

# Automated Black-box Verification of Networking Systems



Alexandra Silva



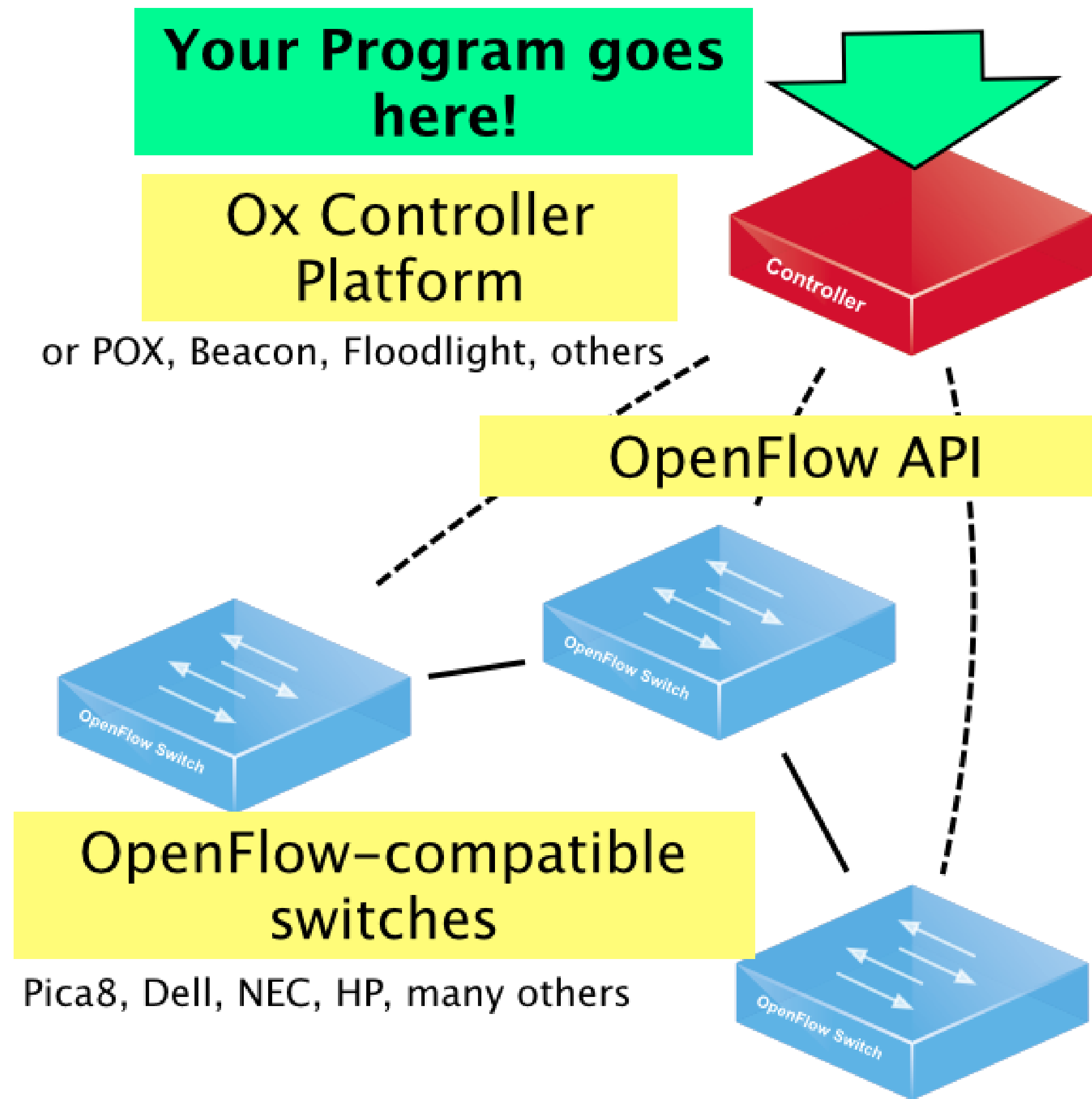
**Matteo Sammartino**

UCL & VeTSS



Stefan Zetsche

# Software-Defined Networks



# Verification of networks

## Trend in PL&Verification after Software-Defined Networks

- Design *high-level languages* that model essential network features
- Develop *semantics* that enables reasoning precisely about behaviour
- Build *tools* to synthesise low-level implementations automatically

- ❖ Frenetic [Foster & al., ICFP 11]
- ❖ Pyretic [Monsanto & al., NSDI 13]
- ❖ Maple [Voellmy & al., SIGCOMM 13]
- ❖ FlowLog [Nelson & al., NSDI 14]
- ❖ Header Space Analysis [Kazemian & al., NSDI 12]
- ❖ VeriFlow [Khurshid & al., NSDI 13]
- ❖ NetKAT [Anderson & al., POPL 14]
- ❖ and many others . . .

