

An algebraic framework to reason about concurrency

Alexandra Silva

!

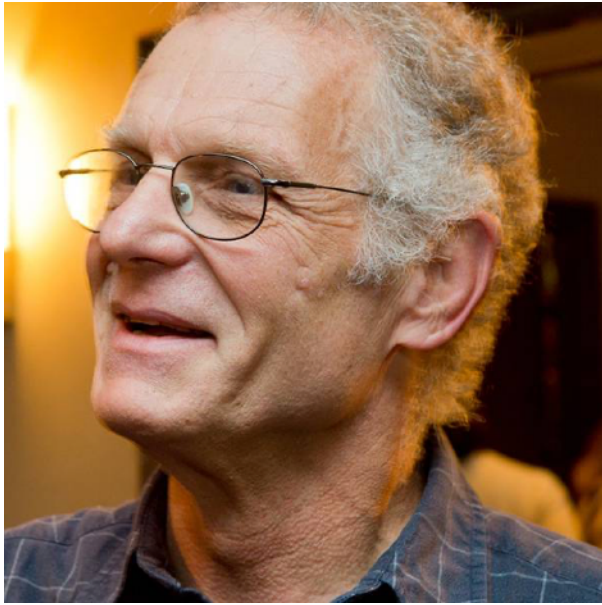
Context

Context



Kleene Algebra as an algebraic
foundation for program
verification

Context



Kleene Algebra as an algebraic
foundation for program
verification

Completeness

Context



Kleene Algebra as an algebraic
foundation for program
verification

Completeness

Equivalence

Context



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Applications

Program Schematology
Compiler Optimization
and much more!

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Extensions

KAT, SKAT
KAT+B! ,...

Context



Kleene Algebra as an algebraic
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Kleene Algebra as an algebraic
foundation for program
verification



Context



Kleene Algebra as an algebraic foundation for program verification



Kleene Algebra: why?

Kleene Algebra: why?

**Compositional
Semantics**

Kleene Algebra: why?

**Compositional
Semantics**

**Scalable
verification**

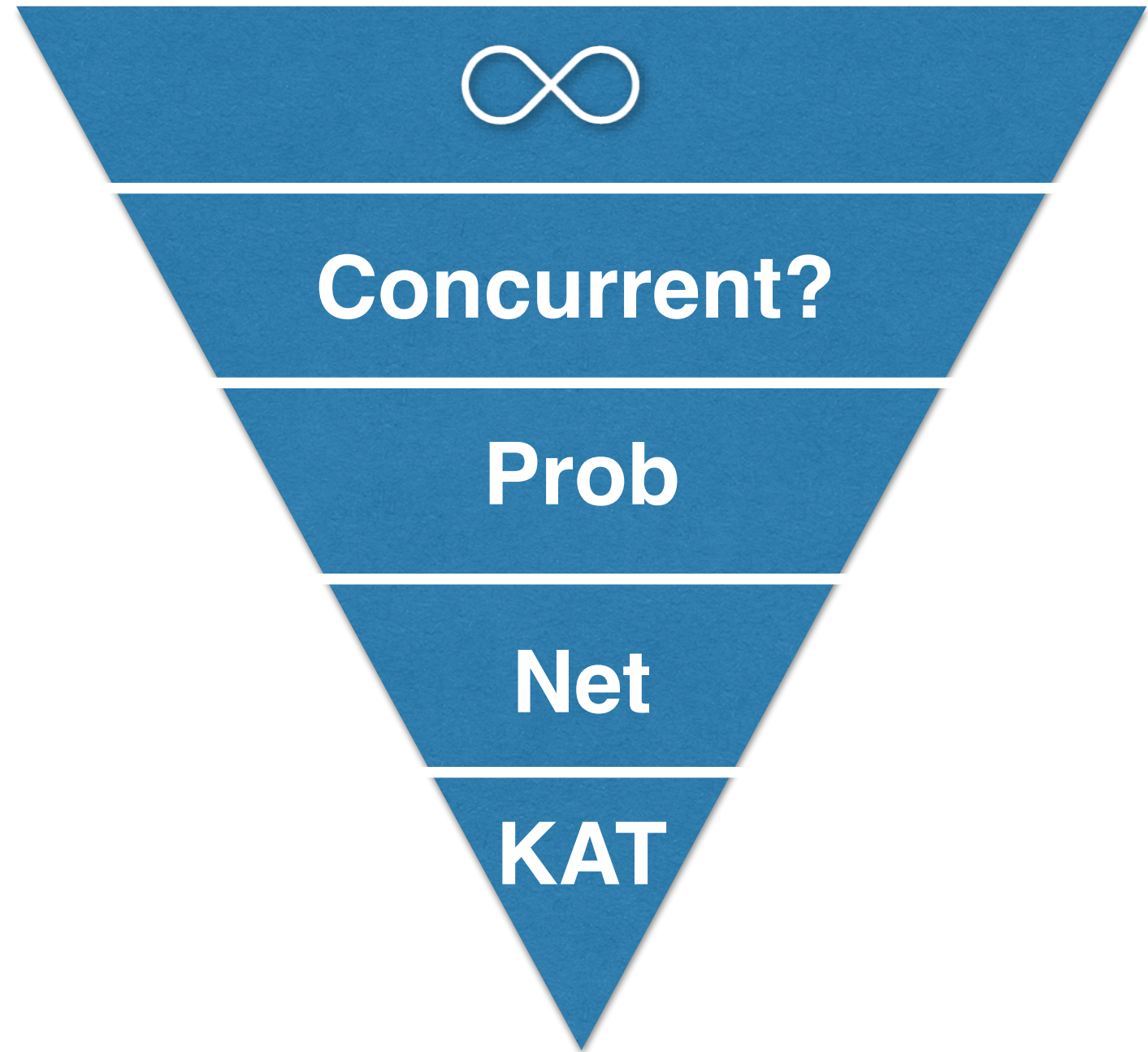
Kleene Algebra: why?

