



NDSS
SYMPOSIUM

San Diego, California
23-27 February 2026

STRATEGIC GAMES AND ZERO SHOT ATTACKS ON HEAVY-HITTER NETWORK FLOW MONITORING

FRANCESCO DA DALT (ETH ZÜRICH) (Presenter)

ADRIAN PERRIG (ETH ZÜRICH)

CHALLENGE

CHALLENGE

Configure complex systems

to be **optimally secure** against

PAST and FUTURE attack strategies

CHALLENGE

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Alice



Bob



CHALLENGE

Configure complex systems

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PAST and FUTURE attack strategies

Alice

many possible behaviors

Bob



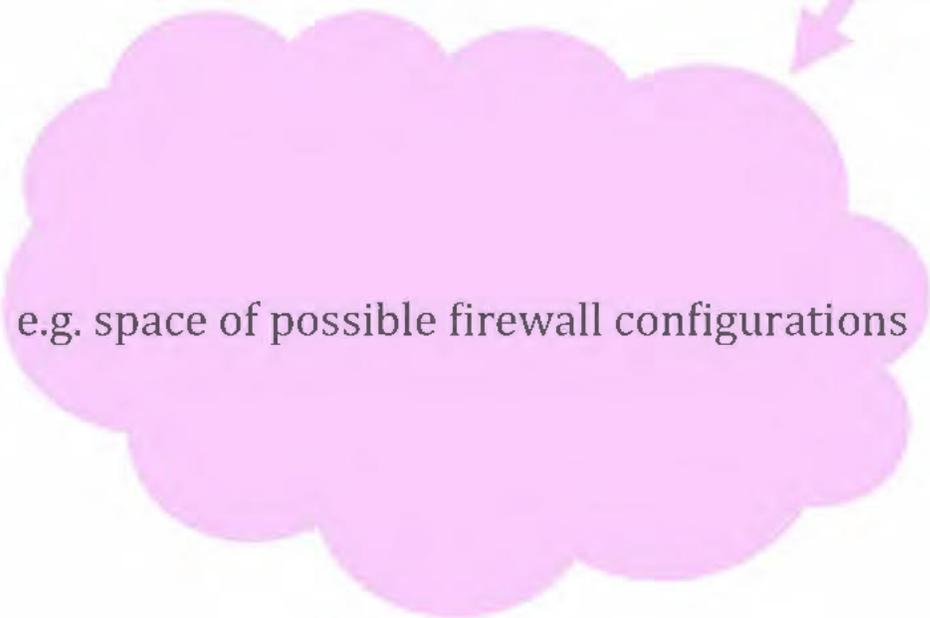
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e.g. space of possible firewall configurations

many possible behaviors

Bob



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many possible behaviors

Bob

e.g. space of possible firewall configurations

e.g. space of possible DoS attacks

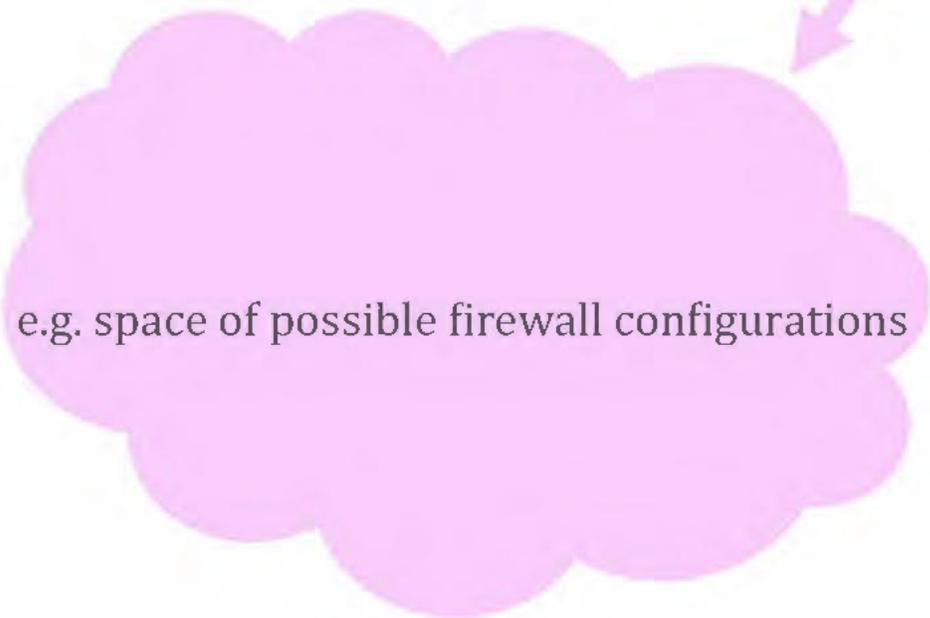
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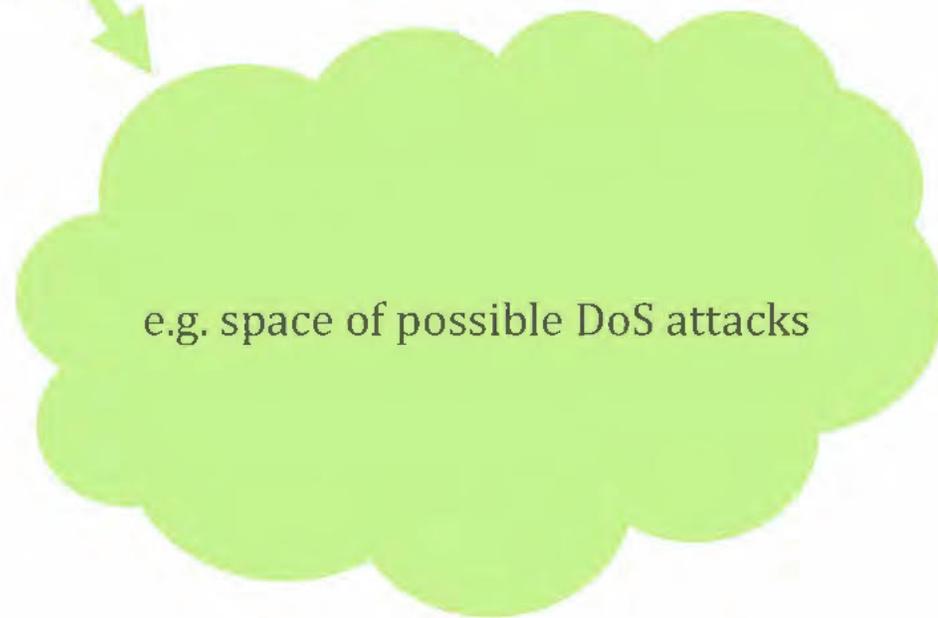


many possible behaviors



heuristic

Bob



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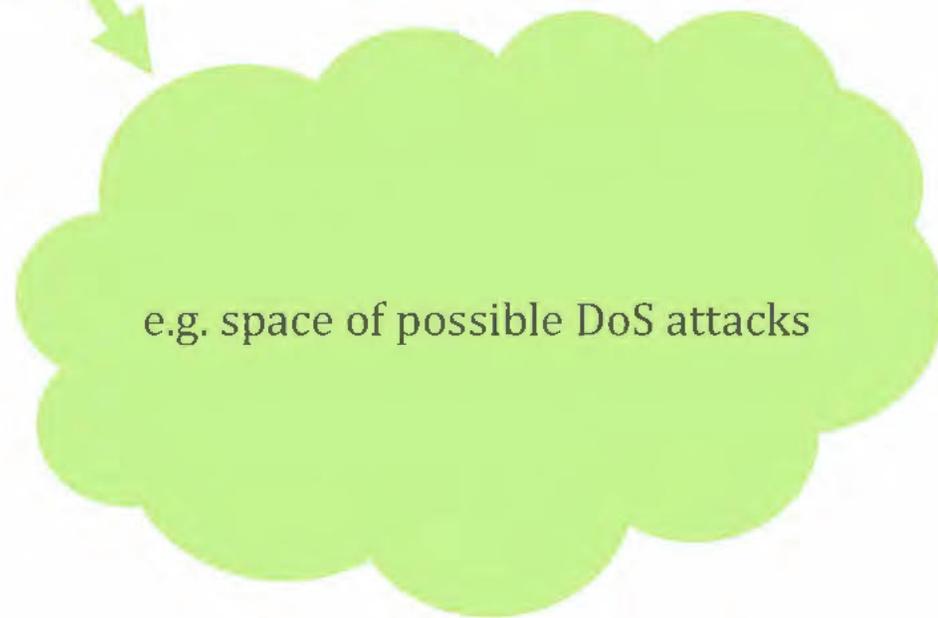


many possible behaviors



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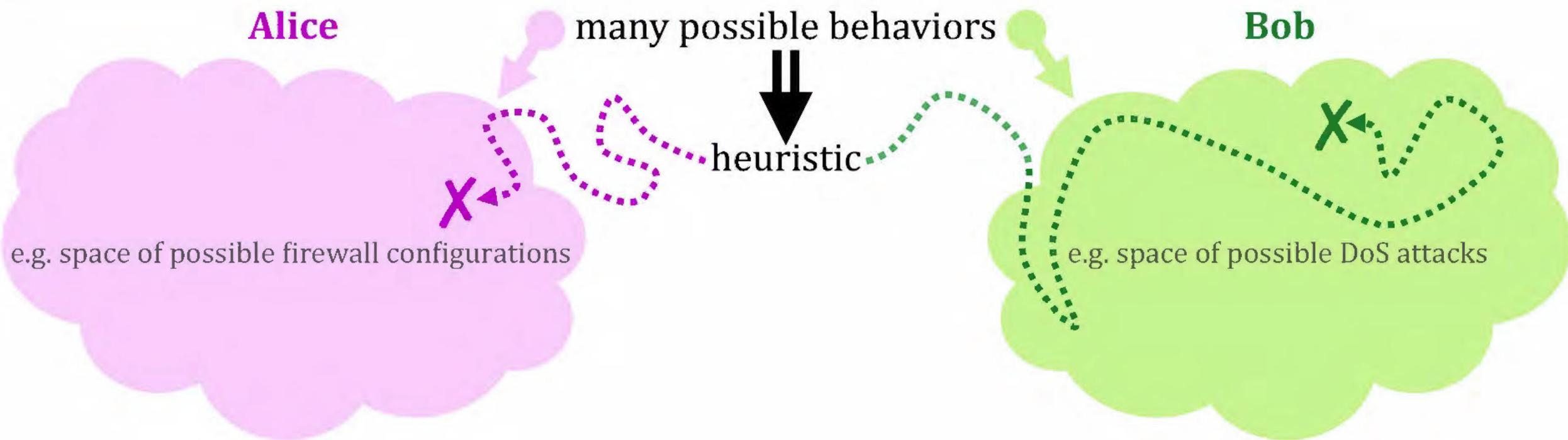


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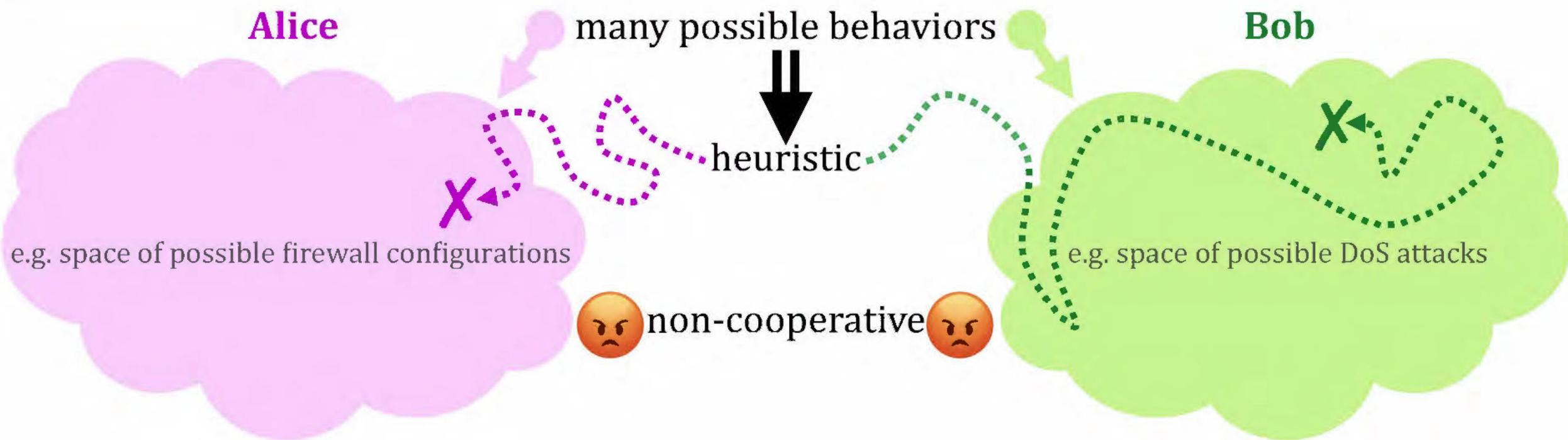


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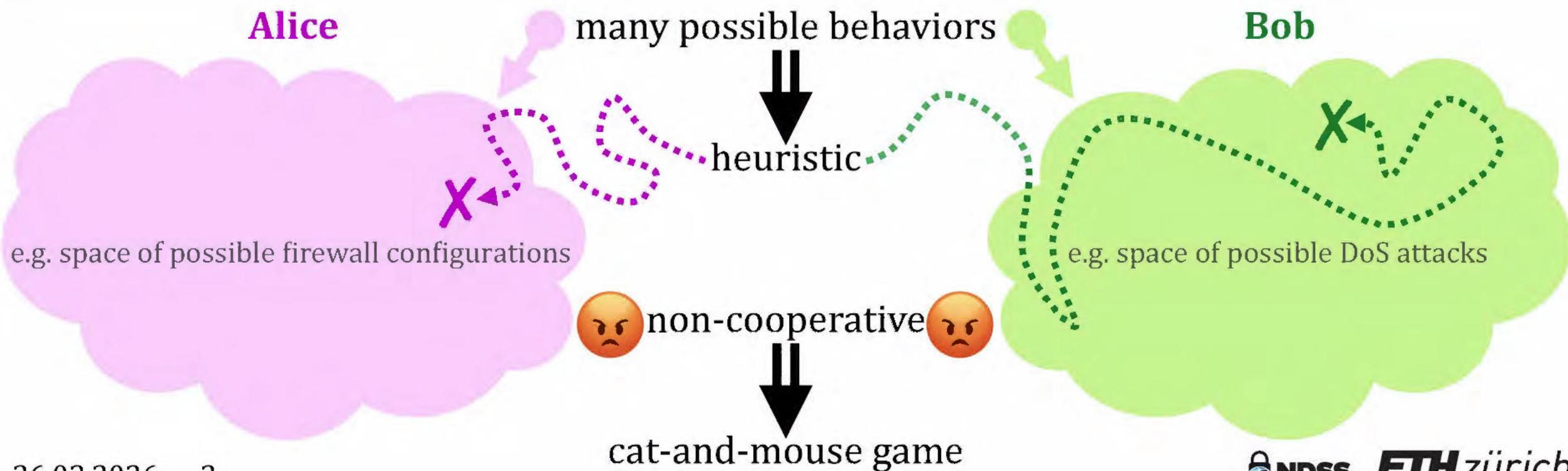


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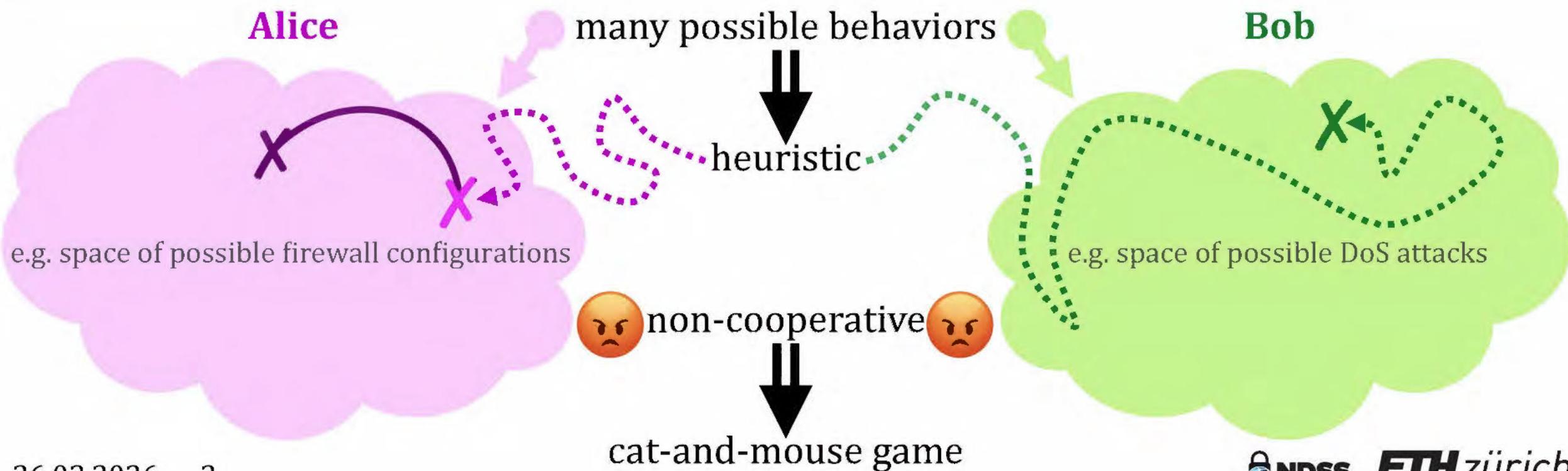


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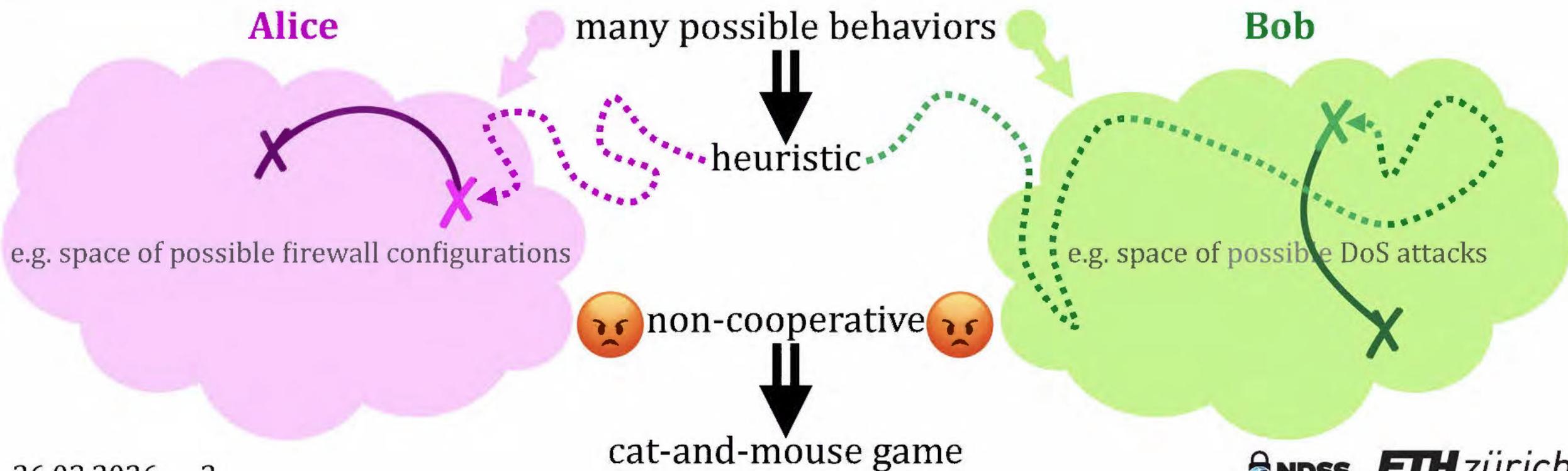


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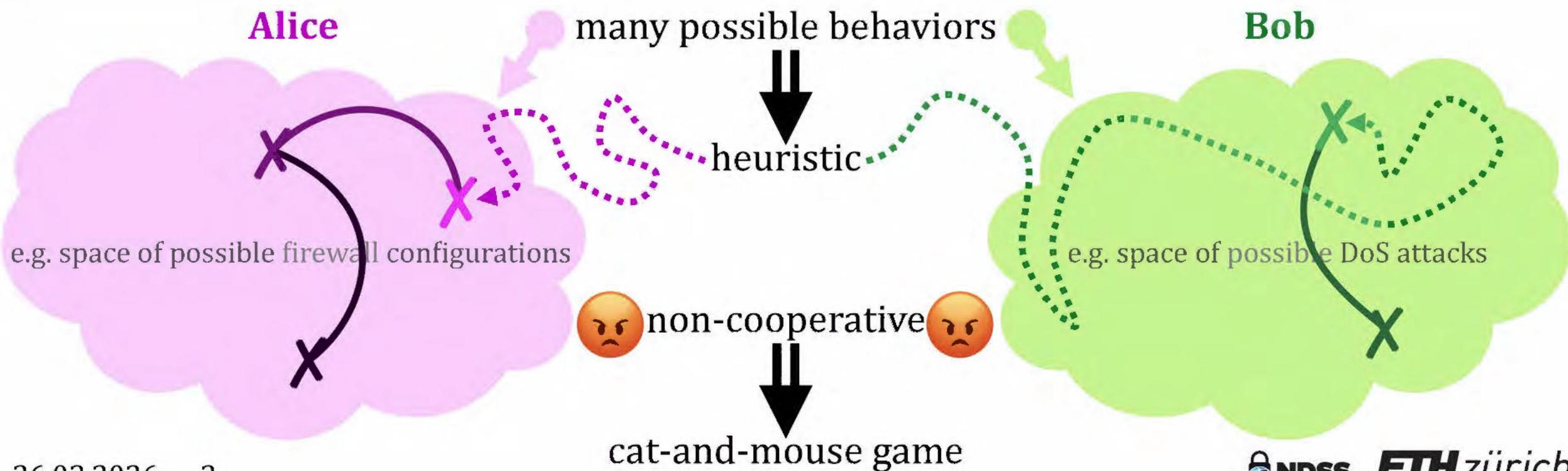


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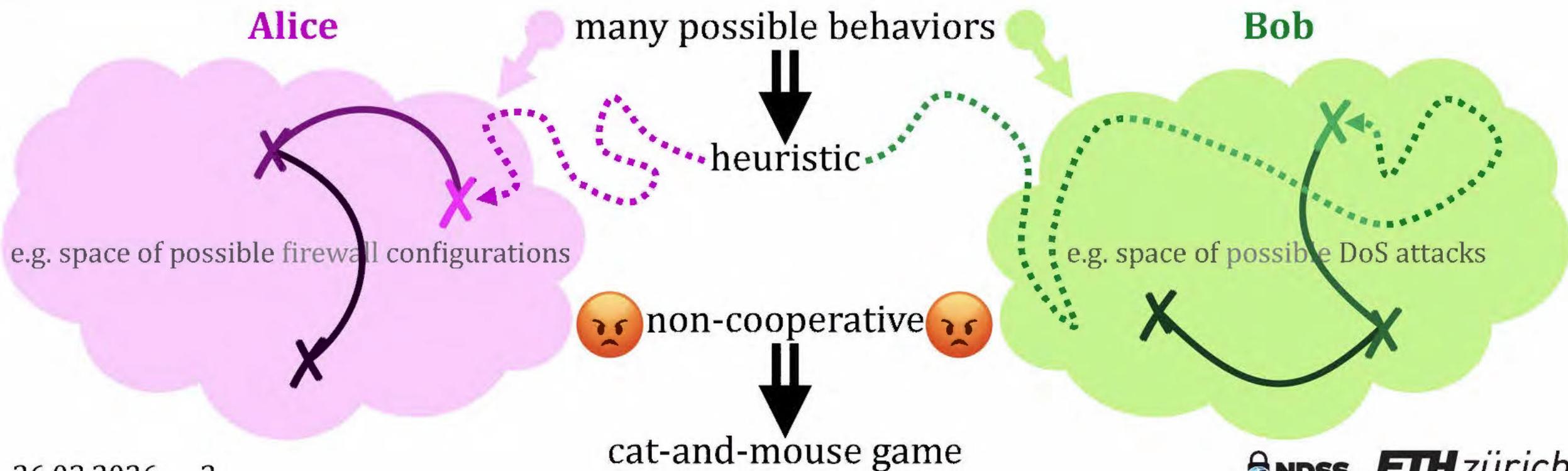


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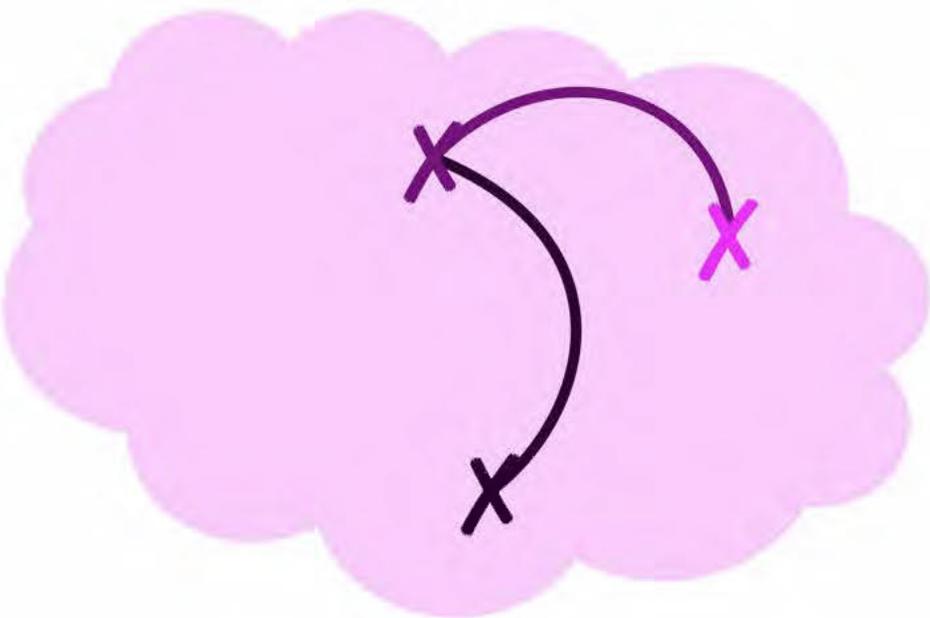
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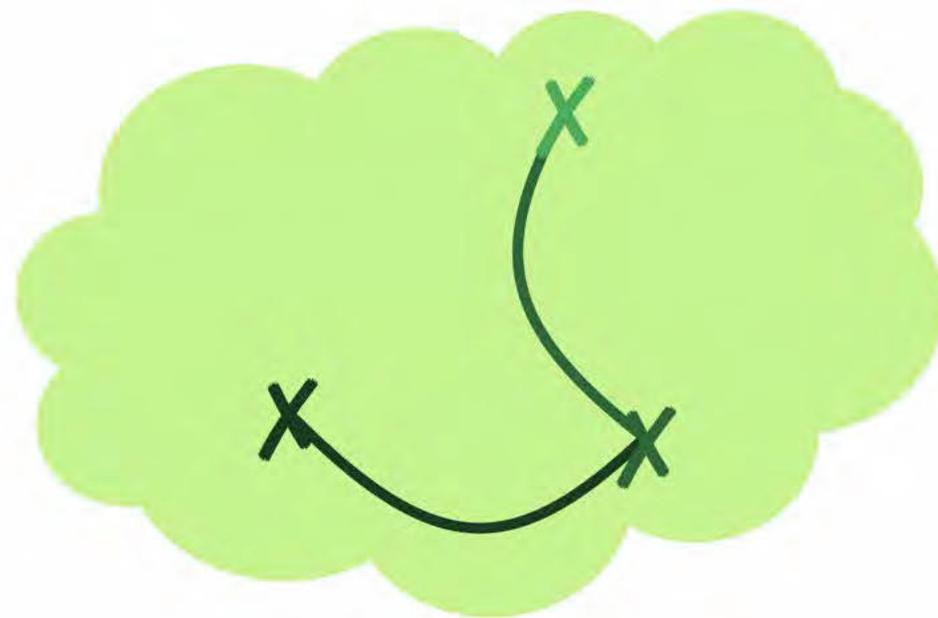
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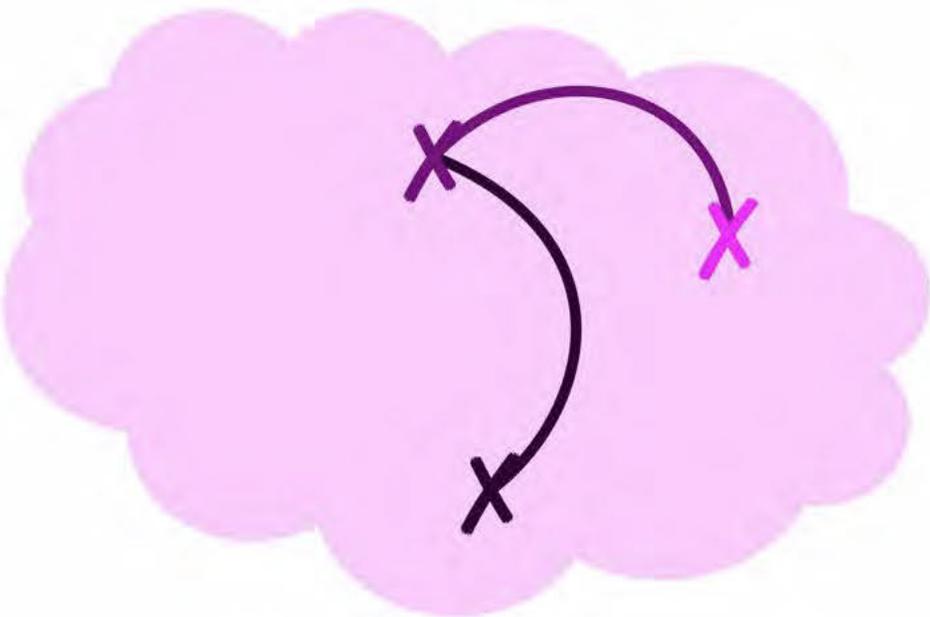
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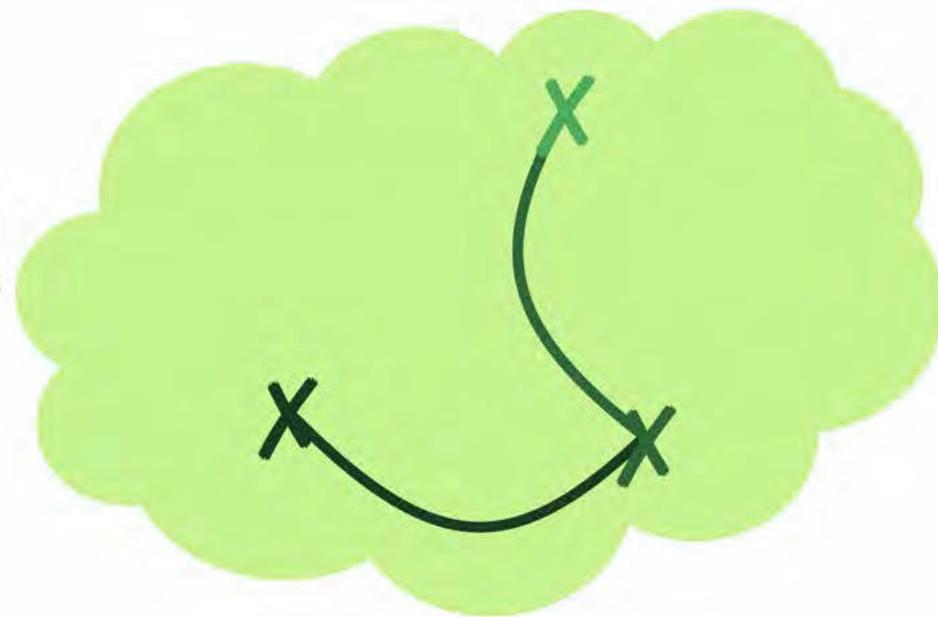
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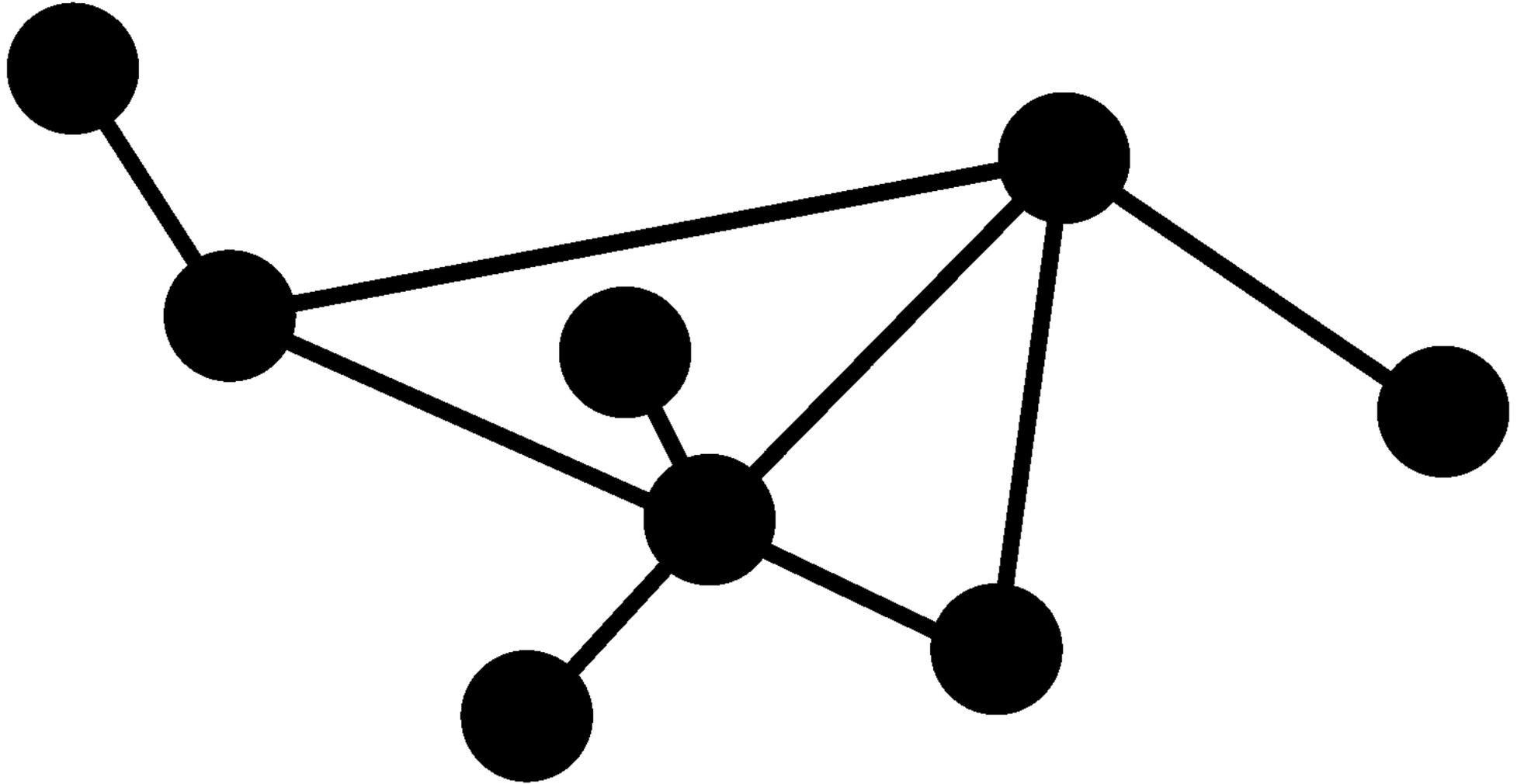