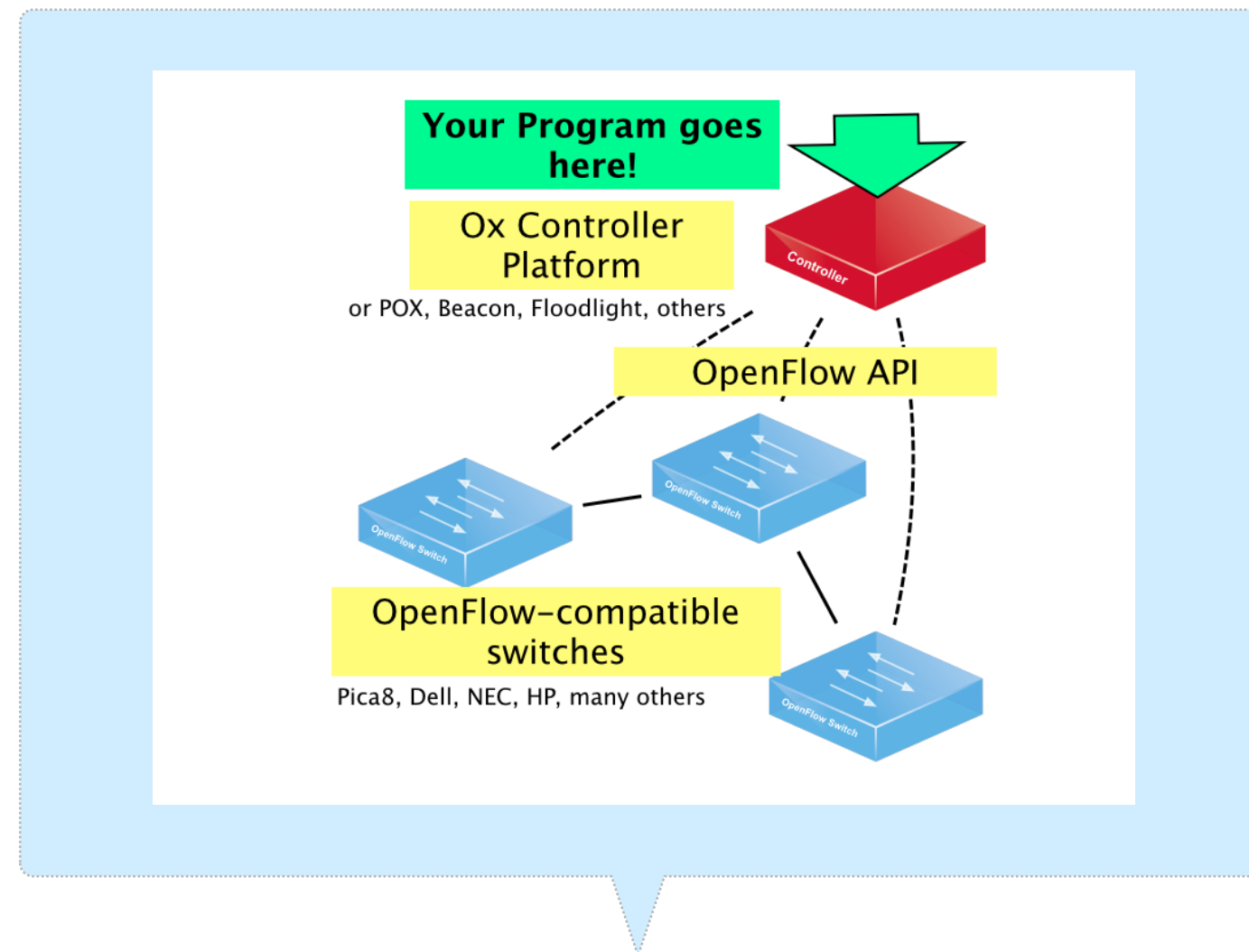
This is all very nice but..