**Compositional
Semantics**

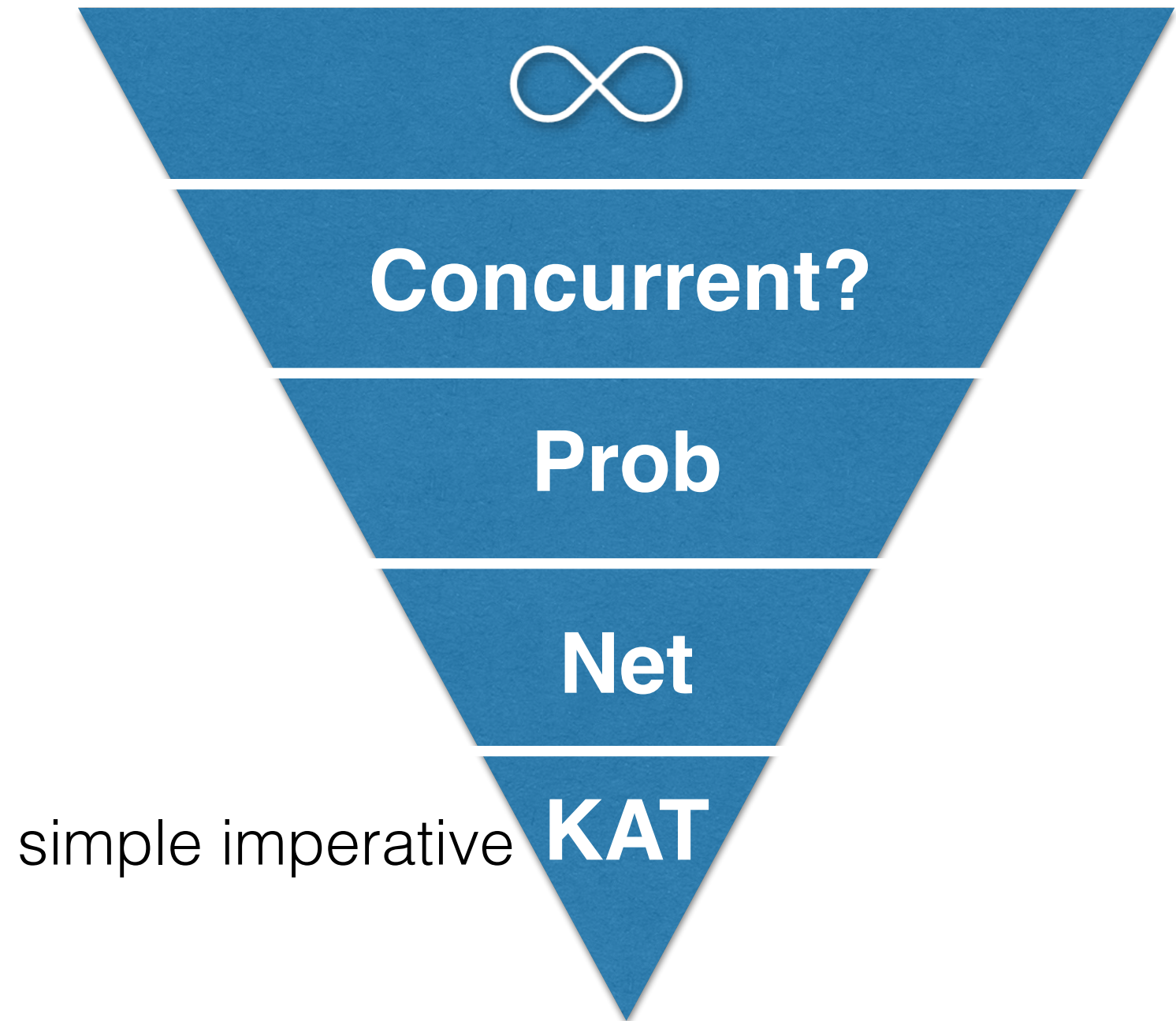
**Scalable
verification**

**Fundamental
correspondence
to automata and
language theory**

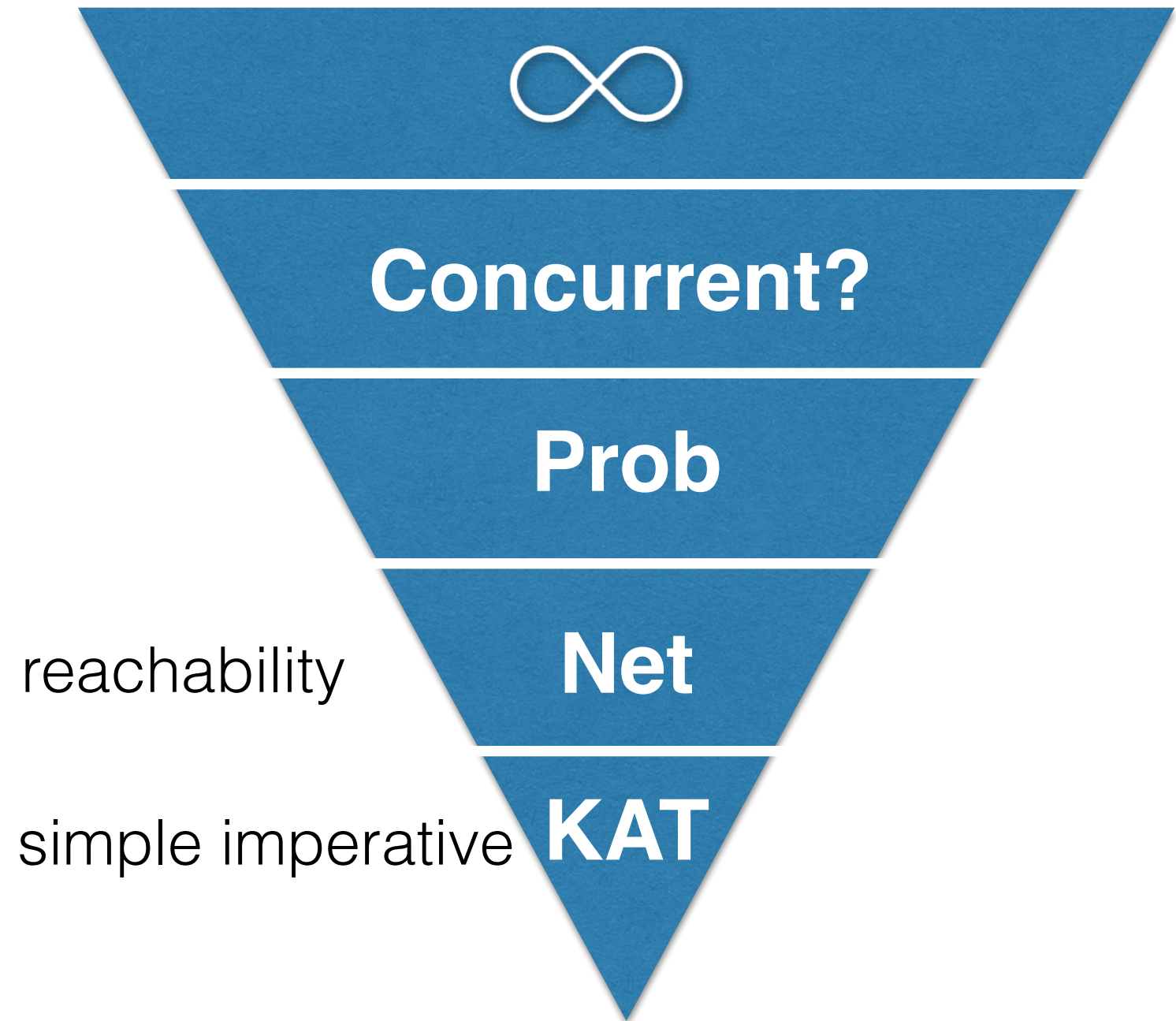
The KA(T) tower principle



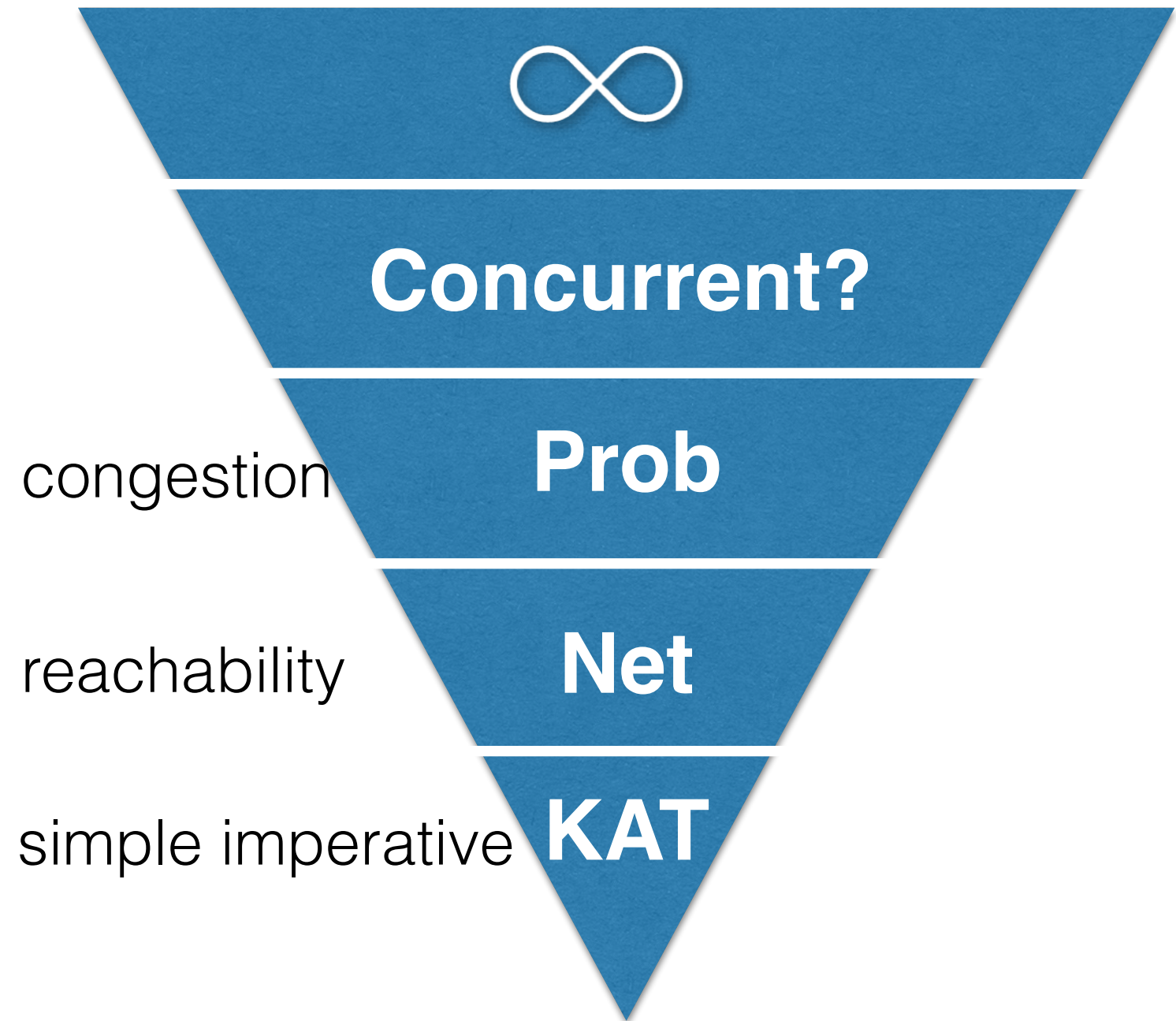
The KA(T) tower principle



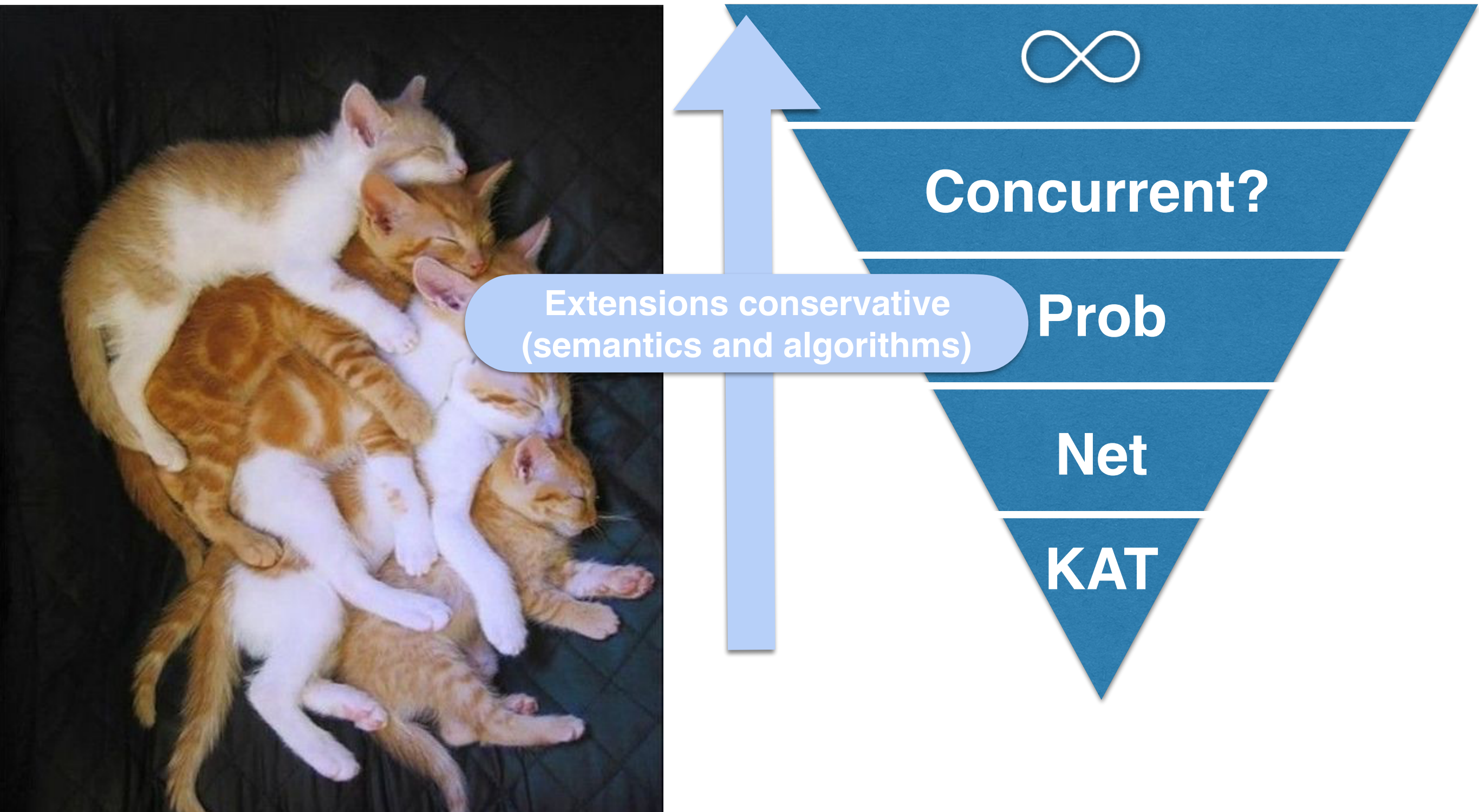
The KA(T) tower principle



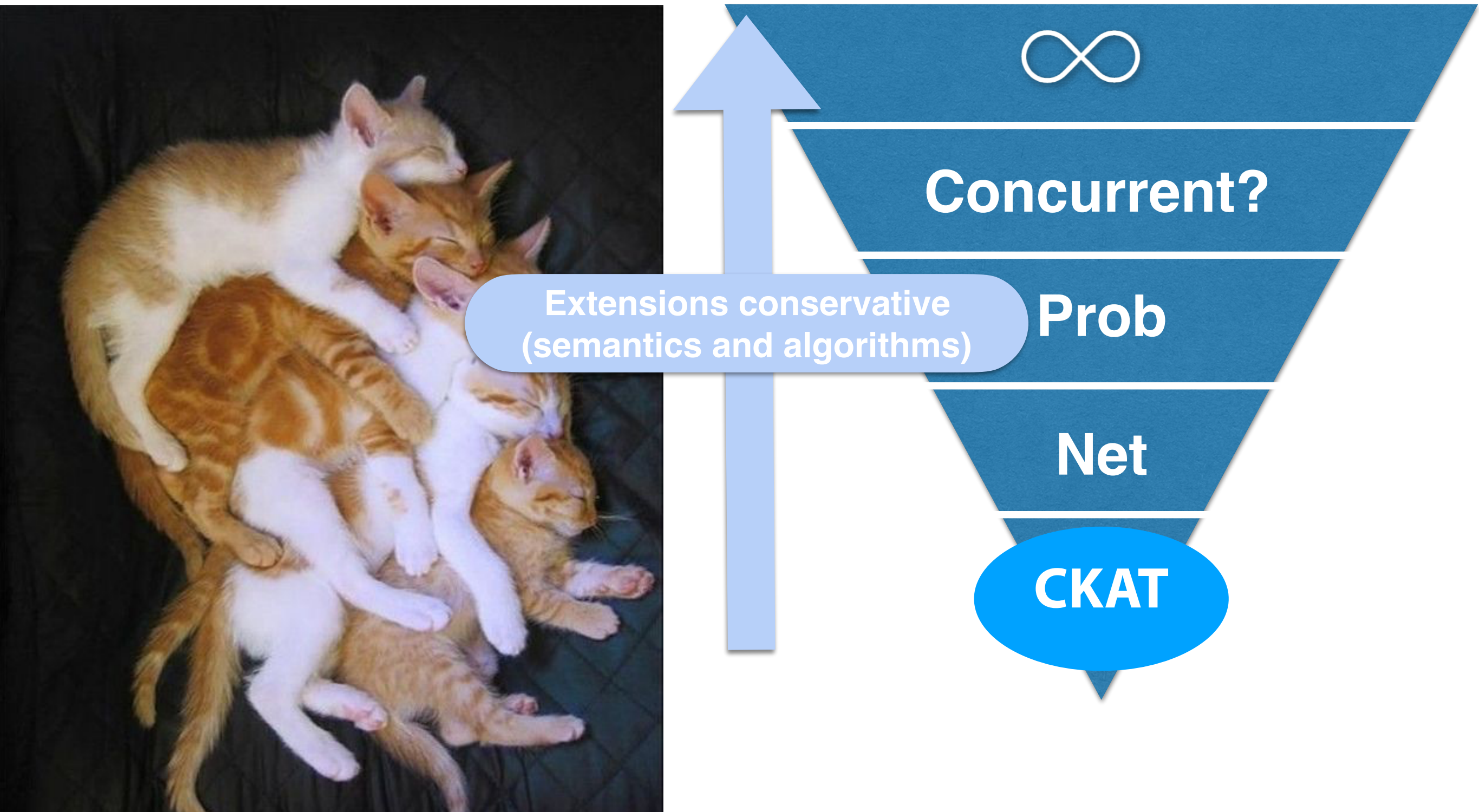
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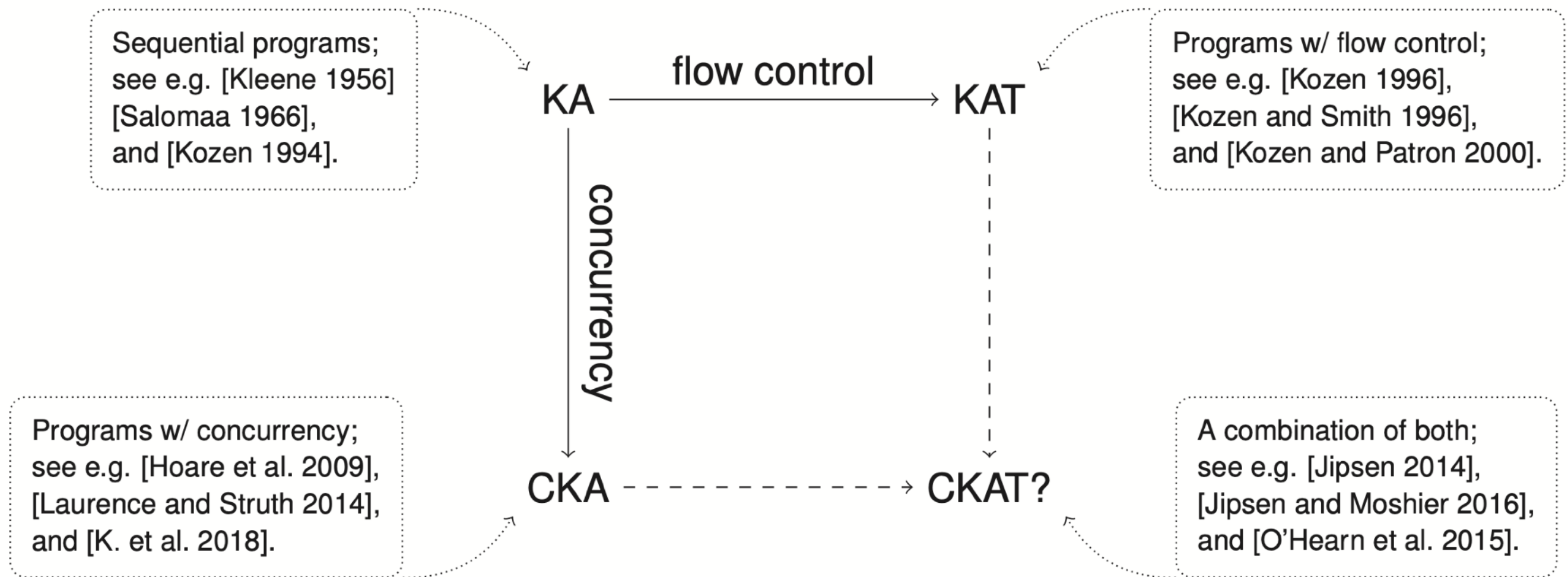
The KA(T) tower principle



The KA(T) tower principle

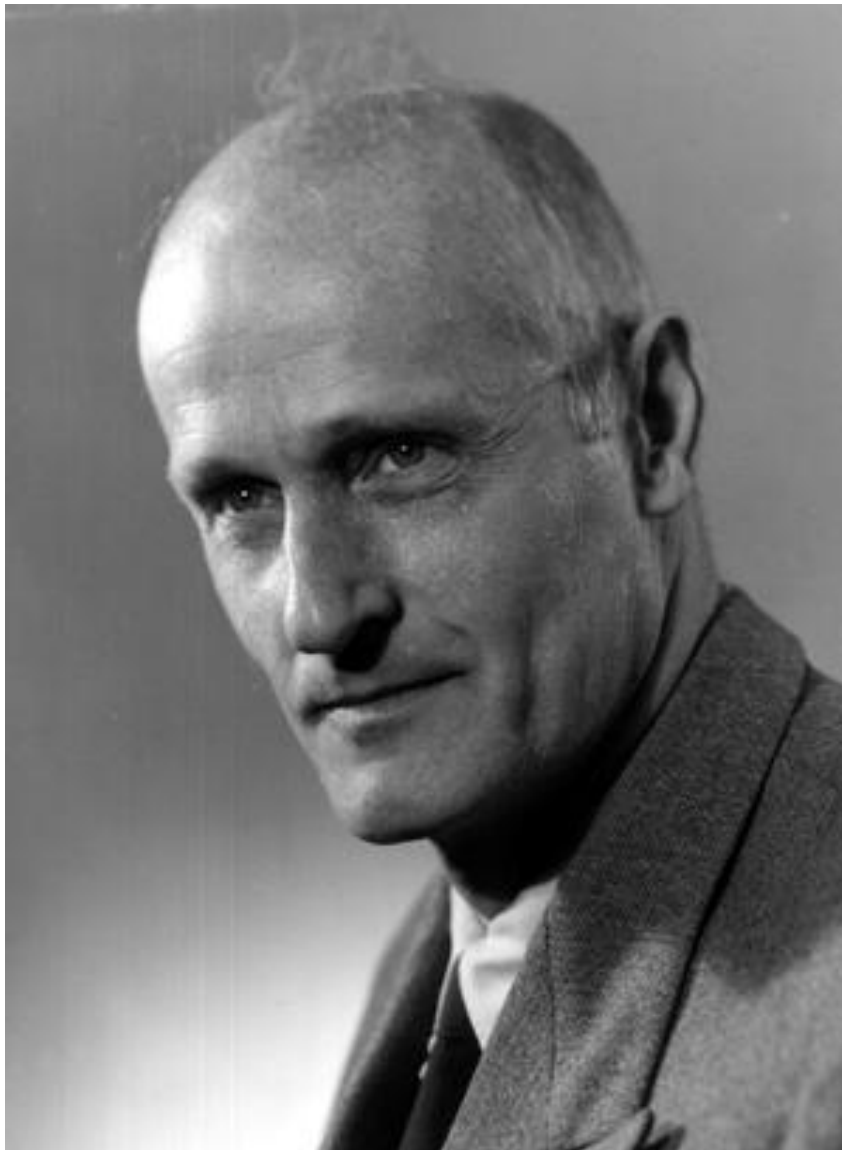


This talk



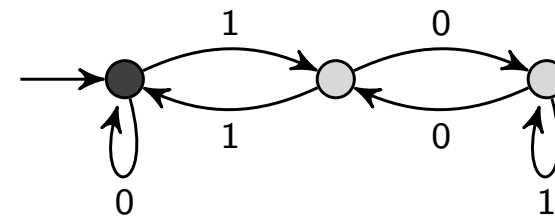
**Let's start from the
beginning...**

Kleene algebra - **KA**

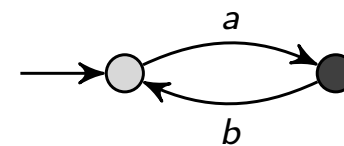


Stephen Cole Kleene
(1909–1994)

$(0 + 1(01^*0)^*1)^*$
{multiples of 3 in binary}



$(ab)^*a = a(ba)^*$
{ $a, aba, ababa, \dots$ }



$(a + b)^* = a^*(ba^*)^*$

{all strings over $\{a, b\}$ }



Kleene algebra - **KA**

program	expression
atomic action	$a, b, \dots \in \Sigma$
abort execution	0
no-operation	1
nondeterministic choice	$e + f$
sequential composition	$e \cdot f$
repetition	e^*

Kleene algebra - **KA**

$$e + 0 \equiv e$$

$$e + e \equiv e$$

$$e + f \equiv f + e$$

$$e + (f + g) \equiv (e + f) + g$$

Kleene algebra - **KA**

$$e + 0 \equiv e$$

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$$e + (f + g) \equiv (e + f) + g$$

$$e \cdot 0 \equiv 0 \equiv 0 \cdot e$$

$$e \cdot 1 \equiv e \equiv 1 \cdot e$$

$$e \cdot (f \cdot g) \equiv (e \cdot f) \cdot g$$

Kleene algebra - KA

$$e + 0 \equiv e \qquad e + e \equiv e \qquad e + f \equiv f + e \qquad e + (f + g) \equiv (e + f) + g$$

$$e \cdot 0 \equiv 0 \equiv 0 \cdot e \qquad e \cdot 1 \equiv e \equiv 1 \cdot e \qquad e \cdot (f \cdot g) \equiv (e \cdot f) \cdot g$$

$$e \cdot (f + g) \equiv e \cdot f + e \cdot g \qquad (e + f) \cdot g \equiv e \cdot g + f \cdot g$$