**Do in
Principled
Way**

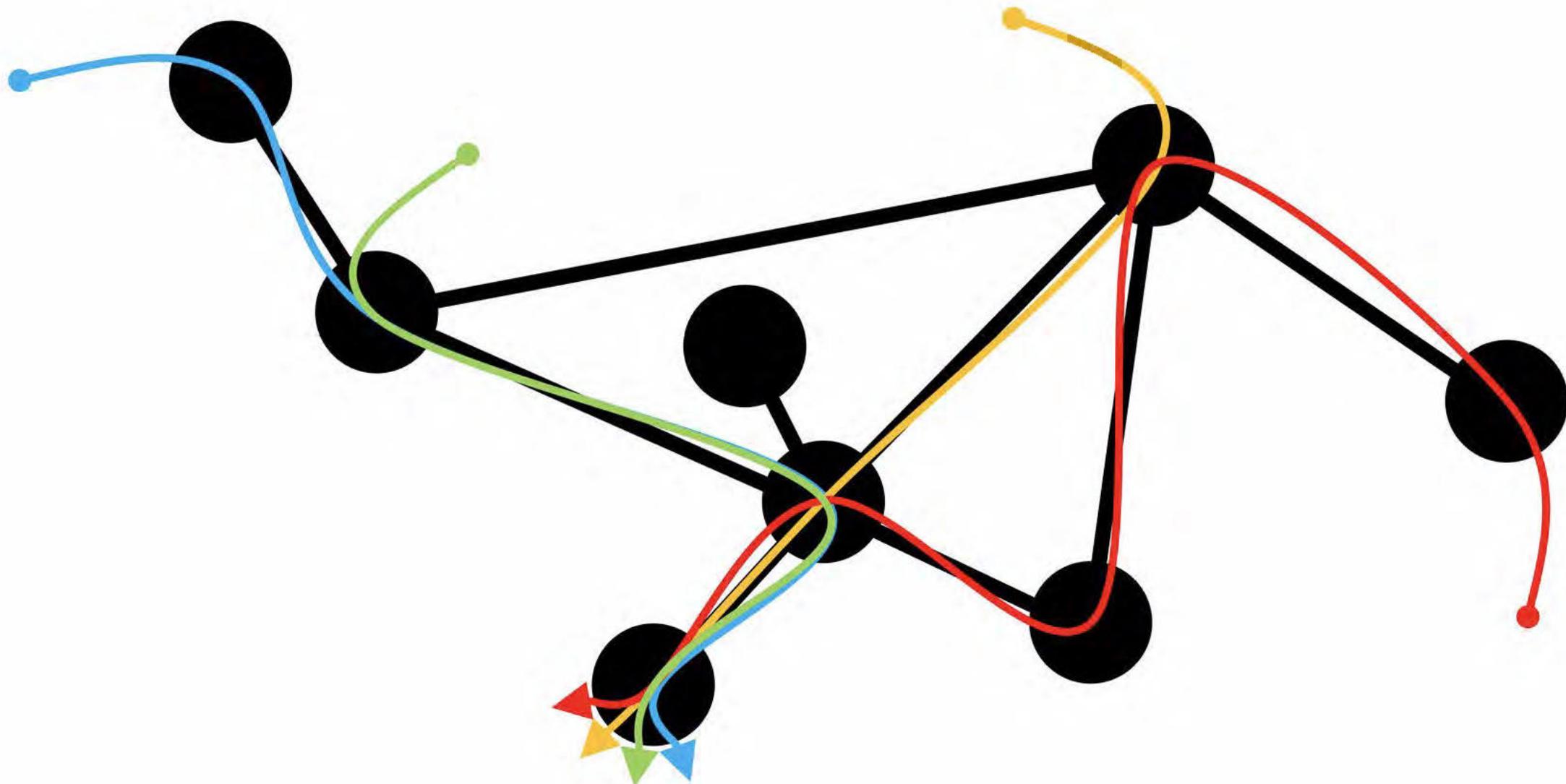
Bob



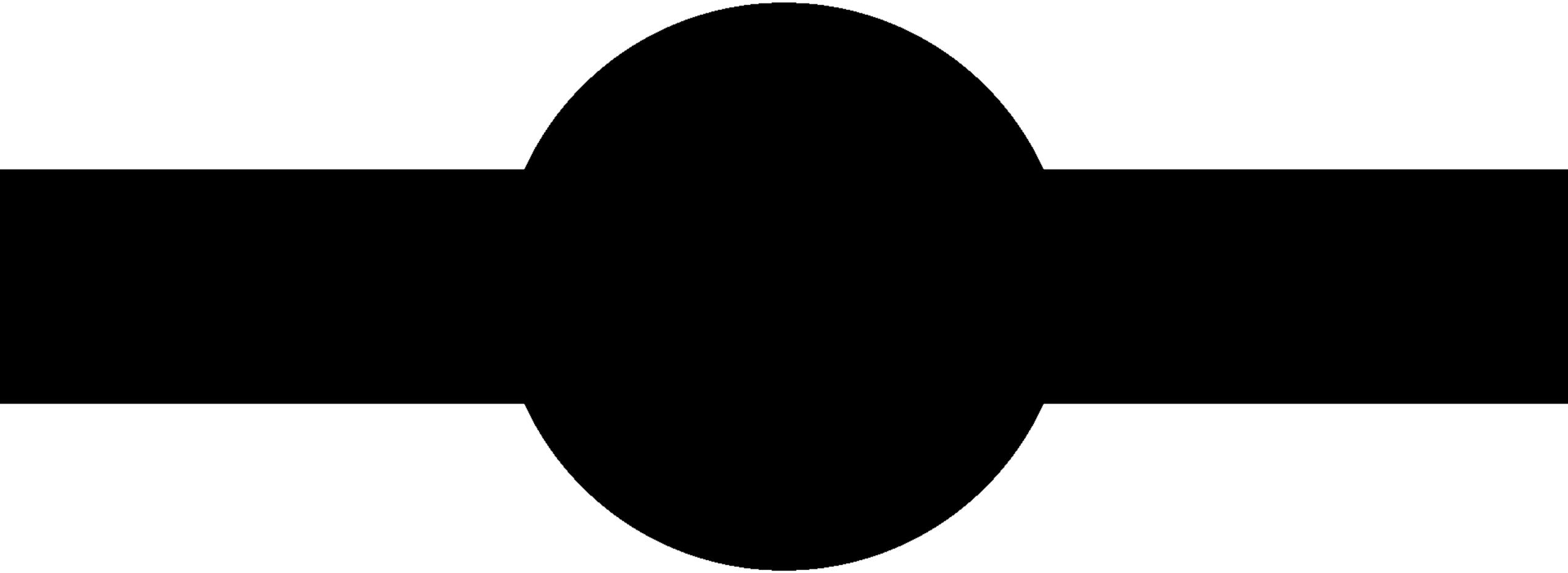
FLOW MONITORING



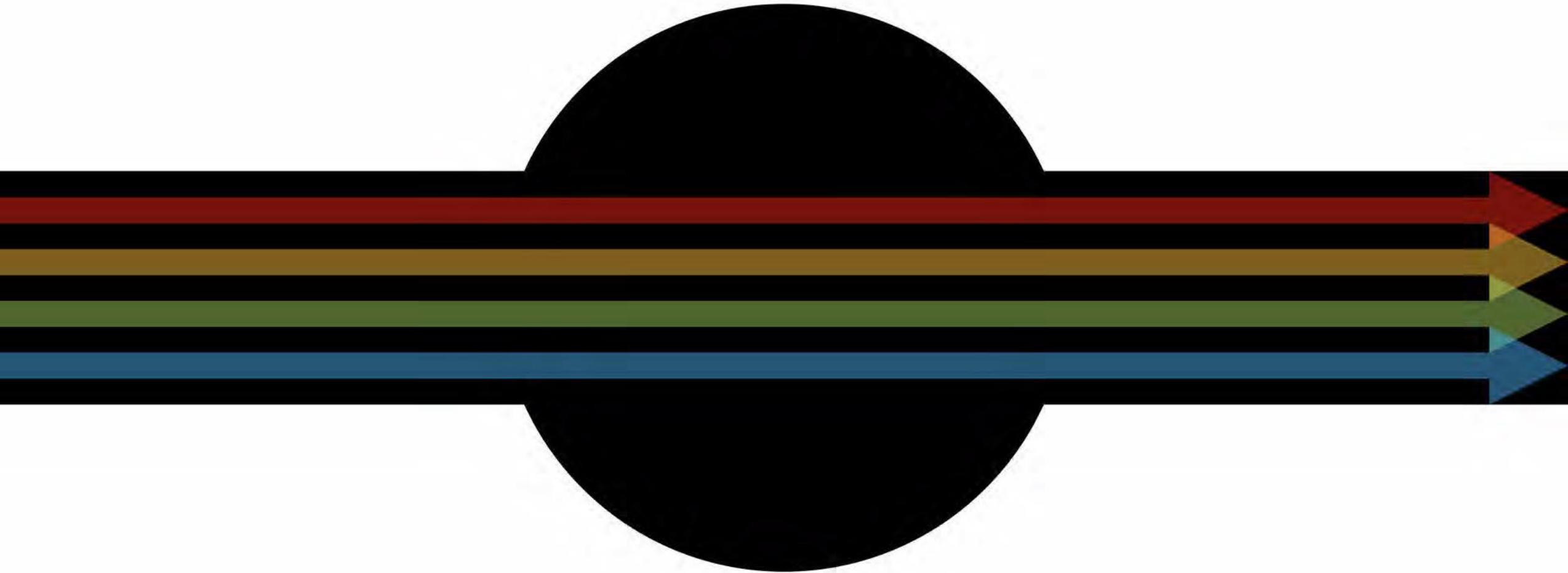
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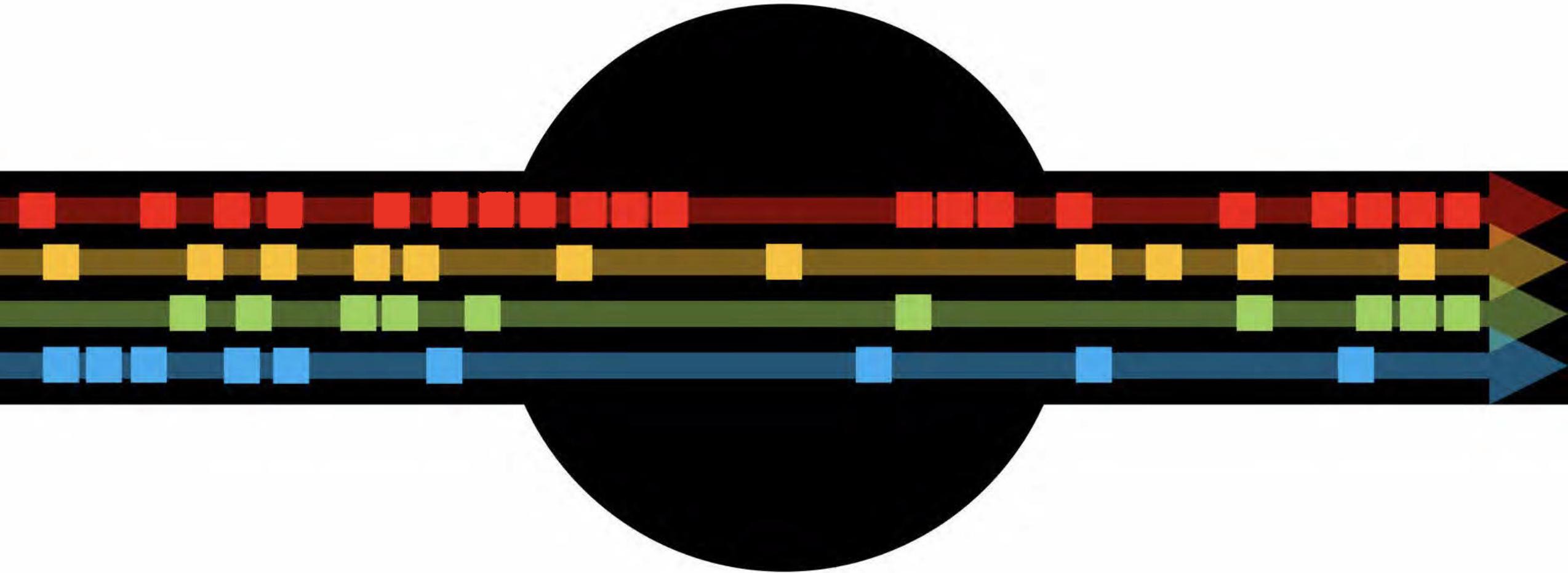
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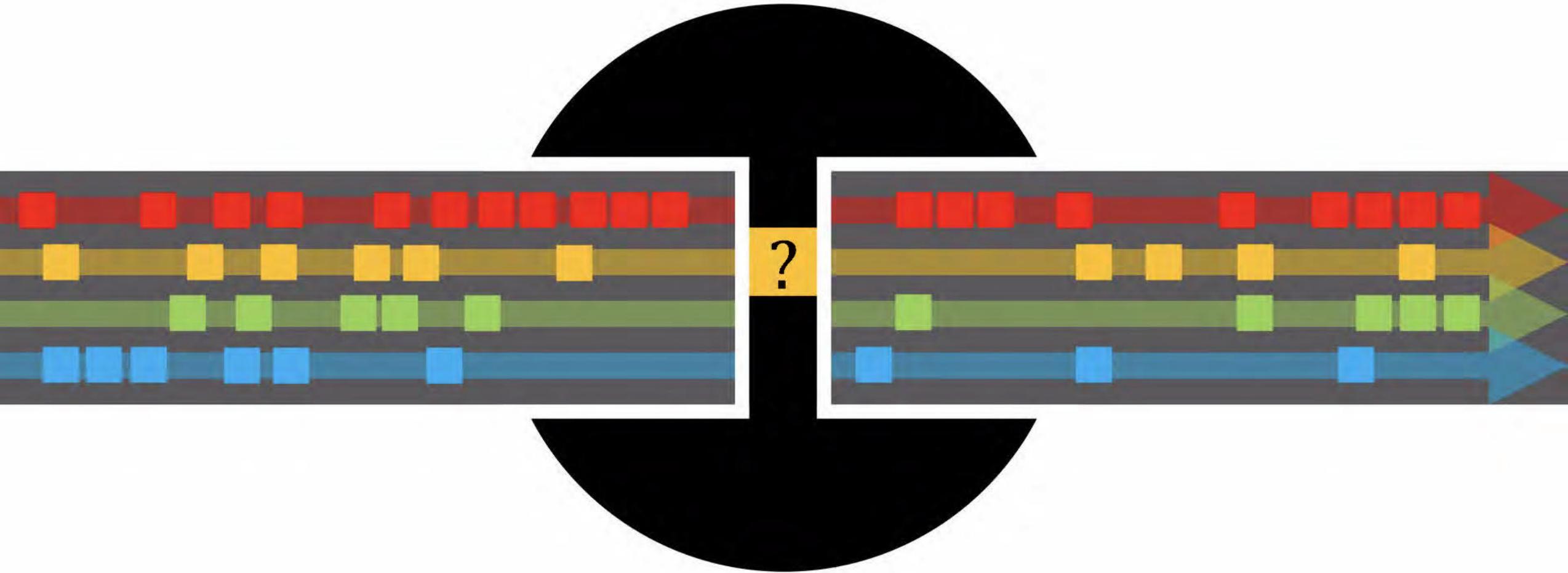
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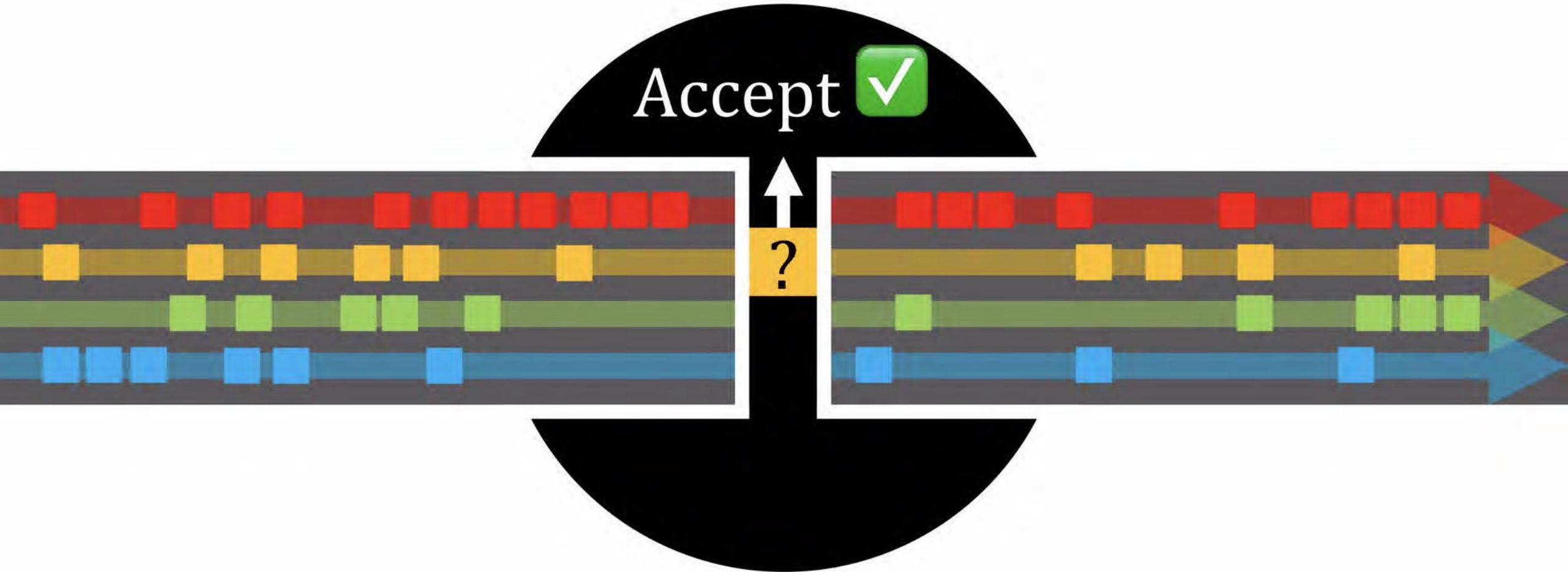
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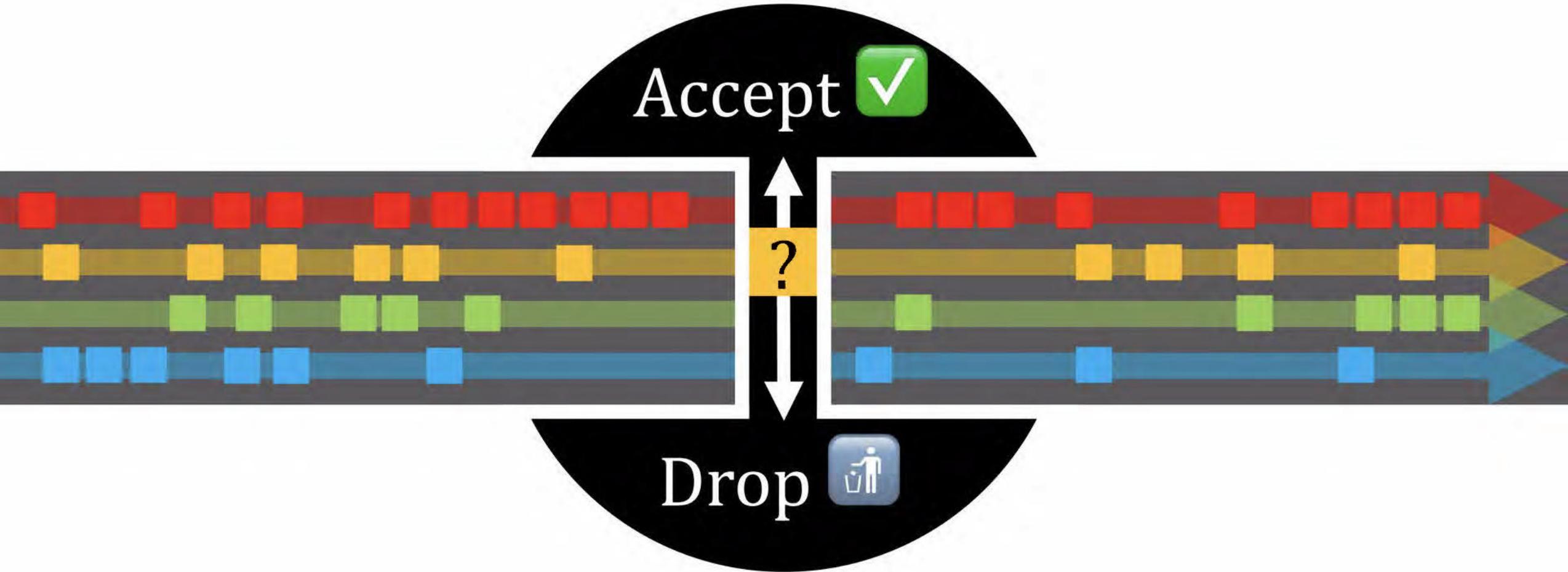
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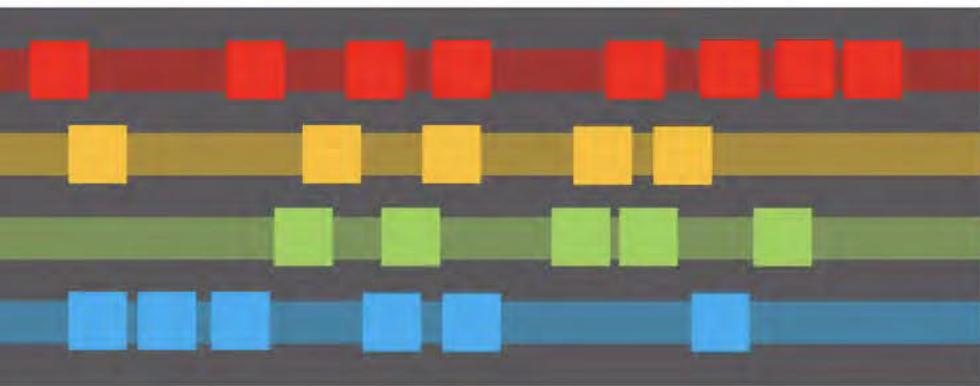
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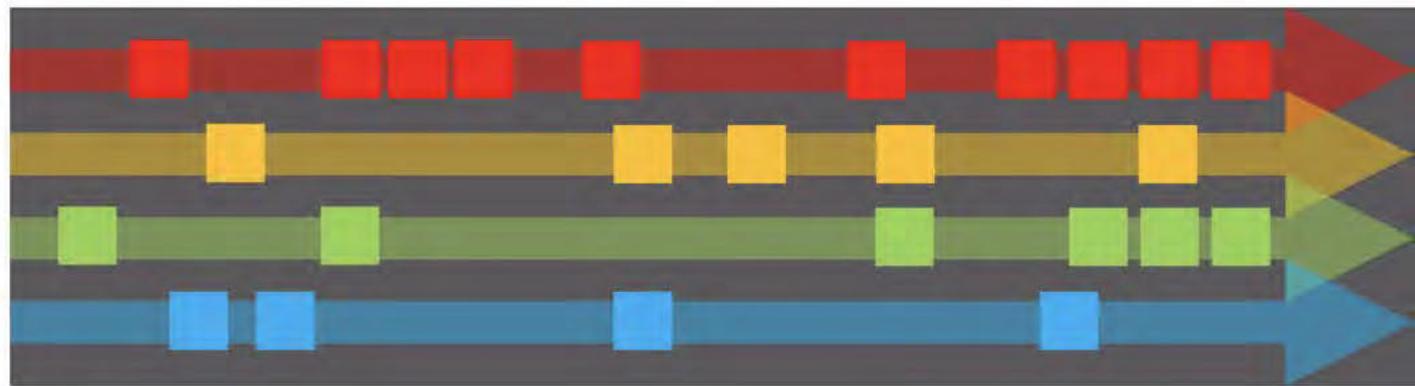
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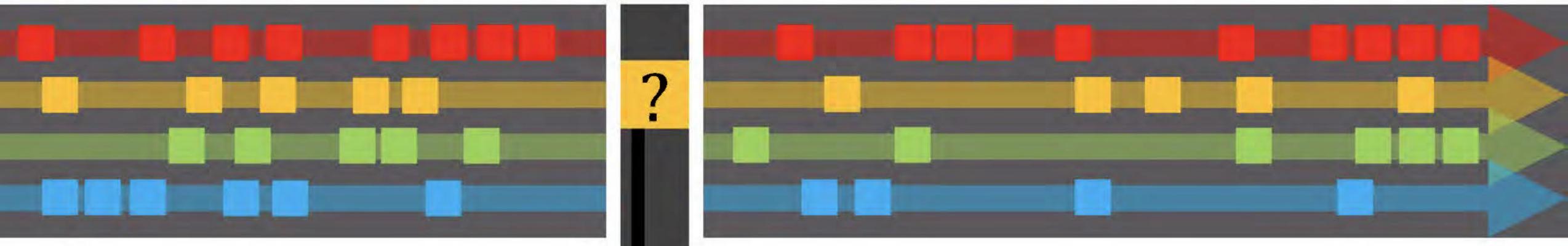
RATE MONITORING AND LIMITING



?

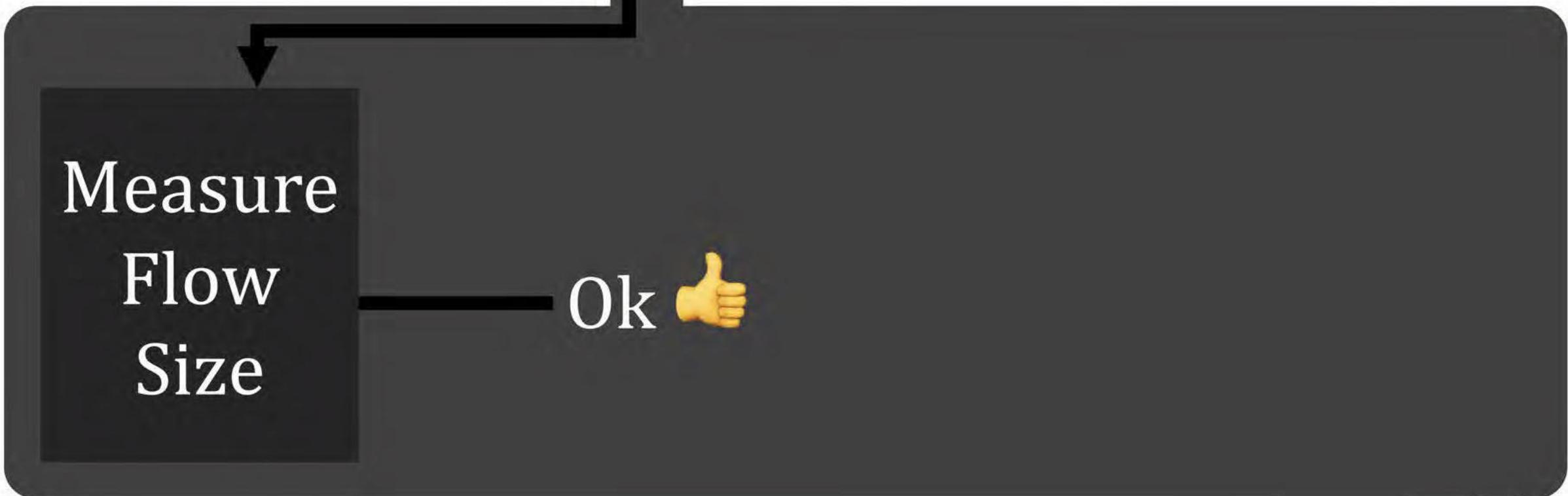
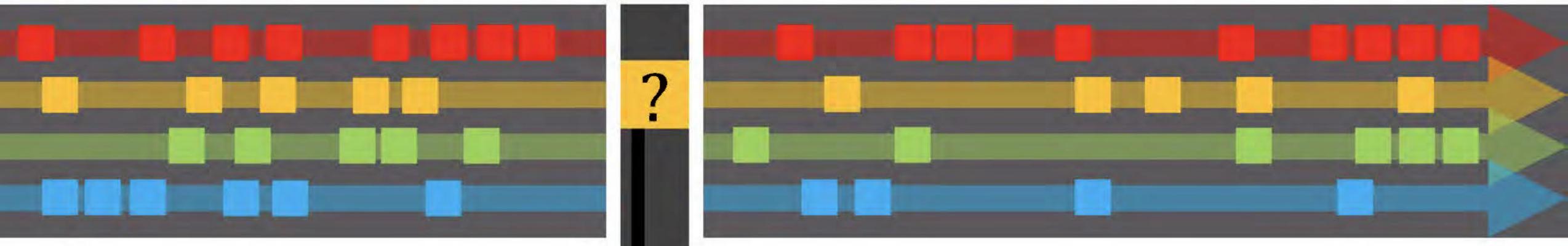


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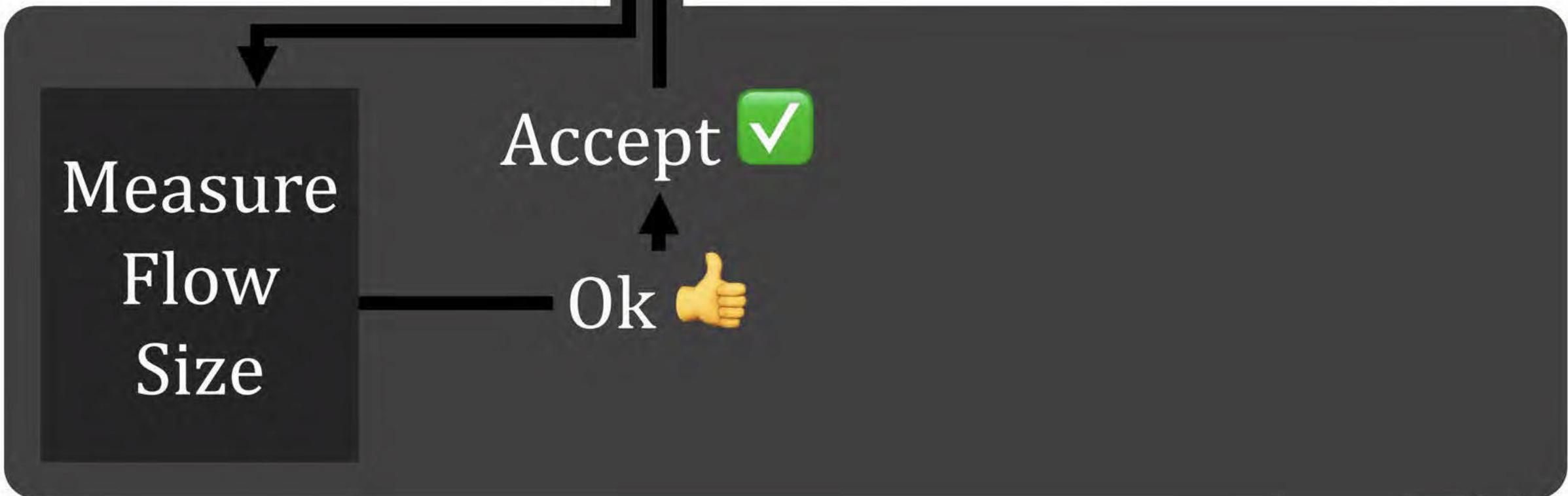
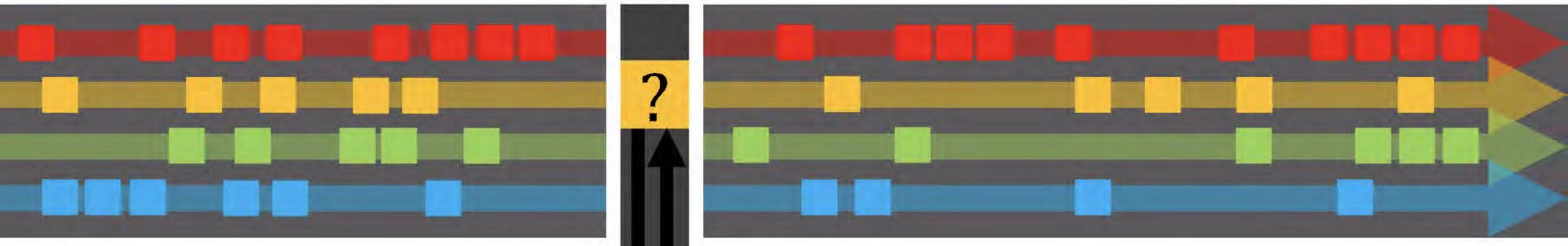