*What if there is no formal model?*

*Does the low-level implementation really do  
what it is supposed to do?*



# What we propose



**Build black-box model via interactions with the system**

**Automated  
Modelling**

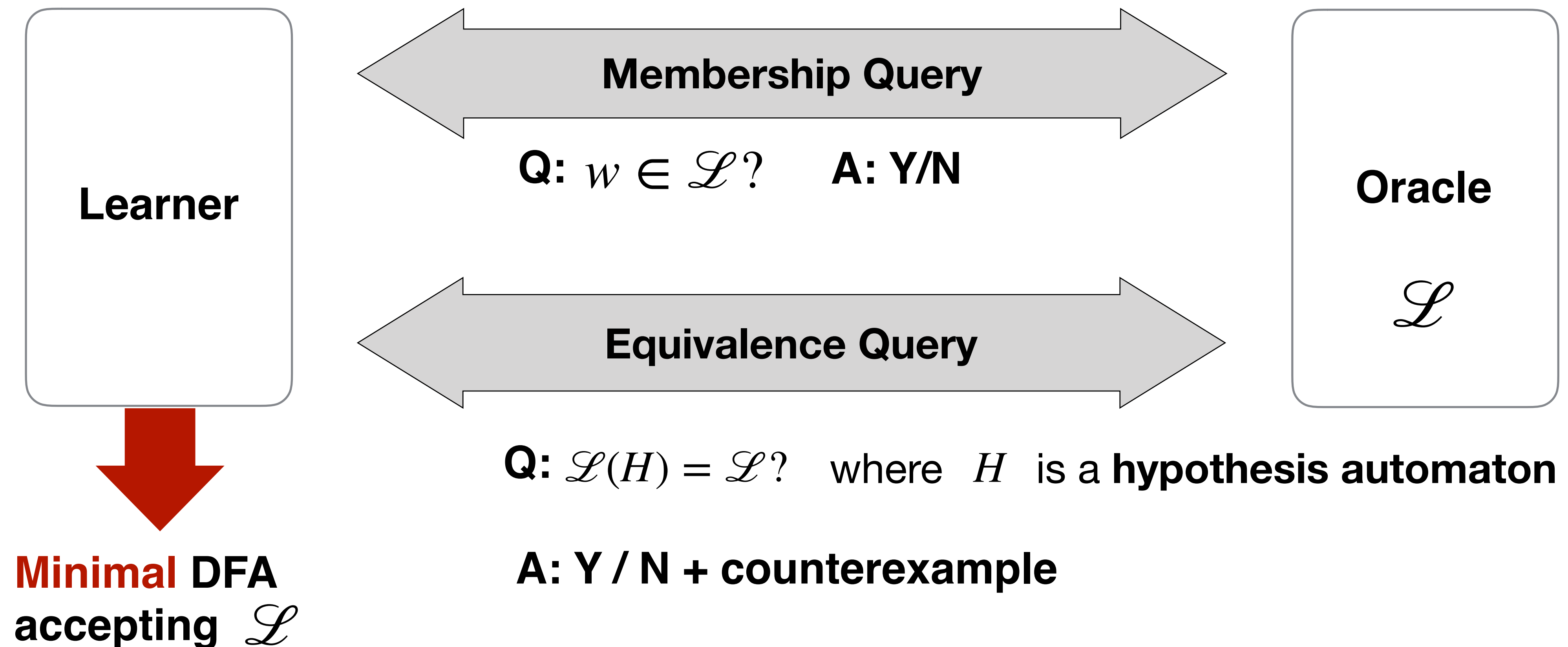
**Automated  
Verification**

**Properties**

# Automata learning (Angluin '87)

**Finite alphabet** of system's actions  $A$

Set of system behaviours is a **regular language**  $\mathcal{L} \subseteq A^*$

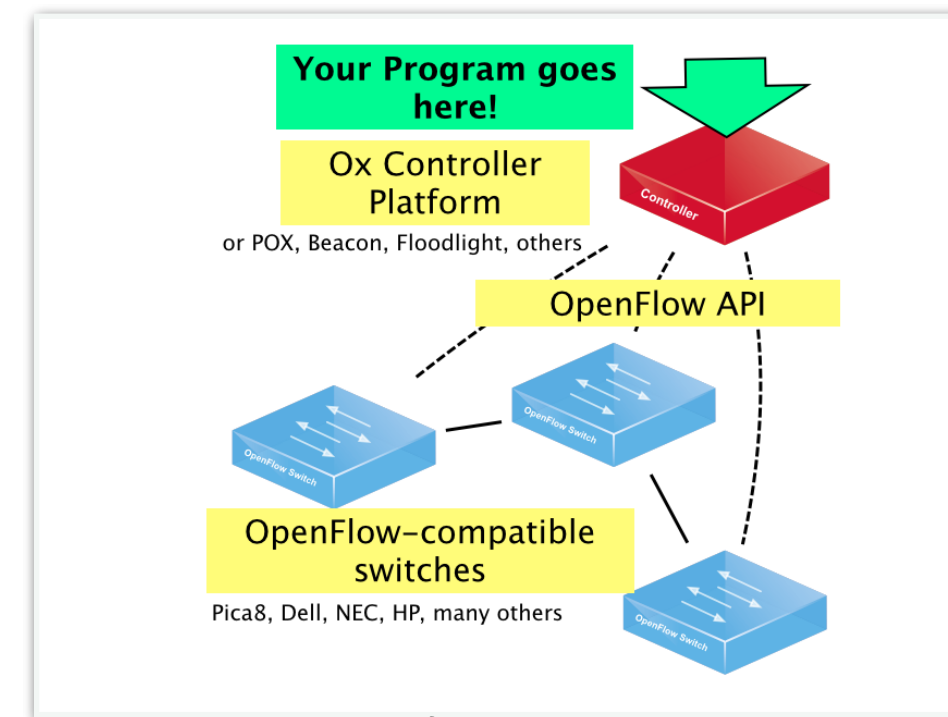


# In practice...

**Membership Query**  
**= Test Case**

**Equivalence Query**

## Oracle



**Is spec violation an  
actual bug?**

**Test Suite**

**Model-based  
testing**