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$$e + 0 \equiv e \qquad e + e \equiv e \qquad e + f \equiv f + e \qquad e + (f + g) \equiv (e + f) + g$$

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$$e \cdot (f + g) \equiv e \cdot f + e \cdot g \qquad (e + f) \cdot g \equiv e \cdot g + f \cdot g$$

$$1 + e \cdot e^* \equiv e^*$$

$$e \cdot f + g \leq f \implies e^* \cdot g \leq f$$

Kleene algebra - KA

$$e + 0 \equiv e \qquad e + e \equiv e \qquad e + f \equiv f + e \qquad e + (f + g) \equiv (e + f) + g$$

$$e \cdot 0 \equiv 0 \equiv 0 \cdot e \qquad e \cdot 1 \equiv e \equiv 1 \cdot e \qquad e \cdot (f \cdot g) \equiv (e \cdot f) \cdot g$$

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$$1 + e \cdot e^* \equiv e^* \qquad e \cdot f + g \leq f \implies e^* \cdot g \leq f$$

Theorem [Kozen'90]

KA axioms are sound and complete

Equivalence

Via Completeness
using KA axioms

Via Kleene's Theorem
using automata

Near-linear algorithms
Hopcroft-Karp, Bisimulation up-to

Equivalence

Via Completeness
using KA axioms

Via Kleene's Theorem
using automata

Near-linear algorithms
Hopcroft-Karp, Bisimulation up-to

Equivalence is essential to many verification questions!

RESEARCH-ARTICLE **FREE ACCESS**

NetKAT: semantic foundations for networks



Authors: [Carolyn Jane Anderson](#), [Nate Foster](#), [Arjun Guha](#), [Jean-Baptiste Jeannin](#), [Dexter Kozen](#), [Cole Schlesinger](#),

[David Walker](#) [Authors Info & Affiliations](#)

Equivalence

Via Completeness
using KA axioms

Via Kleene's Theorem
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Near-linear algorithms
Hopcroft-Karp, Bisimulation up-to

Equivalence is essential to many verification questions!

Efficient fragments are still being studied!

Equivalence

Via Completeness
using KA axioms

Via Kleene's Theorem
using automata

Near-linear algorithms
Hopcroft-Karp, Bisimulation up-to

Equivalence is essential to many verification questions!

Efficient fragments are still being studied!

