



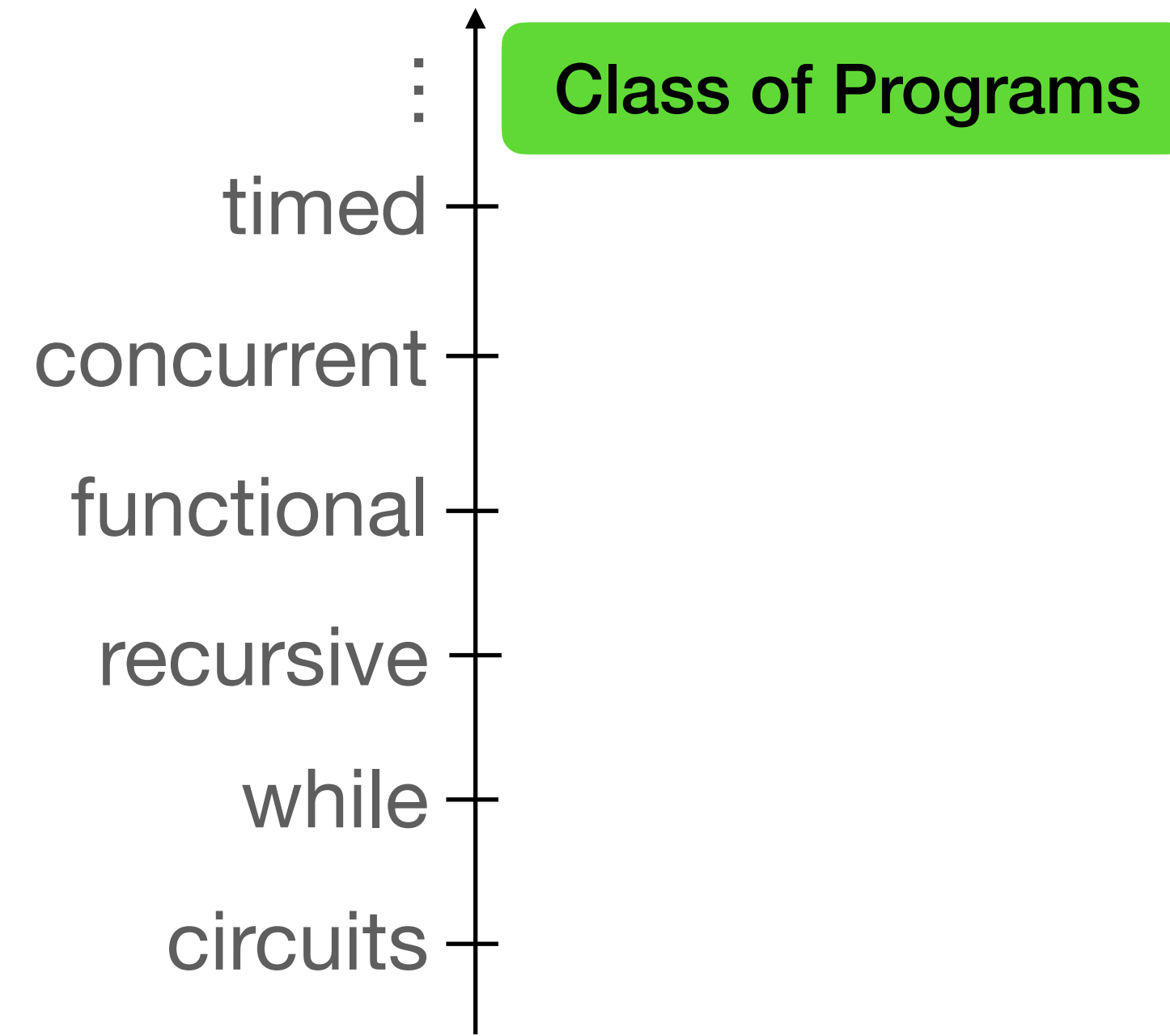
Color coding ahead!