**Model-checking**

# In practice...

***“Lazy” testing and model-checking***

***Good for scalability!***

Members

=

Oracle

Equivalence

testing

ing

# Many interesting applications

- Detect TLS implementations flaws  
[USENIX Sec. Sym. '15]
- TCP implementations [CAV '16]
- Analysis of botnet protocols [CCS '10]
- Bank cards ...



# To each application domain its model...

Probabilistic

Mealy Machines

Alternating

Non-deterministic

Weighted

Register

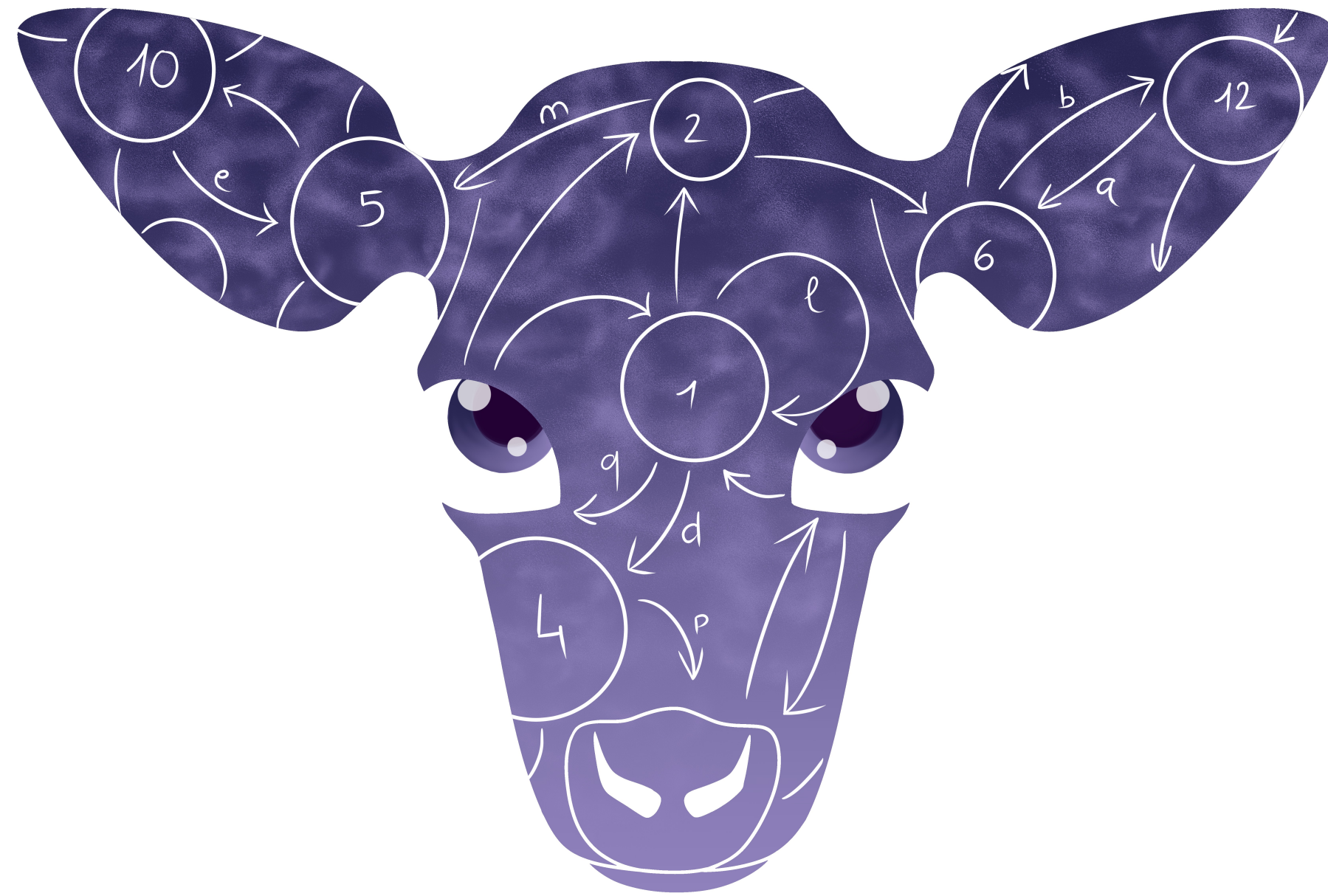
Universal

Buchi

*Do I need to write my automata learning algorithm from scratch?*

**NO! Maths can help!**





# Categorical Automata Learning Framework

[calf-project.org](http://calf-project.org)