ARTICLE [OPEN ACCESS](#)

**Guarded Kleene algebra with tests: verification of
uninterpreted programs in nearly linear time**



Authors:  [Steffen Smolka](#),  [Nate Foster](#),  [Justin Hsu](#),  [Tobias Kappé](#),  [Dexter Kozen](#),

 [Alexandra Silva](#) [Authors Info & Affiliations](#)

KAT

$(K, B, +, \cdot, *, \neg, 0, 1), \quad B \subseteq K$

- $(K, +, \cdot, *, 0, 1)$ is a Kleene algebra
- $(B, +, \cdot, \neg, 0, 1)$ is a Boolean algebra
- $(B, +, \cdot, 0, 1)$ is a subalgebra of $(K, +, \cdot, 0, 1)$
- $p, q, r, \dots$ range over K
- $a, b, c, \dots$ range over B

KAT

KAT = simple imperative language

If b **then** p **else** $q = b;p + !b;q$

While b **do** $p = (bp)^*!b$

Boolean
algebra

KAT

KAT = simple imperative language

If b **then** p **else** $q = b;p + !b;q$

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KAT

KAT = simple imperative language

If b **then** p **else** $q = b;p + !b;q$

While b **do** $p = (bp)^*!b$

$$\llbracket p \rrbracket \subseteq At \cdot (\Sigma \cdot At)^*$$

KAT

$$\llbracket p \rrbracket \subseteq At \cdot (\Sigma \cdot At)^*$$

If b **then** p **else** $q = b;p + !b;q$

While b **do** $p = (bp)^*!b$

$\{\alpha_b p \beta, \alpha_{!b} p \beta\}$

$\{\alpha_{!b}, \alpha_b p \alpha_{!b}, \alpha_b p \alpha_b p \alpha_{!b}, \dots\}$

valuations
variables

Equivalence

Theorem [Kozen'96]

KA+BA axioms are sound and complete

Via Completeness
using KAT axioms

Via Kleene's Theorem
using *guarded* automata

Equivalence

Theorem [Kozen'96]

KA+BA axioms are sound and complete

Via Completeness
using KAT axioms

Via Kleene's Theorem
using *guarded* automata

$$\begin{aligned}\{b\} p \{c\} &\overset{\triangle}{\iff} bp \leq pc \\ &\iff bp = bpc \\ &\iff bp\bar{c} = 0\end{aligned}$$

Concurrent programs

initial state: $x = 0, y = 0$

T0

a: $x \leftarrow 1;$

b: $r1 \leftarrow y;$

T1

c: $y \leftarrow 1;$

d: $r2 \leftarrow x;$

assert: $r_1 \neq 0 \text{ xor } r_2 \neq 0$

Concurrent programs

initial state: $x = 0, y = 0$	
T0	T1
a: $x \leftarrow 1;$	c: $y \leftarrow 1;$
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Can we reason about these programs (co)algebraically?

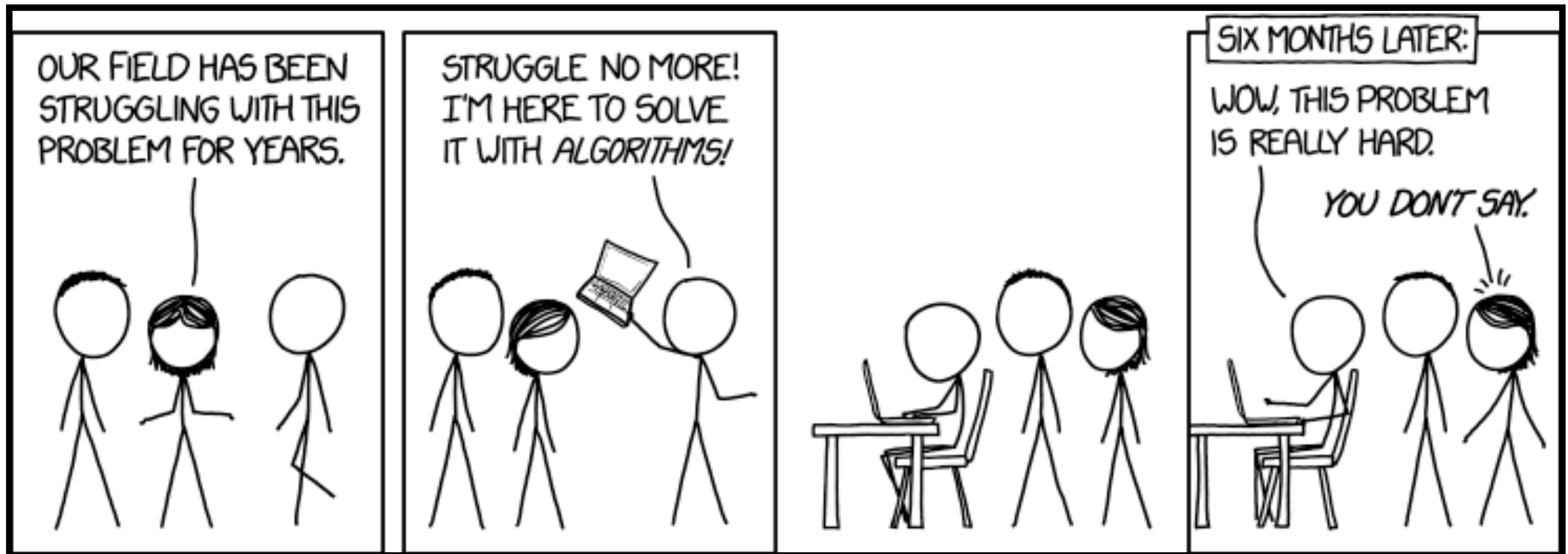
Concurrent programs

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b: $r1 \leftarrow y;$	d: $r2 \leftarrow x;$
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Can we reason about these programs (co)algebraically?

$$(x = 0 \wedge y = 0) \cdot (T0 \parallel T1) \leq \neg(r1 = 0 \wedge r2 = 0)$$

Concurrency



Concurrent Kleene Algebra

(Hoare, Moeller, Struth, Wehrman'09)

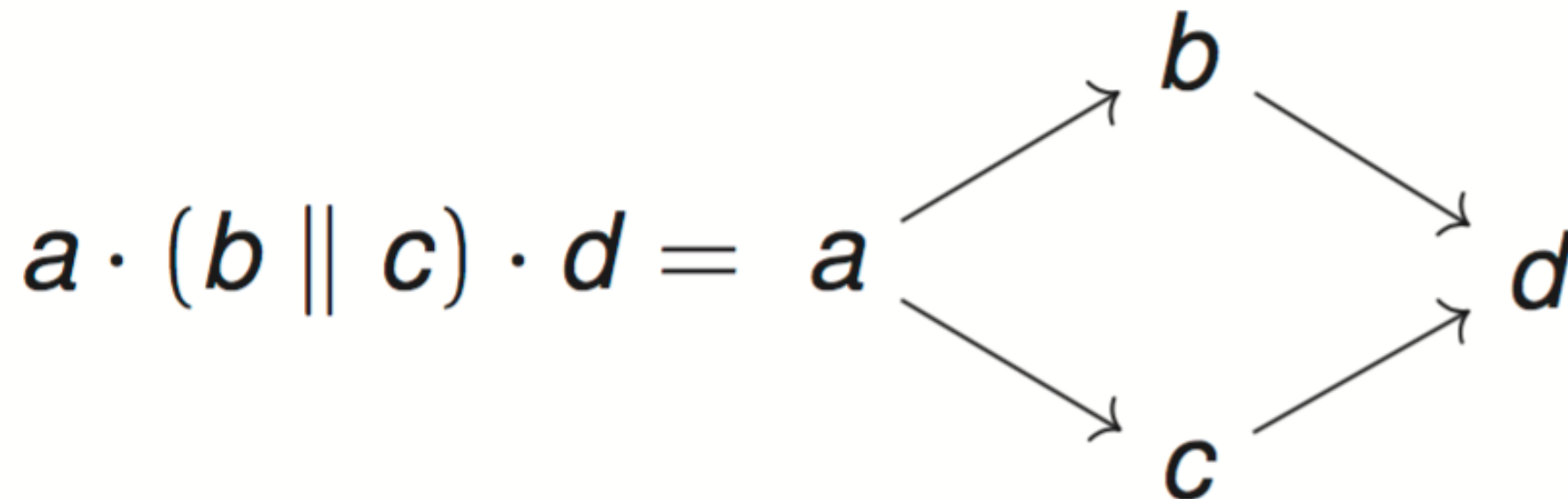
$$p \parallel q$$

Concurrent Kleene Algebra

(Hoare, Moeller, Struth, Wehrman'09)

$$p \parallel q$$

Semantics = languages of PomSets



Concurrent Kleene Algebra

(Hoare, Moeller, Struth, Wehrman'09)

$$p \parallel q$$

Kleene Theorem

Axiomatisation

Decision Procedure

Concurrent Kleene Algebra

(Hoare, Moeller, Struth, Wehrman'09)

$$p \parallel q$$

Kleene Theorem



Axiomatisation



Decision Procedure



Concurrent Kleene Algebra

(Hoare, Moeller, Struth, Wehrman'09)

$$e \parallel f \equiv f \parallel e$$

$$e \parallel (f \parallel g) \equiv (e \parallel f) \parallel g$$

$$e \parallel 1 \equiv e$$

$$e \parallel 0 \equiv 0$$

$$e \parallel (f + g) \equiv e \parallel f + e \parallel g$$

Concurrent Kleene Algebra

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$$(e \parallel g) \cdot (f \parallel h) \leq (e \cdot f) \parallel (g \cdot h). \quad \text{Exchange law}$$

Concurrent Kleene Algebra

(Hoare, Moeller, Struth, Wehrman'09)