Measure
Flow
Size

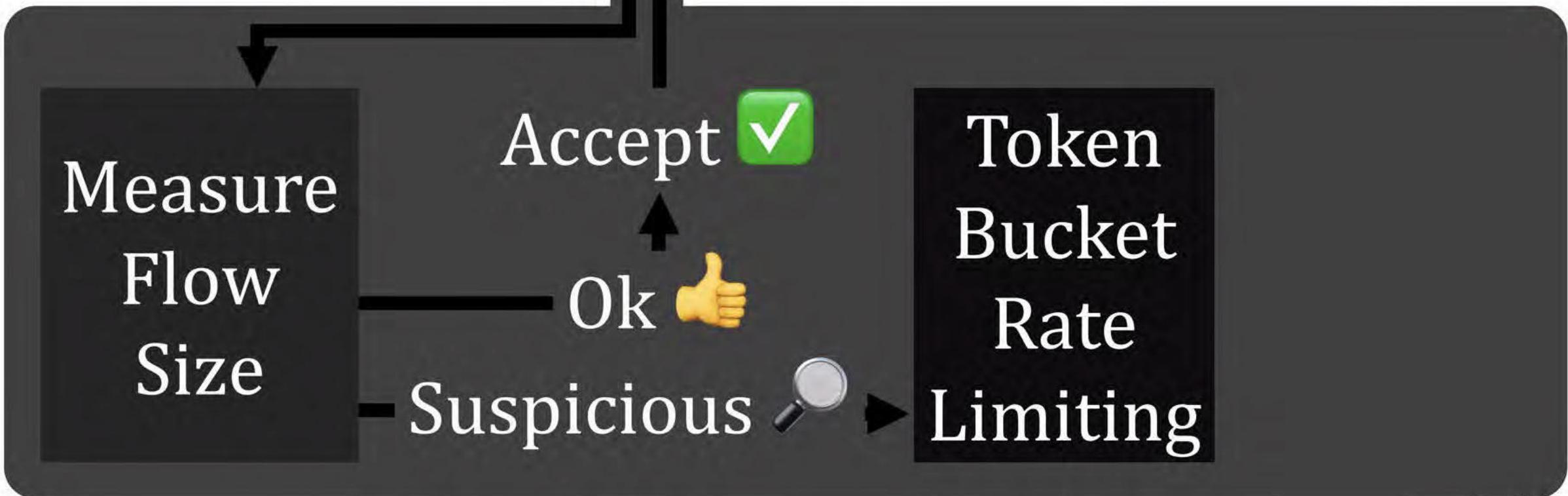
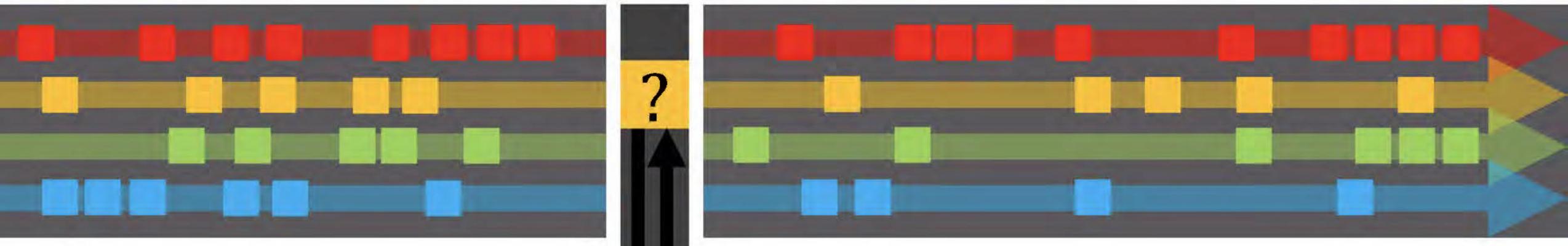
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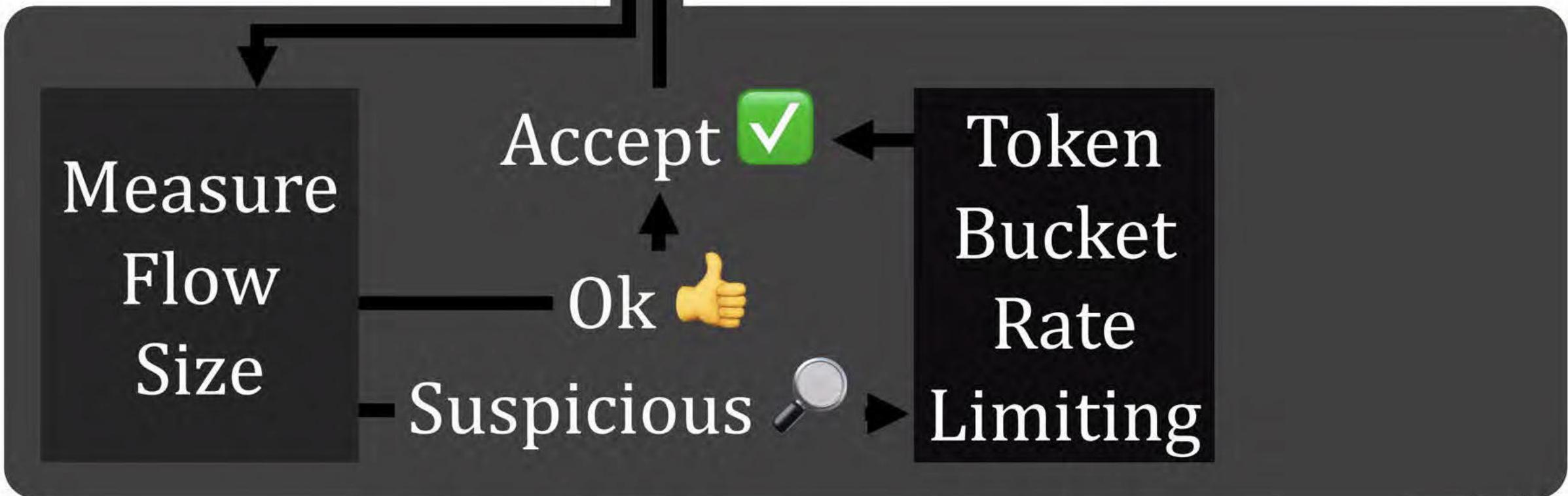
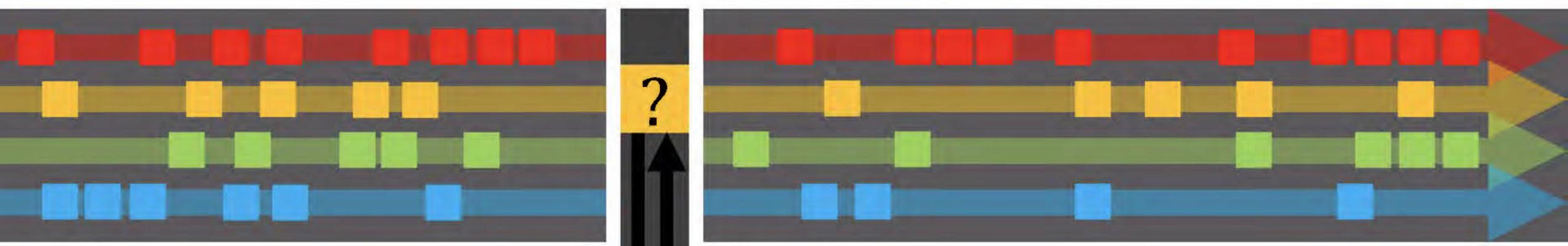
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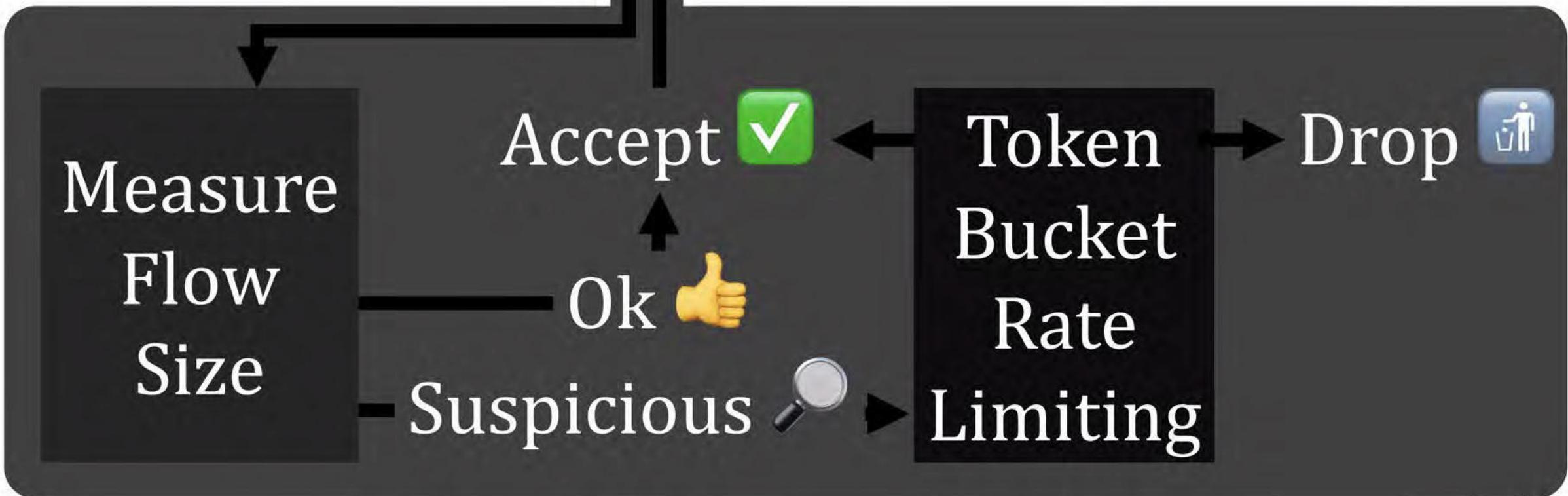
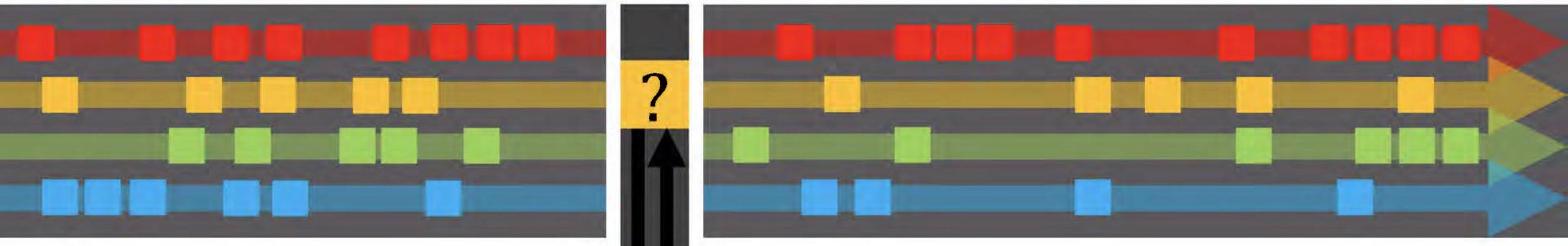
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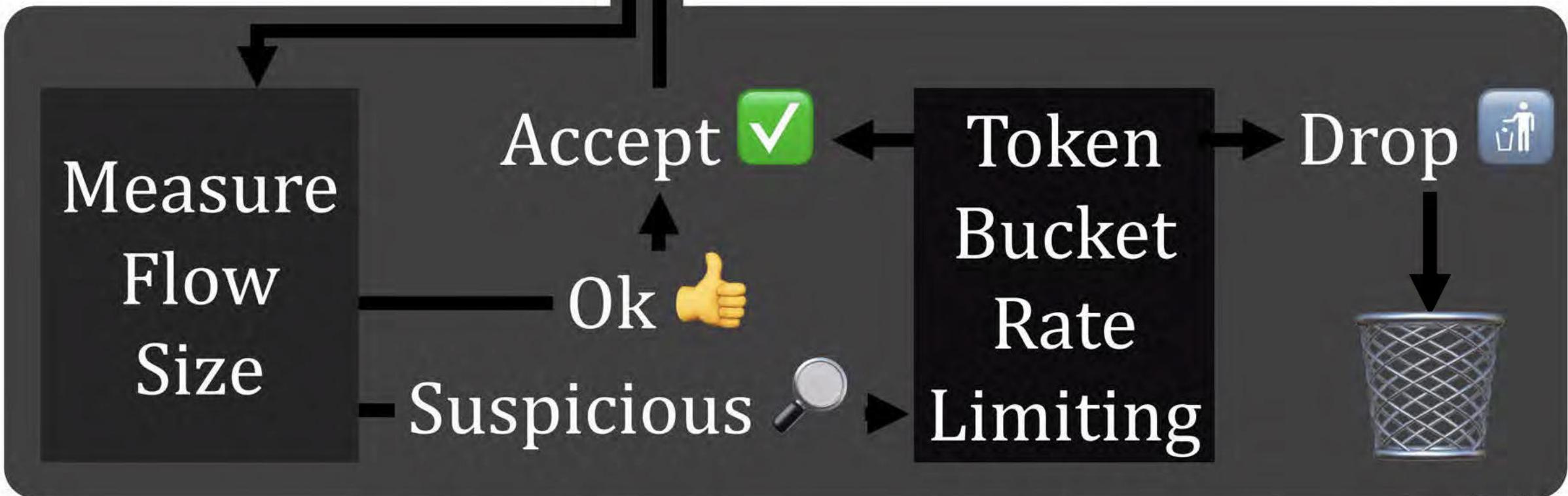
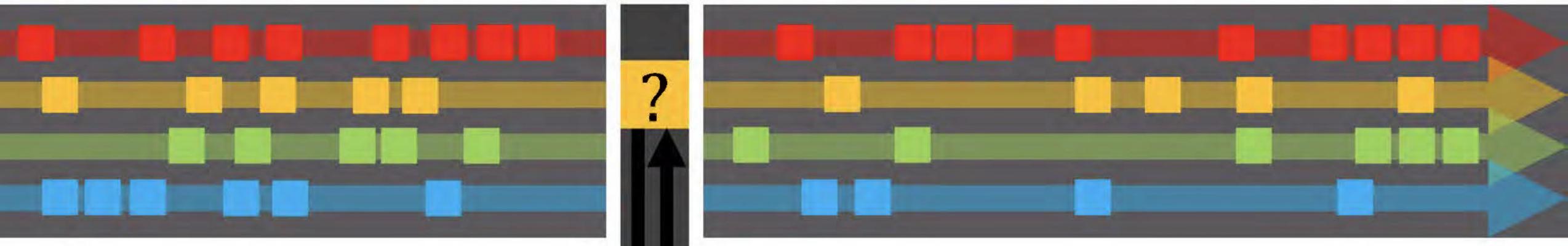
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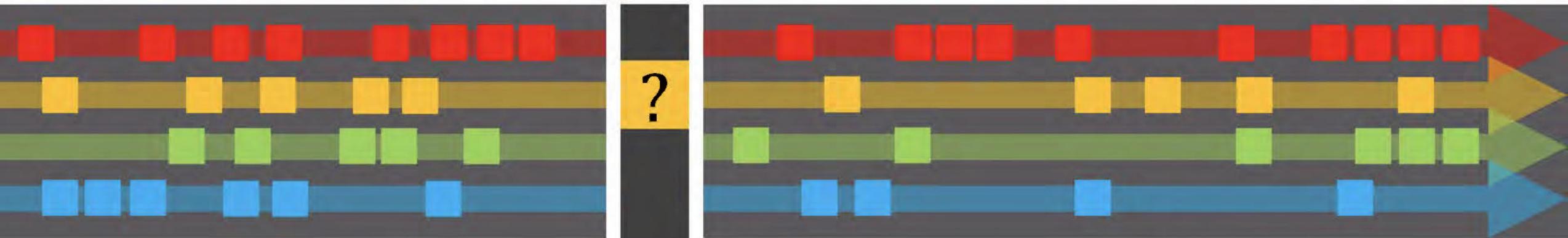
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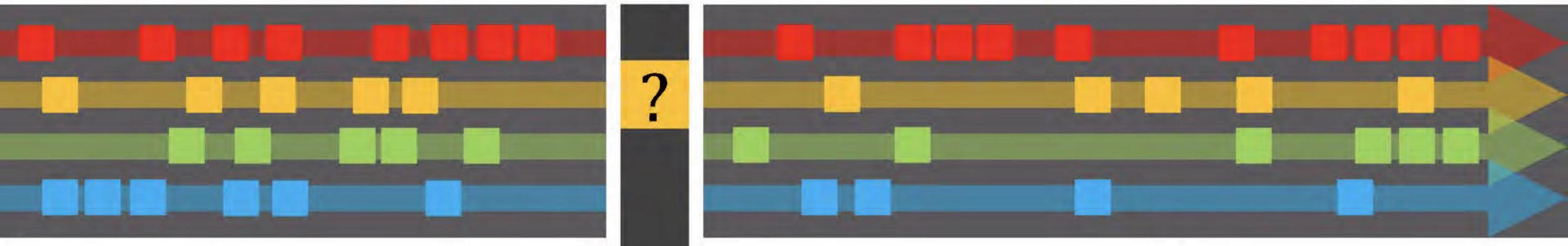


RATE MONITORING AND LIMITING



Heavy-Hitter Detector	Token Bucket Rate Limiting
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RATE MONITORING AND LIMITING



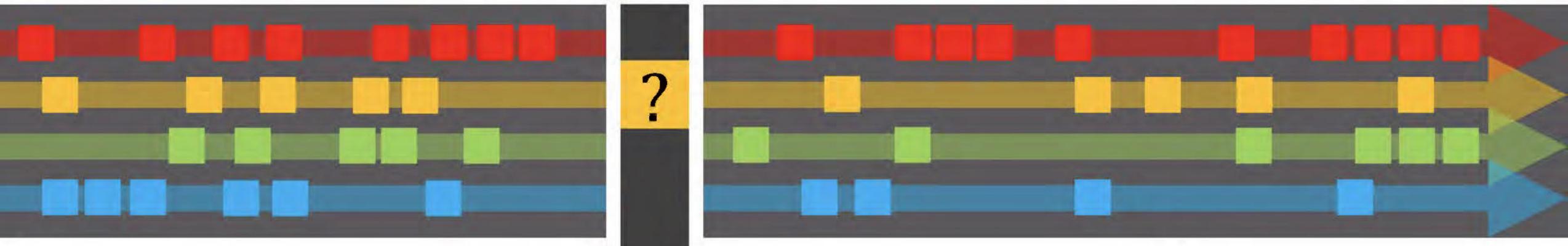
Efficient
Cheap



Heavy-Hitter
Detector

Token Bucket
Rate Limiting

RATE MONITORING AND LIMITING



Efficient
Cheap

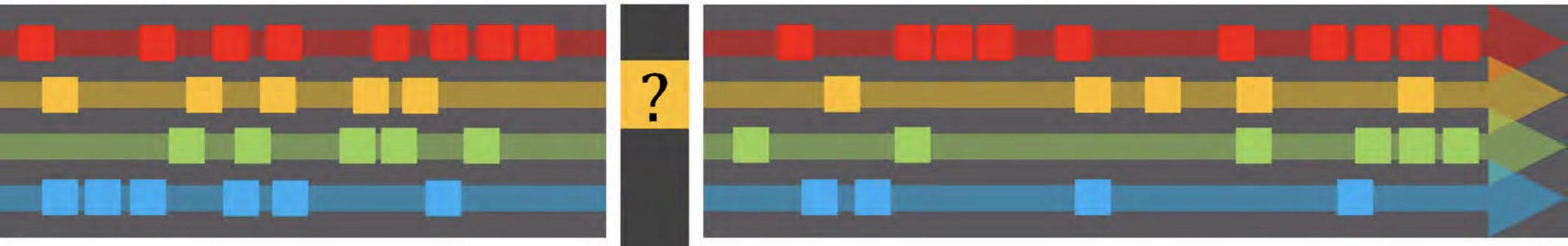


Approximate

Heavy-Hitter
Detector

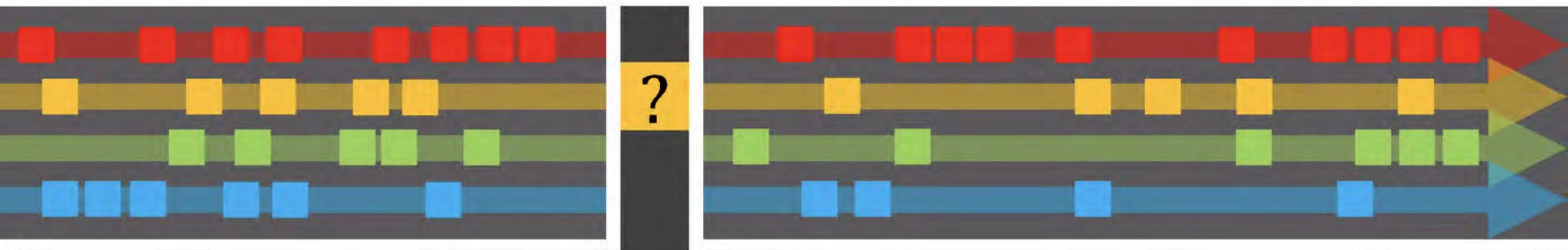
Token Bucket
Rate Limiting

RATE MONITORING AND LIMITING



 <p>Efficient Cheap</p> <p>Approximate</p>	<p>Heavy-Hitter Detector</p>	<p>Token Bucket Rate Limiting</p>	<p>Resource Intense</p> 
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RATE MONITORING AND LIMITING



Efficient
Cheap



Approximate

Heavy-Hitter
Detector

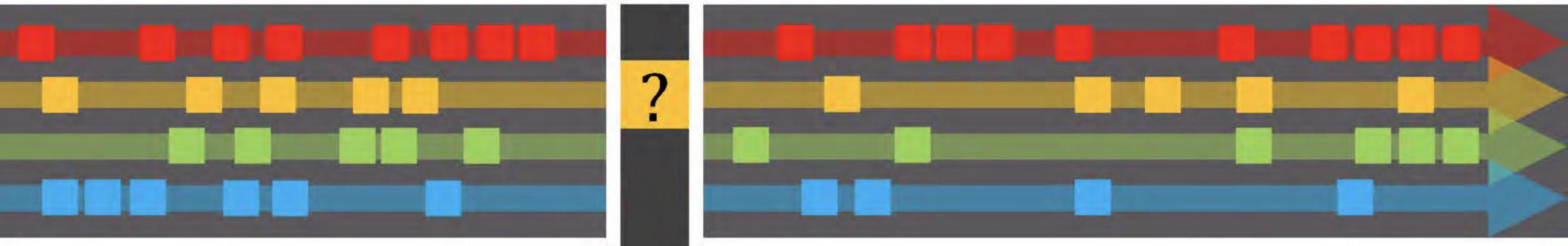
Token Bucket
Rate Limiting

Resource
Intense



Exact

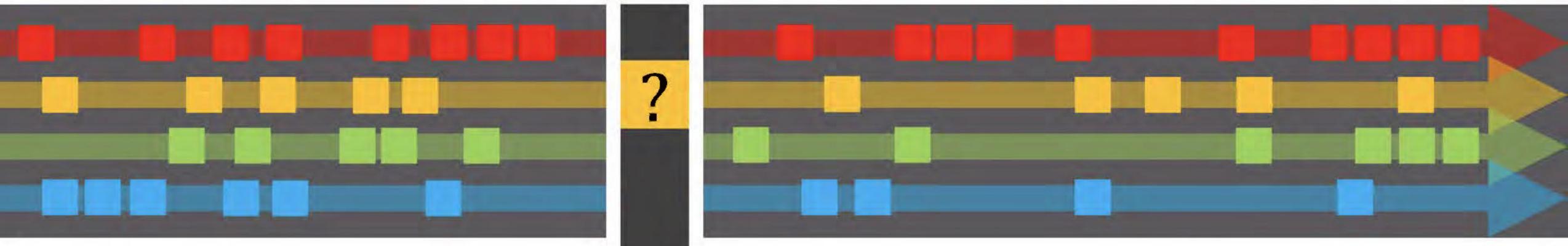
RATE MONITORING AND LIMITING



 <p>Efficient Cheap</p>	 <p>Approximate</p>	<p>Heavy-Hitter Detector</p>	<p>Token Bucket Rate Limiting</p>	 <p>Resource Intense</p>	 <p>Exact</p>
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How to configure optimally ?

RATE MONITORING AND LIMITING

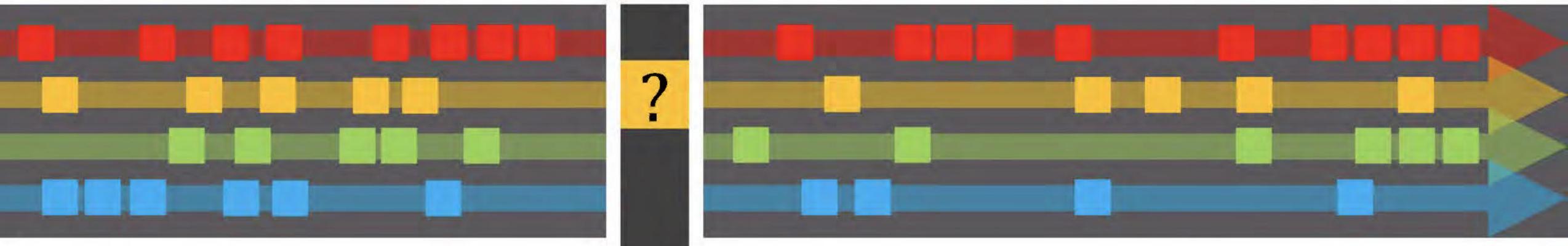


 <p>Efficient Cheap</p>	 <p>Approximate</p>	<p>Heavy-Hitter Detector</p>	<p>Token Bucket Rate Limiting</p>	 <p>Resource Intense</p>	<p>Exact</p>
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How to configure optimally ?

↓
Depends on attack.

RATE MONITORING AND LIMITING



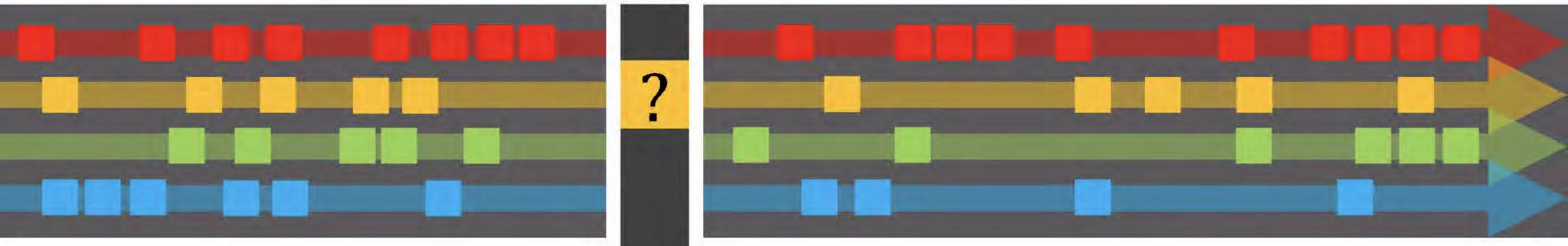
 <p>Efficient Cheap</p>	<p>Approximate</p>	<p>Heavy-Hitter Detector</p>	<p>Token Bucket Rate Limiting</p>	<p>Resource Intense</p>	 <p>Exact</p>
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How to configure optimally ?

Whats the optimal attack?

Depends on attack.

RATE MONITORING AND LIMITING



 <p>Efficient Cheap</p>	 <p>Approximate</p>	Heavy-Hitter Detector	Token Bucket Rate Limiting	 <p>Resource Intense</p>	 <p>Exact</p>
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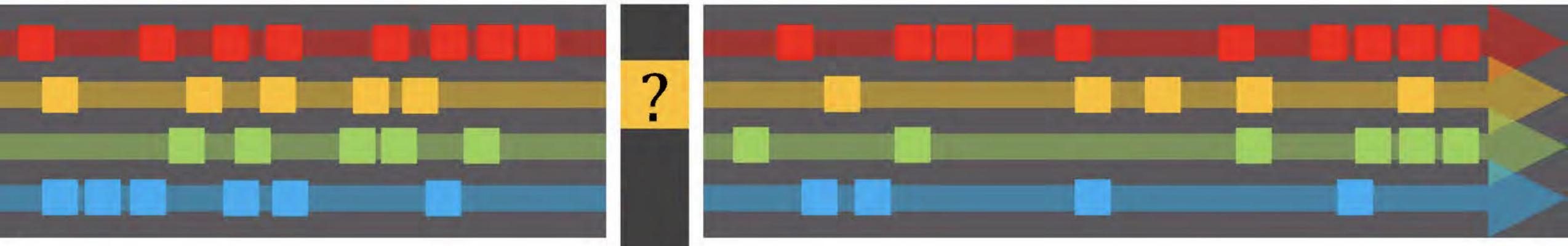
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Whats the optimal attack?

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Depends on attack.

↓
Depends on configuration.

RATE MONITORING AND LIMITING



 <p>Efficient Cheap</p>	 <p>Approximate</p>	Heavy-Hitter Detector	Token Bucket Rate Limiting	 <p>Resource Intense</p>	 <p>Exact</p>
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How to configure optimally ?

Whats the optimal attack?

Depends on attack.

Depends on configuration.

Nobody
knows

RATE MONITORING AND LIMITING

Efficient
Cheap



Approximate

Heavy-Hitter
Detector

Token Bucket
Rate Limiting

Resource
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Heavy-Hitter
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How to configure optimally?

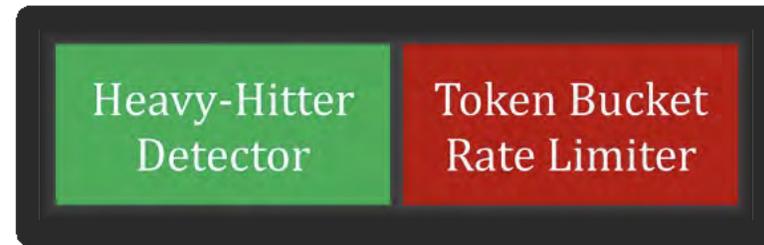
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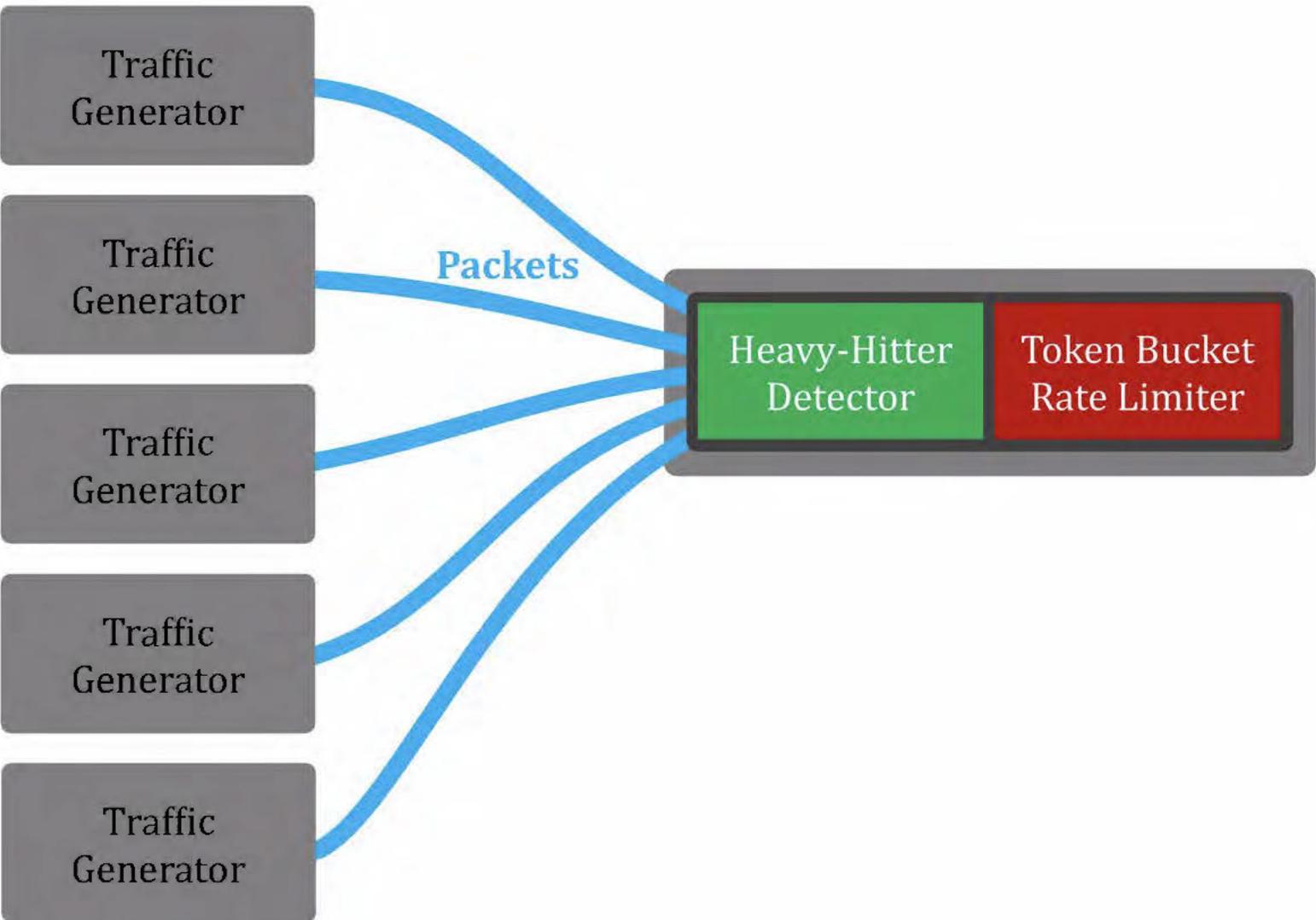
Depends on configuration.