IC3

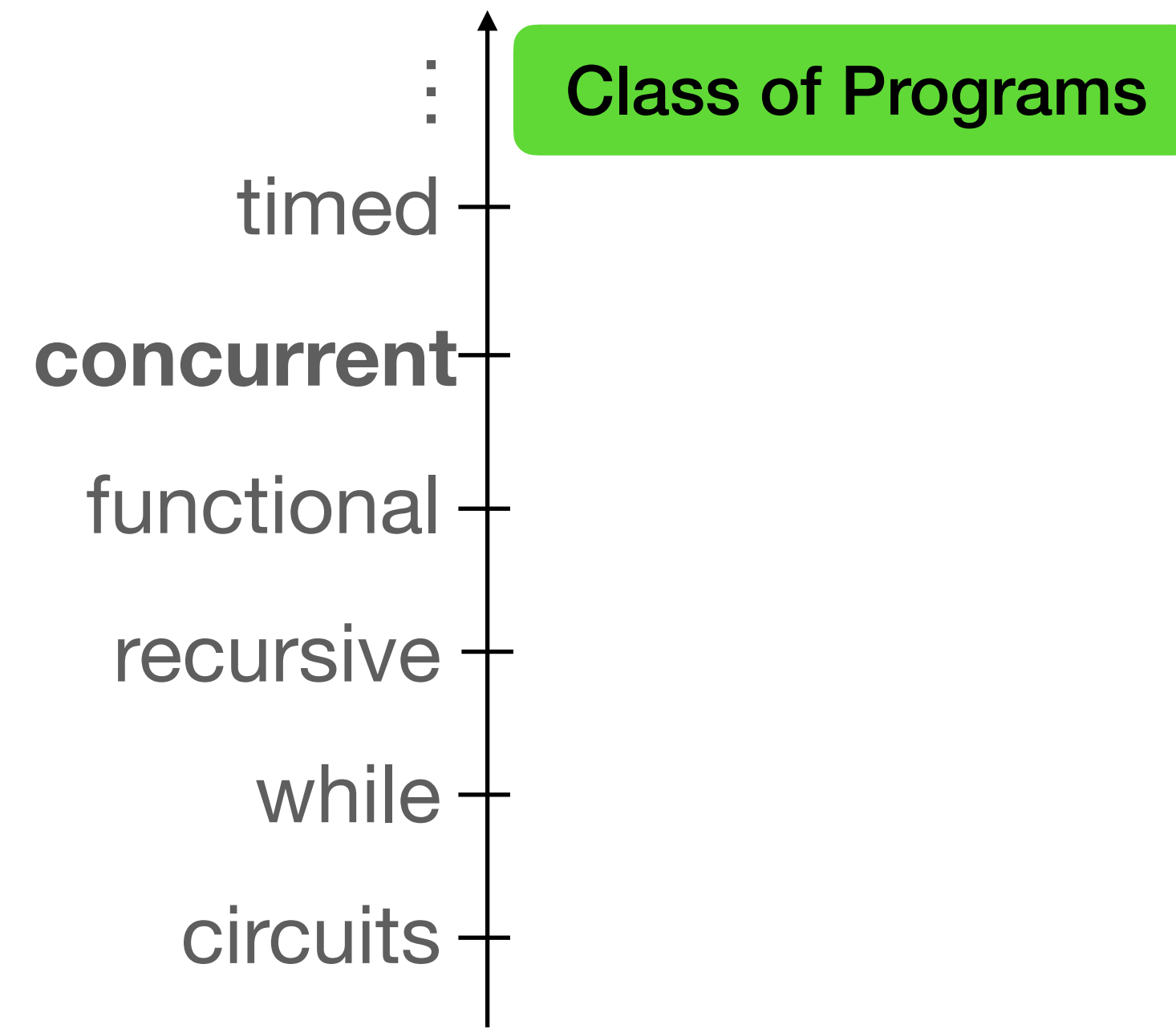
Incremental **C**onstruction of **I**nductive **C**lauses for **I**ndubitable **C**orrectness

Roland Meyer, TU Braunschweig

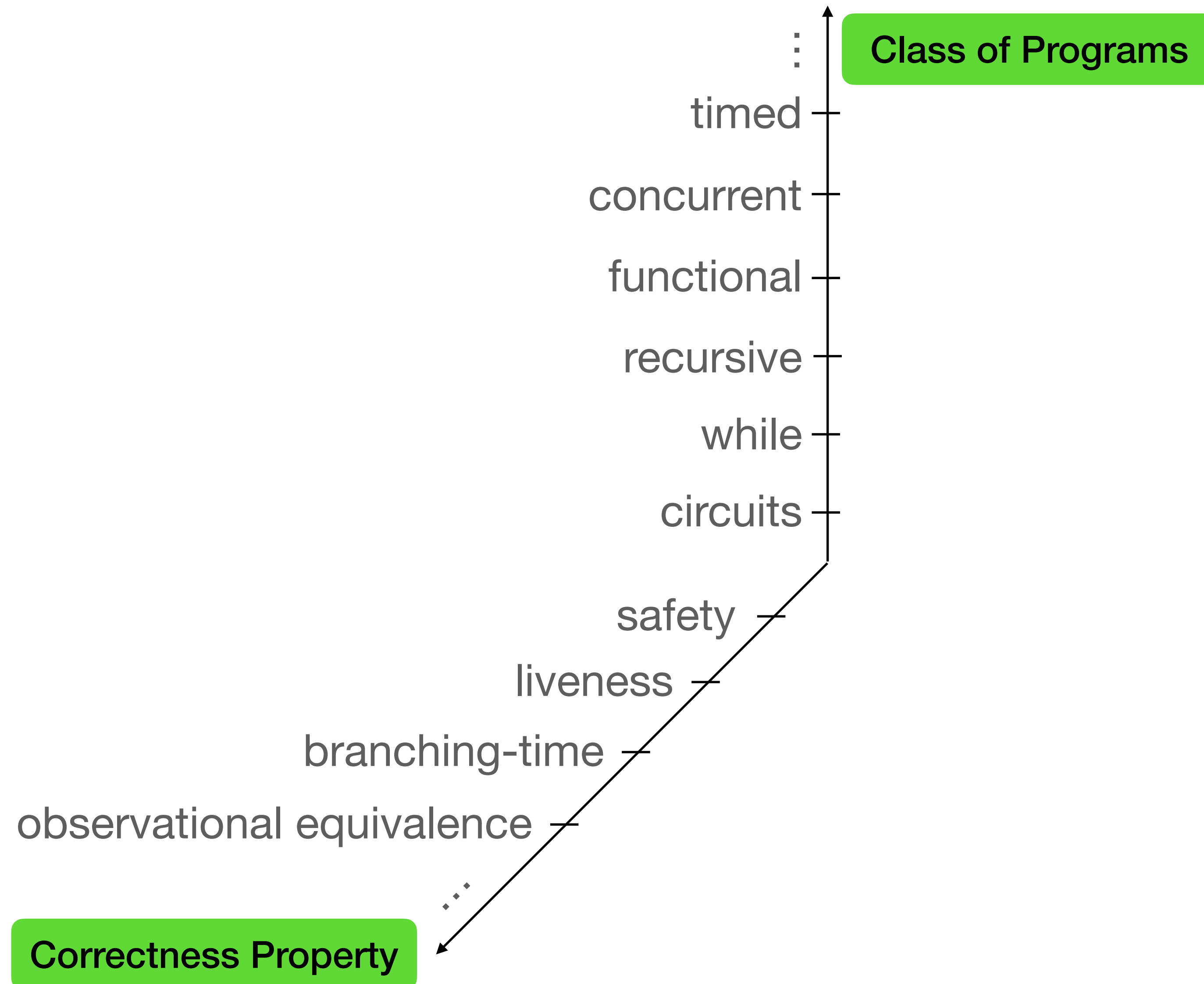
Program Verification



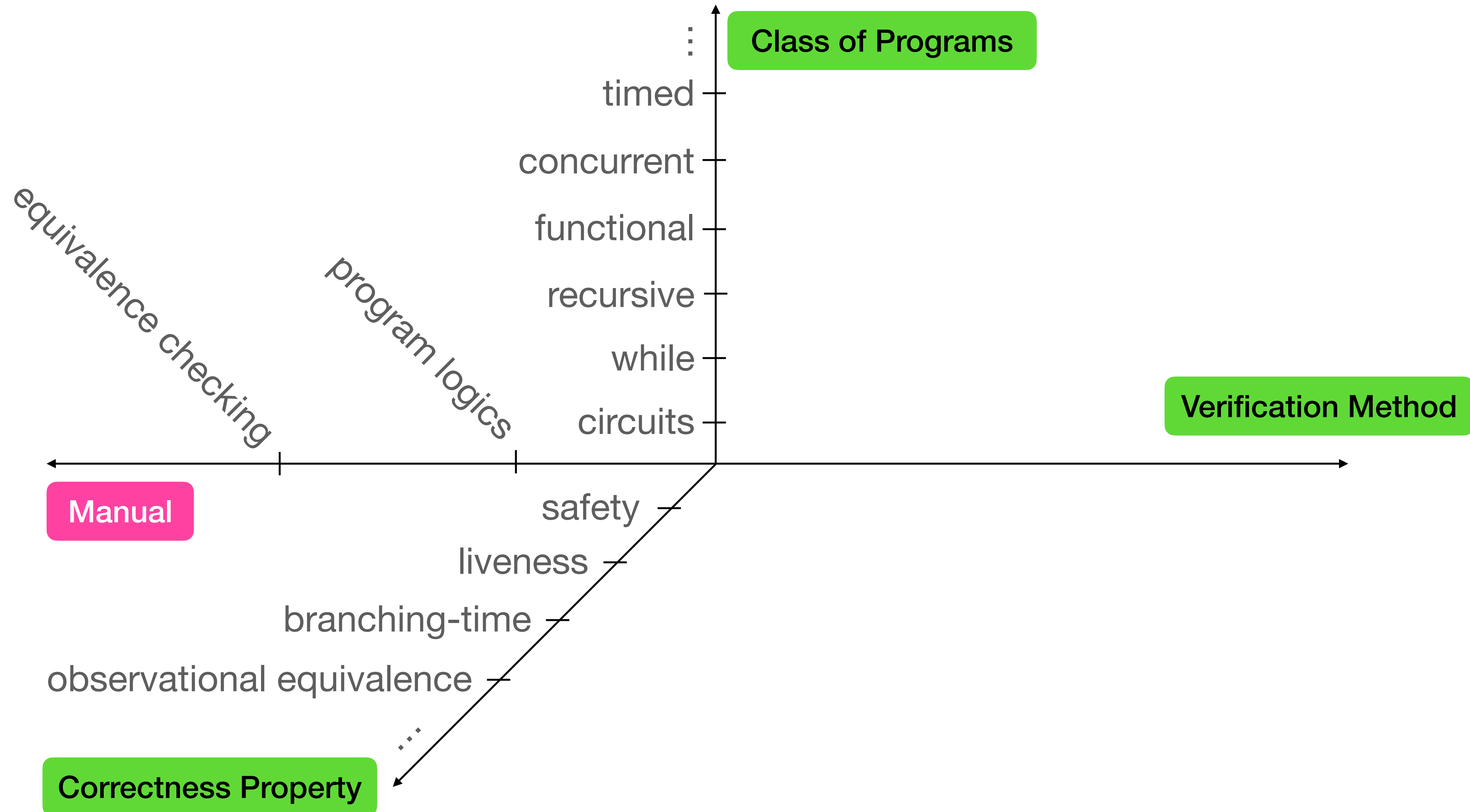