$$e \parallel f \equiv f \parallel e$$

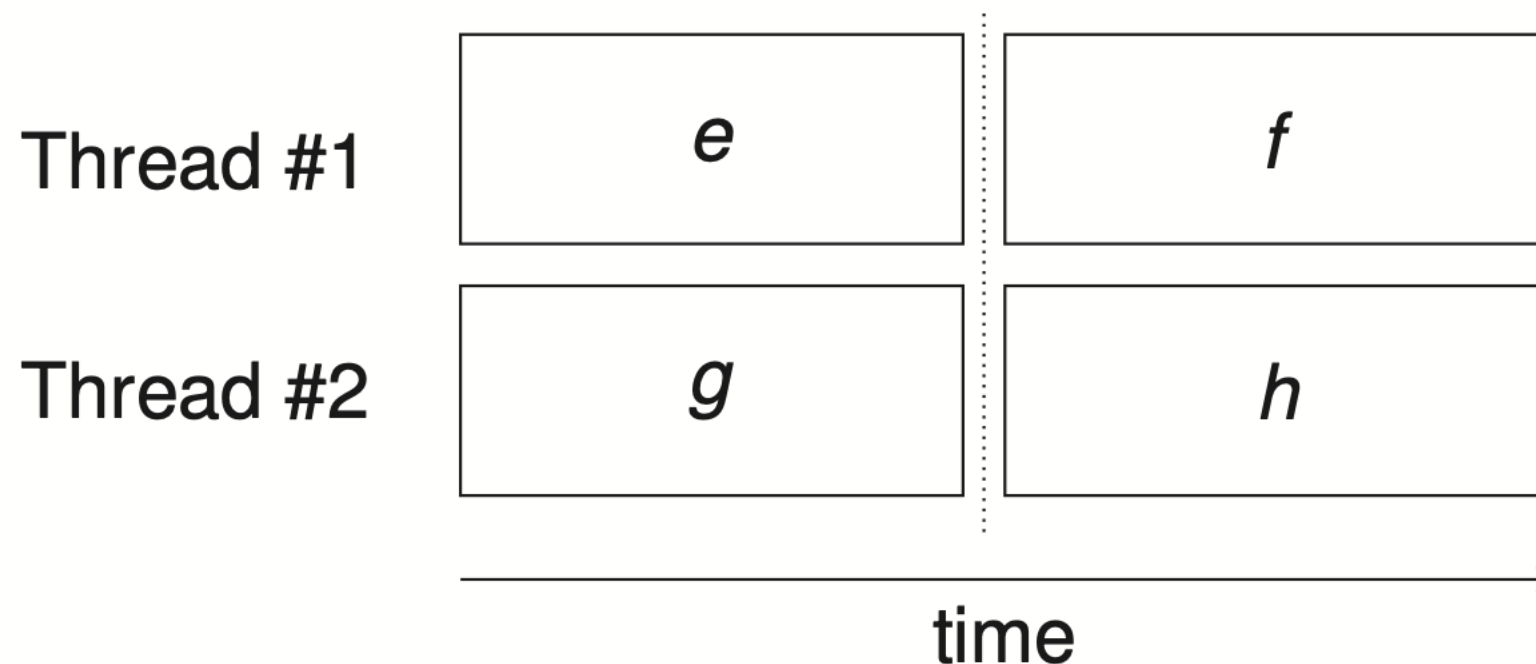
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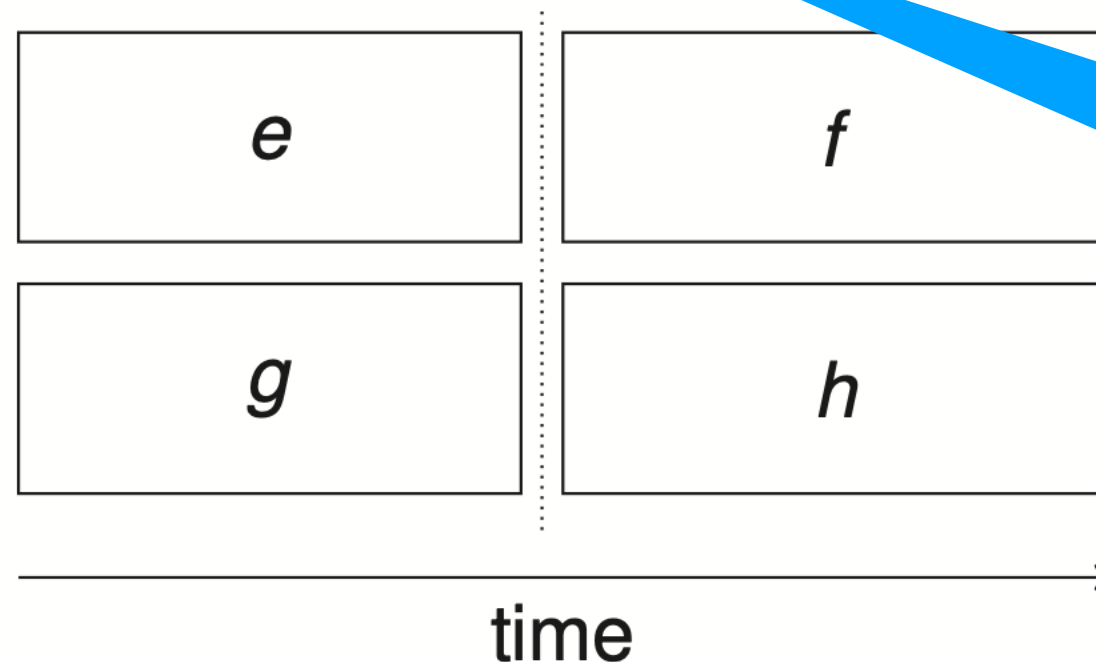
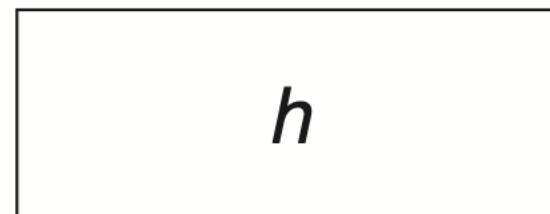
$$e \parallel (f + g) \equiv e \parallel f + e \parallel g$$

$$(e \parallel g) \cdot (f \parallel h) \leq (e \cdot f) \parallel (g \cdot h). \quad \text{Exchange law}$$

Thread #1

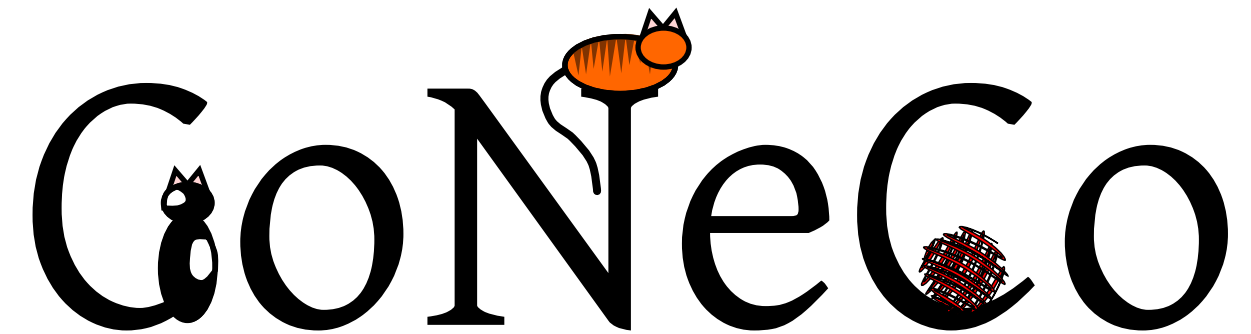


Thread #2



Interleaving as
special case:
 $p \parallel q = p \cdot q + q \cdot p$

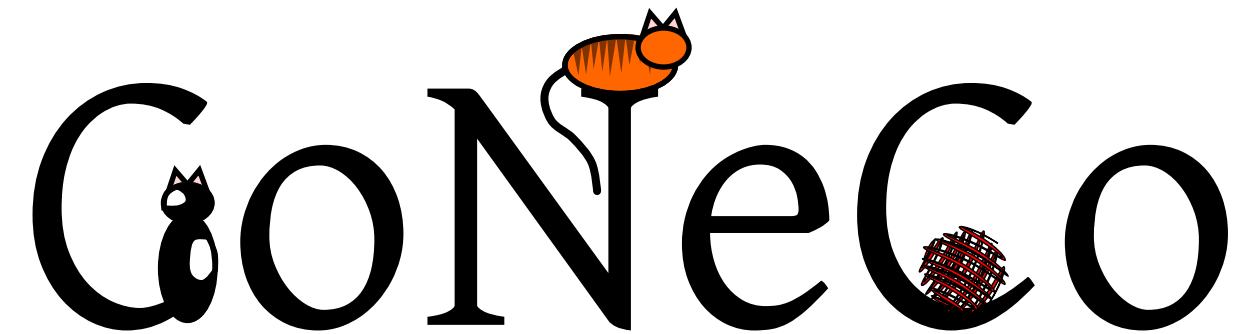
GoNeCo



Kleene Theorem

Axiomatisation

Decision Procedure



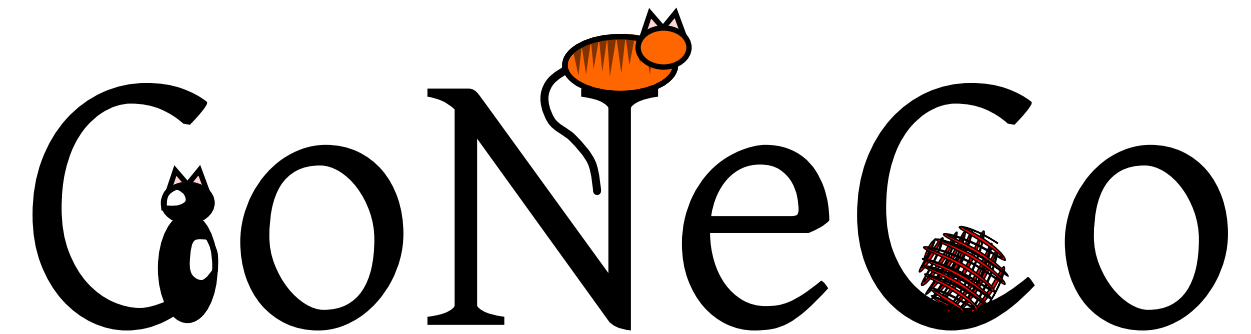
Brzozowski goes concurrent: a Kleene theorem for Pomset languages ([CONCUR 2017](#))

Tobias Kappé, Paul Brunet, Bas Luttik, Alexandra Silva, and Fabio Zanasi

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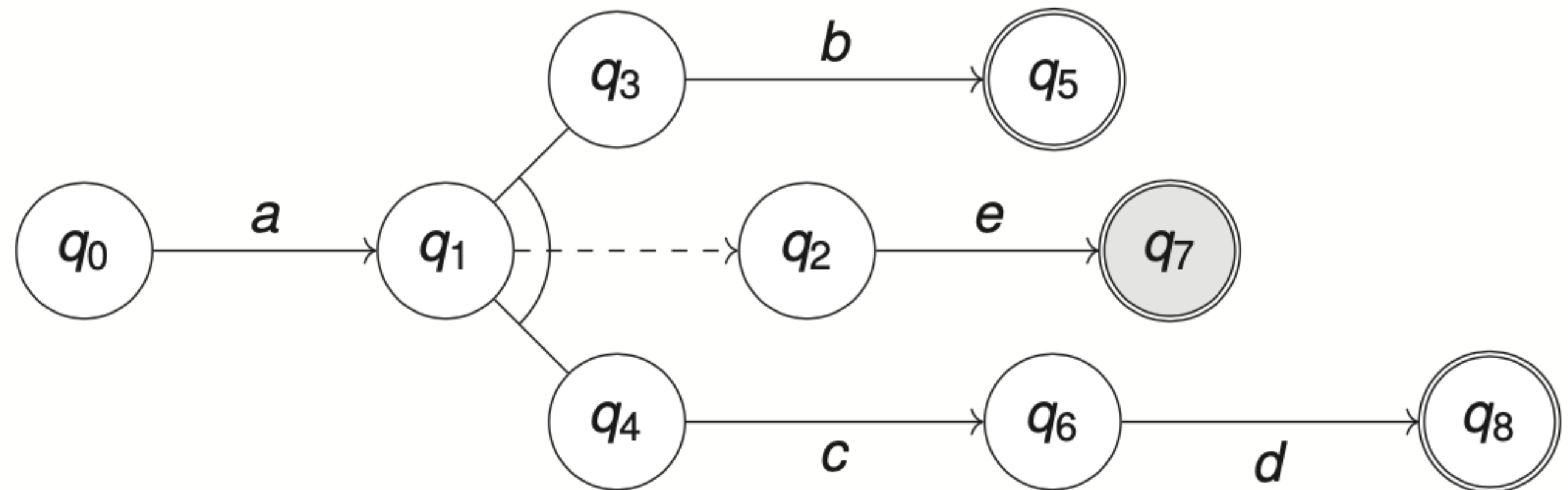
Decision Procedure

Concurrent Kleene Algebra: free model and completeness (ESOP 2018)