Ignoring this dependency leaves one vulnerable to adaptive adversaries.

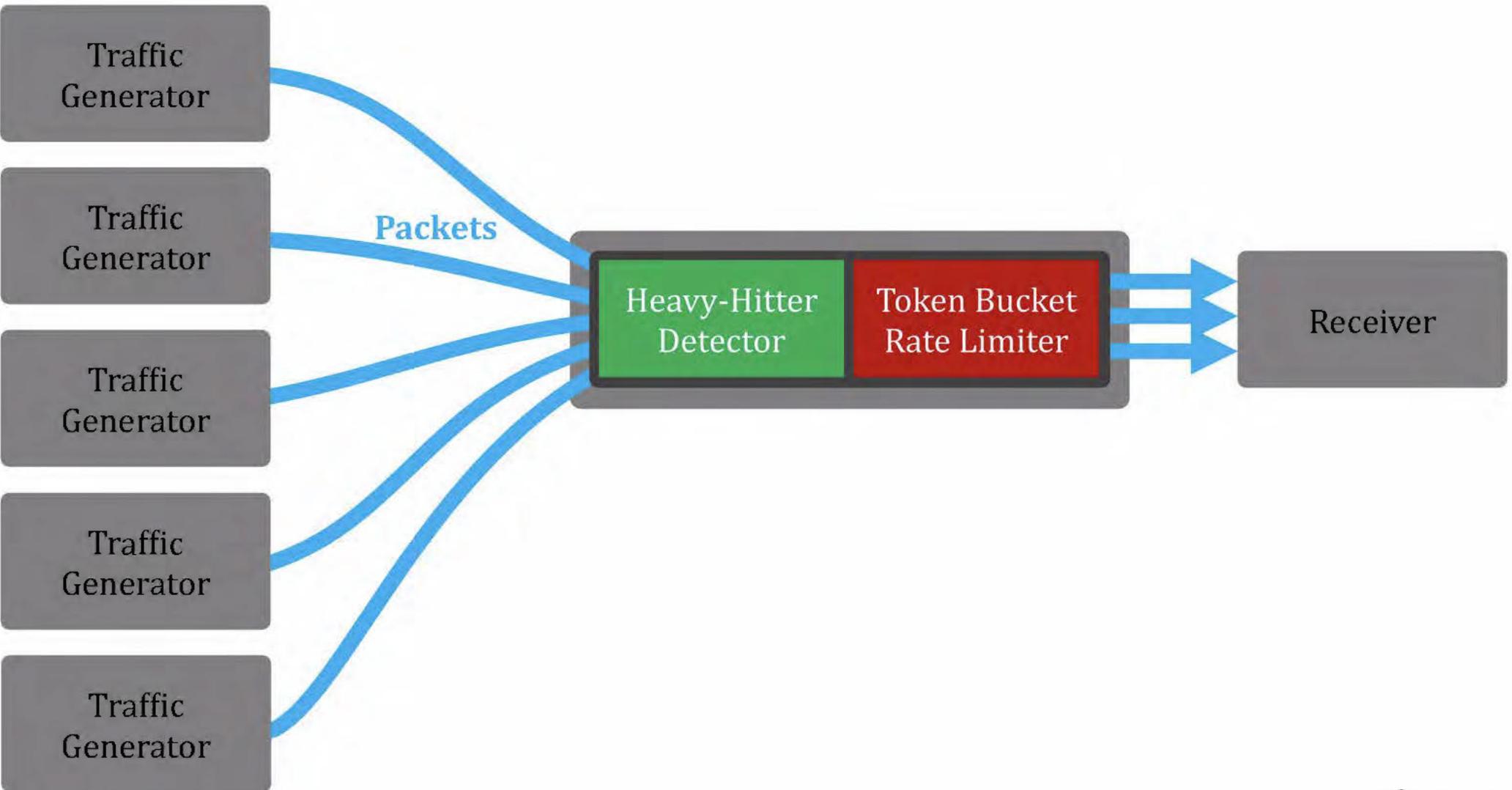
SYSTEM STRUCTURE AND DYNAMICS



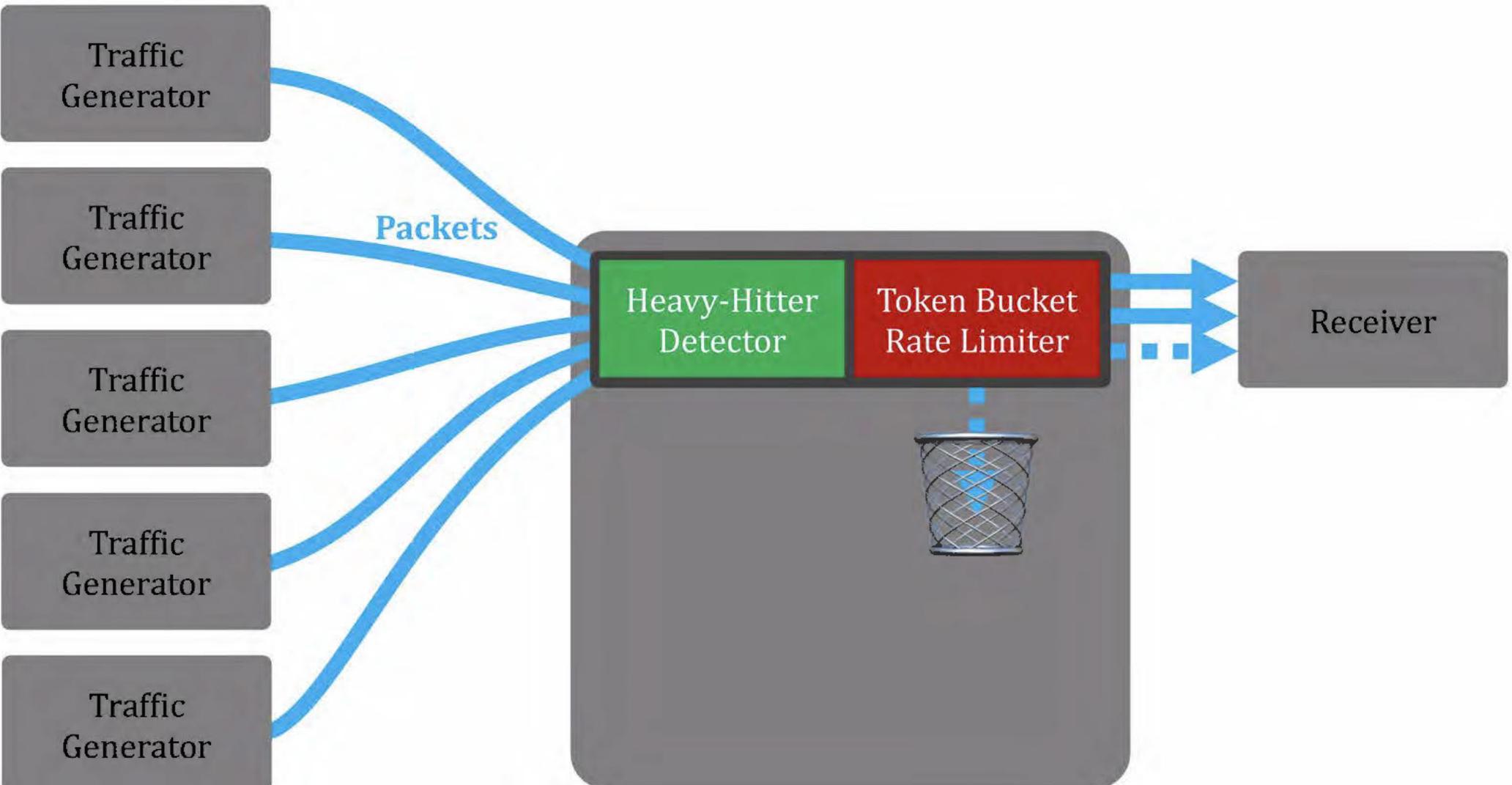
SYSTEM STRUCTURE AND DYNAMICS



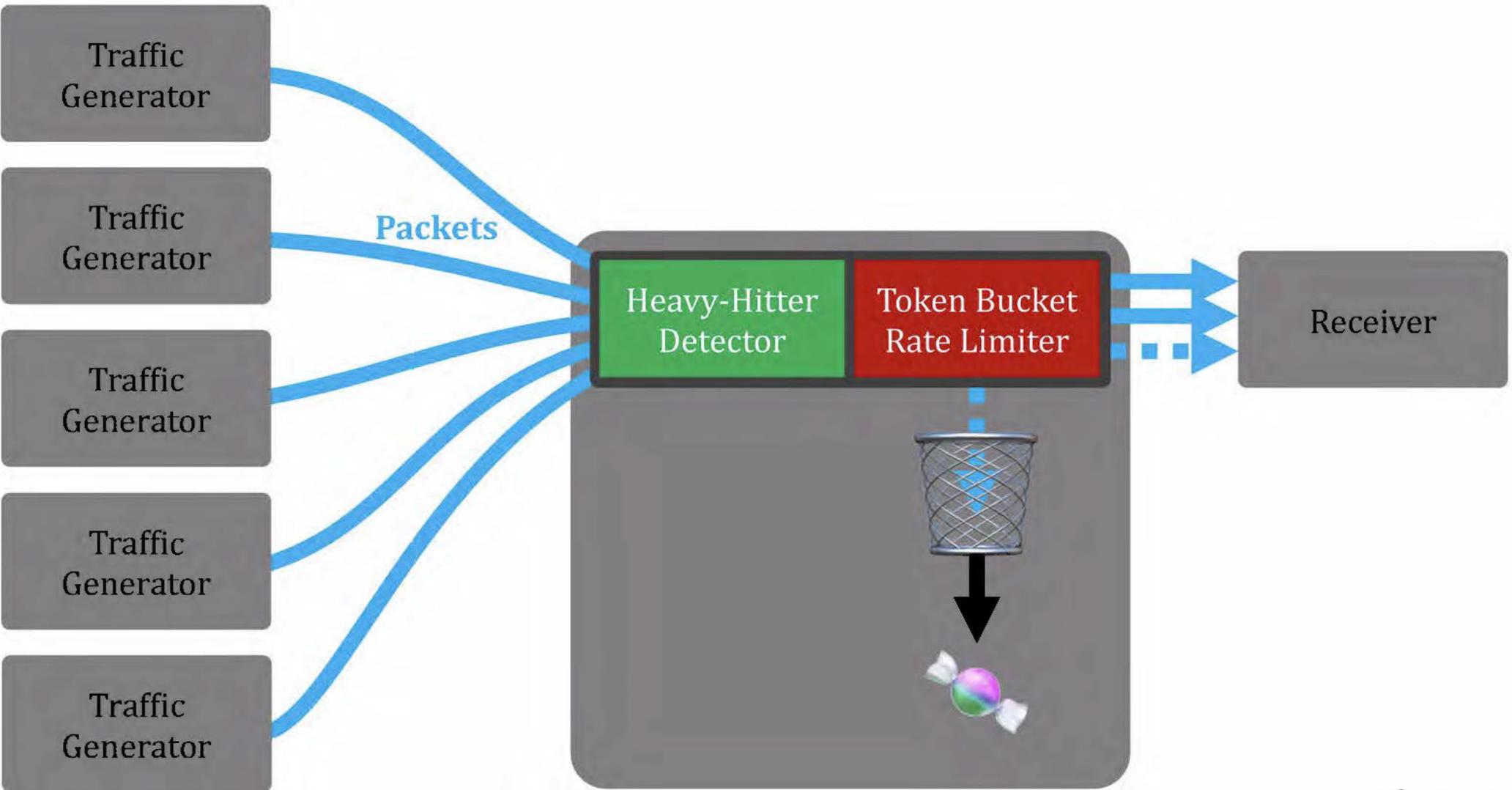
SYSTEM STRUCTURE AND DYNAMICS



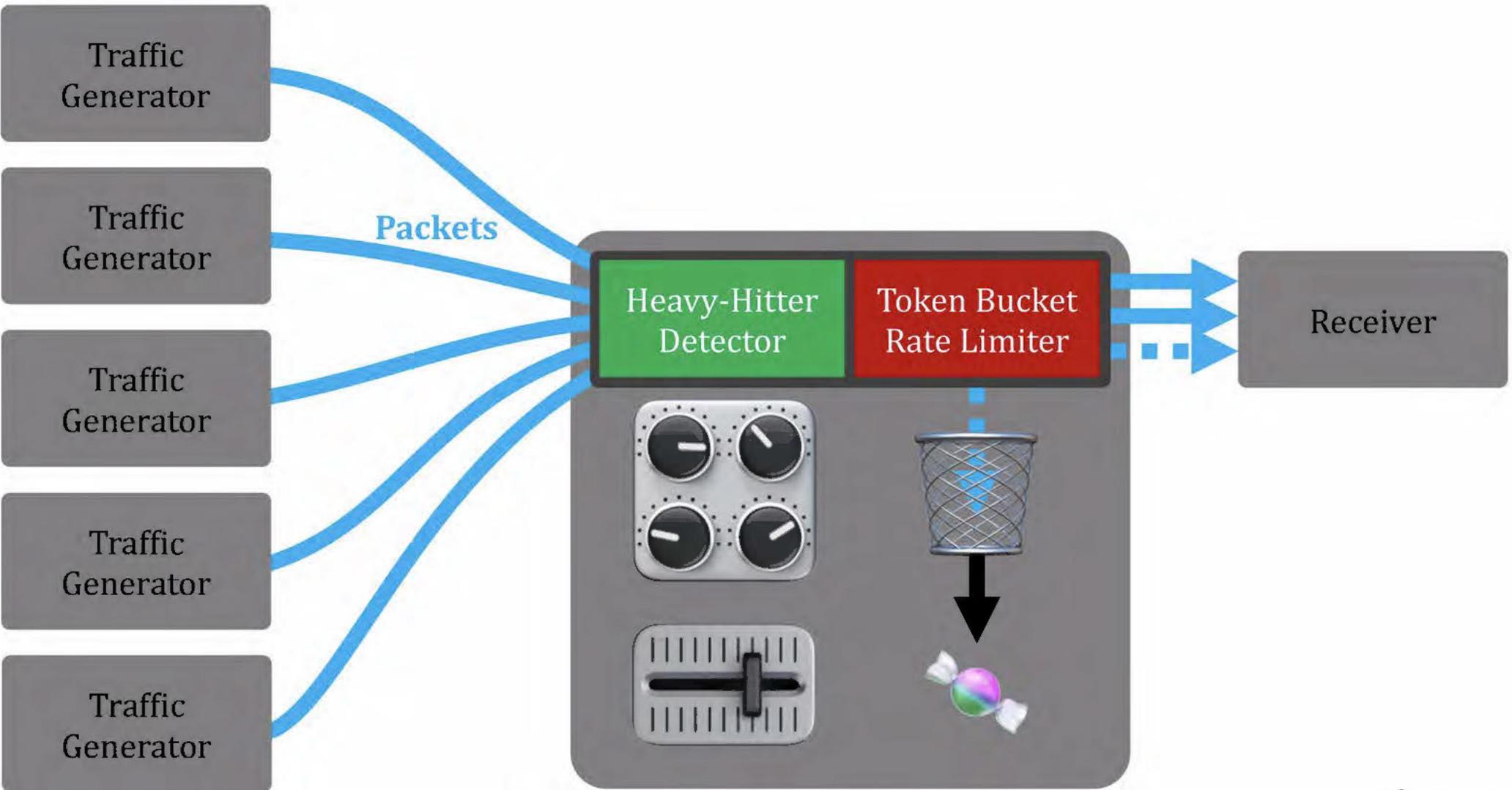
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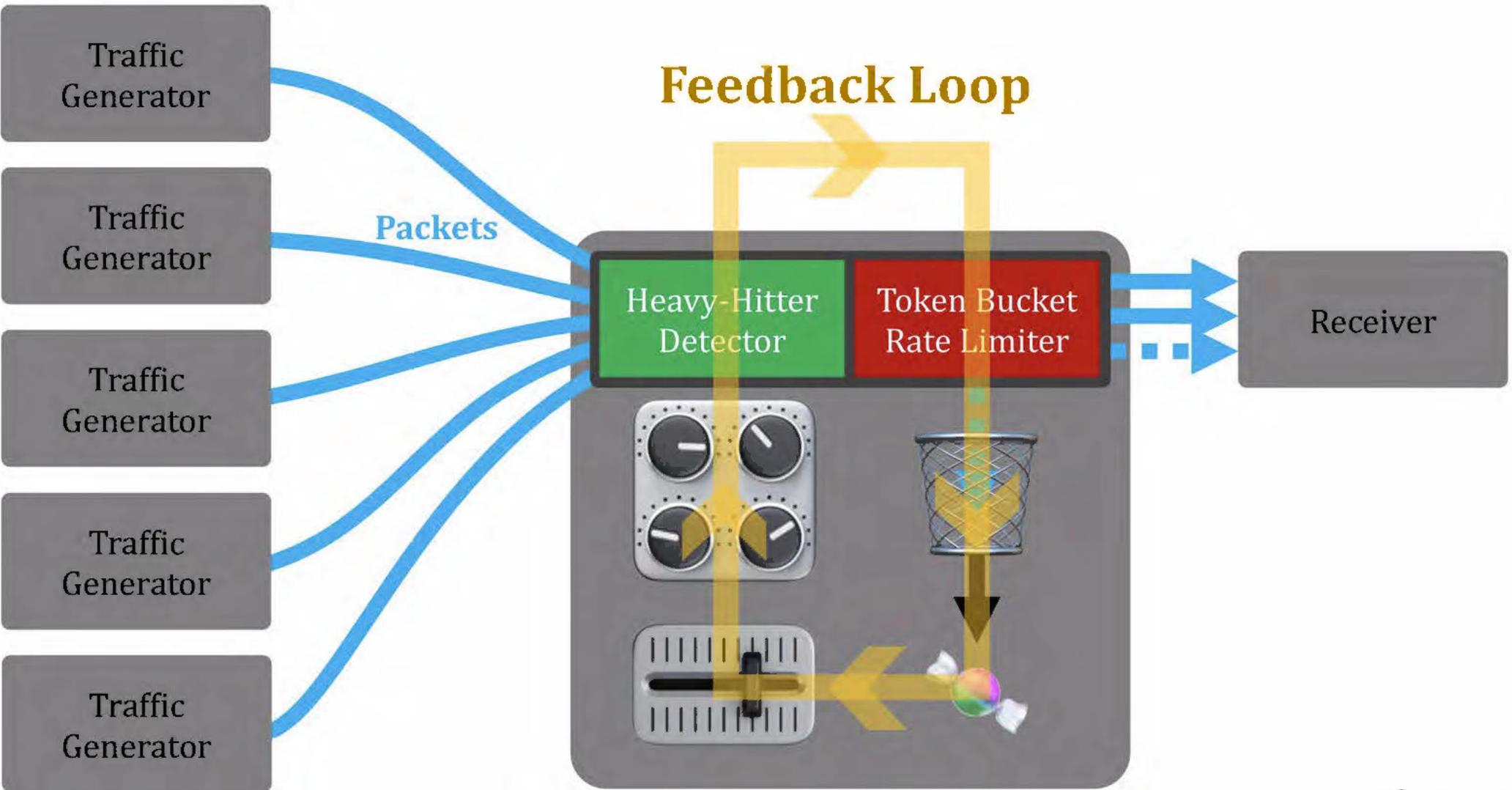
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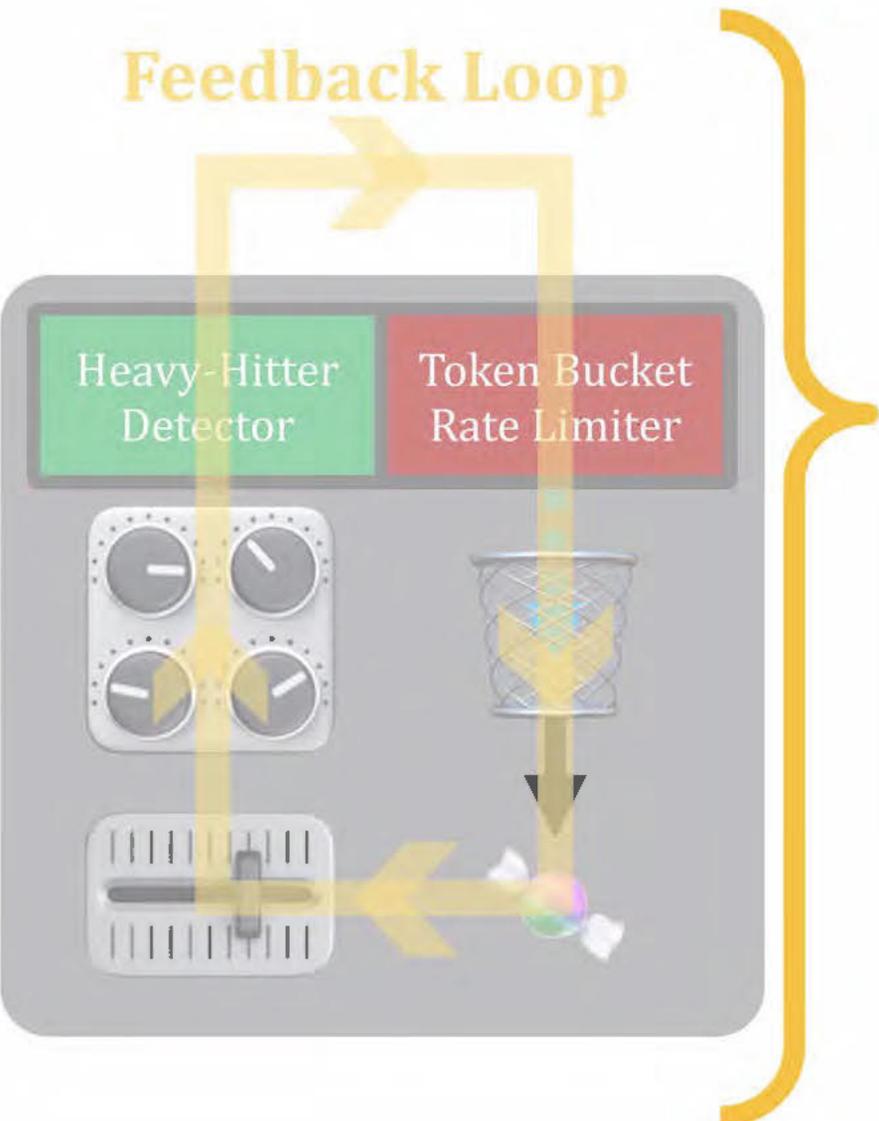
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SYSTEM STRUCTURE AND DYNAMICS

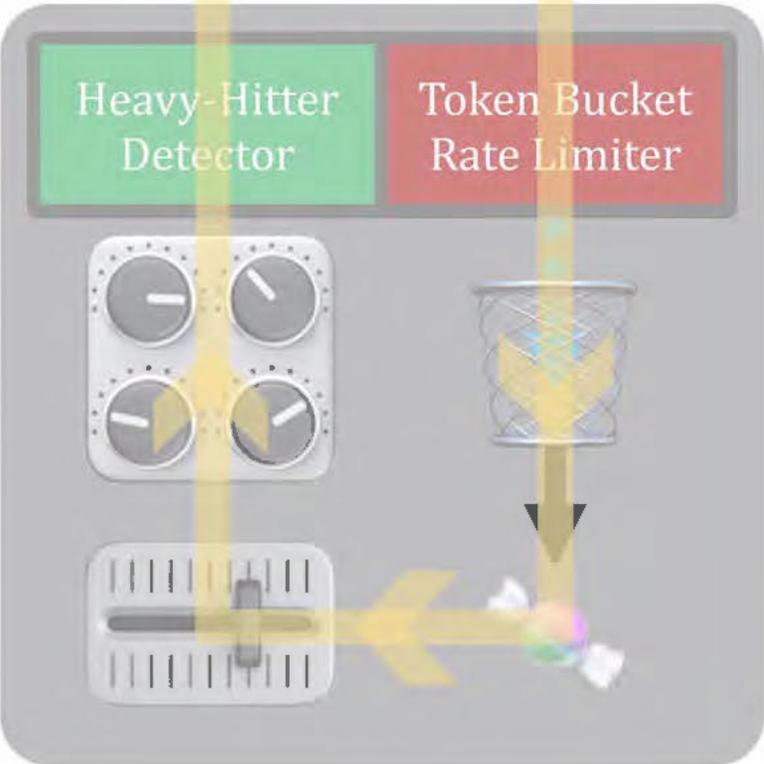


TUNING HHD PARAMETERS



TUNING HHD PARAMETERS

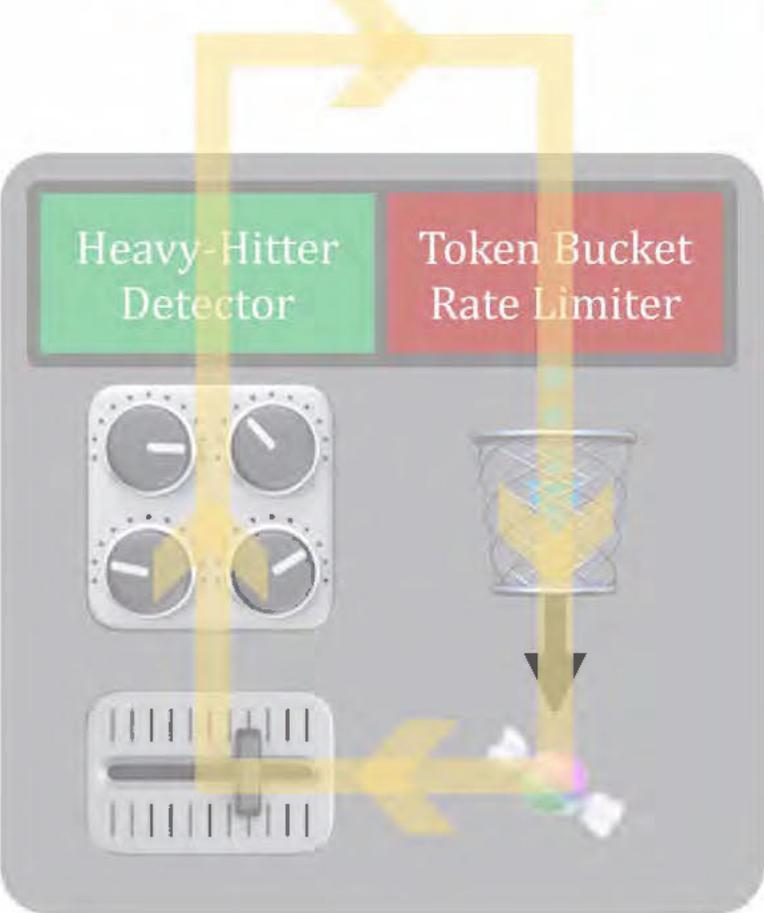
Feedback Loop



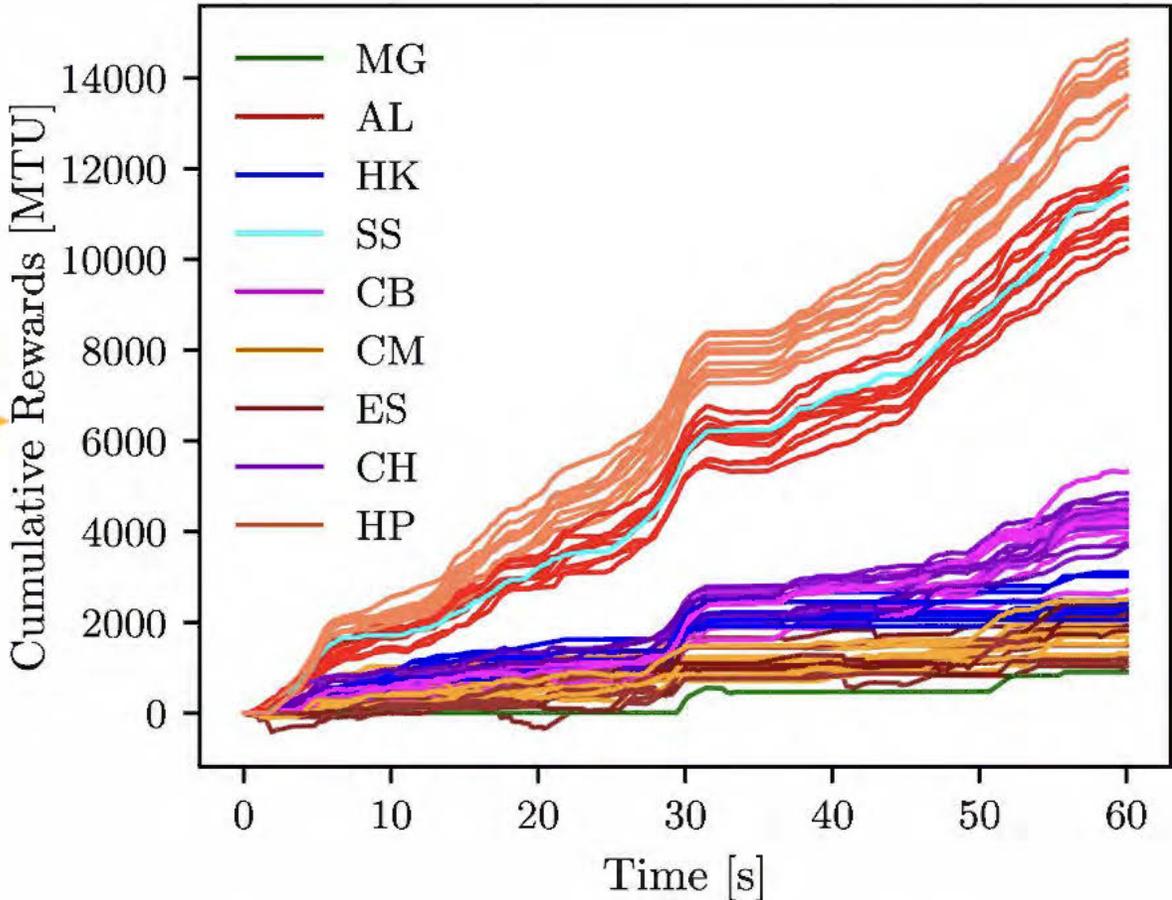
Optimize performance for 9 different HHD methods:

TUNING HHD PARAMETERS

Feedback Loop

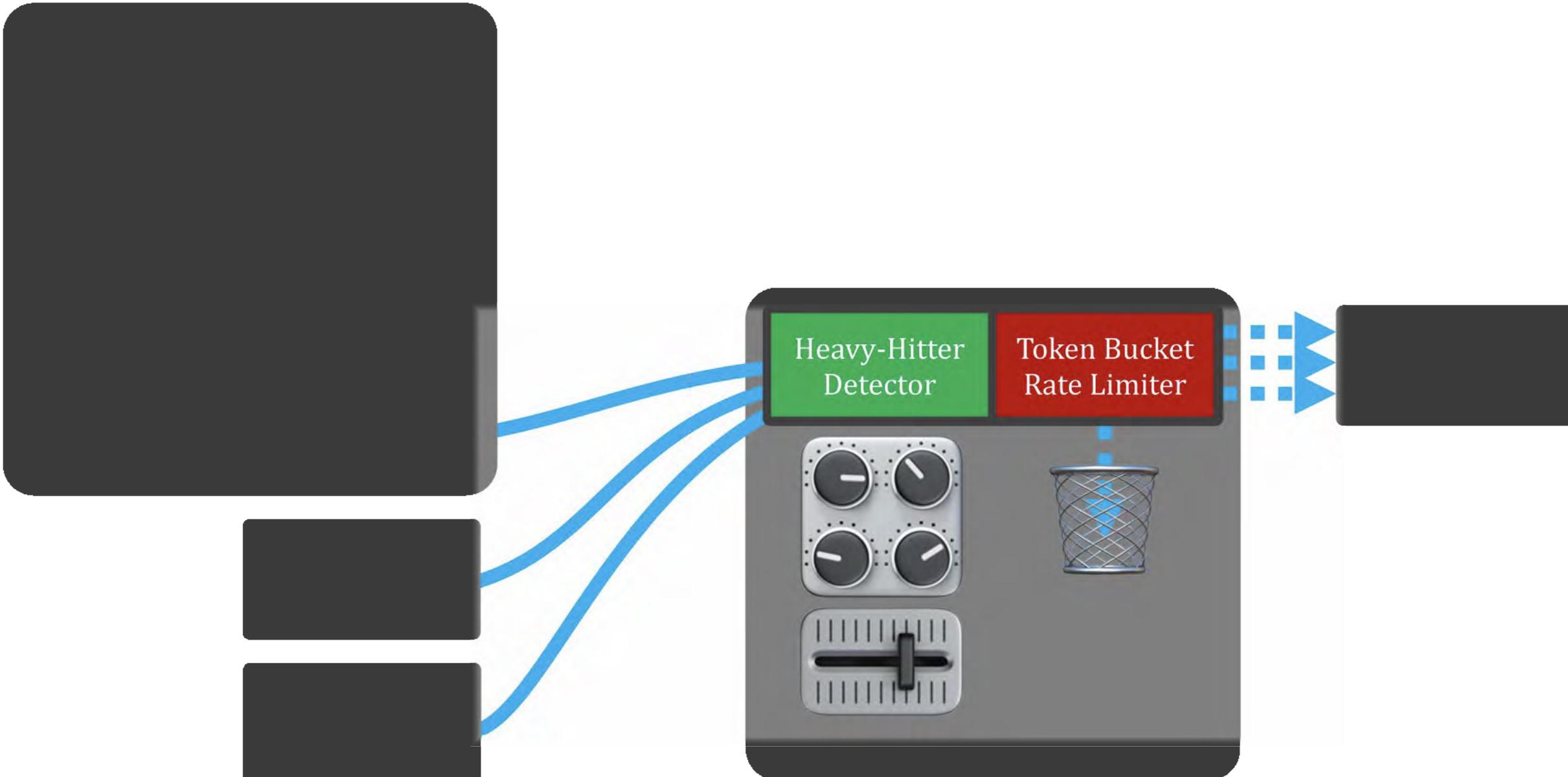


Optimize performance for 9 different HHD methods:

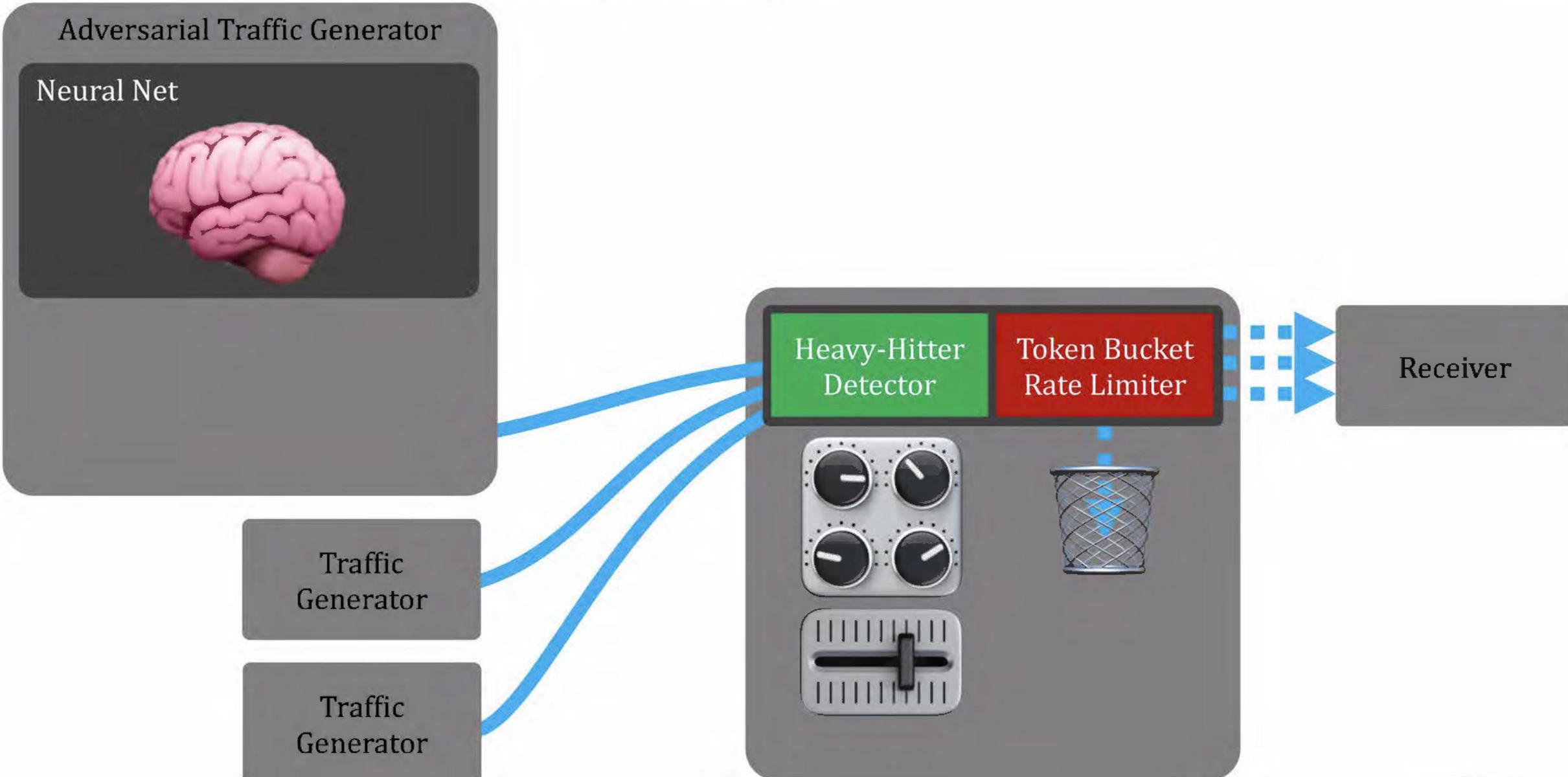


Rewards earned by the HHDs as a function of time

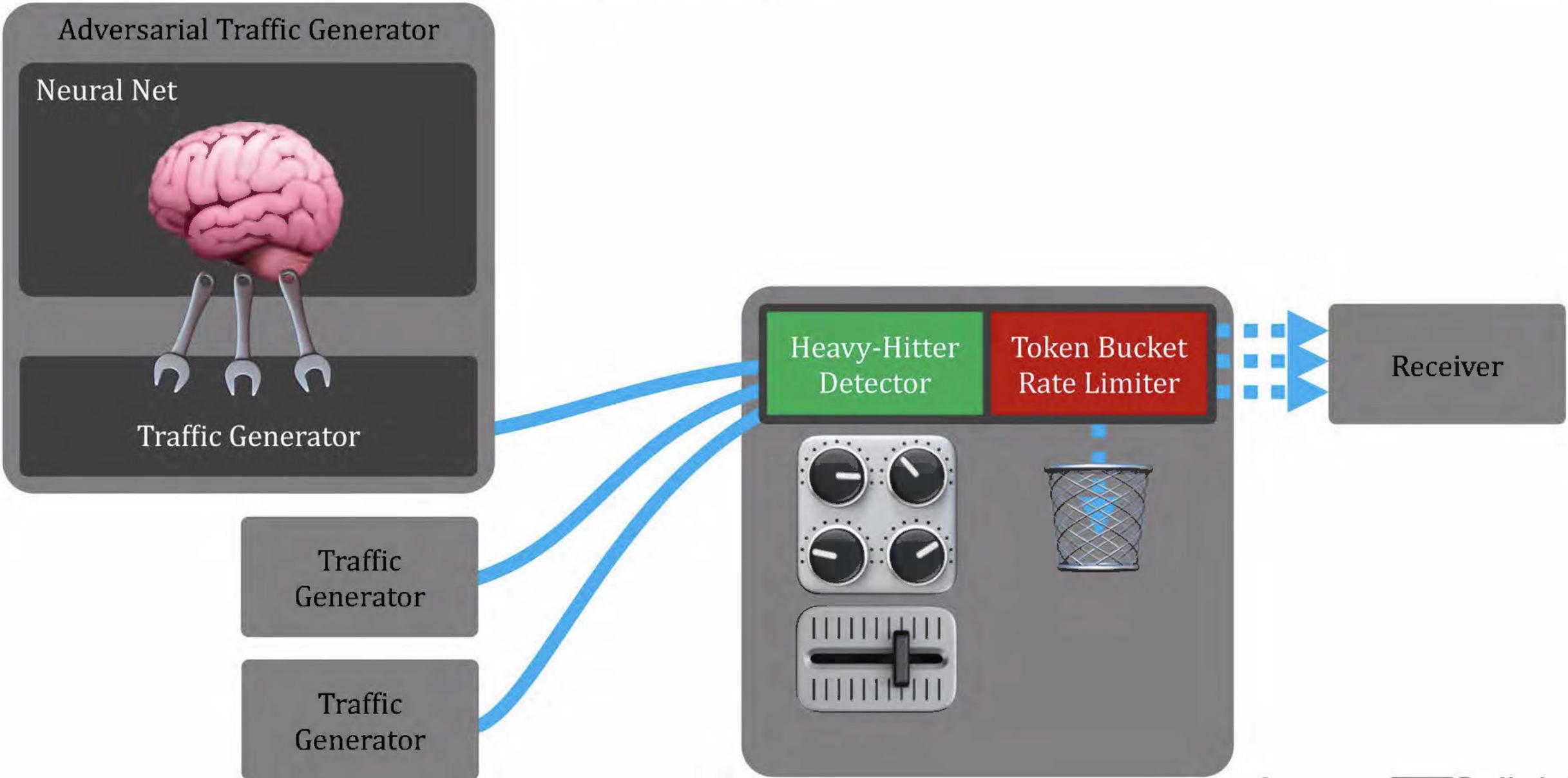
ADVERSARIAL BEHAVIOR



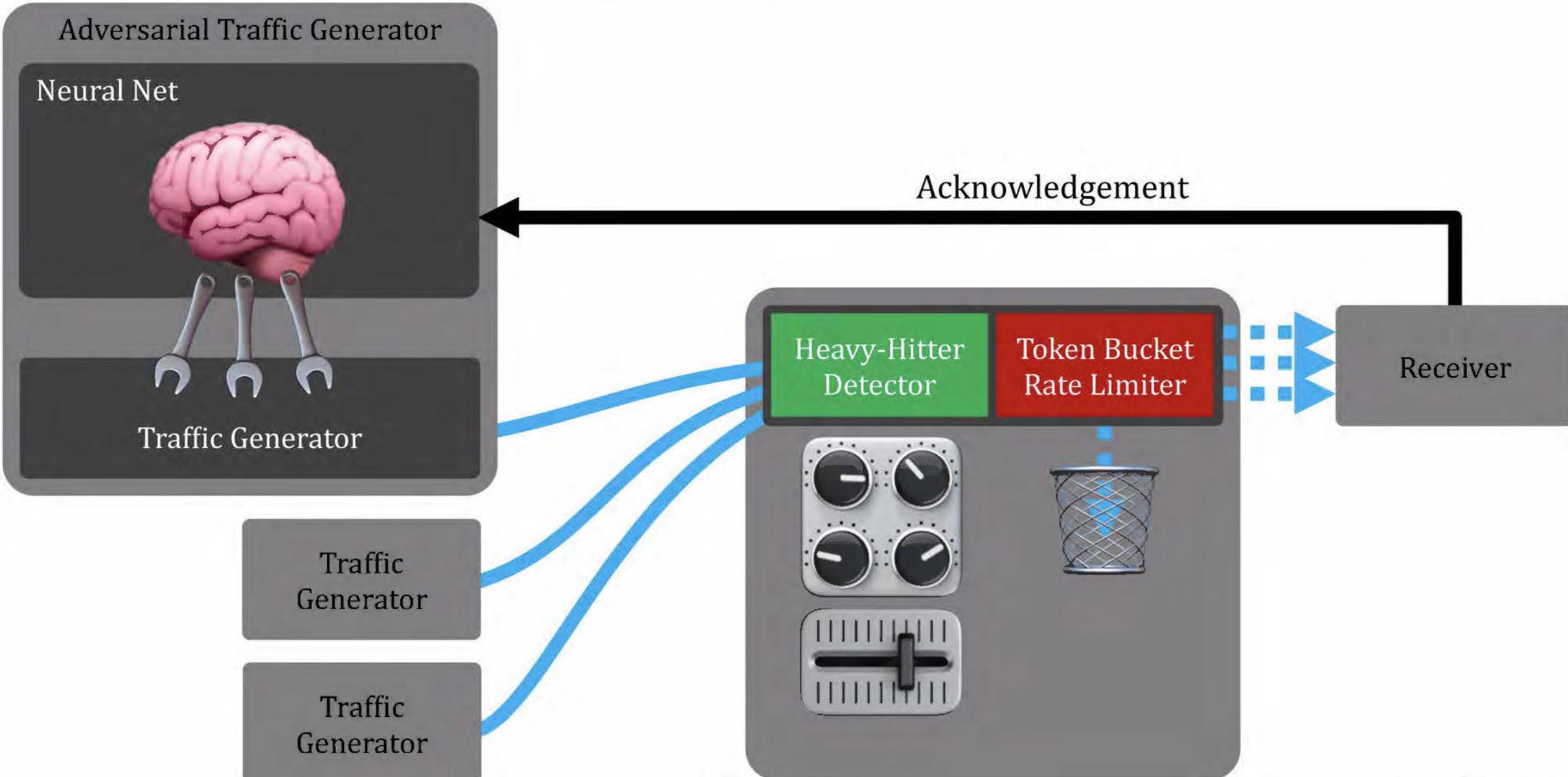
ADVERSARIAL BEHAVIOR



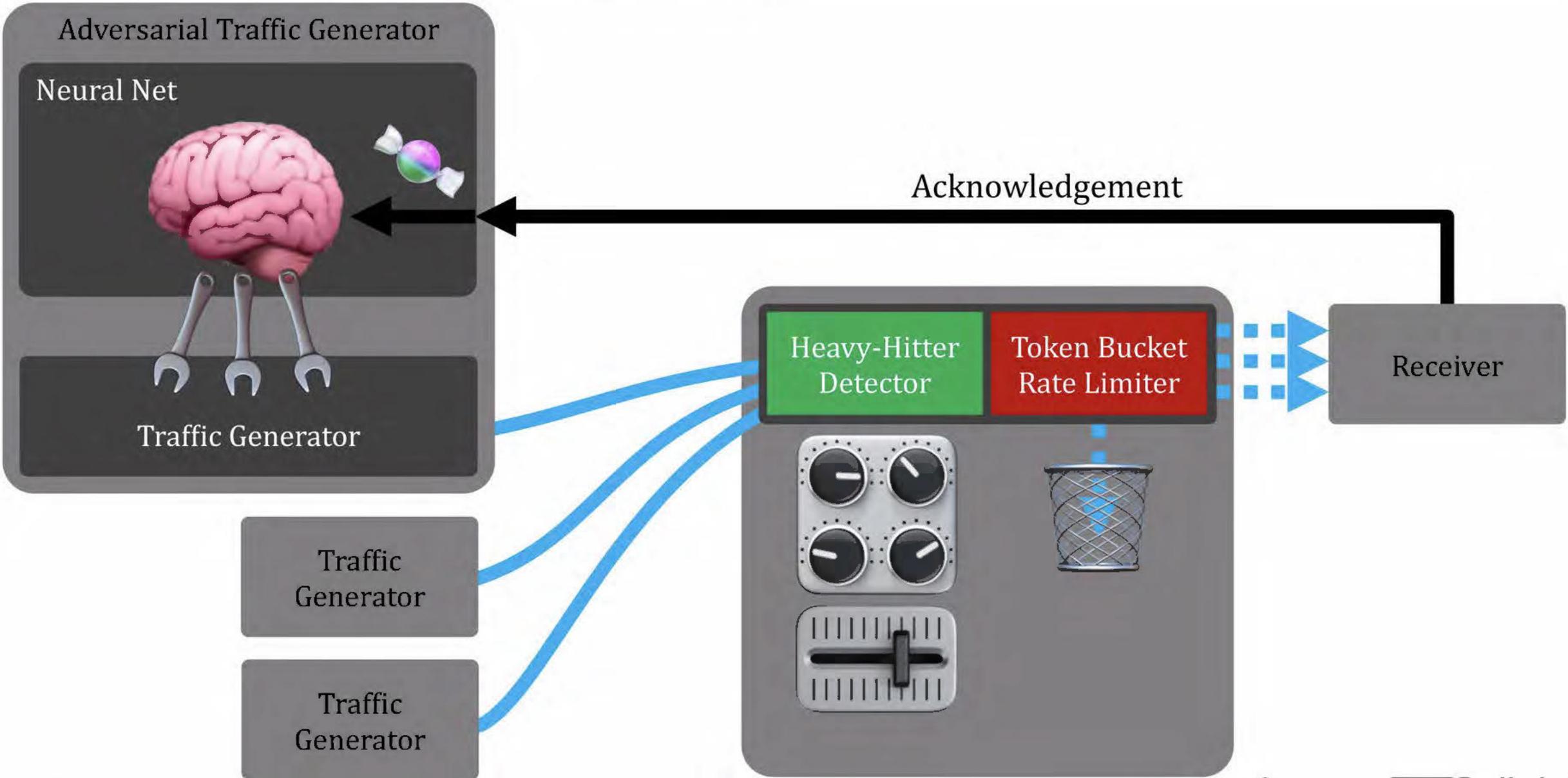
ADVERSARIAL BEHAVIOR



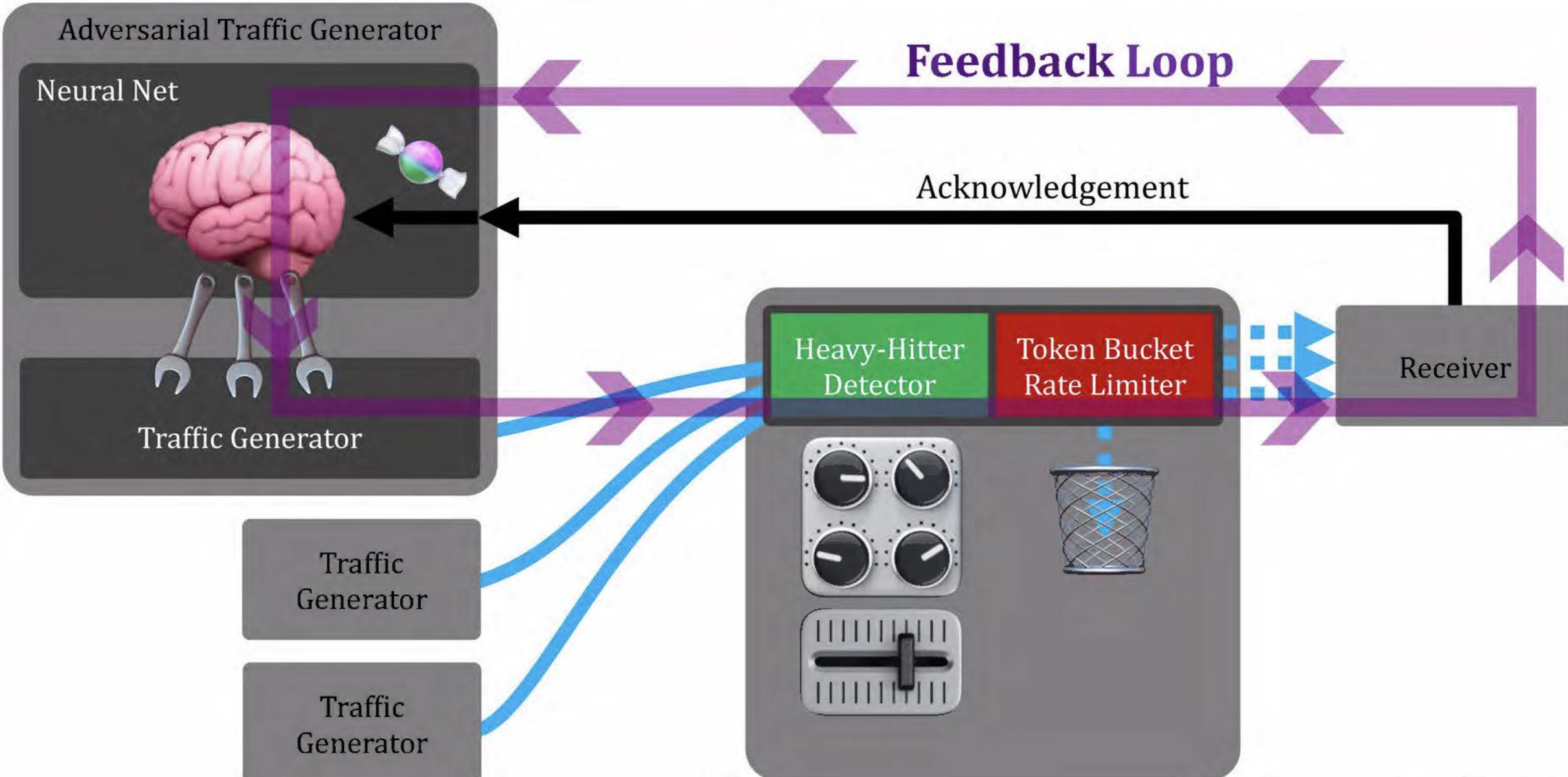
ADVERSARIAL BEHAVIOR



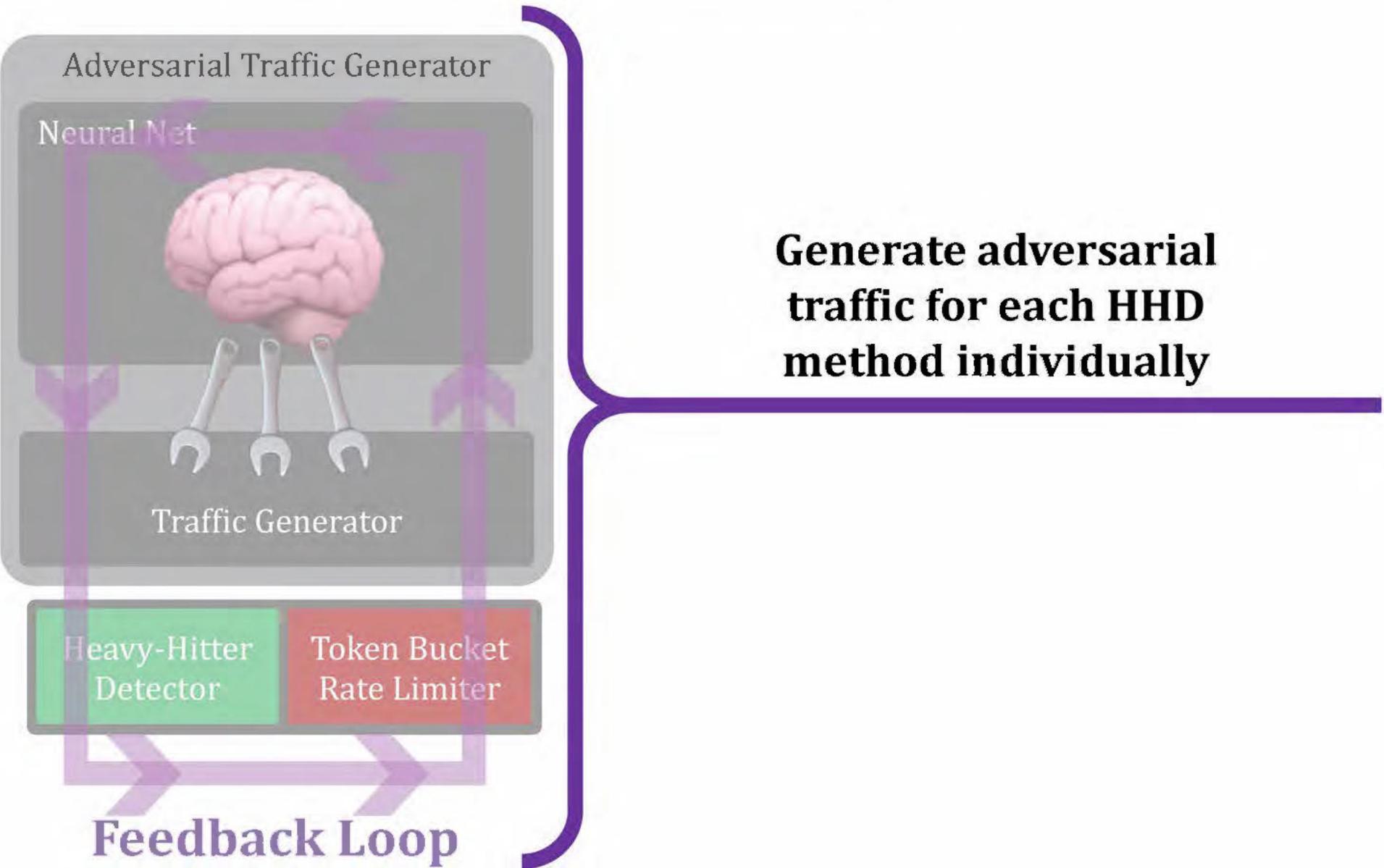
ADVERSARIAL BEHAVIOR



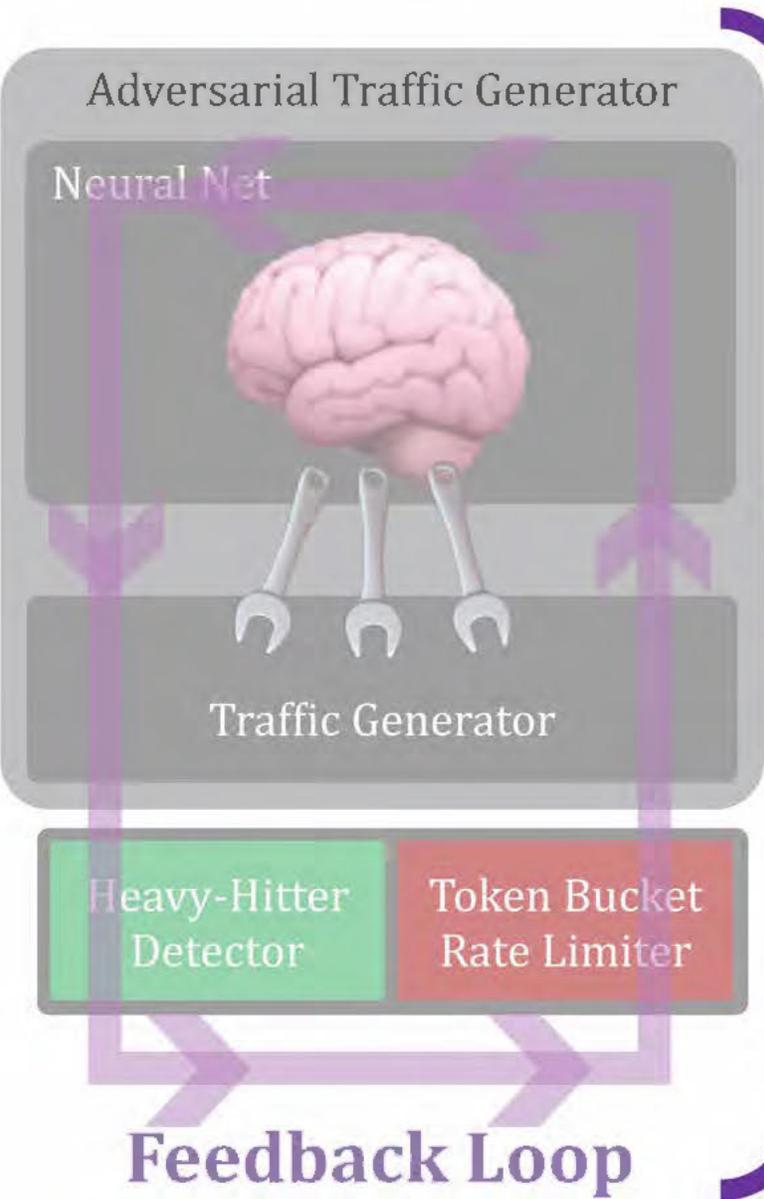
ADVERSARIAL BEHAVIOR



ADVERSARIAL BEHAVIOR



ADVERSARIAL BEHAVIOR



Generate adversarial traffic for each HHD method individually

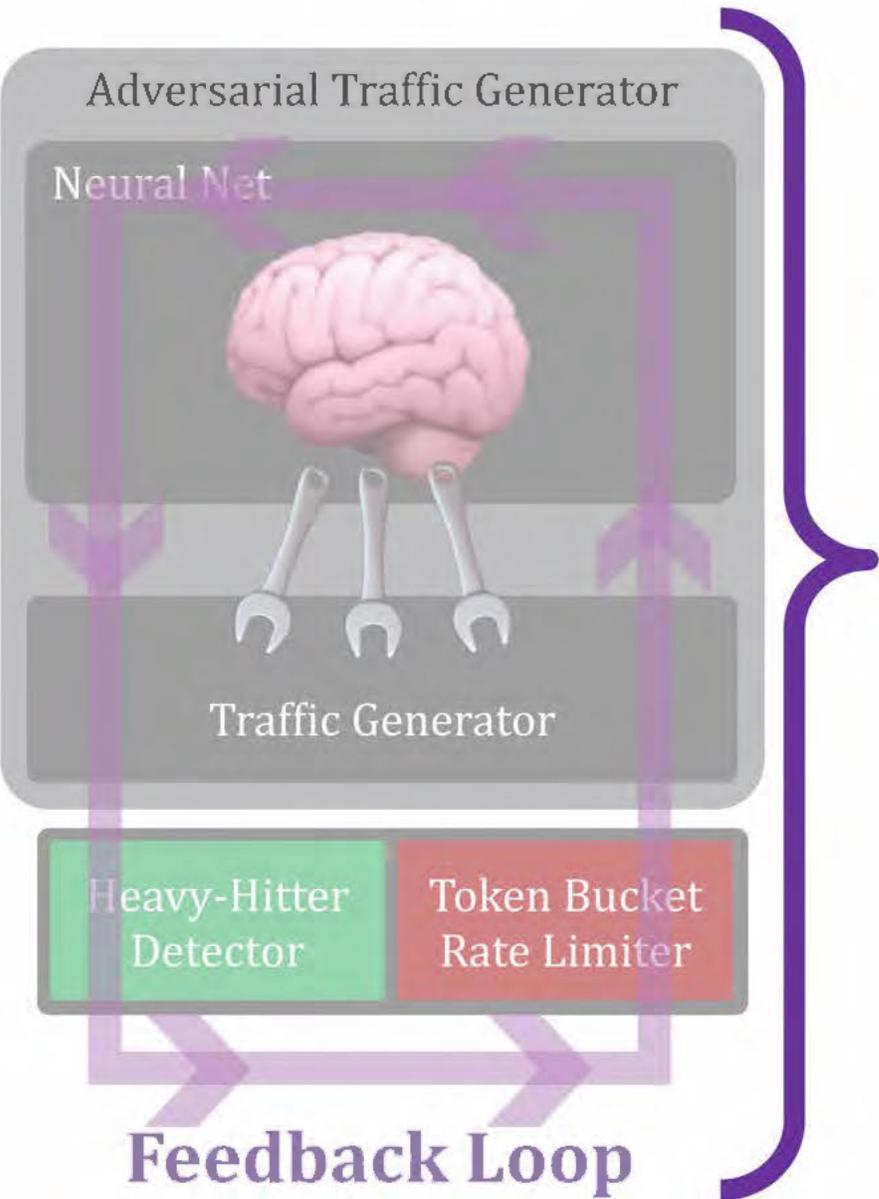
Evaluated for 9 different heavy-hitter detectors

Synthetic traffic
Captured traffic

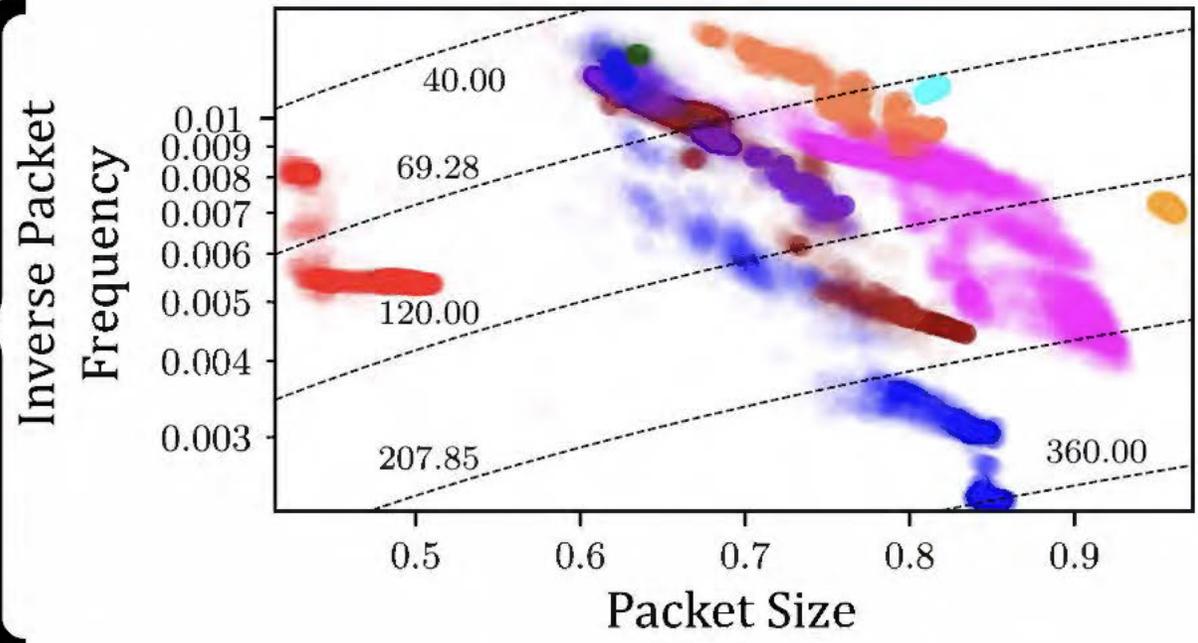
	AL	CB	CM	ES	HK	MG	SS	CH	HP
Synthetic traffic	85%	78%	138%	299%	10%	37%	68%	67%	54%
Captured traffic	90%	185%	326%	670%	-21%	78%	88%	161%	82%

Adversary Overuse

ADVERSARIAL BEHAVIOR



Phase-Space Diagram



Evaluated for 9 different heavy-hitter detectors

Synthetic traffic
Captured traffic

	AL	CB	CM	ES	HK	MG	SS	CH	HP
Synthetic traffic	85%	78%	138%	299%	10%	37%	68%	67%	54%
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Adversary Overuse

LEARN FROM AN ADAPTIVE ADVERSARY

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Problem: HHD algorithm not ready for adaptive adversary...