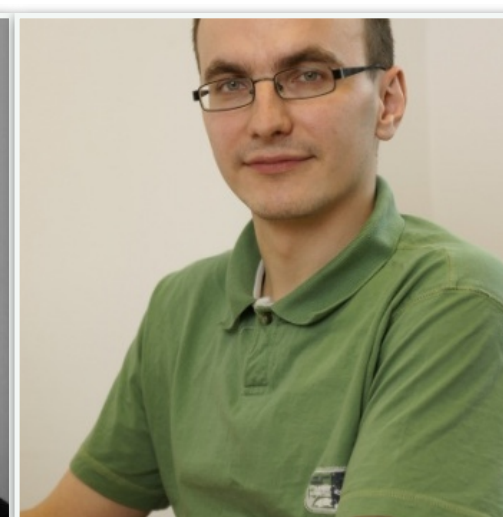
Gerco van Heerdt  
**UCL**



Joshua Moerman  
**Radboud University**



Bartek Klin  
**Warsaw University**



Michal Szynwelski  
**Warsaw University**

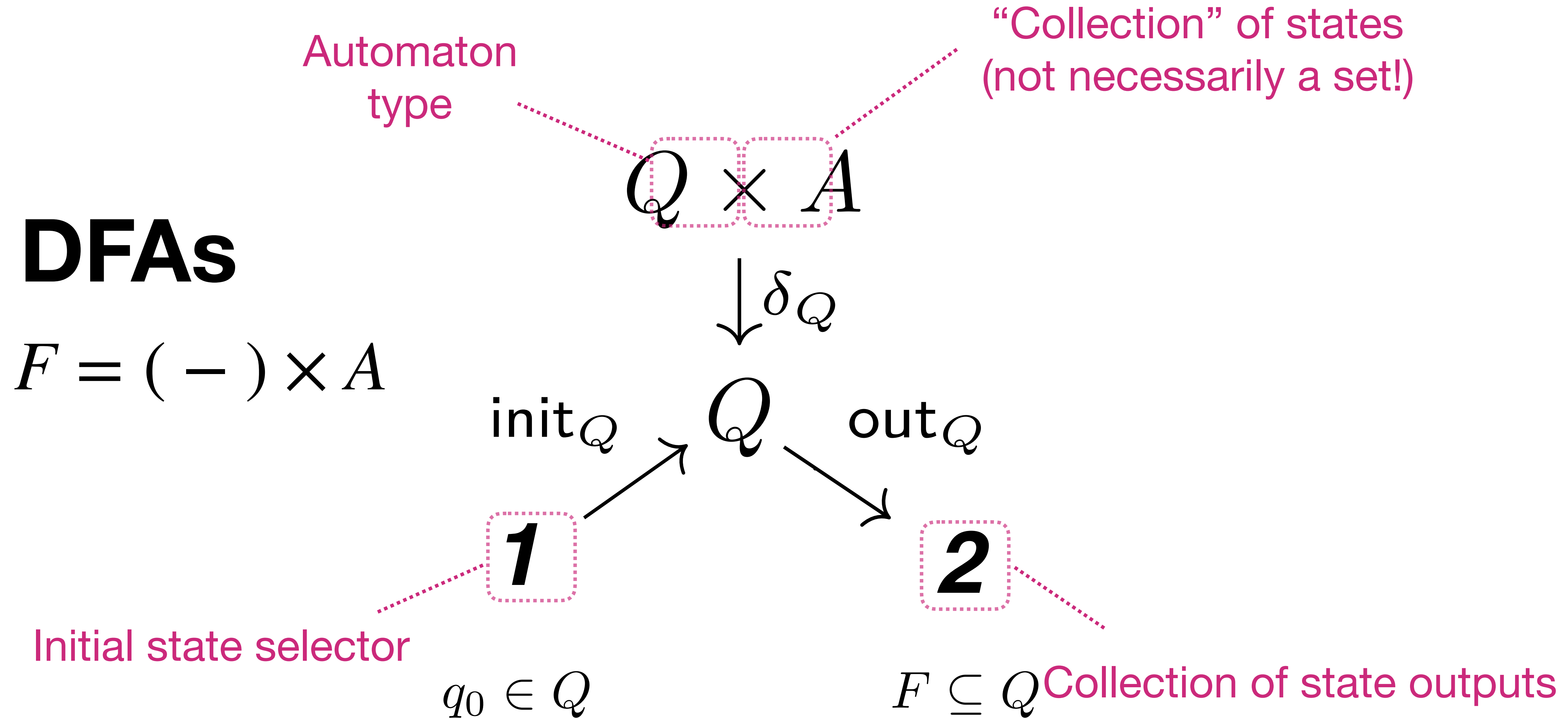


Maverick Chardet  
**ENS Lyon**



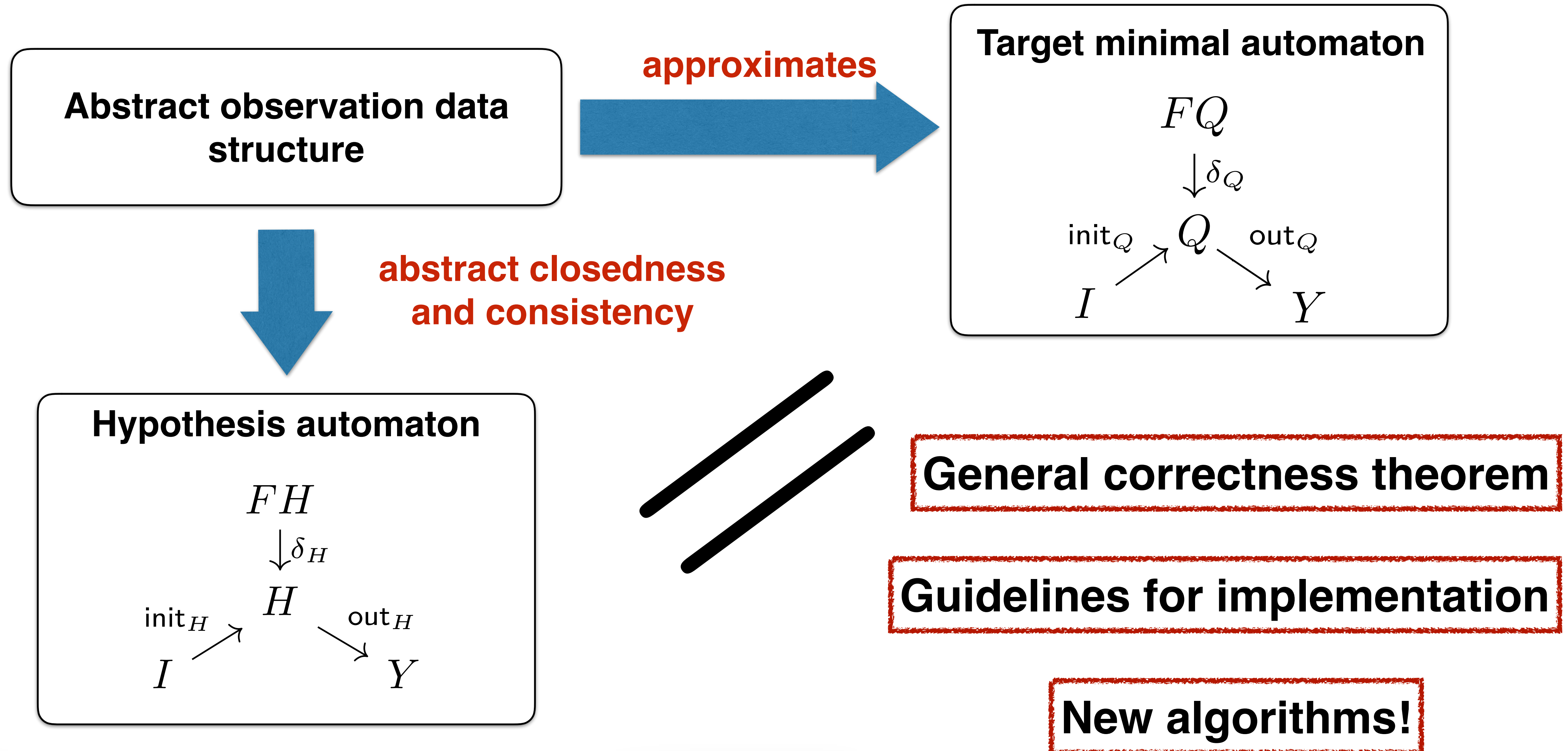
Tiago Ferreira  
**UCL Intern**

# Different automata, same structure





# A general framework



# Other automata & optimizations

## Change automaton type

### Learning Nominal Automata (POPL '17)

Joshua Moerman, Matteo Sammartino, Alexandra Silva, Bartek Klin, Michal Szynwelski