Tobias Kappé, Paul Brunet, Alexandra Silva, and Fabio Zanasi

Kleene Theorem

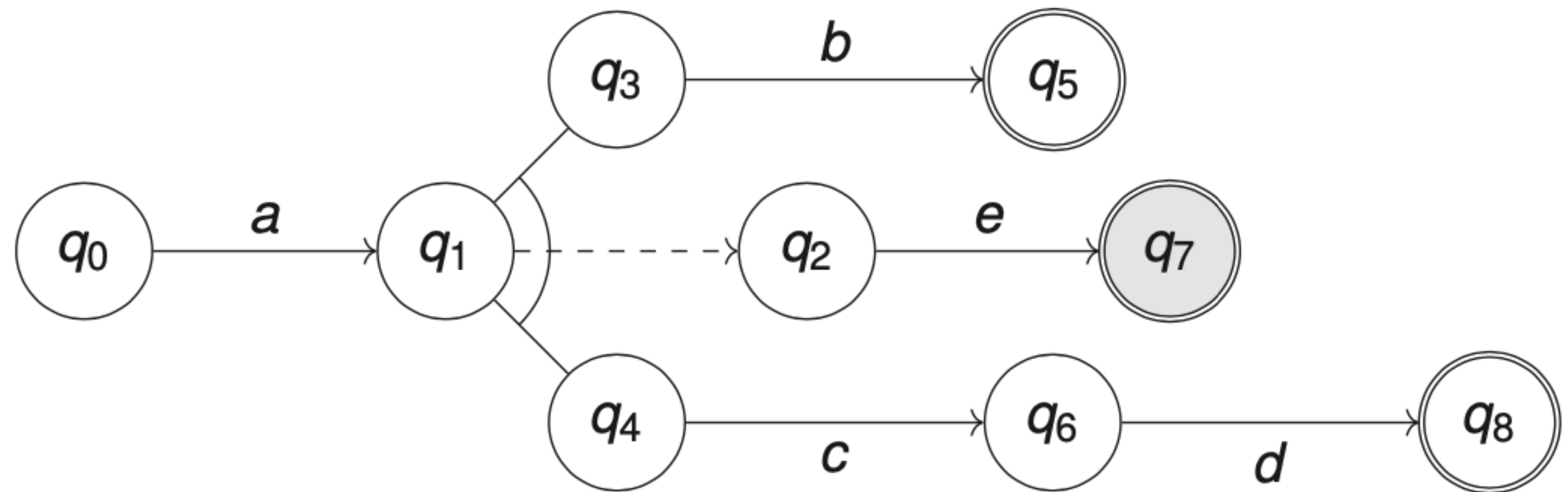
Fork Automata (Gischer'88)



$a(b \parallel cd)e$

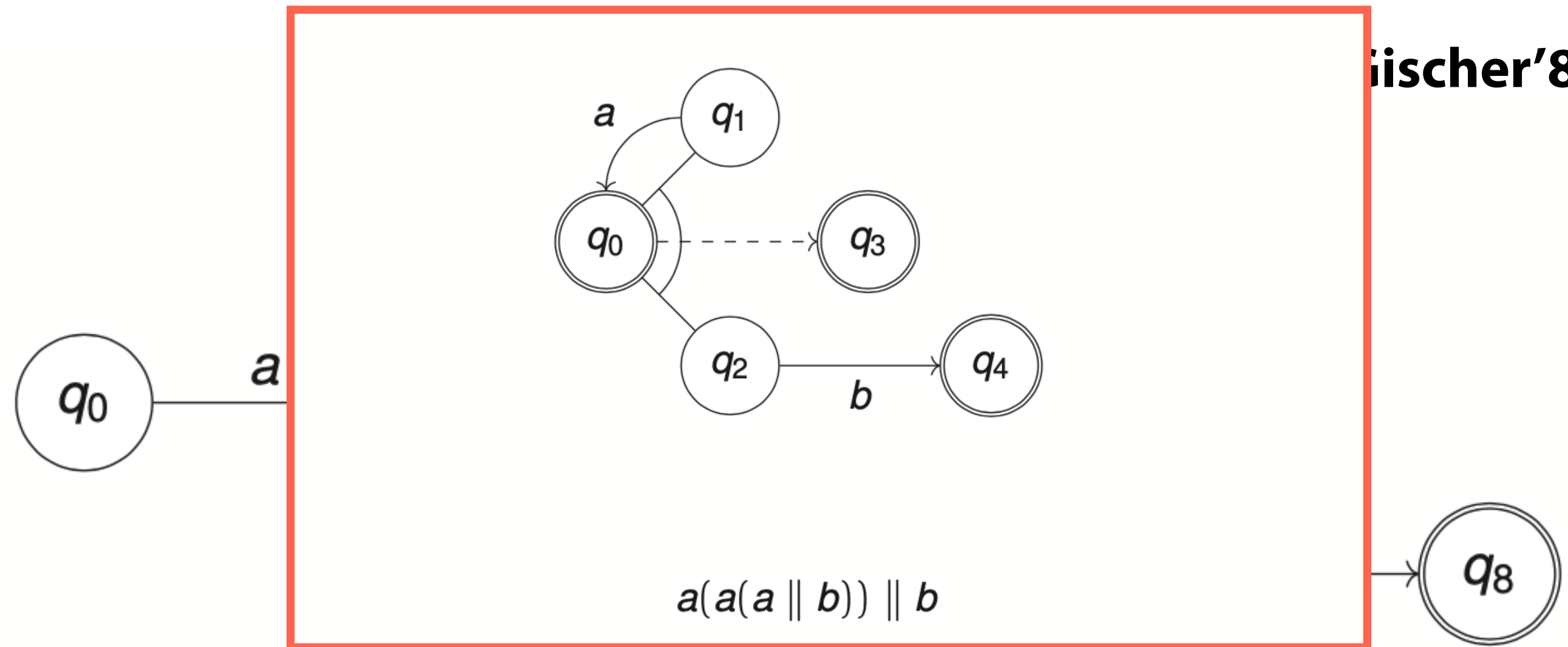
Kleene Theorem

Fork Automata (Gischer'88)



Kleene Theorem

(Fischer'88)



Automata

Brzowski-like construction

Expressions

Requires restriction

GoNeCo

CKA



GoNeCo

CKAT

next

CKA



GoNeCo

CNetKAT

soon

CKAT

next

CKA



CKAT [Jipsen'14]

$$e, f ::= p \mid 0 \mid 1 \mid a \in \Sigma \mid e + f \mid e \cdot f \mid e^* \mid e \parallel f$$

KAT terms

$$p, q ::= \perp \mid \top \mid t \in T \mid p \vee q \mid p \wedge q \mid \bar{p}$$

CKAT [Jipsen'14]

CKA terms

$$e, f ::= \underbrace{p \mid 0 \mid 1 \mid a \in \Sigma \mid e + f \mid e \cdot f \mid e^* \mid e \parallel f}_{\text{KAT terms}}$$

KAT terms

$$p, q ::= \perp \mid \top \mid t \in T \mid p \vee q \mid p \wedge q \mid \bar{p}$$

The problem with CKAT

$$\begin{aligned} p \cdot e \cdot \bar{p} &\leq (p \parallel e) \cdot \bar{p} \\ &\equiv (p \parallel e) \cdot (\bar{p} \parallel 1) \\ &\leq (p \cdot \bar{p}) \parallel (e \cdot 1) \\ &\equiv (p \cdot \bar{p}) \parallel e \end{aligned}$$

The problem with CKAT

$$\begin{aligned} p \cdot e \cdot \bar{p} &\leq (p \parallel e) \cdot \bar{p} \\ &\equiv (p \parallel e) \cdot (\bar{p} \parallel 1) \\ &\leq (p \cdot \bar{p}) \parallel (e \cdot 1) \\ &\equiv (p \cdot \bar{p}) \parallel e \\ &\equiv (p \wedge \bar{p}) \parallel e \\ &\equiv \perp \parallel e \\ &\equiv 0 \parallel e \\ &\equiv 0 \end{aligned}$$

The problem with CKAT

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The problem with CKAT

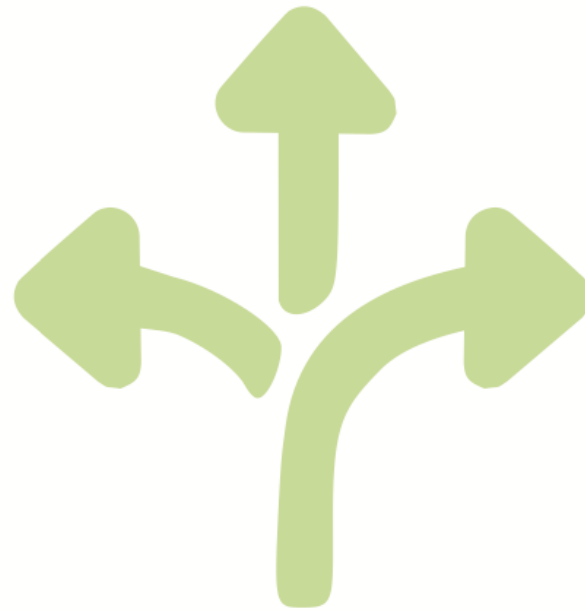
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Every test is an
invariant of every
program!

Crossroads

Non-congruence?

Drop $e \parallel 0 \equiv 0$?



Drop exchange law?

Crossroads



See also [Bergstra and Ponse 2011].

Crossroads



See also [Bergstra and Ponse 2011].

Crossroads



See also [Bergstra and Ponse 2011].

Crossroads

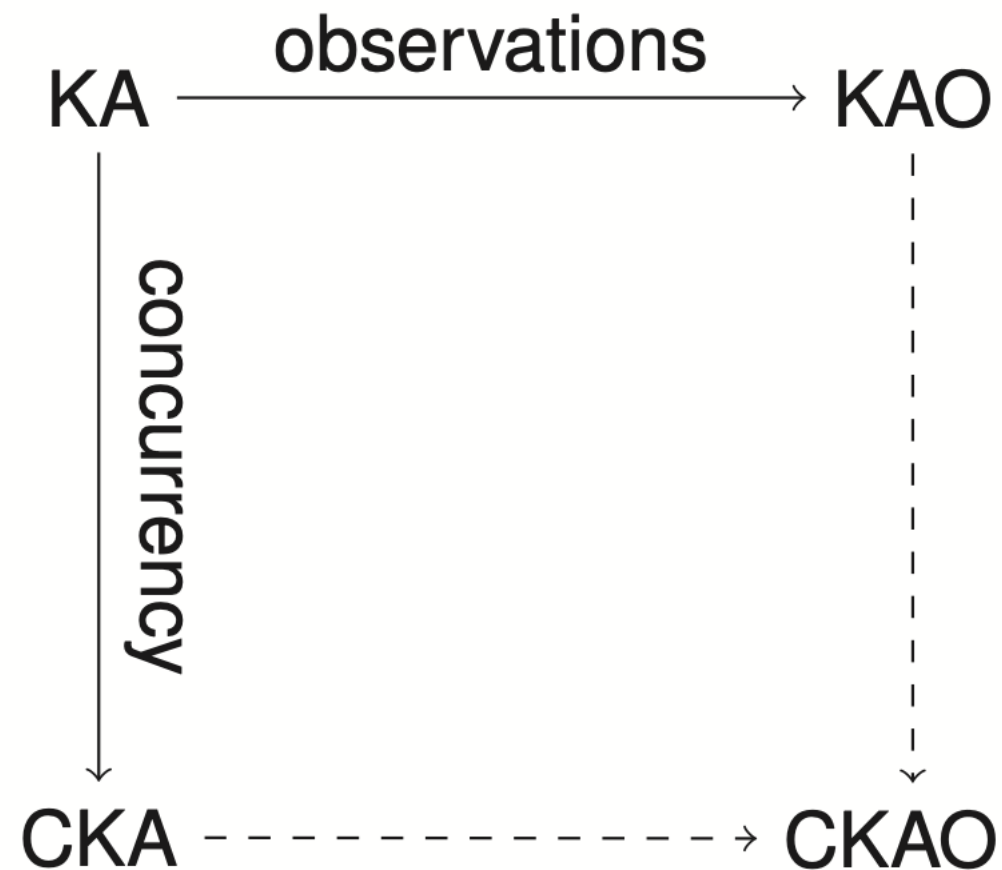


See also [Bergstra and Ponse 2011].