Program Verification



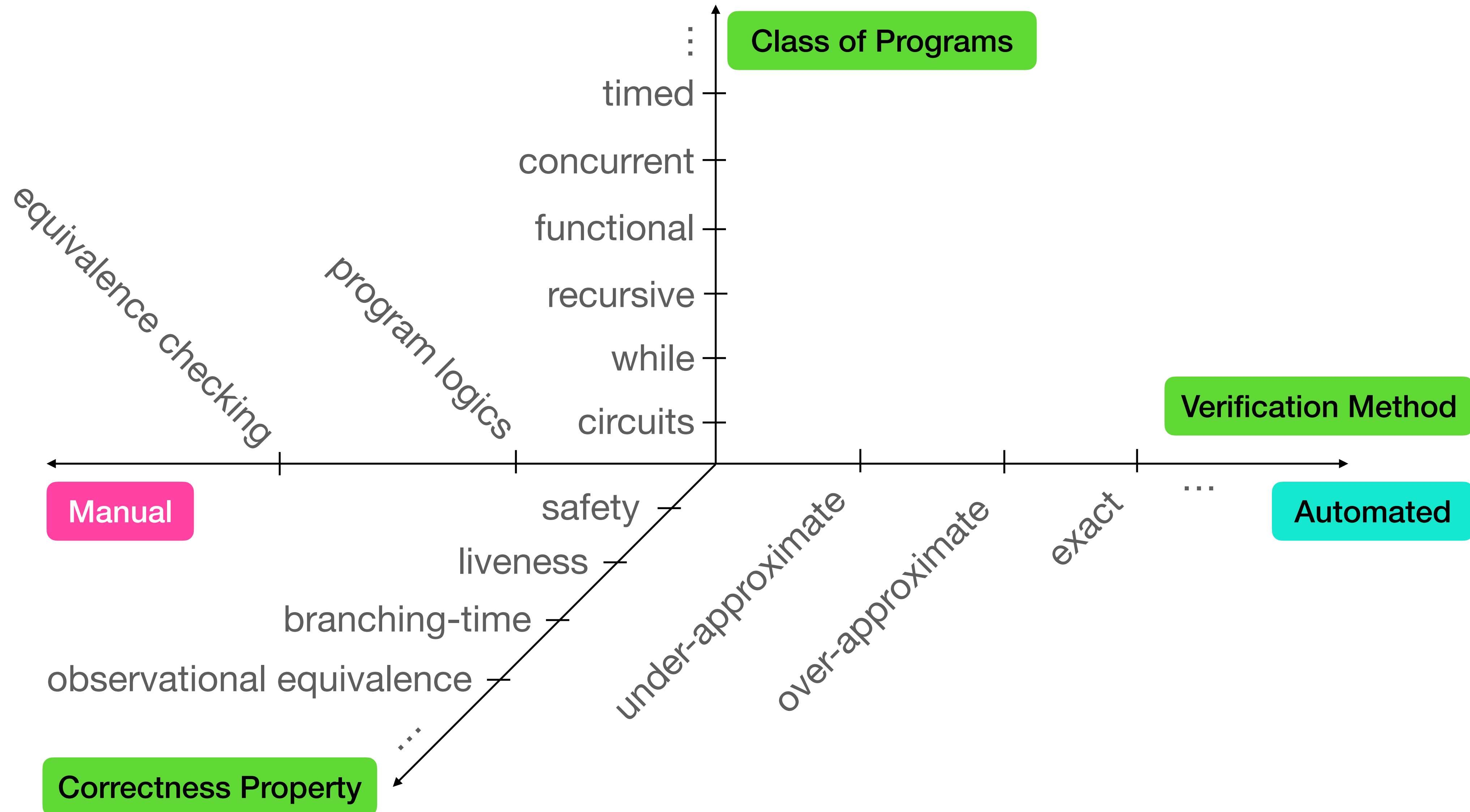