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Solution: Let HHD and adversary learn from each other!

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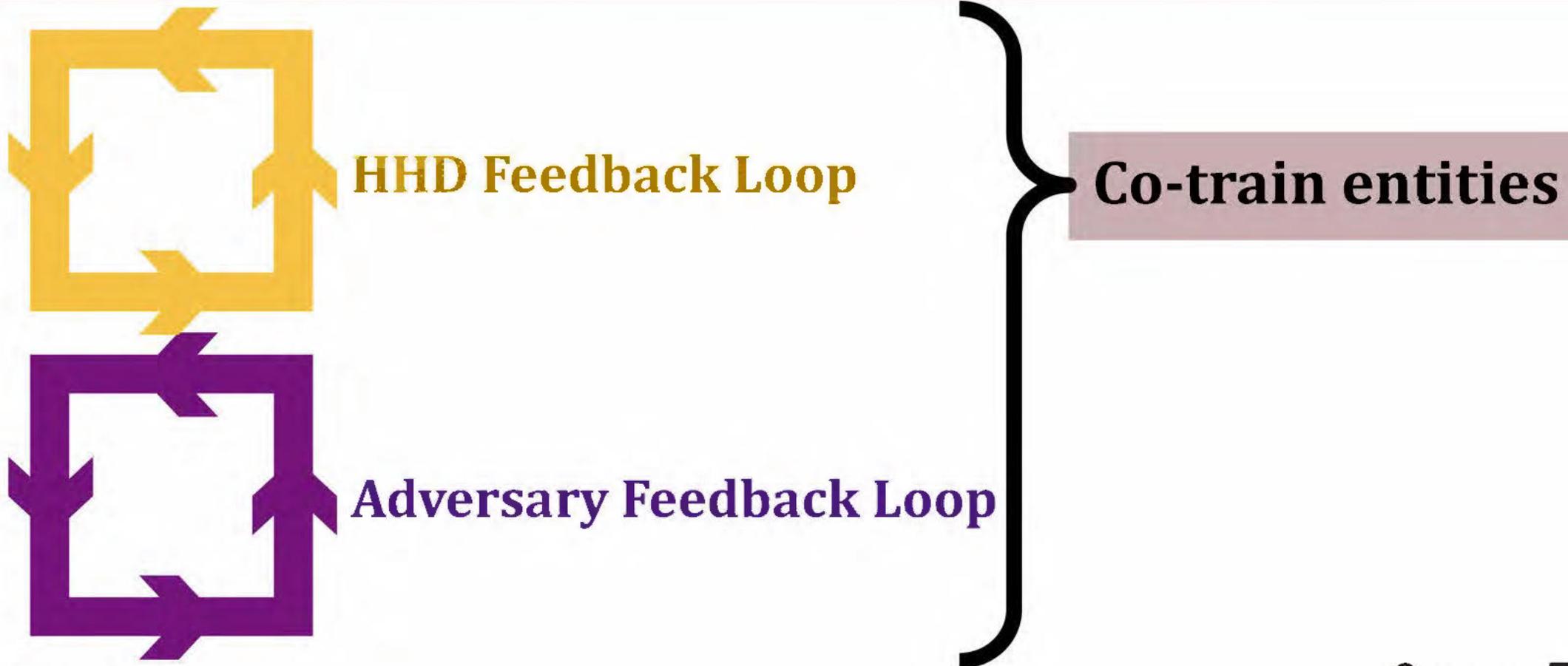
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Co-train entities

Each learns to exploit the other's weakness

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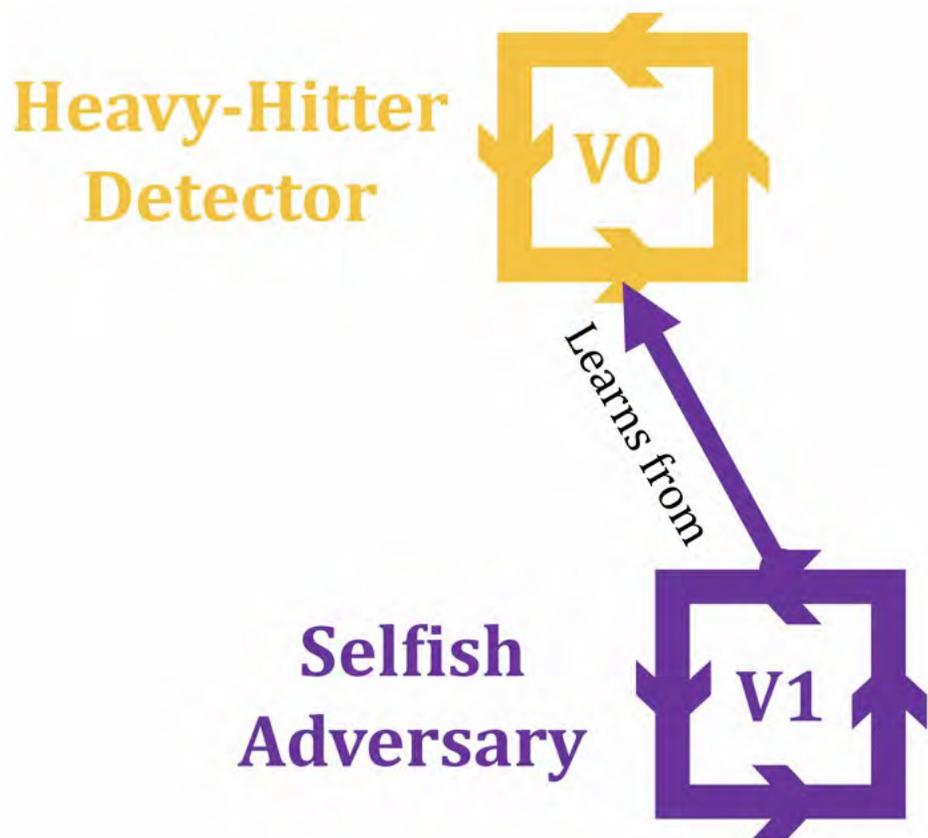
Heavy-Hitter
Detector



LEARN FROM AN ADAPTIVE ADVERSARY

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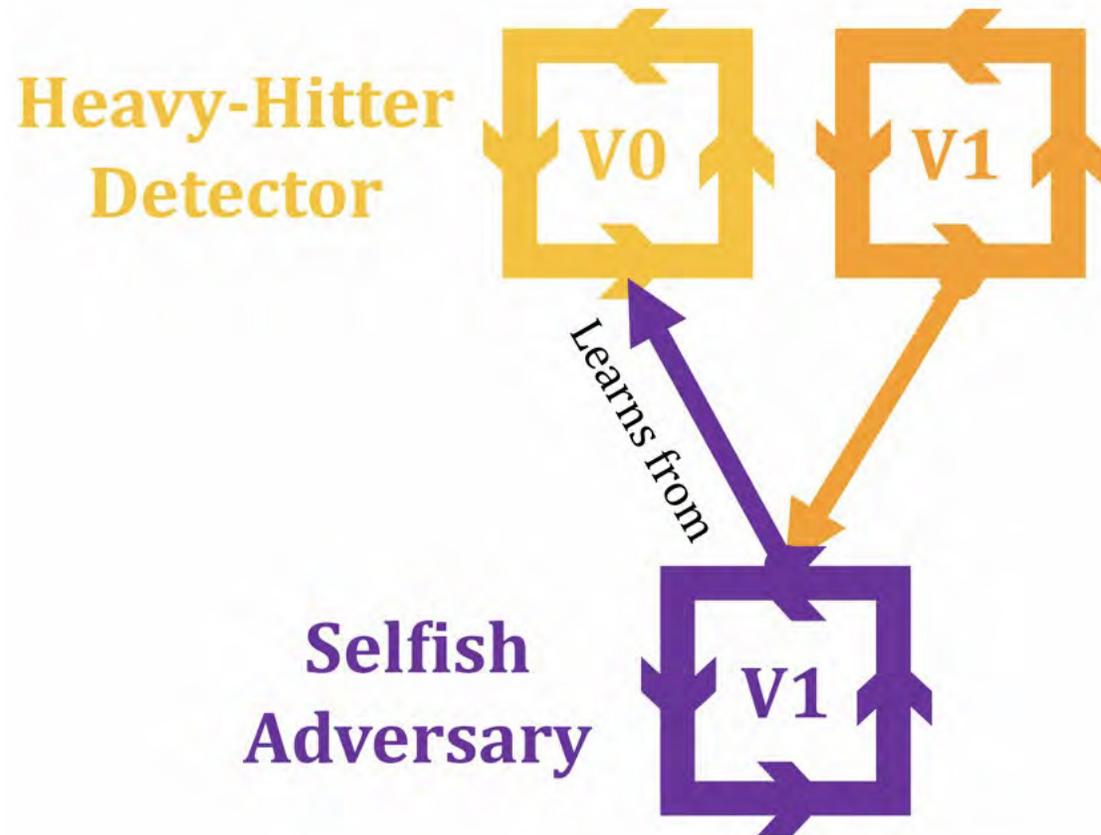
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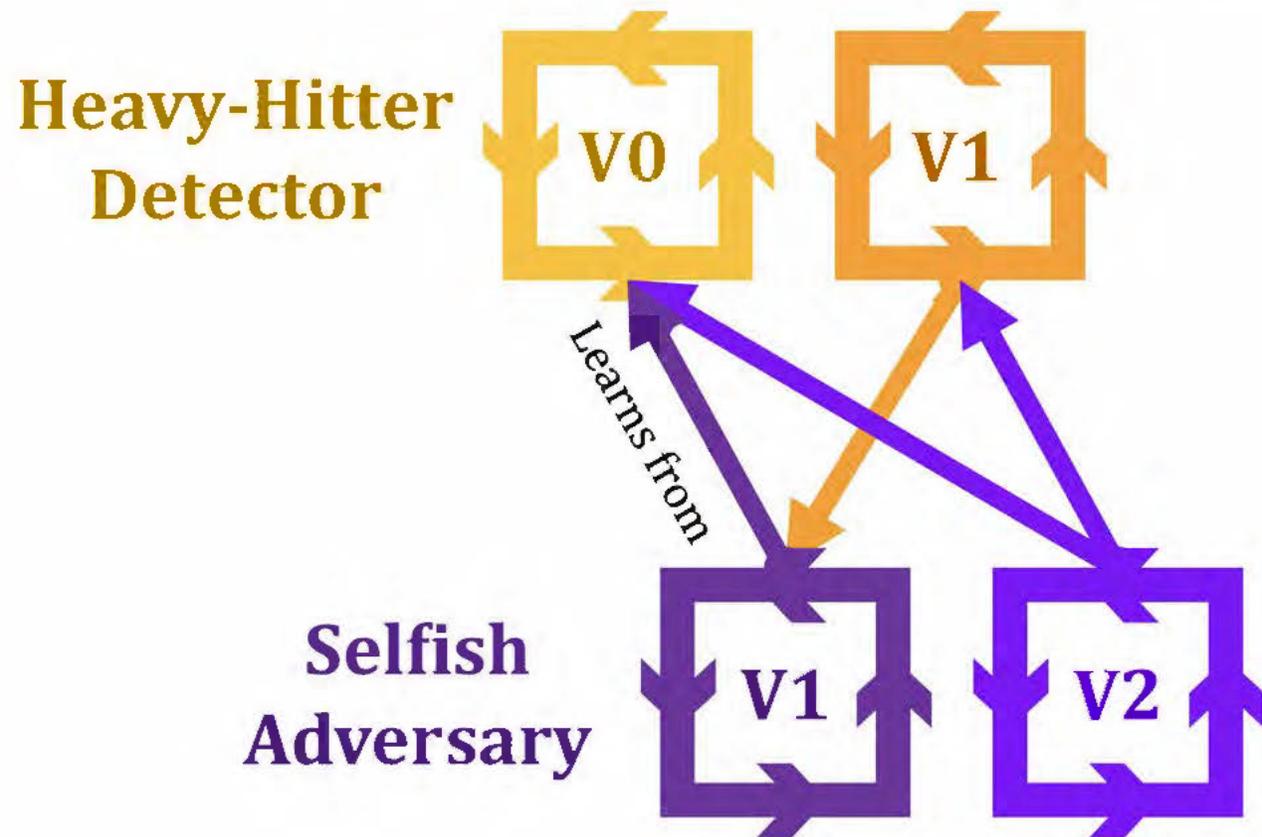
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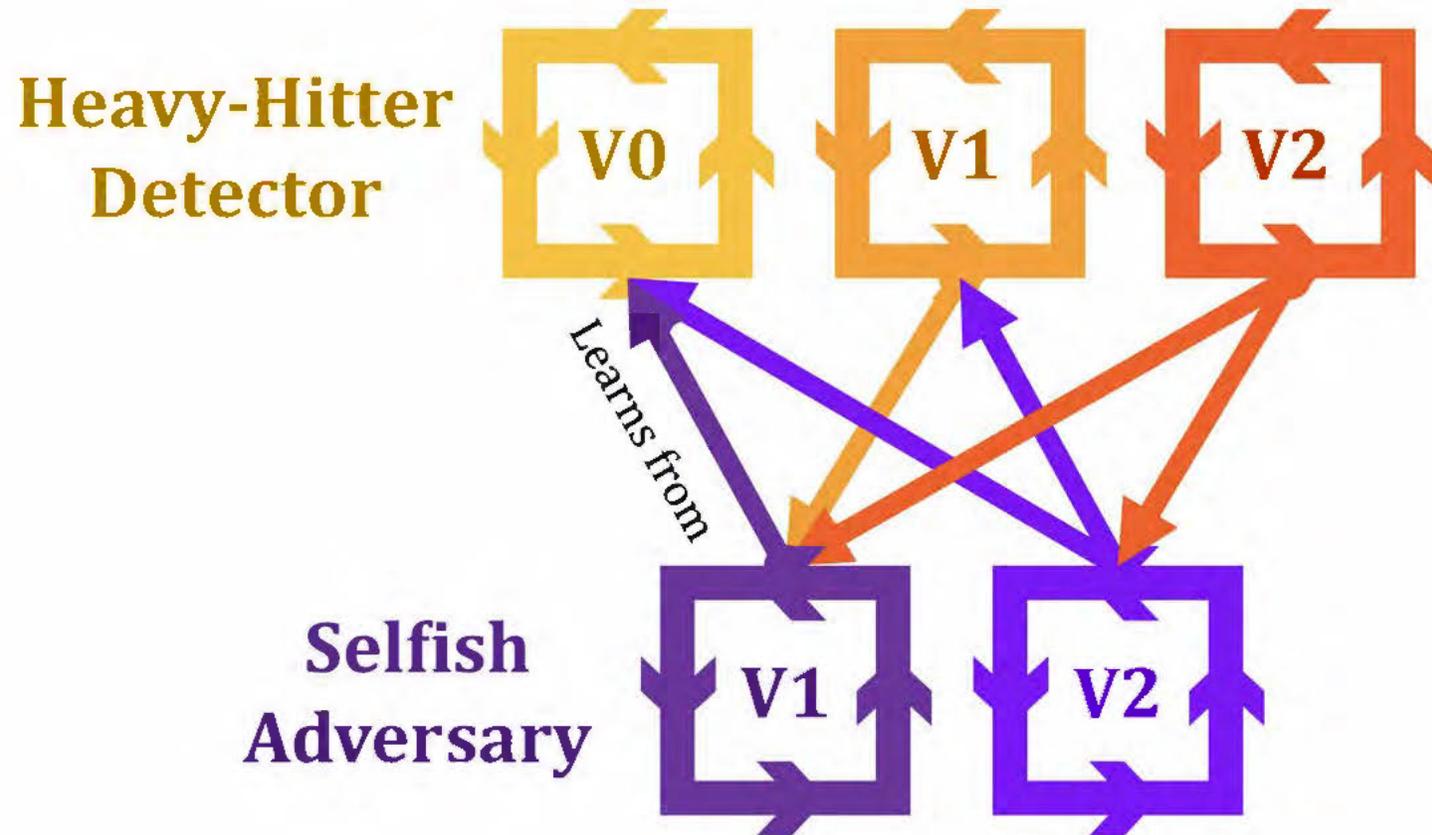
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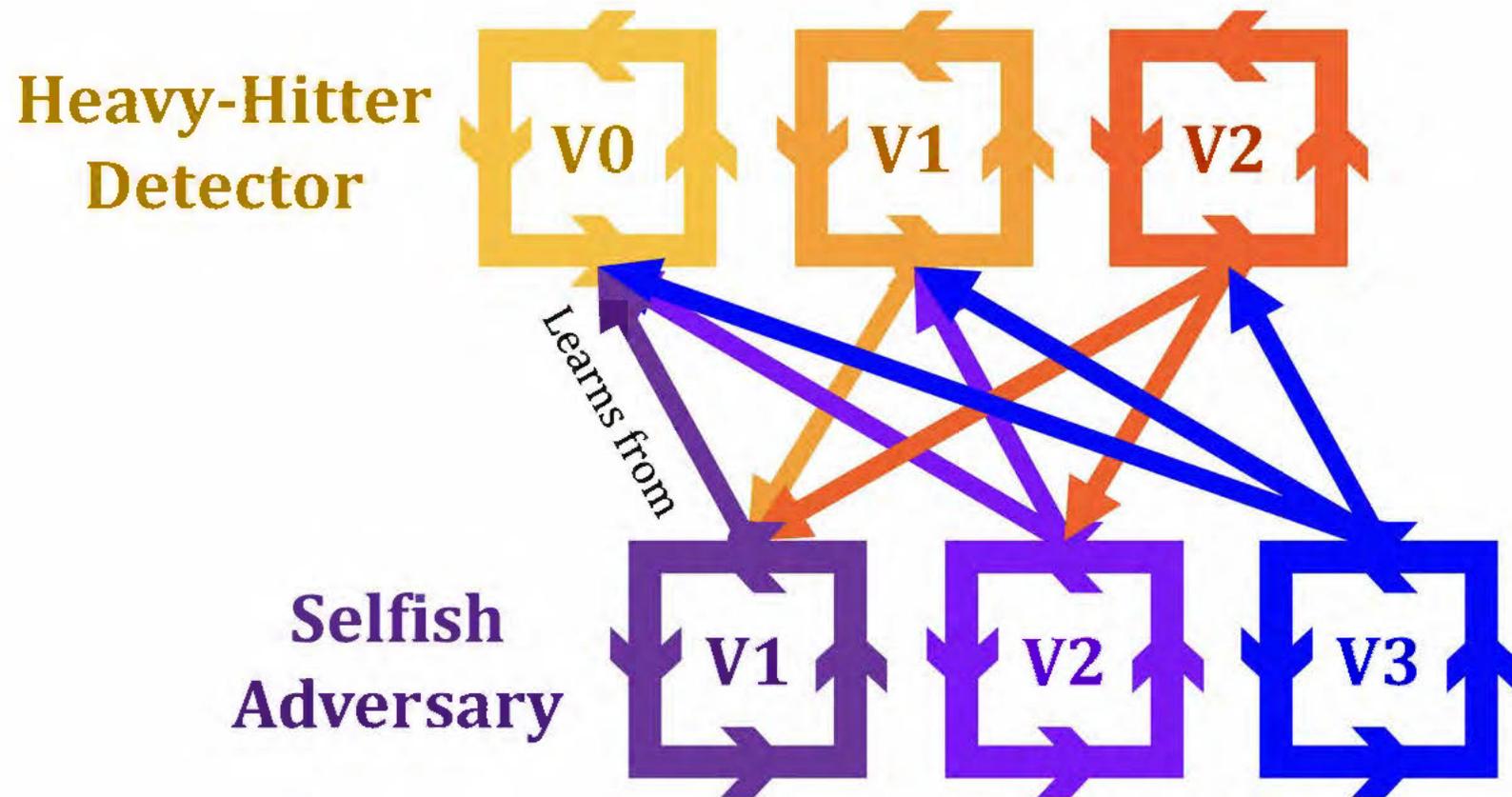
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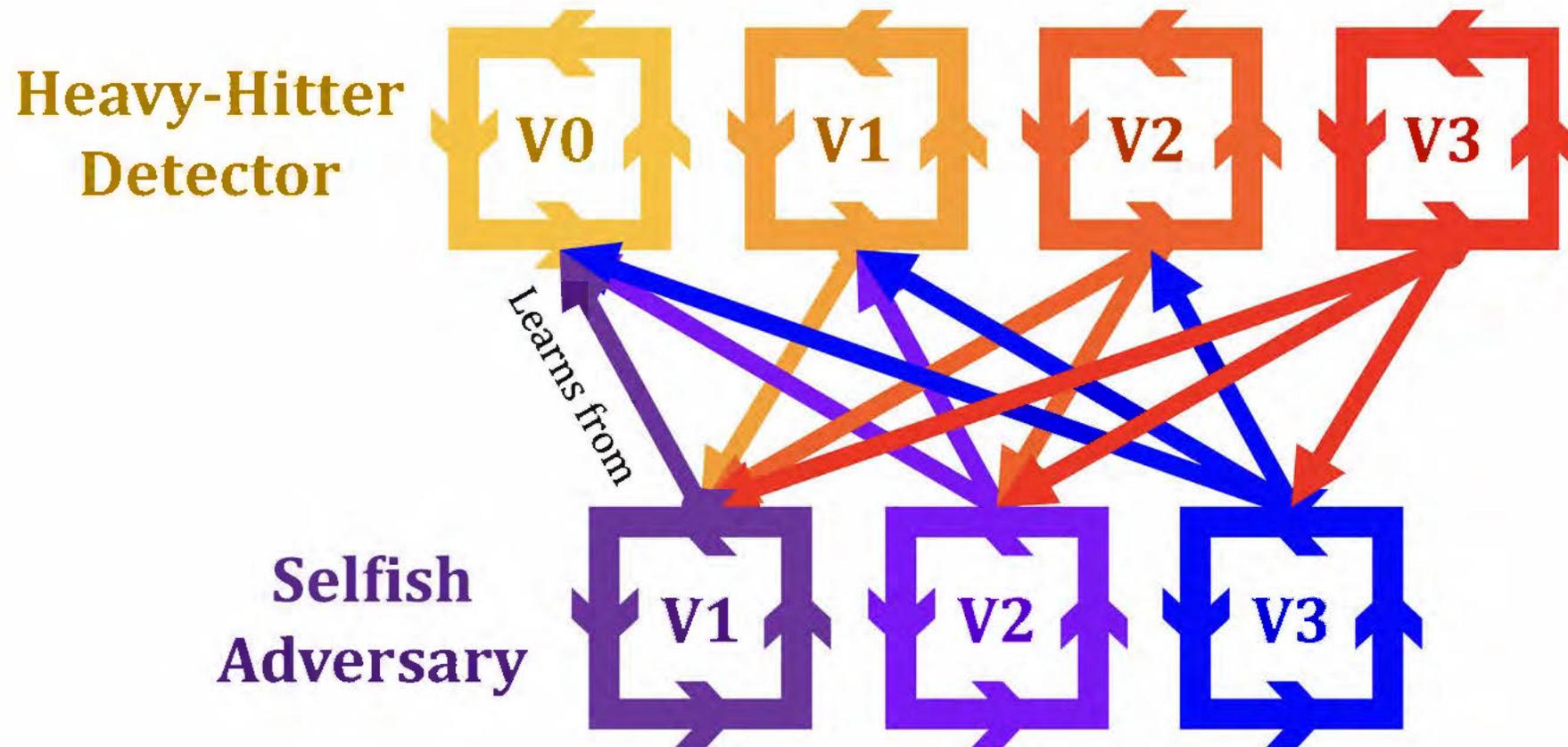
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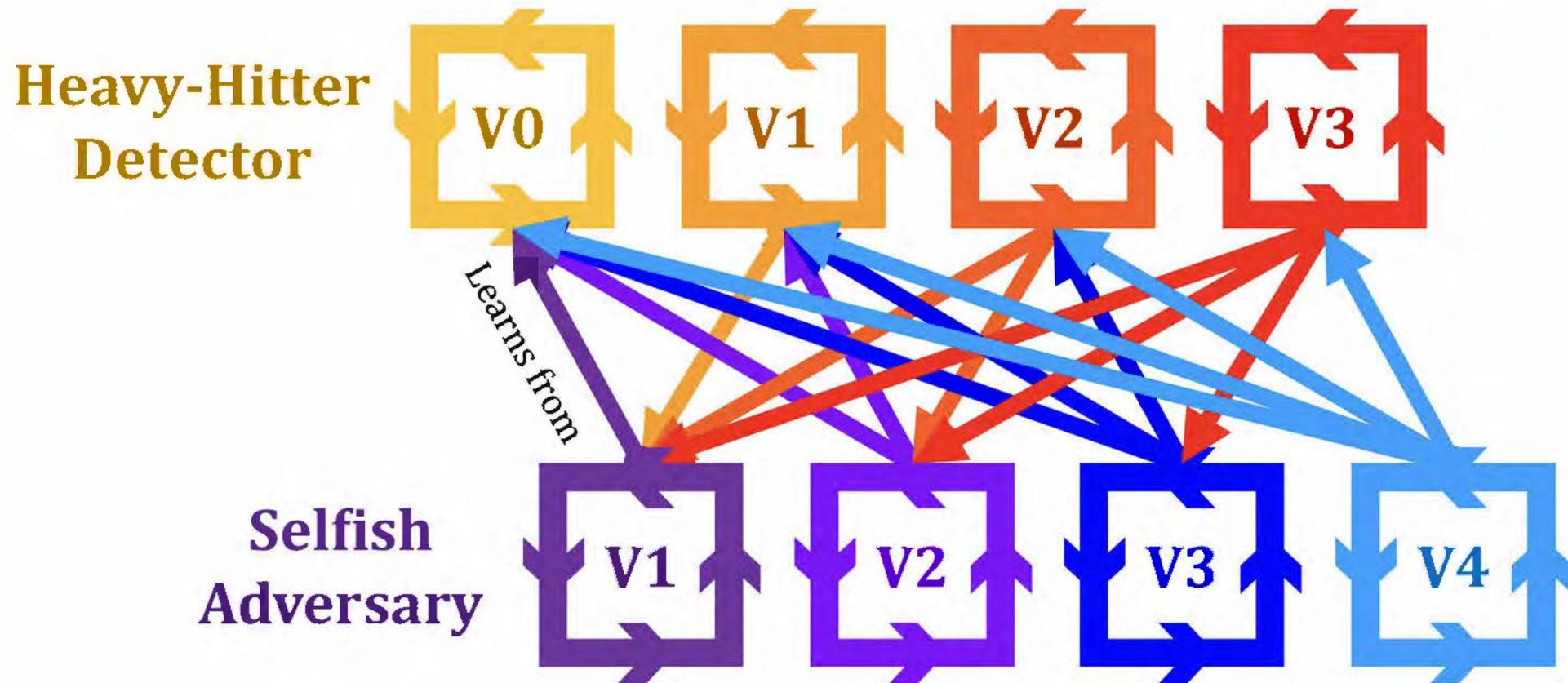
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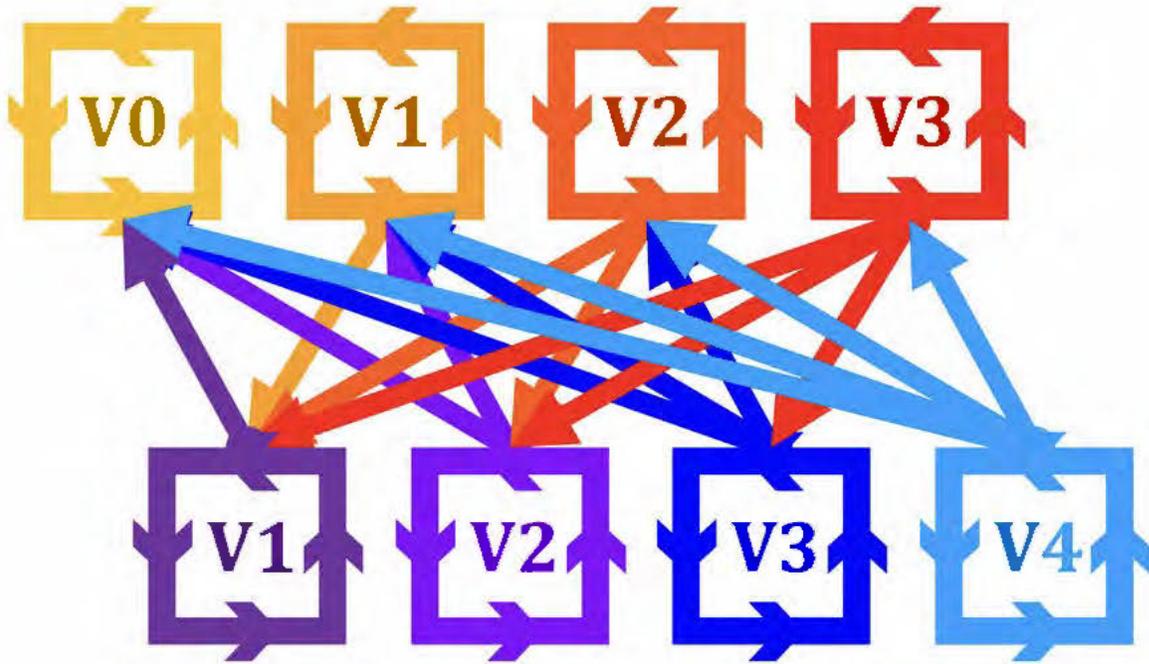
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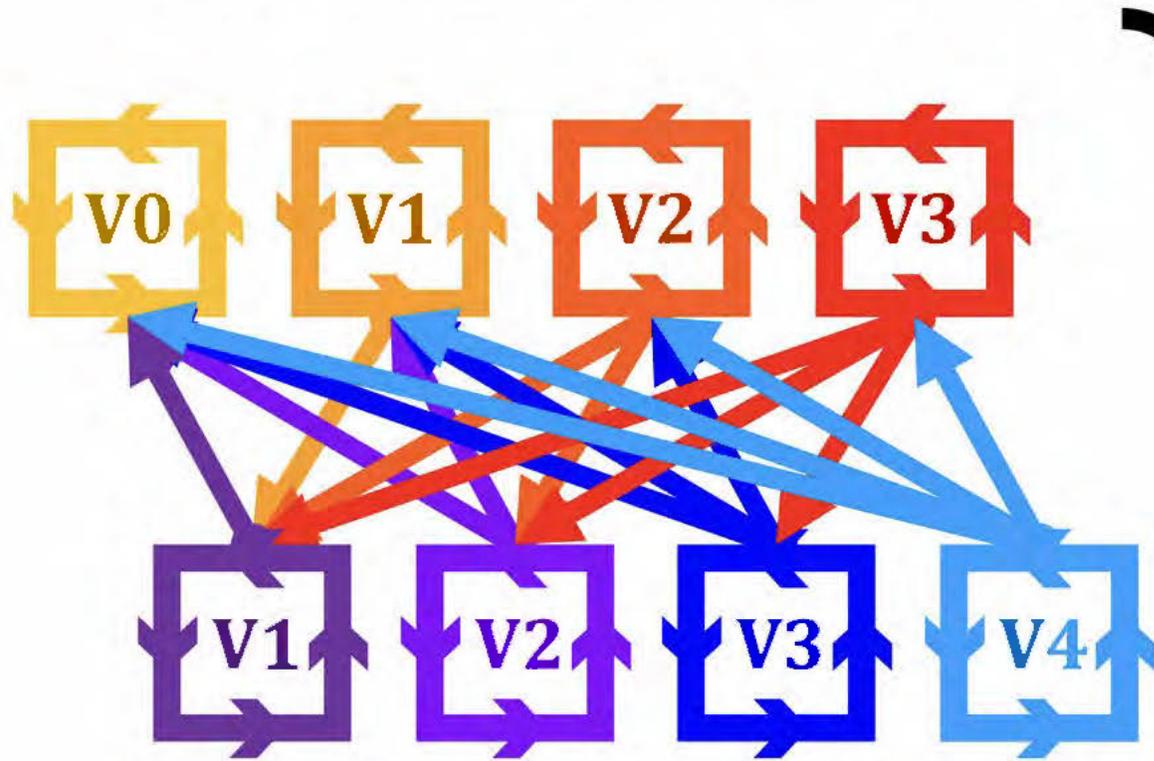
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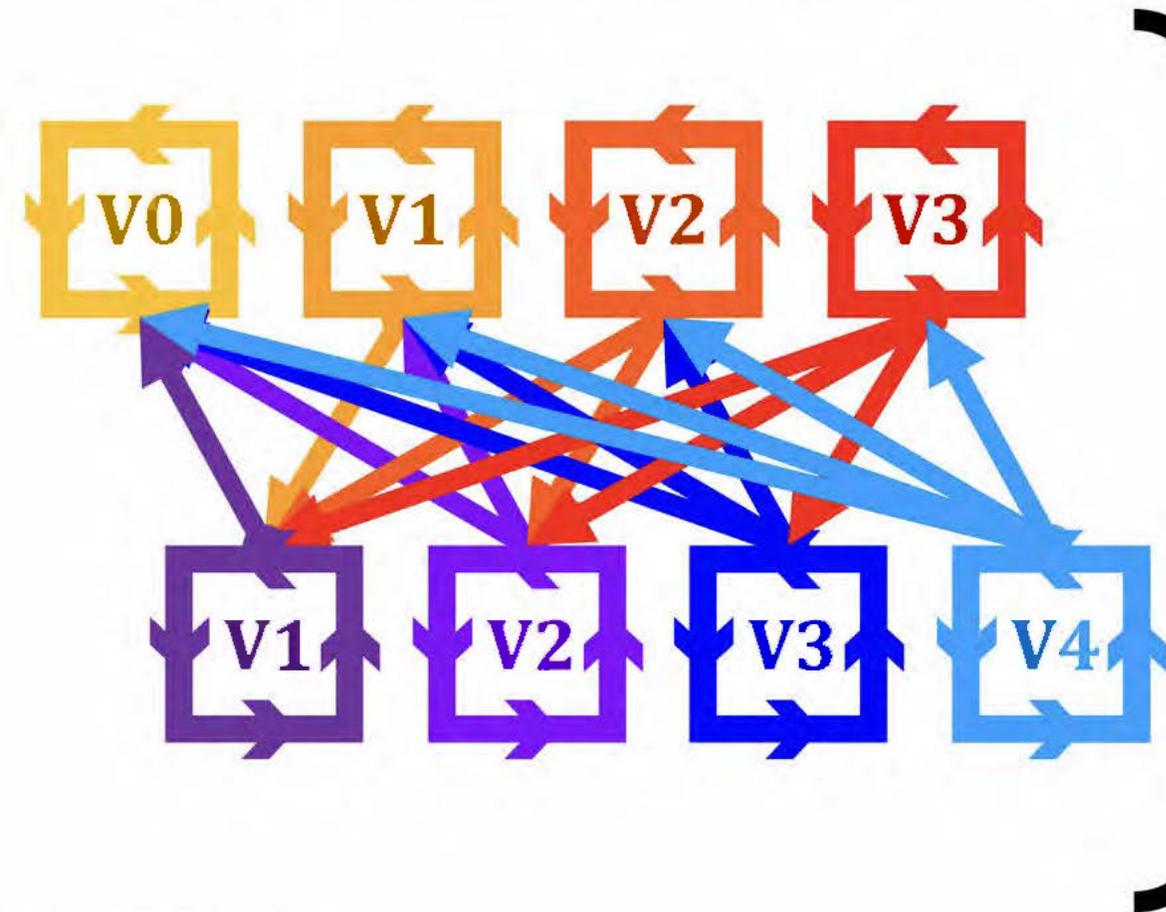
Example results (HHD = Elastic-Sketch):

Before co-training: 300% adversary overuse.

