIF analysis technique:

- **Combines** and **extends symbolic execution** and **model counting** techniques:
  - We extend **symbolic execution** to extract constraints characterizing relationships between the secret and the adversary-observable events.
  - With **model counting** constraint solvers, we quantify the amount of information leaked, in terms of entropy, by observable events:
    - A **novel, efficient** and **exact model counting** technique for a class of constraints extracted during QIF analysis of arbiter protocols.
- **Supports randomized** protocols.