**Nom**    **Nominal automata**

**Vect**    **Weighted automata**

## Change main data structure

**Observation tables**

**Discrimination trees**

## Plug monads in

**Powerset**    **NFAs**

**Powerset with intersection**    **Universal automata**

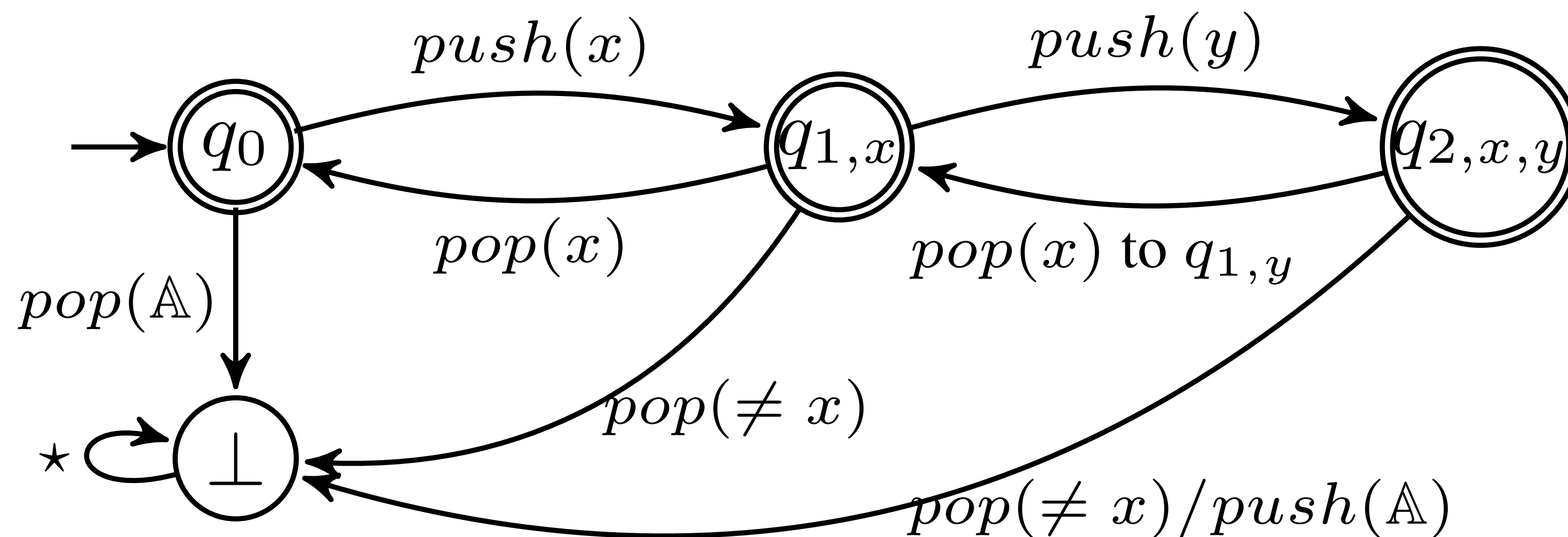
**Double powerset**    **Alternating automata**

**Maybe monad**    **Partial automata**



# Infinite alphabets

**infinite-state**, but **finitely representable** automata



# Other automata & optimizations

Change automaton type

<b>Set</b>	<b>DFAs</b>
<b>Nom</b>	<b>Nominal automata</b>
<b>Vect</b>	<b>Weighted automata</b>

Change main data structure

<b>Observation tables</b>
<b>Discrimination trees</b>

Plug monads in

<b>Powerset</b>	<b>NFAs</b>
<b>Powerset with intersection</b>	<b>Universal automata</b>
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### Optimising Automata Learning via Monads