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Example results (HHD = Elastic-Sketch):

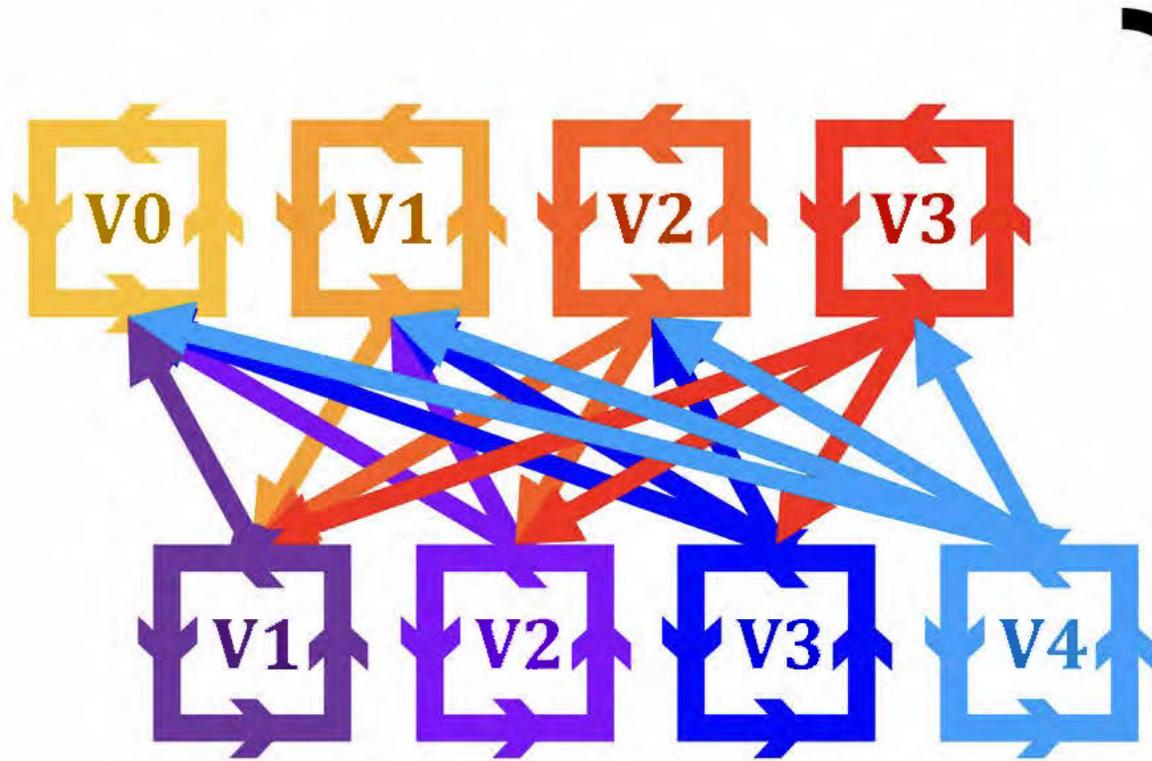
Before co-training: 300% adversary overuse.

After co-training: 139% adversary overuse.

LEARN FROM AN ADAPTIVE ADVERSARY

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Example results (HHD = Elastic-Sketch):

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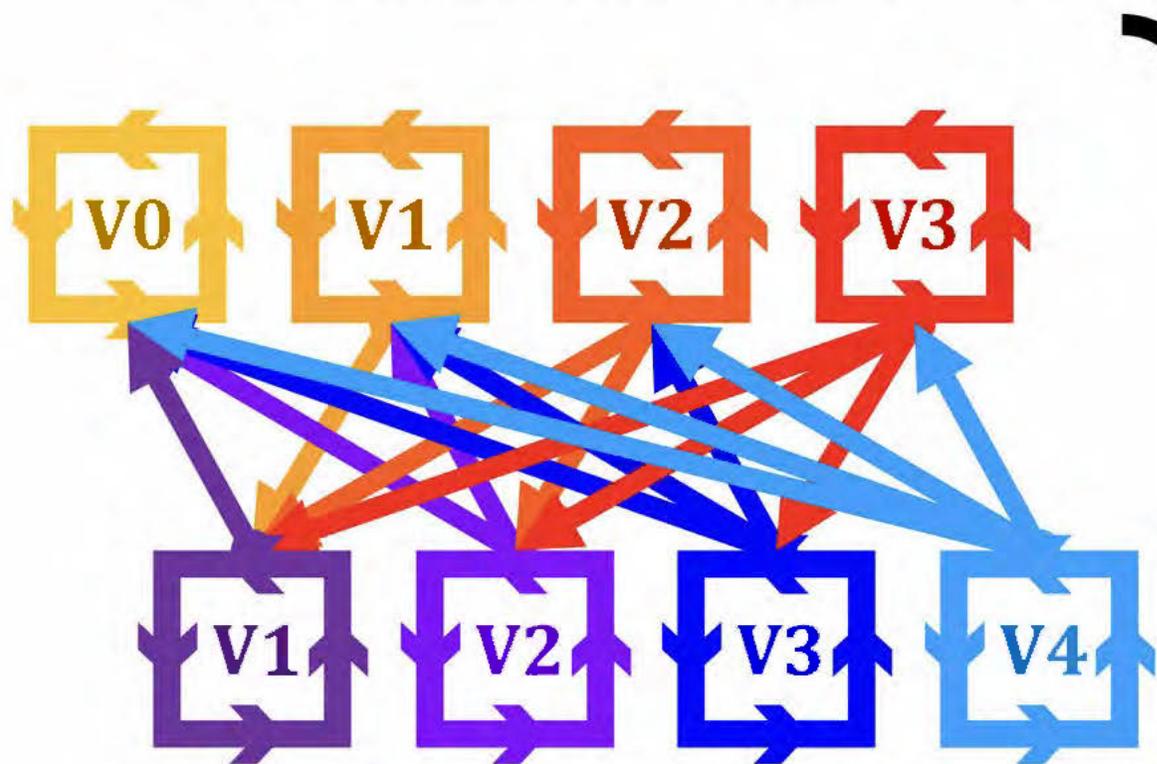
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Reduction by x2.2 “for free”.

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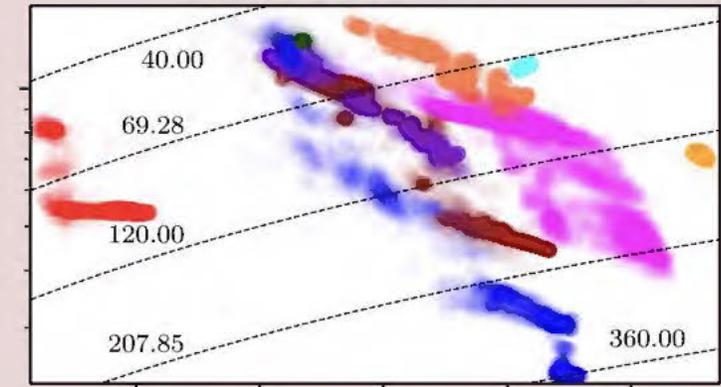
Reduction by x2.2 “for free”.

HHD score increased by x1.6 “for free”.

WHERE WE STAND

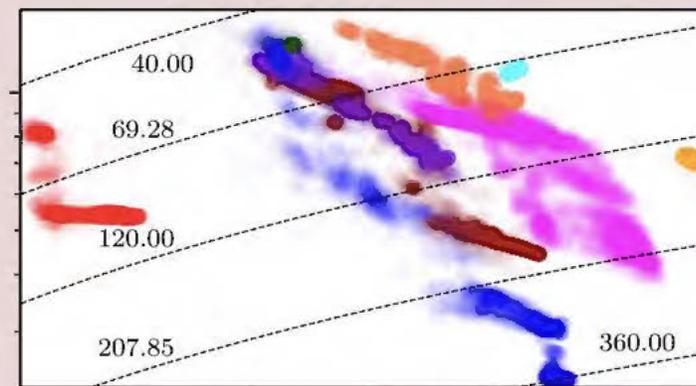
WHERE WE STAND

- 1) Shown that **adversaries can adapt** to monitoring systems.

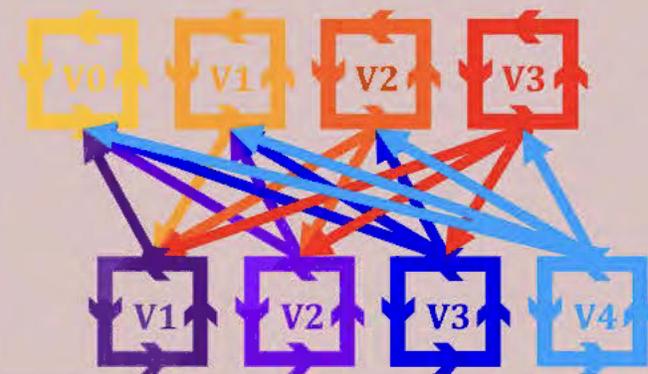


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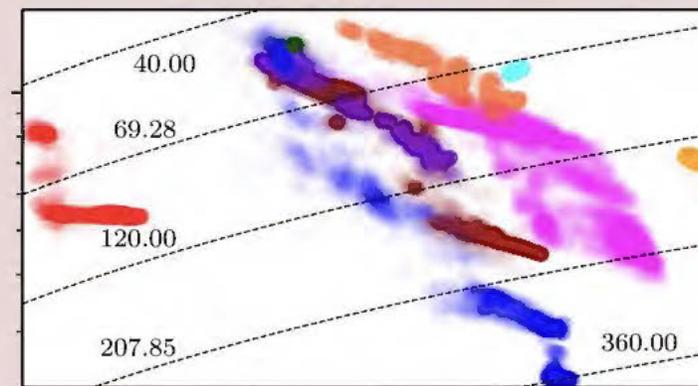


- 2) Shown that we can **prepare monitors** to **deal with any adversary**.

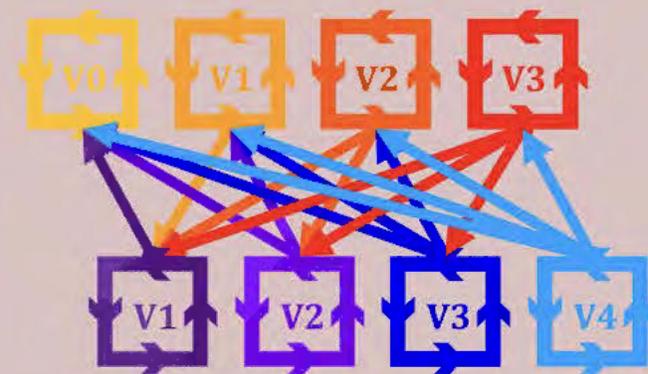


WHERE WE STAND

- 1) Shown that **adversaries can adapt** to monitoring systems.



- 2) Shown that we can **prepare monitors** to **deal with any adversary**.



- 3) Can we also **create adversaries** that can **deal with any monitor**?

THE ROADBLOCK

THE ROADBLOCK

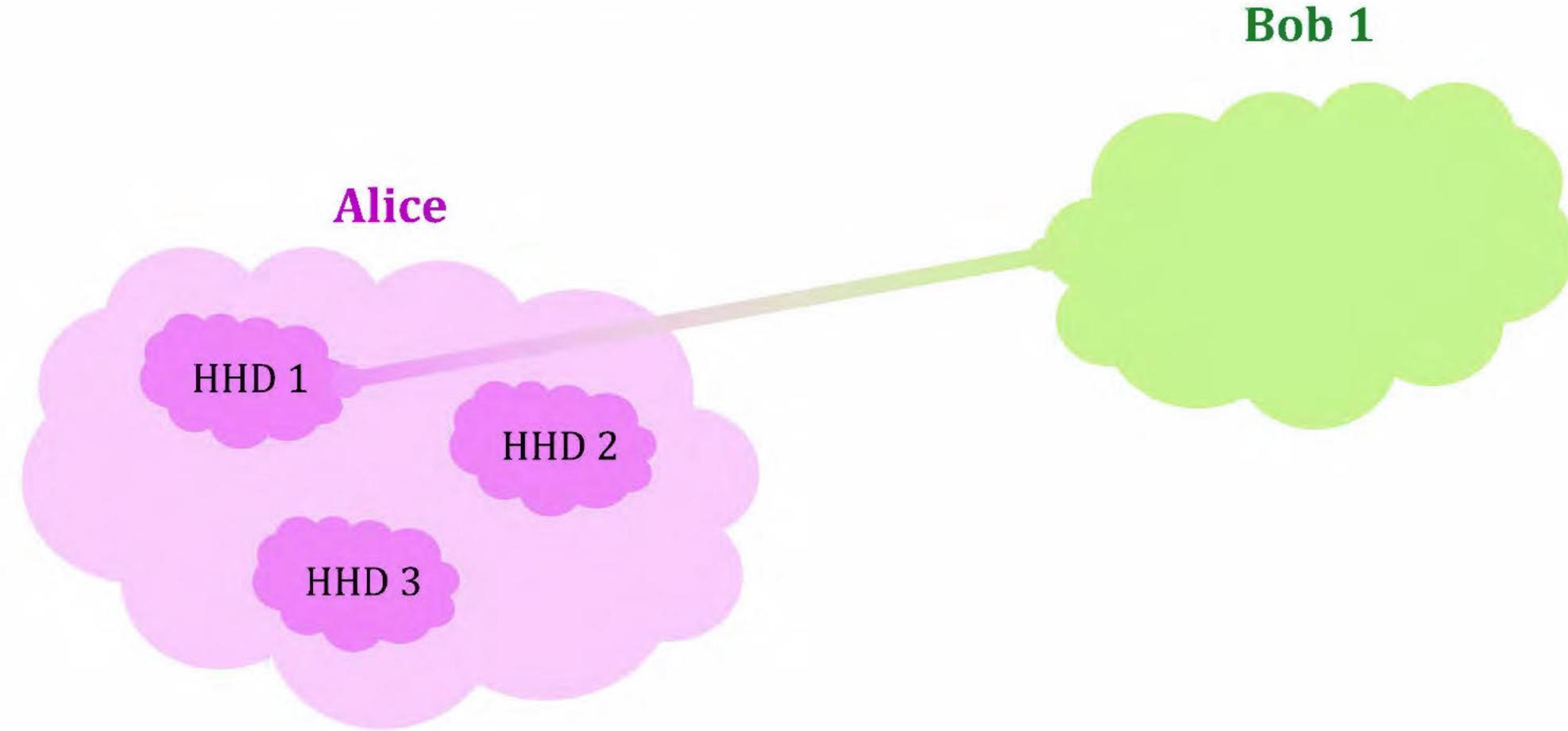
Alice

HHD 1

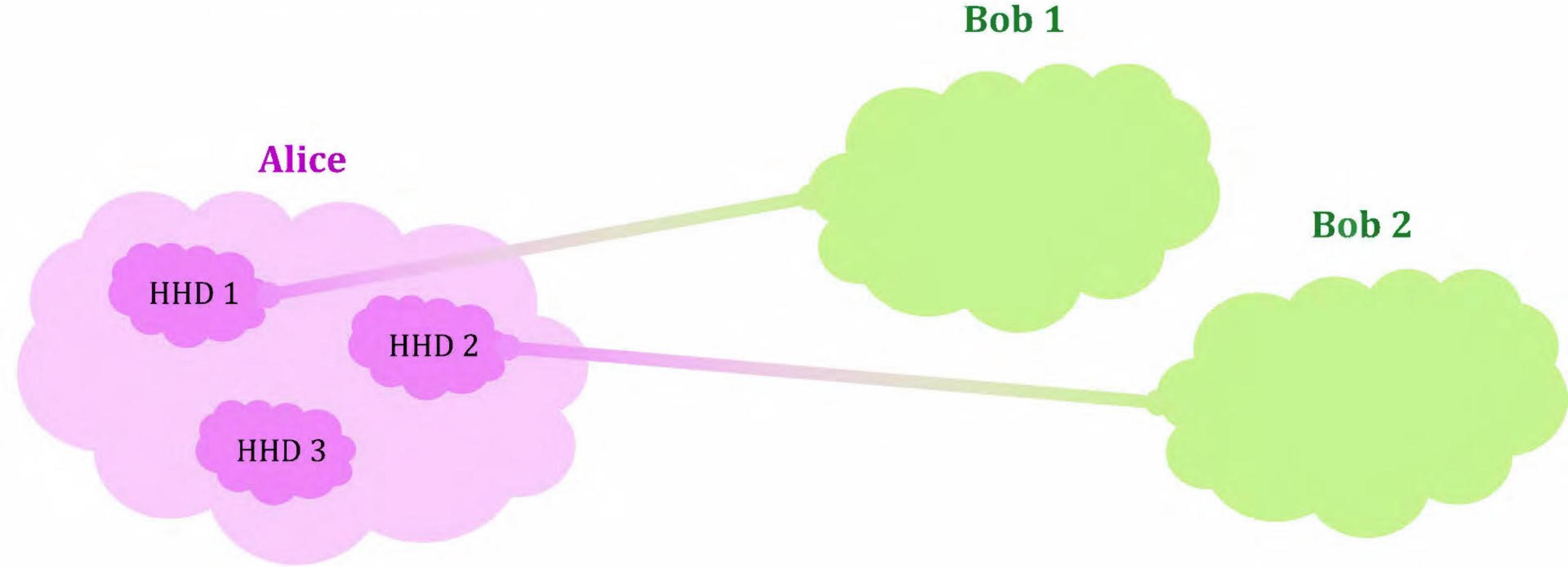
HHD 2

HHD 3

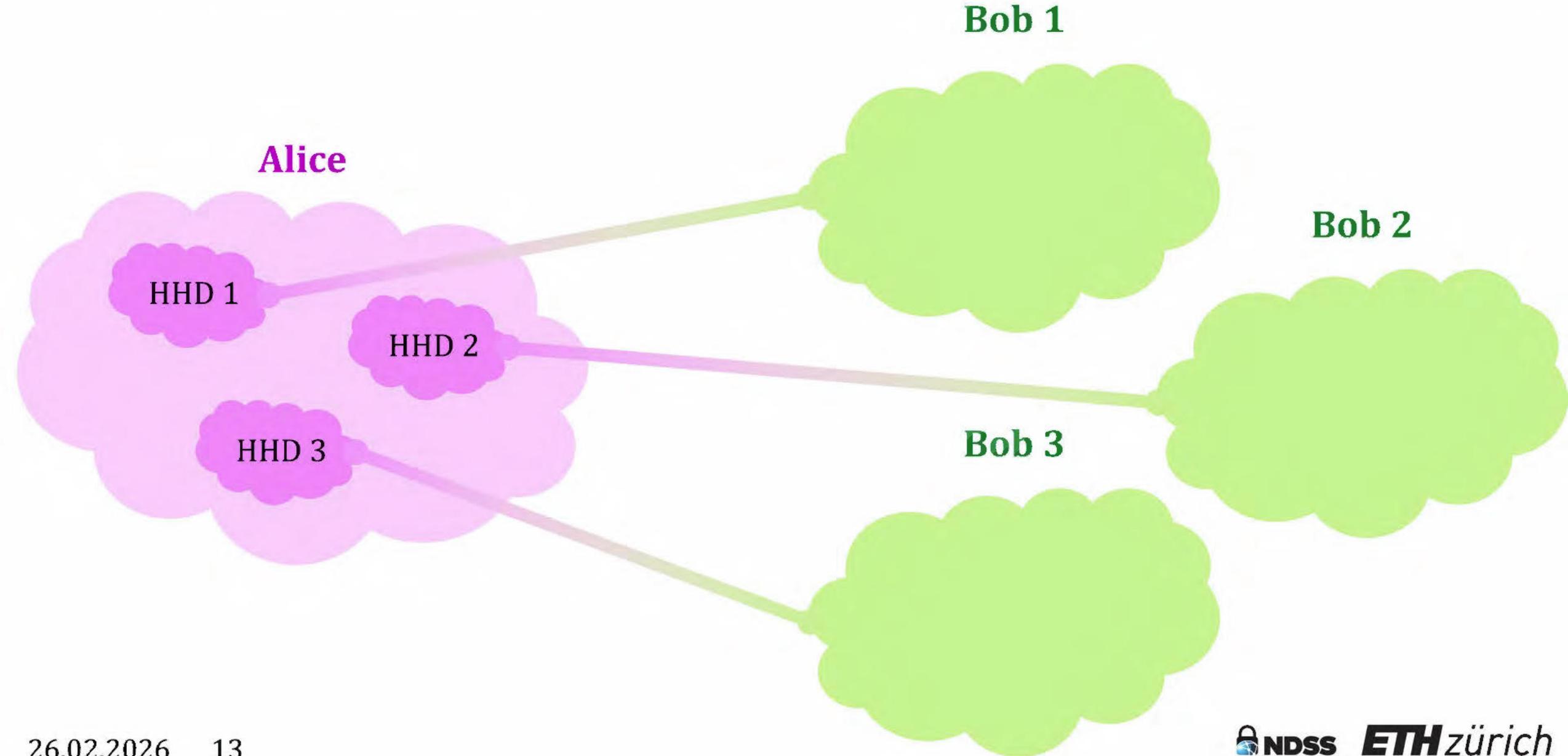
THE ROADBLOCK



THE ROADBLOCK



THE ROADBLOCK



THE ROADBLOCK

Alice

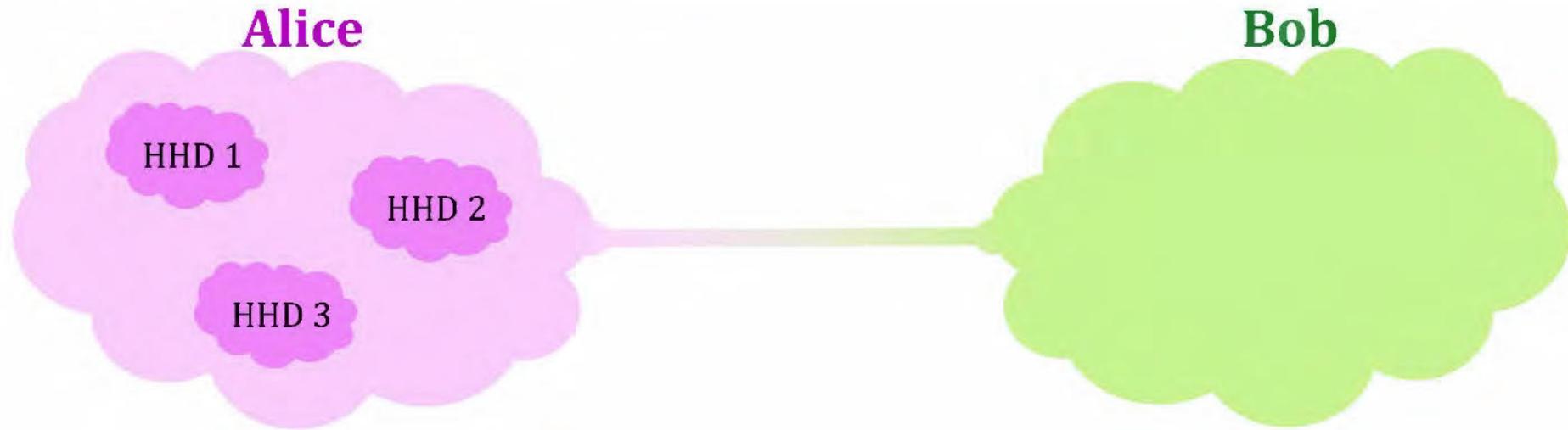
HHD 1

HHD 2

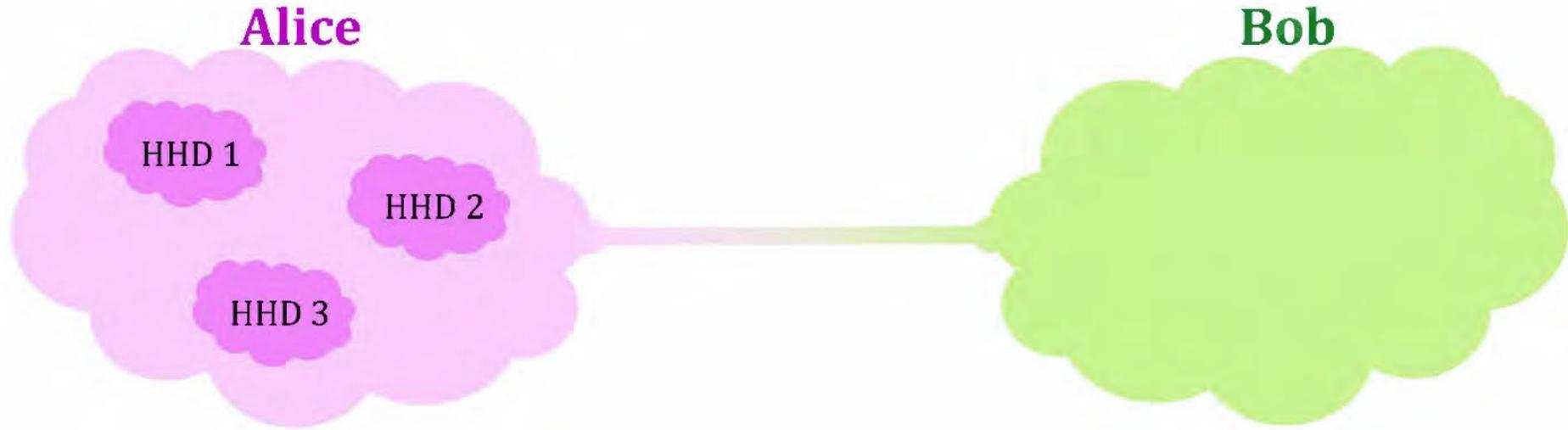
HHD 3

Bob

ZERO-SHOT ATTACKS



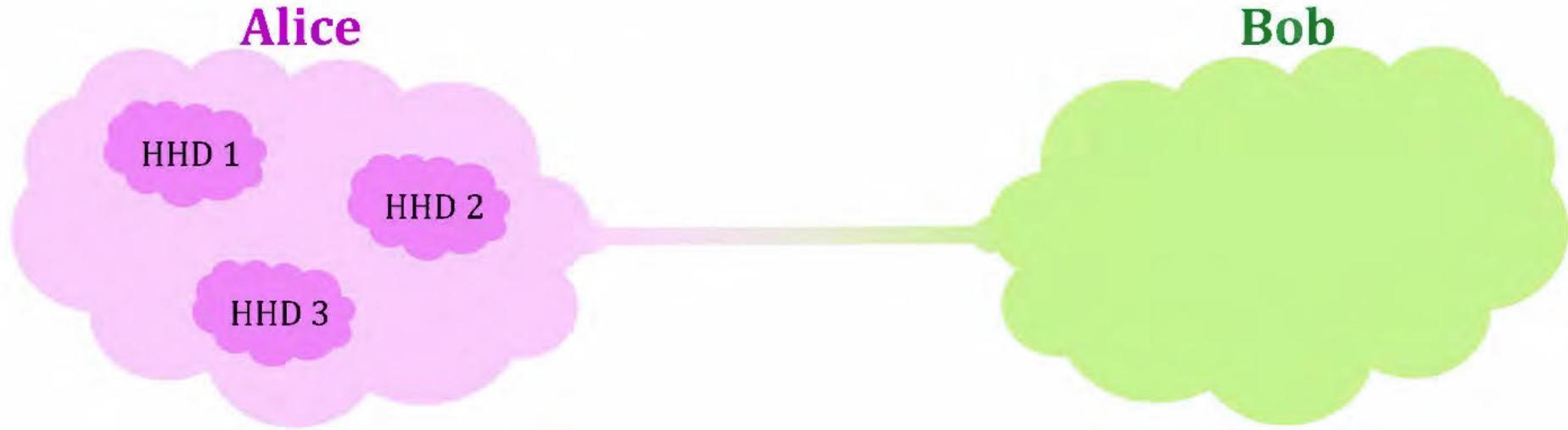
ZERO-SHOT ATTACKS



Step 1: More Flexibility



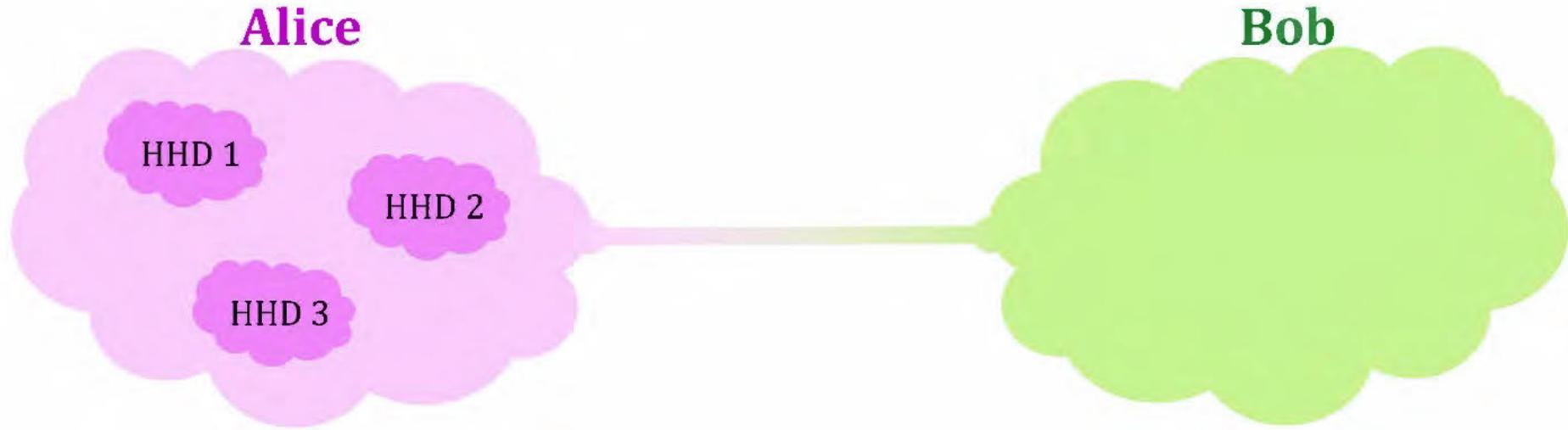
ZERO-SHOT ATTACKS



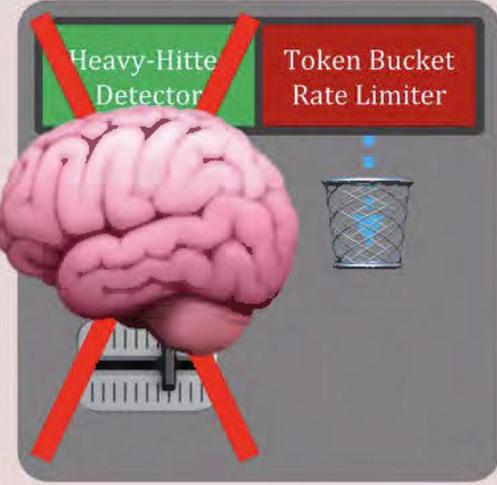
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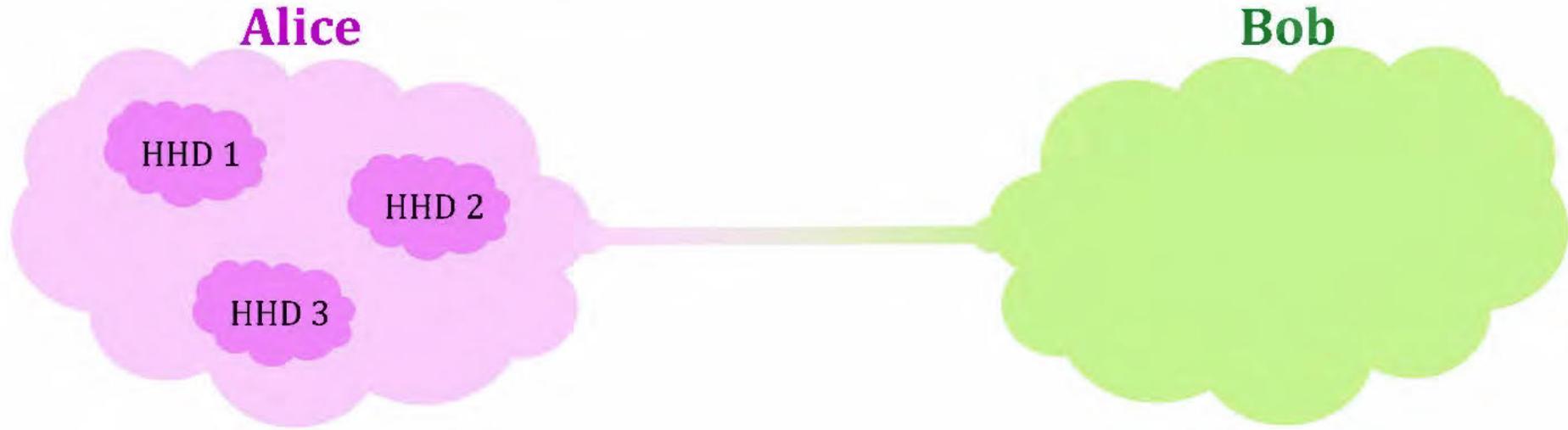
ZERO-SHOT ATTACKS