A new algebra

$$p \wedge q \equiv p \cdot q \rightsquigarrow p \wedge q \leq p \cdot q$$

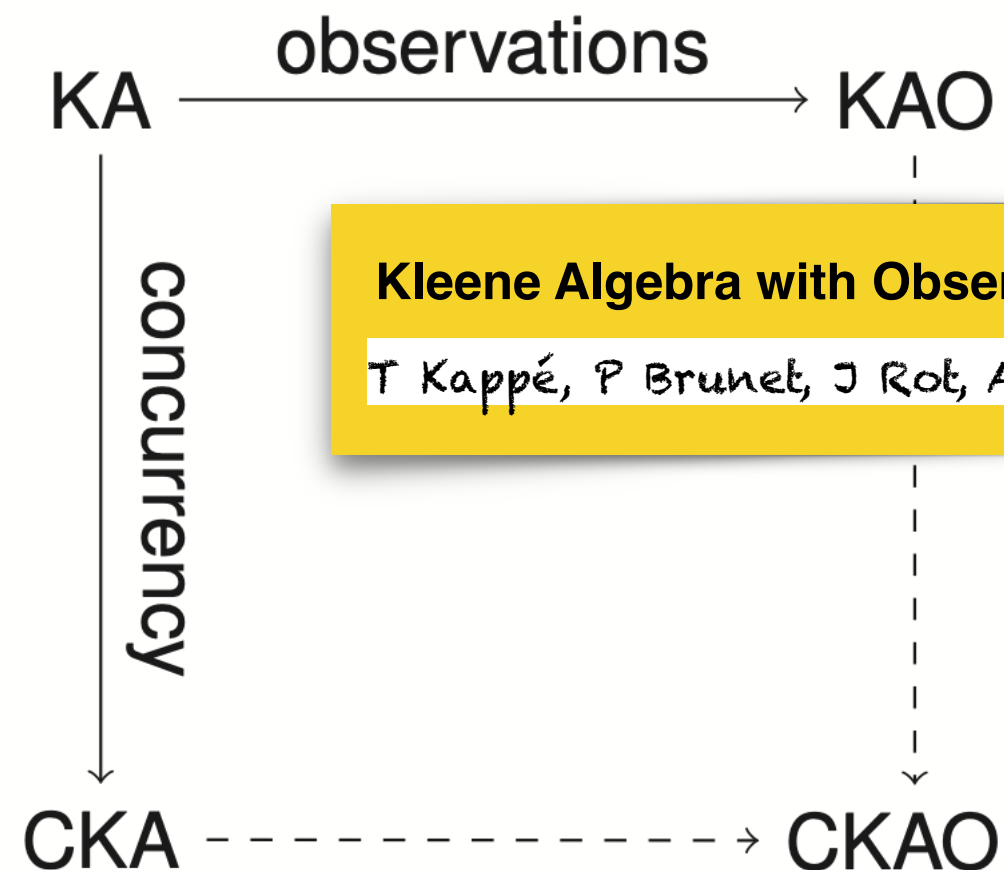
$$1 \equiv \top$$



A new algebra

$$p \wedge q \equiv p \cdot q \rightsquigarrow p \wedge q \leq p \cdot q$$

$$1 \not\equiv \top$$



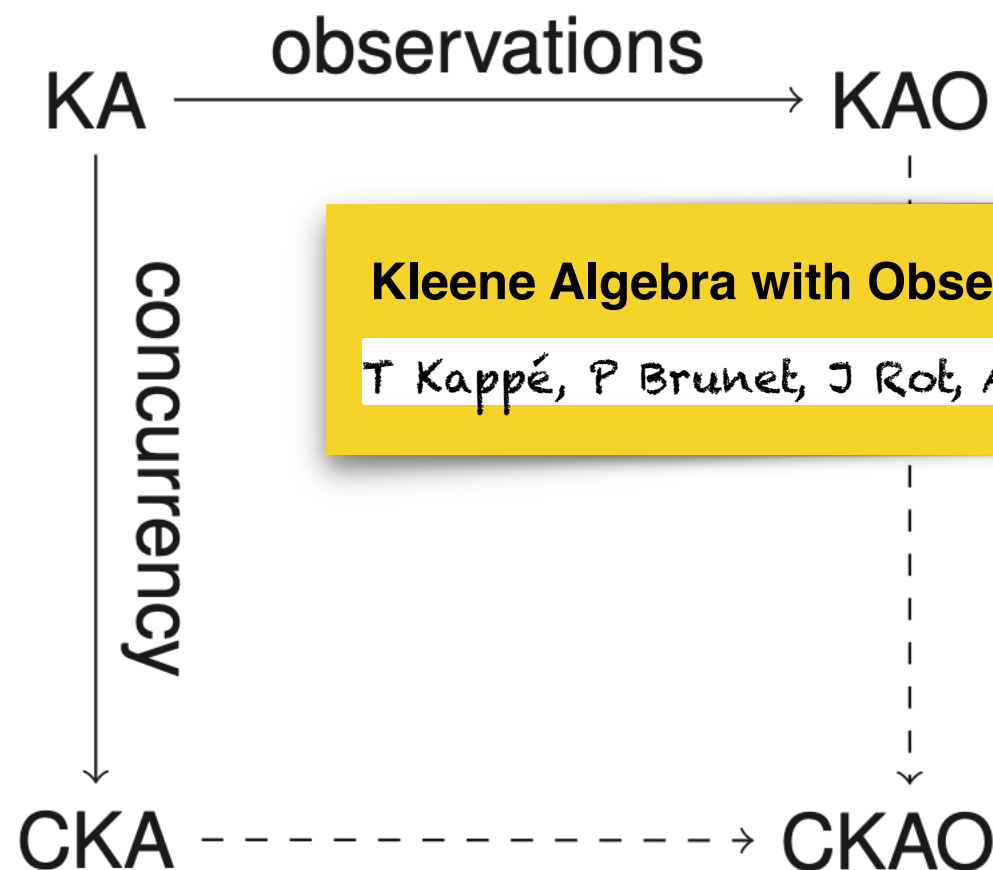
Kleene Algebra with Observations (CONCUR'19)

T Kappé, P Brunet, J Rot, A Silva, J Wagemaker, and F Zanasi

A new algebra

$$p \wedge q \equiv p \cdot q \rightsquigarrow p \wedge q \leq p \cdot q$$

$$1 \equiv \top$$



Kleene Algebra with Observations (CONCUR'19)

T Kappé, P Brunet, J Rot, A Silva, J Wagemaker, and F Zanasi

Concurrent Kleene Algebra with Observations: from Hypotheses to Completeness (Fossacs'20)

T Kappé, P Brunet, A Silva, J Wagemaker, and F Zanasi

CKAO

initial state: $x = 0, y = 0$	
T0	T1
a: $x \leftarrow 1$;	c: $y \leftarrow 1$;
b: $r1 \leftarrow y$;	d: $r2 \leftarrow x$;
assert: $0:r1 = 0 \wedge 1:r2 = 0$	

Can we reason about these programs (co)algebraically?

$$(x = 0 \wedge y = 0) \cdot (T0 \parallel T1) \leq \neg(r1 = 0 \wedge r2 = 0)$$

Axioms
KA+BA+CKA

Keep conjunction
and sequential
composition distinct

CKAO

initial state: $x = 0, y = 0$	
T0	T1
a: $x \leftarrow 1$;	c: $y \leftarrow 1$;
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Axioms
KA+BA+CKA

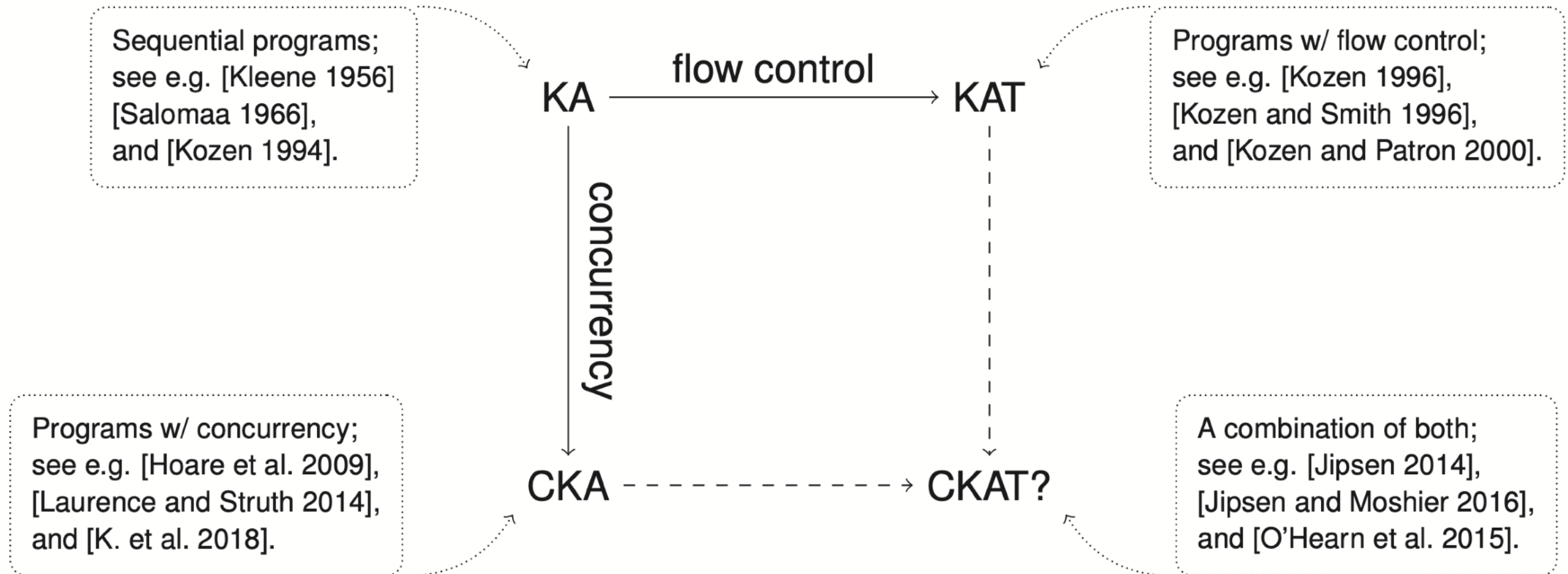
Keep conjunction
and sequential
composition distinct

Theorem 5.6 (Soundness and Completeness CKAO). *Let $e, f \in \mathcal{T}_{\text{CKAO}}$. The following holds:*

$$e \equiv_{\text{CKAO}} f \Leftrightarrow \llbracket e \rrbracket_{\text{CKAO}} = \llbracket f \rrbracket_{\text{CKAO}}.$$

Moreover, given $e, f \in \mathcal{T}$, it is decidable whether $\llbracket e \rrbracket_{\text{CKAO}} = \llbracket f \rrbracket_{\text{CKAO}}$.