Gerco van Heerdt, Matteo Sammartino, Alexandra Silva

**([arXiv:1704.08055](#))**

## Plug monads in

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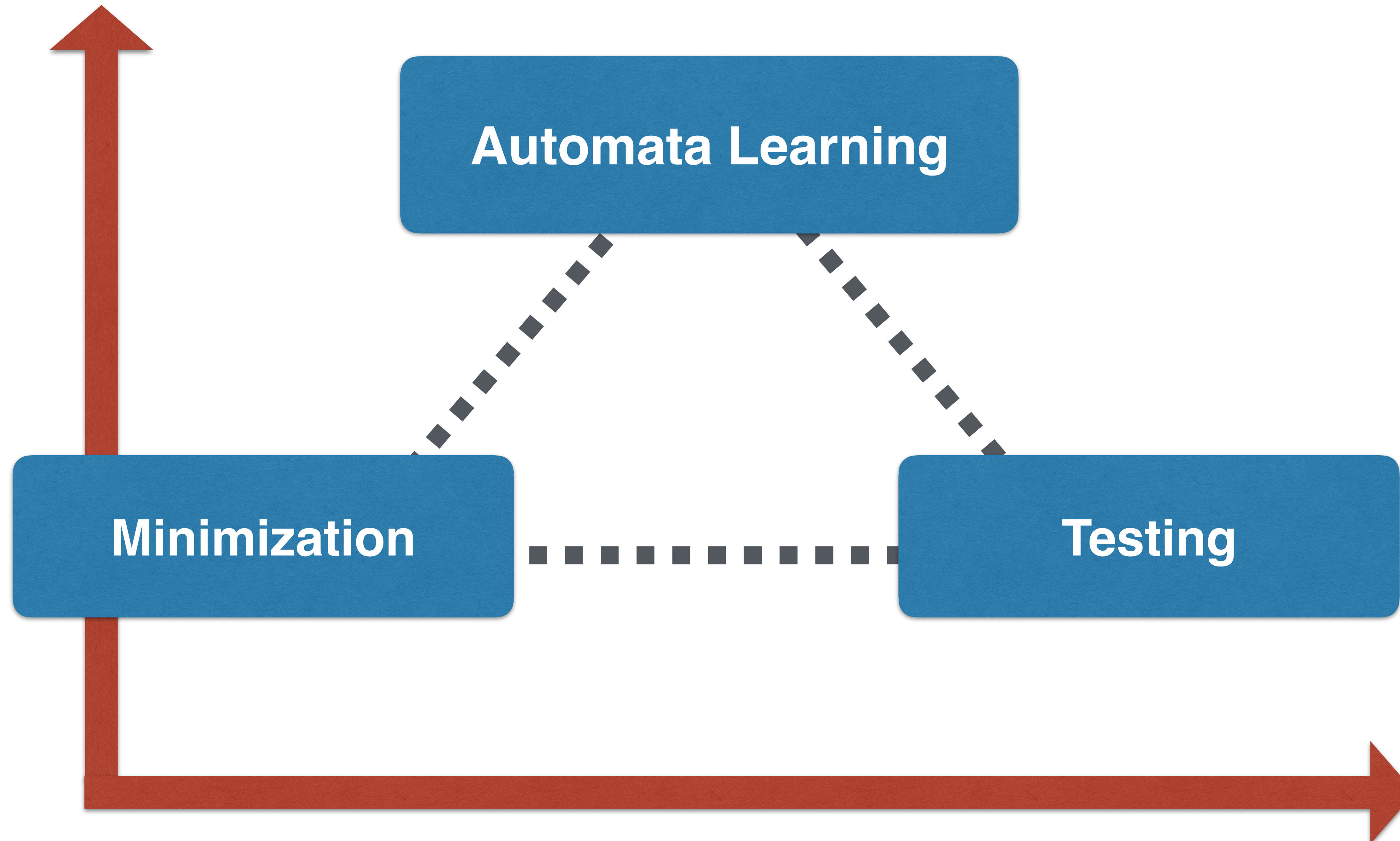
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# Connections with other techniques

Extensions



Optimizations



# Basic ingredients

## NetKat

$\text{sw} = 6; \text{pt} = 8; \text{dst} := 10.0.1.5; \text{pt} := 5$

*For all packets located at port 8 of switch 6, set the destination address to 10.0.1.5 and forward it out on port 5.*

## CKA

[Hoare et al., JLAMP '11]

[Kappe et al., CONCUR '17, ESOP '18]

$a; b \parallel c; d$

*Thread 1: do **a** and then **b***

*Thread 2: do **c** and then **d***

# Verification using NetKAT

## Reachability

- ▶ Can host  $A$  communicate with host  $B$ ? Can every host communicate with every other host?

## Security

- ▶ Does all untrusted traffic pass through the intrusion detection system located at  $C$ ?

## Loop detection

- ▶ Is it possible for a packet to be forwarded around a cycle in the network?

# Verification using NetKAT

## Soundness and Completeness [Anderson et al. 14]

- ▶  $\vdash p = q$  if and only if  $\llbracket p \rrbracket = \llbracket q \rrbracket$

## Decision Procedure [Foster et al. 15]

- ▶ NetKAT coalgebra
- ▶ efficient bisimulation-based decision procedure
- ▶ implementation in OCaml
- ▶ deployed in the Frenetic suite of network management tools

# This project

Forwarding/  
Filtering behaviour

Concurrency

Large data  
domains

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NetKat   **CALF**   CKA

in collaboration with **amazon**

# Other research directions

## **Software Analysis**

- Learning the “correct ways” of using undocumented code
- Learning-based automated test generation

## **Hardware Analysis**

- Analysing concurrency in hardware, in collaboration with **arm**