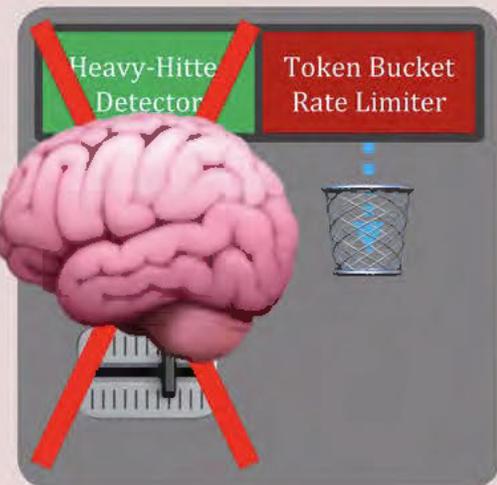
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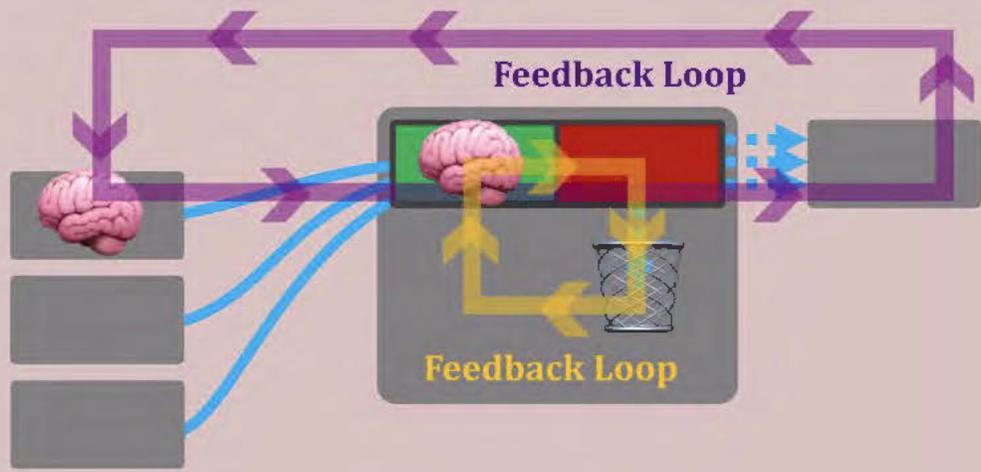
ZERO-SHOT ATTACKS



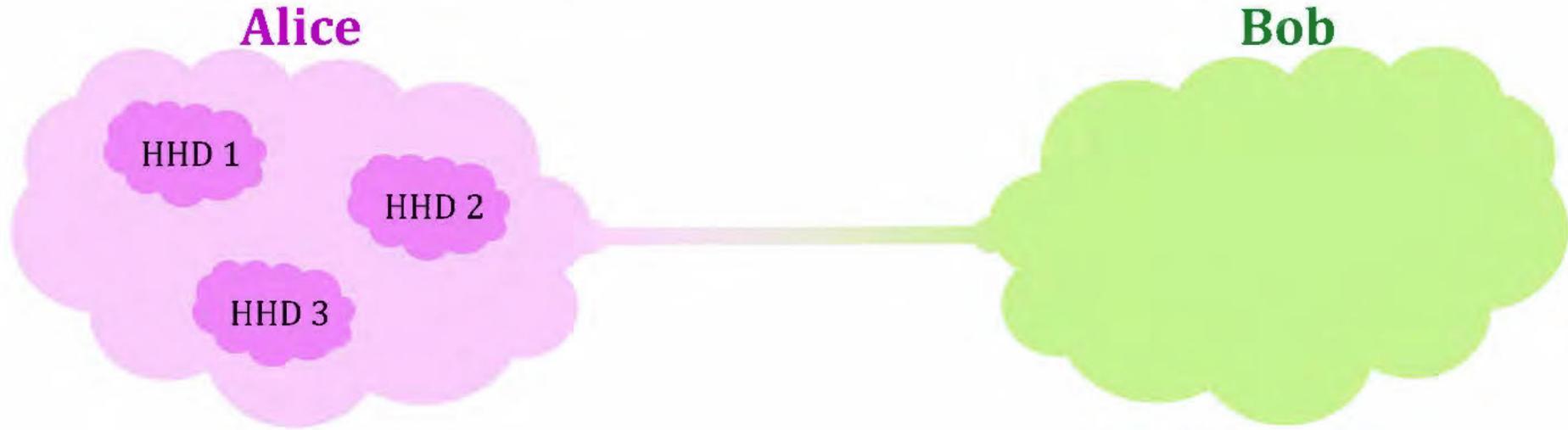
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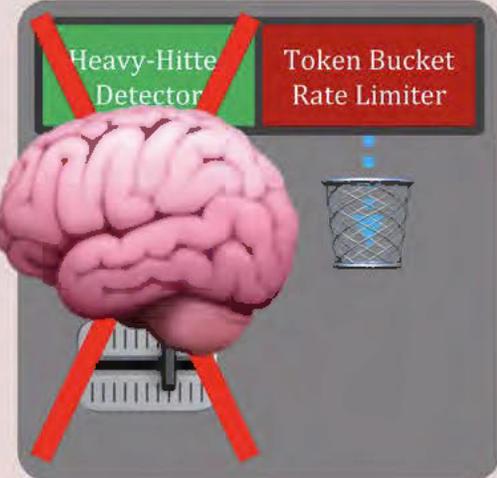
Step 2: Adversarial Co-Training



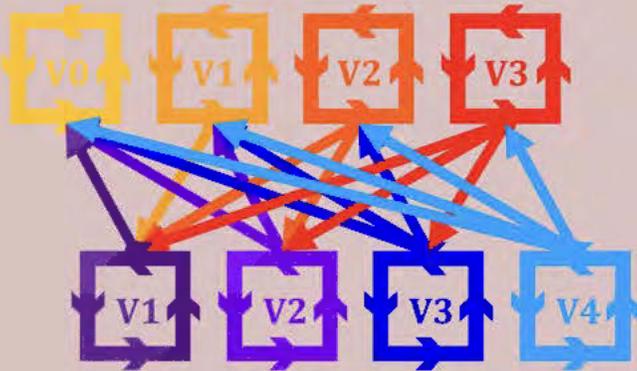
ZERO-SHOT ATTACKS



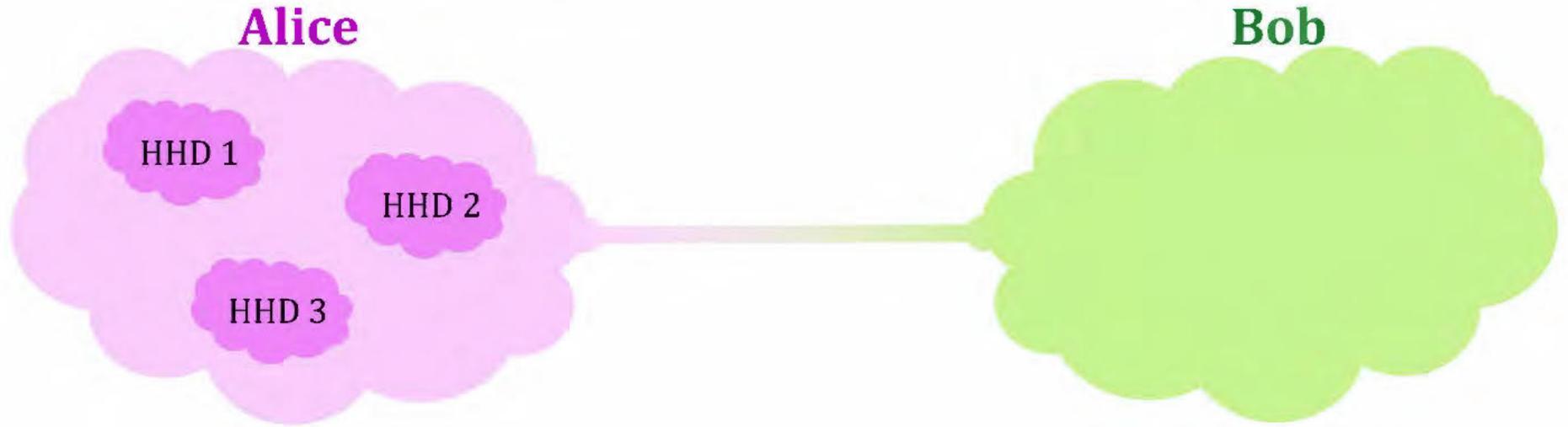
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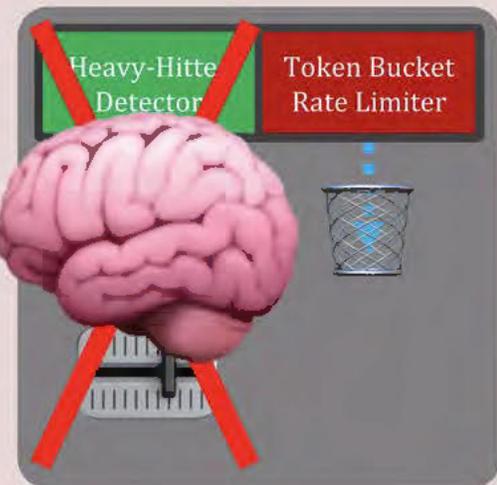
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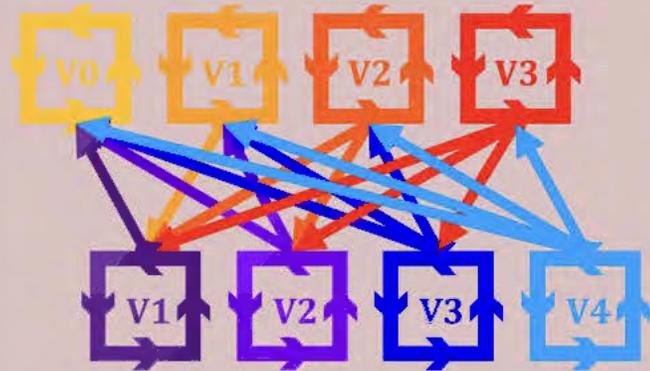
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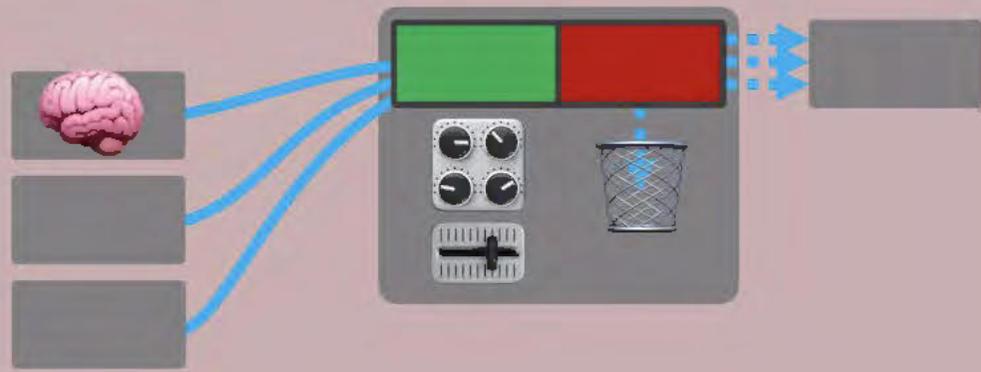
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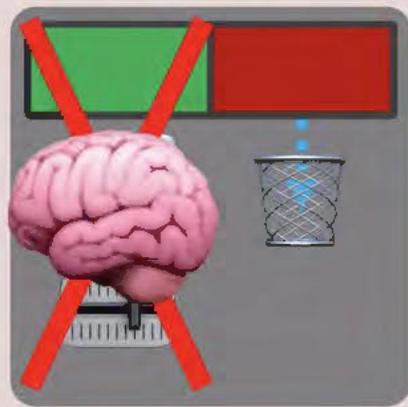


Step 3: Evaluate against HHDs

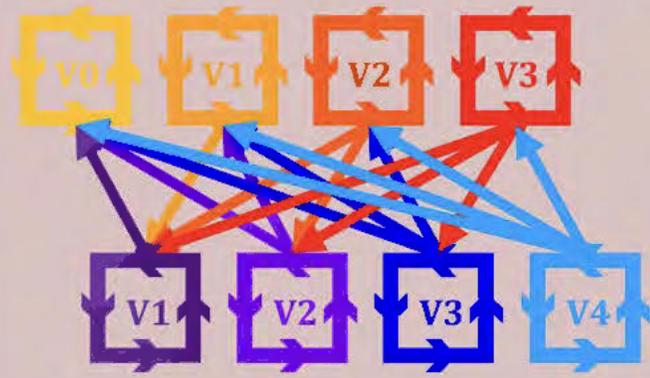


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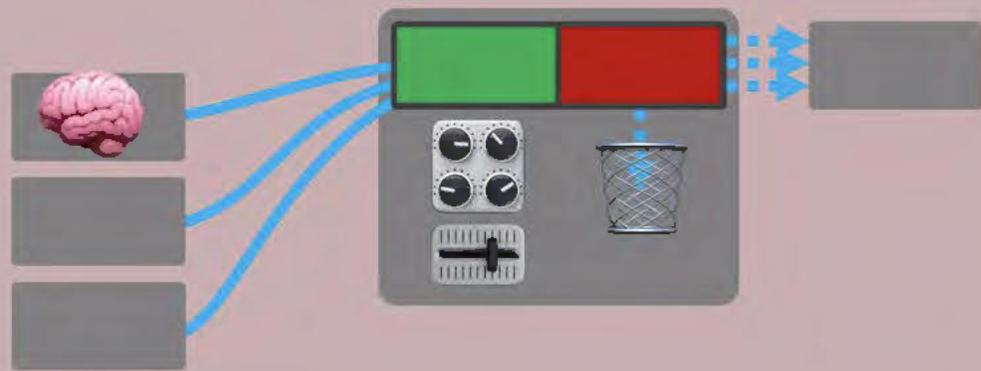
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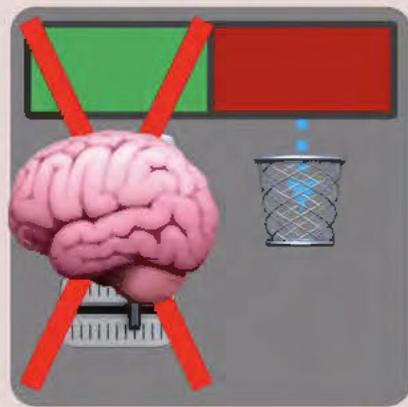


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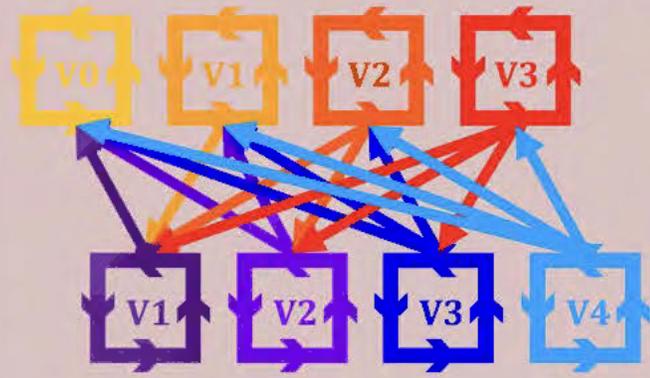


ZERO-SHOT ATTACKS

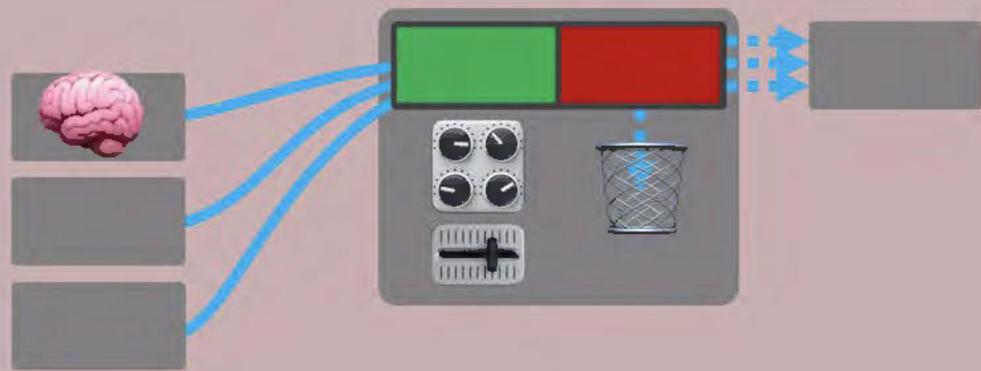
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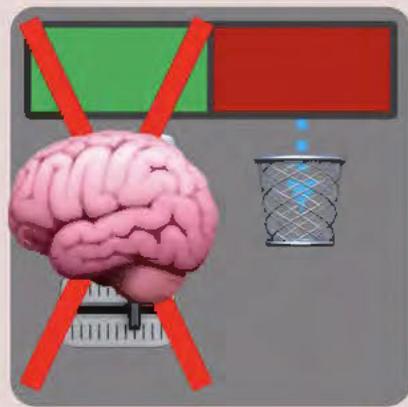
Evaluated for 9 different heavy-hitter detectors

	AL	CB	CM	ES	HK	MG	SS	CH	HP
Synthetic traffic	50%	82%	113%	117%	-20%	27%	58%	86%	38%
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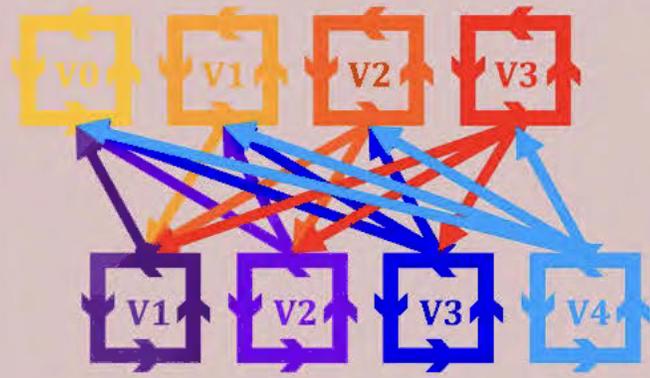
Adversary Overuse

ZERO-SHOT ATTACKS

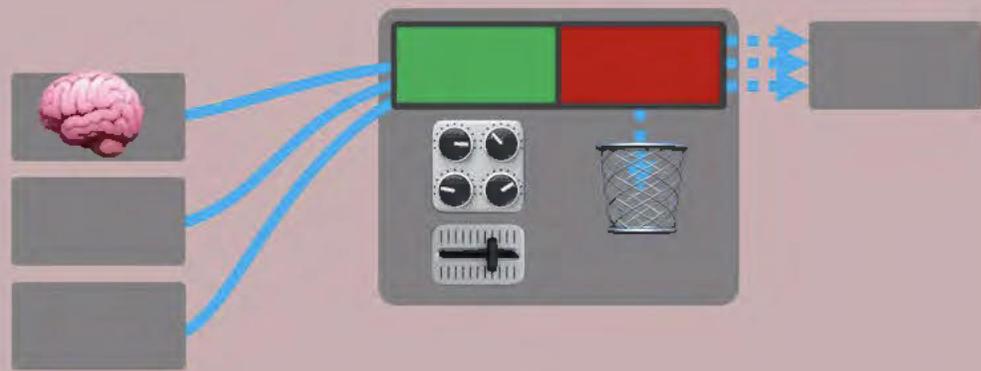
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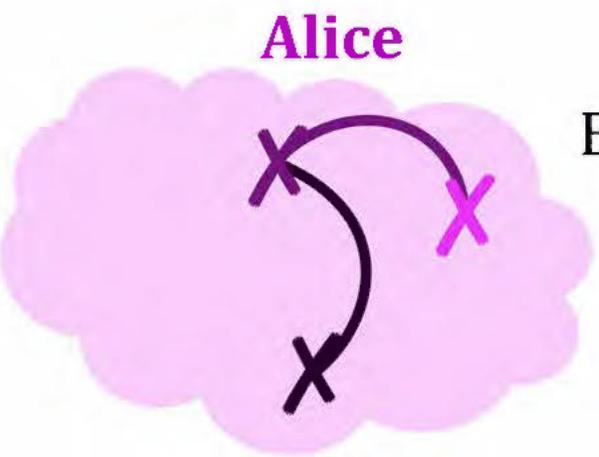


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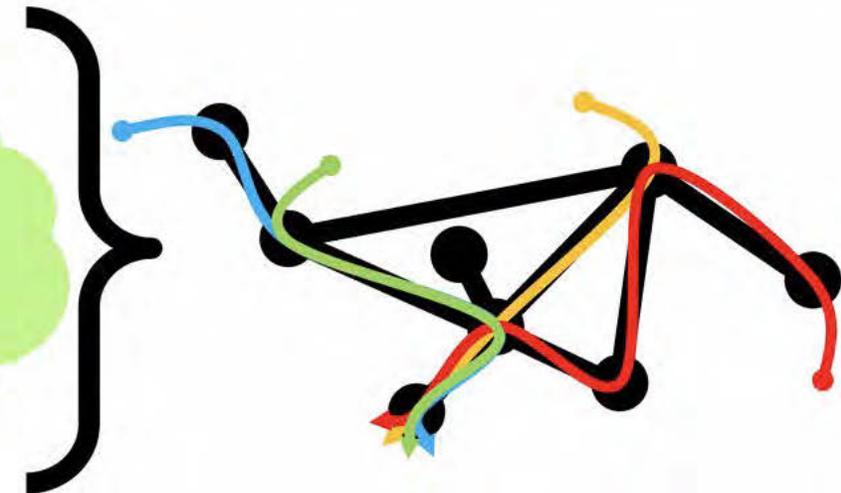
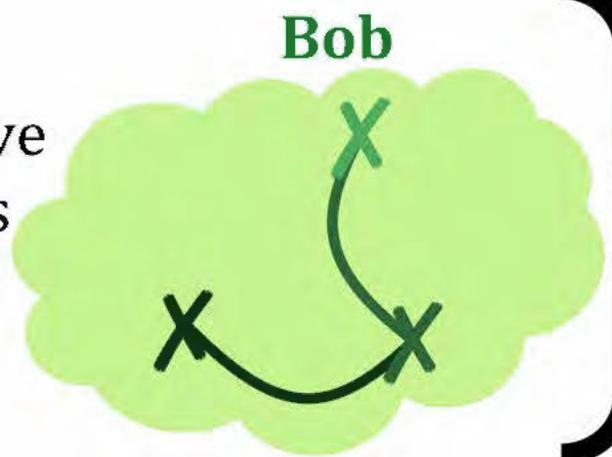
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Synthetic traffic	50%	82%	113%	117%	-20%	27%	58%	86%	38%	8/9
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Adversary Overuse

CONCLUSIONS

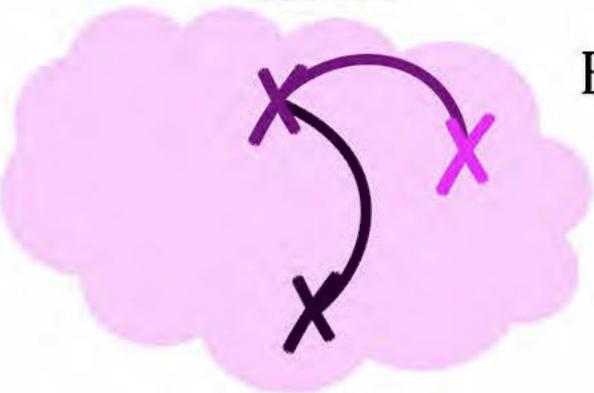


Evaluate and improve heuristic strategies



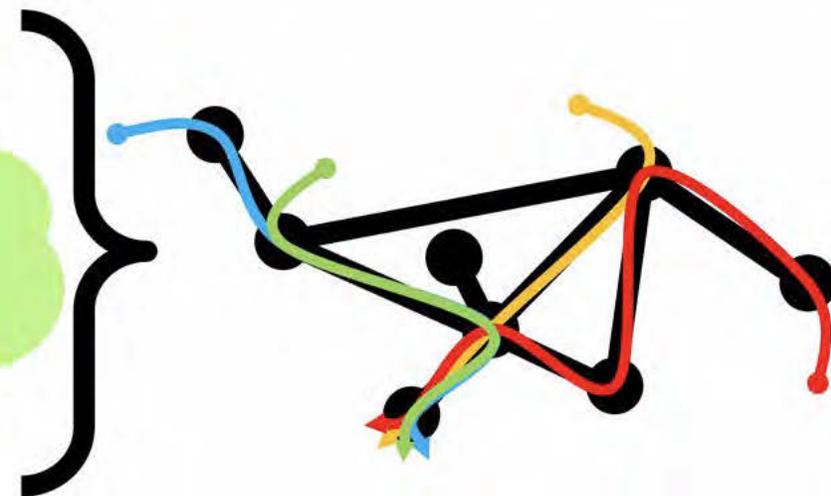
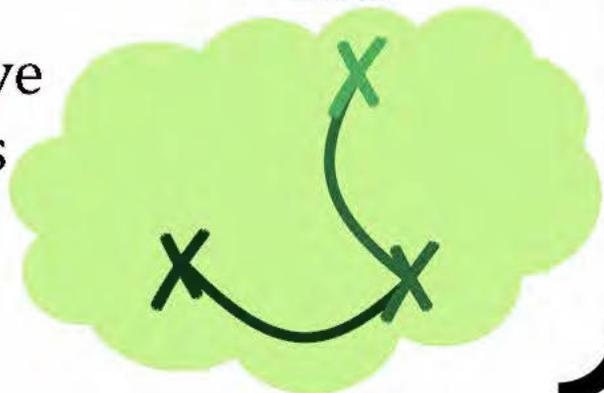
CONCLUSIONS

Alice



Evaluate and improve
heuristic strategies

Bob



- 1) Works with label-free data or no data at all

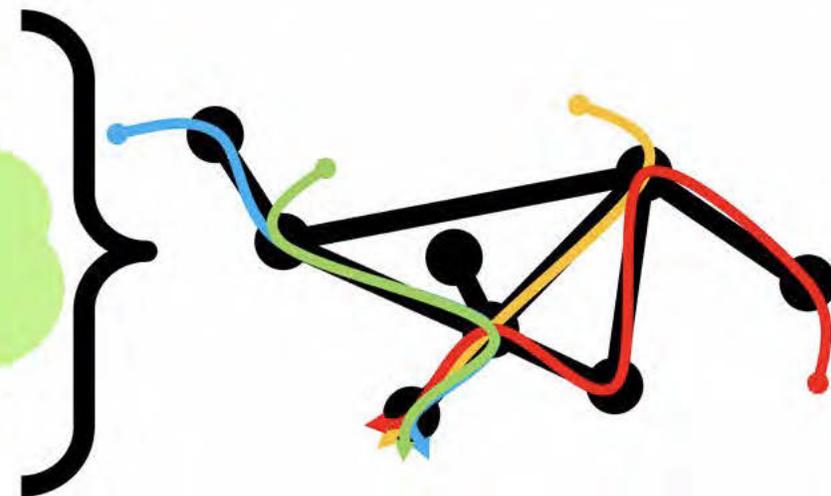
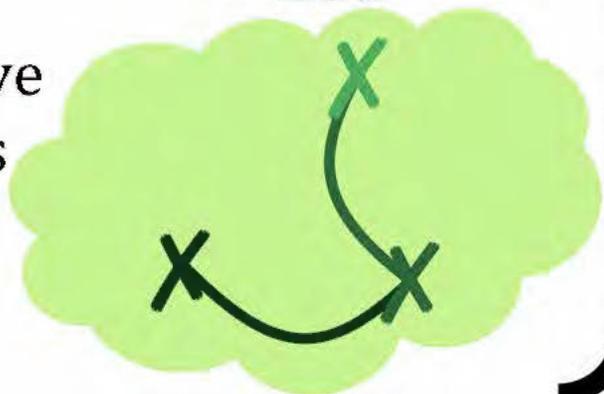
CONCLUSIONS

Alice



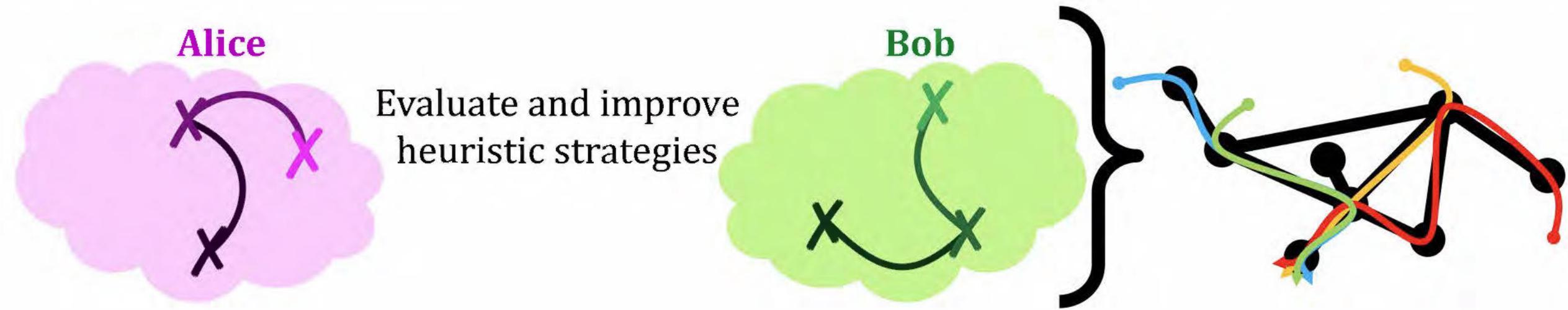
Evaluate and improve
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Bob



- 1) Works with label-free data or no data at all
- 2) Core ideas can be applied to other scenarios

CONCLUSIONS



- 1) Works with label-free data or no data at all
- 2) Core ideas can be applied to other scenarios
- 3) Code and framework is available online