Conclusions

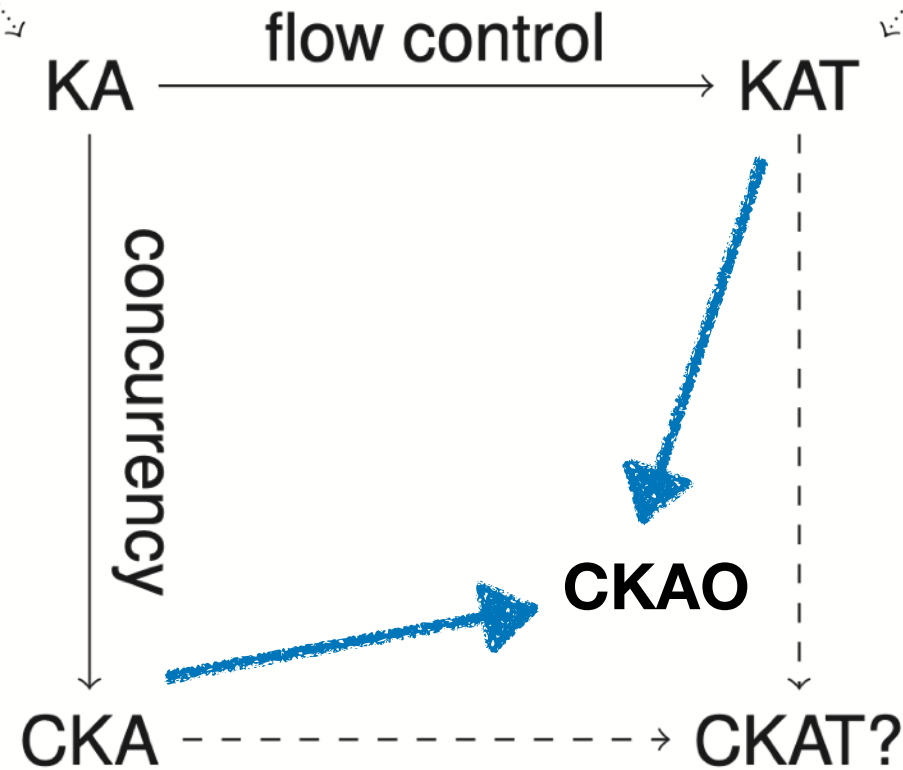


Conclusions

A (co)algebraic framework to analyse programs with concurrency and control flow

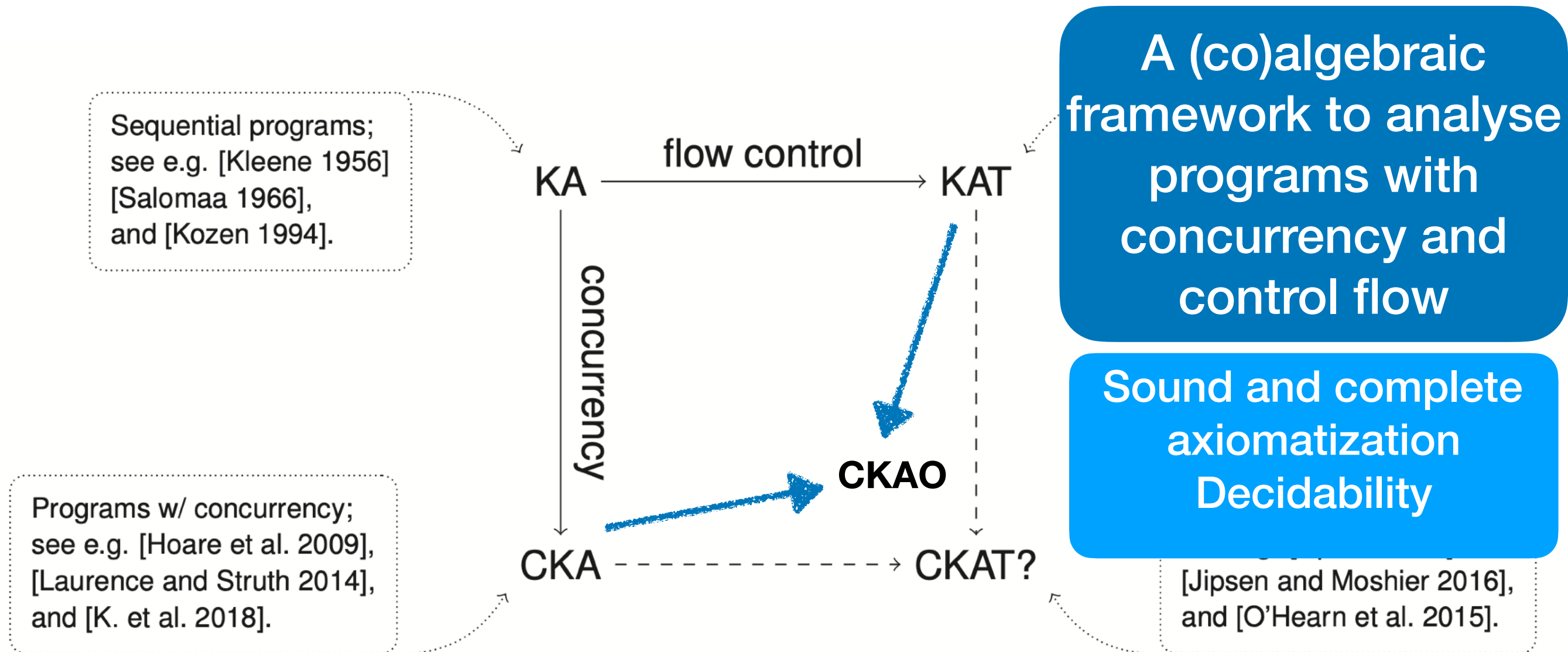
Sequential programs;
see e.g. [Kleene 1956]
[Salomaa 1966],
and [Kozen 1994].

Programs w/ concurrency;
see e.g. [Hoare et al. 2009],
[Laurence and Struth 2014],
and [K. et al. 2018].



A combination of both;
see e.g. [Jipsen 2014],
[Jipsen and Moshier 2016],
and [O'Hearn et al. 2015].

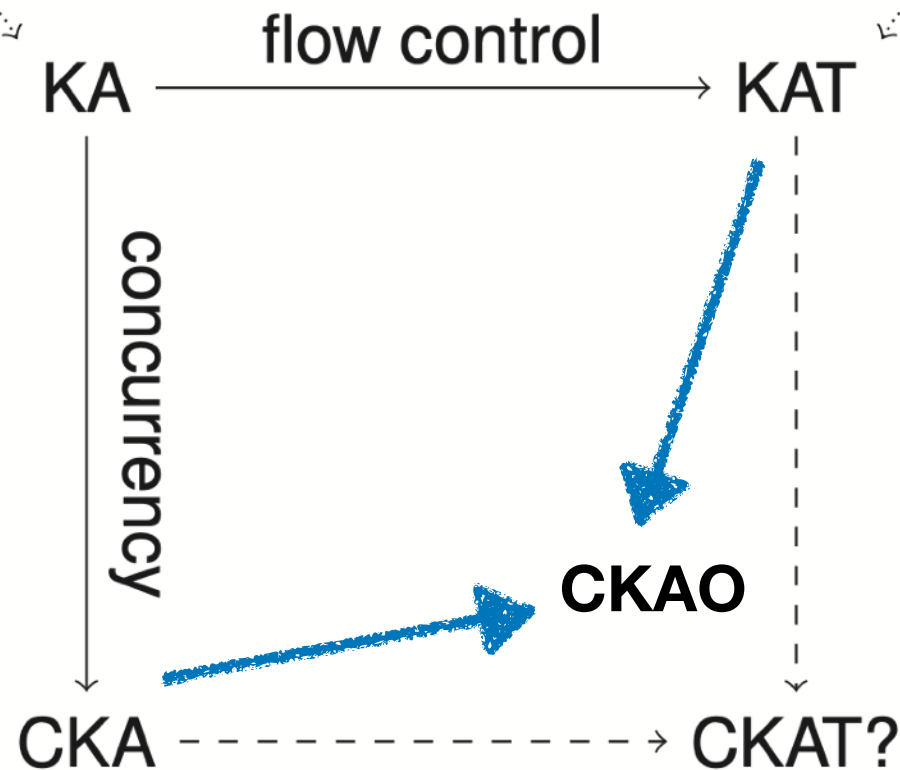
Conclusions



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Sequential programs;
see e.g. [Kleene 1956]
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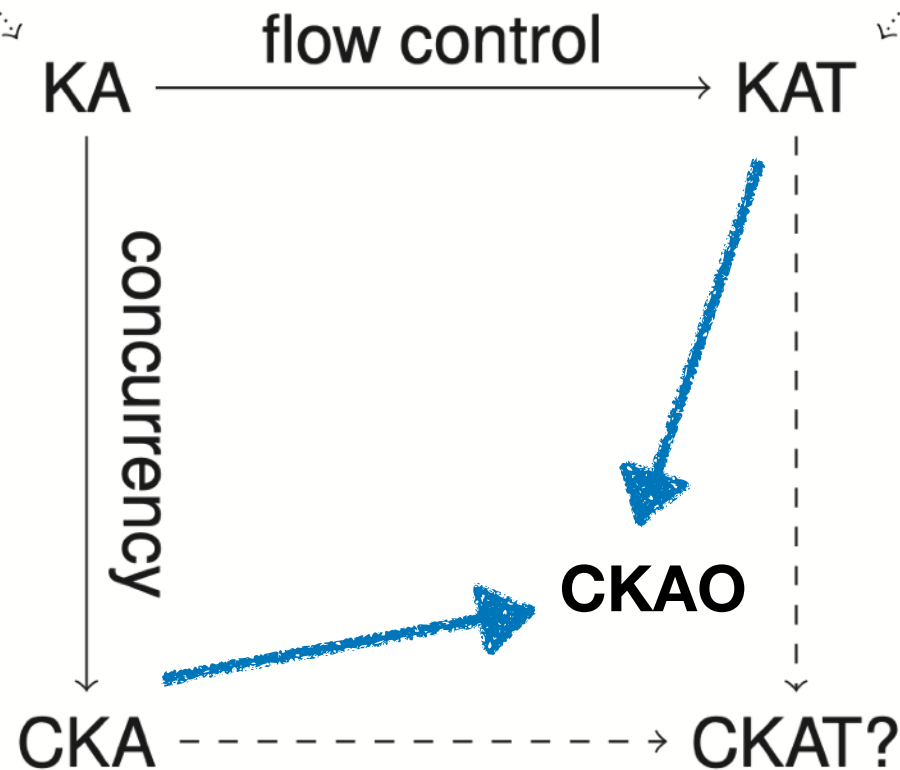
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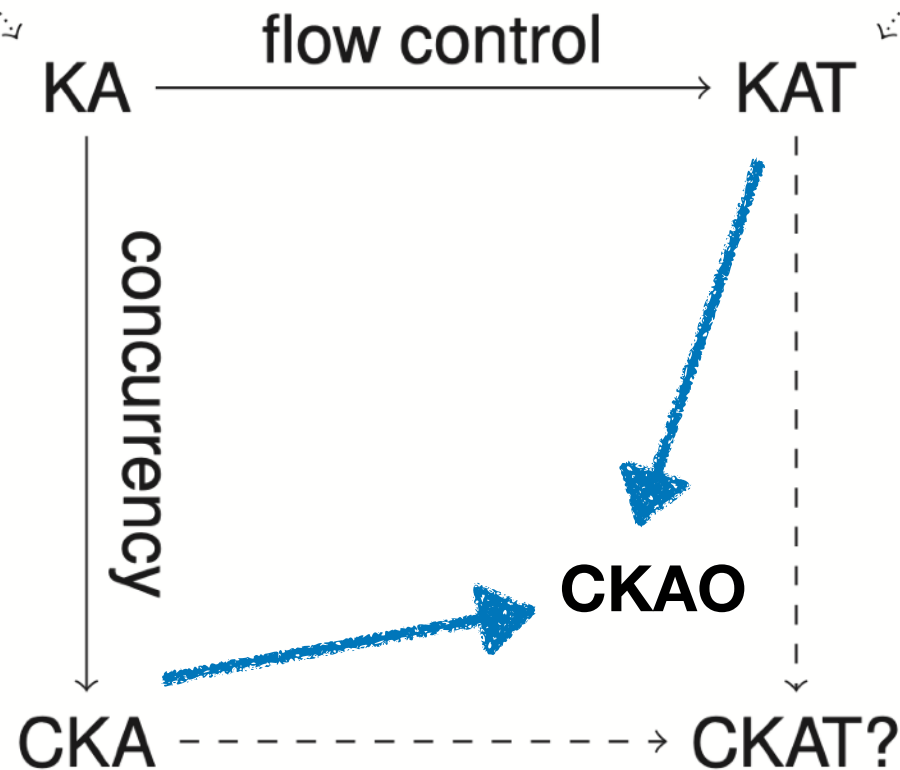
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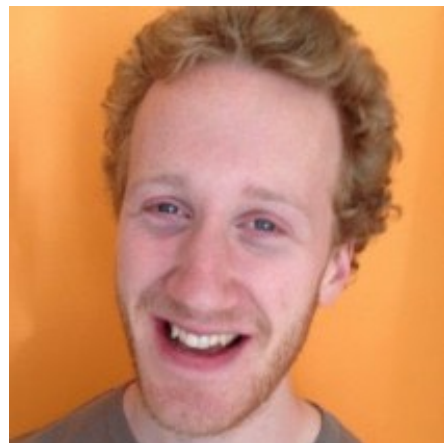
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Questions?

Credits



GoNeCo
<http://coneco-project.org>