Program Verification



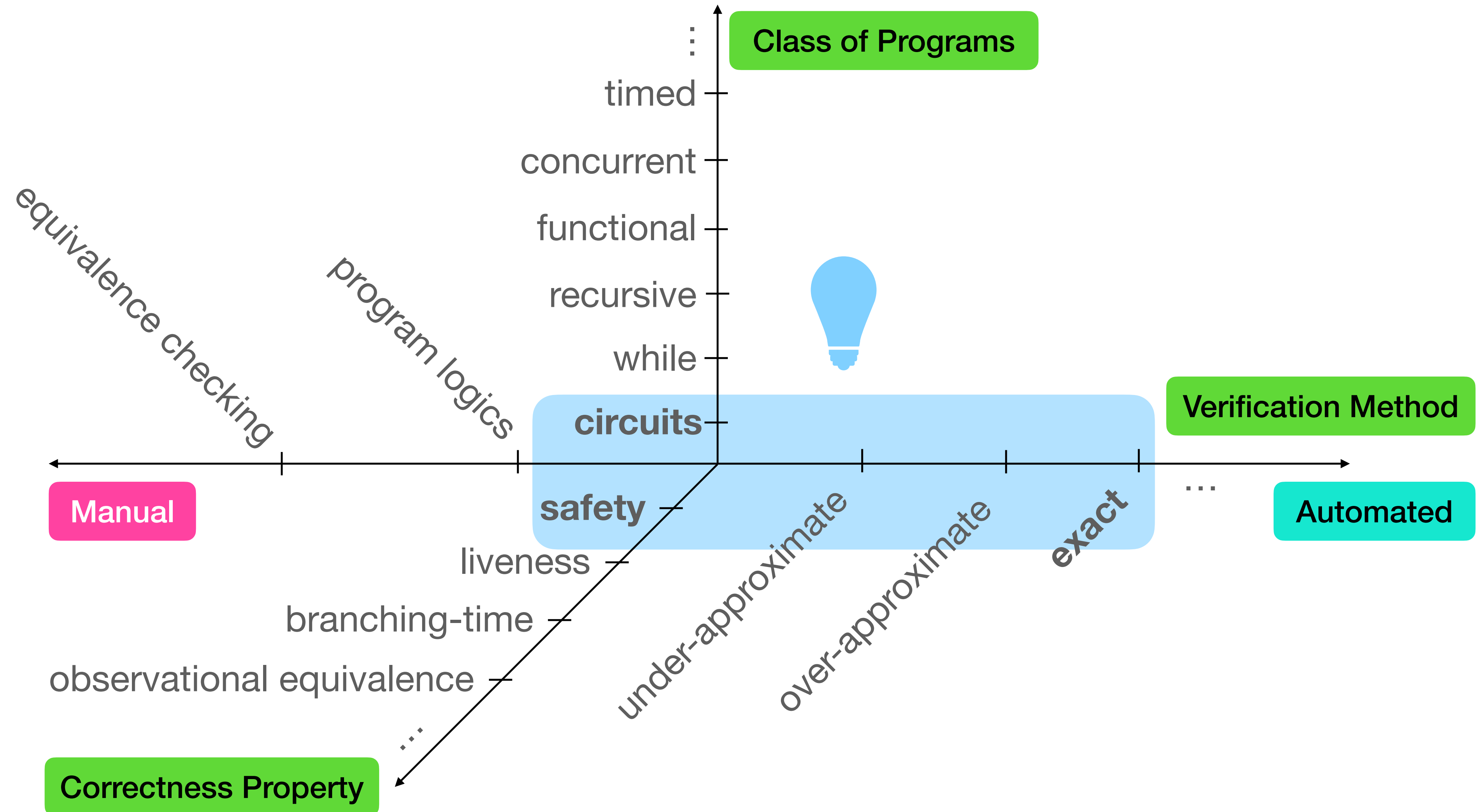
Program Verification



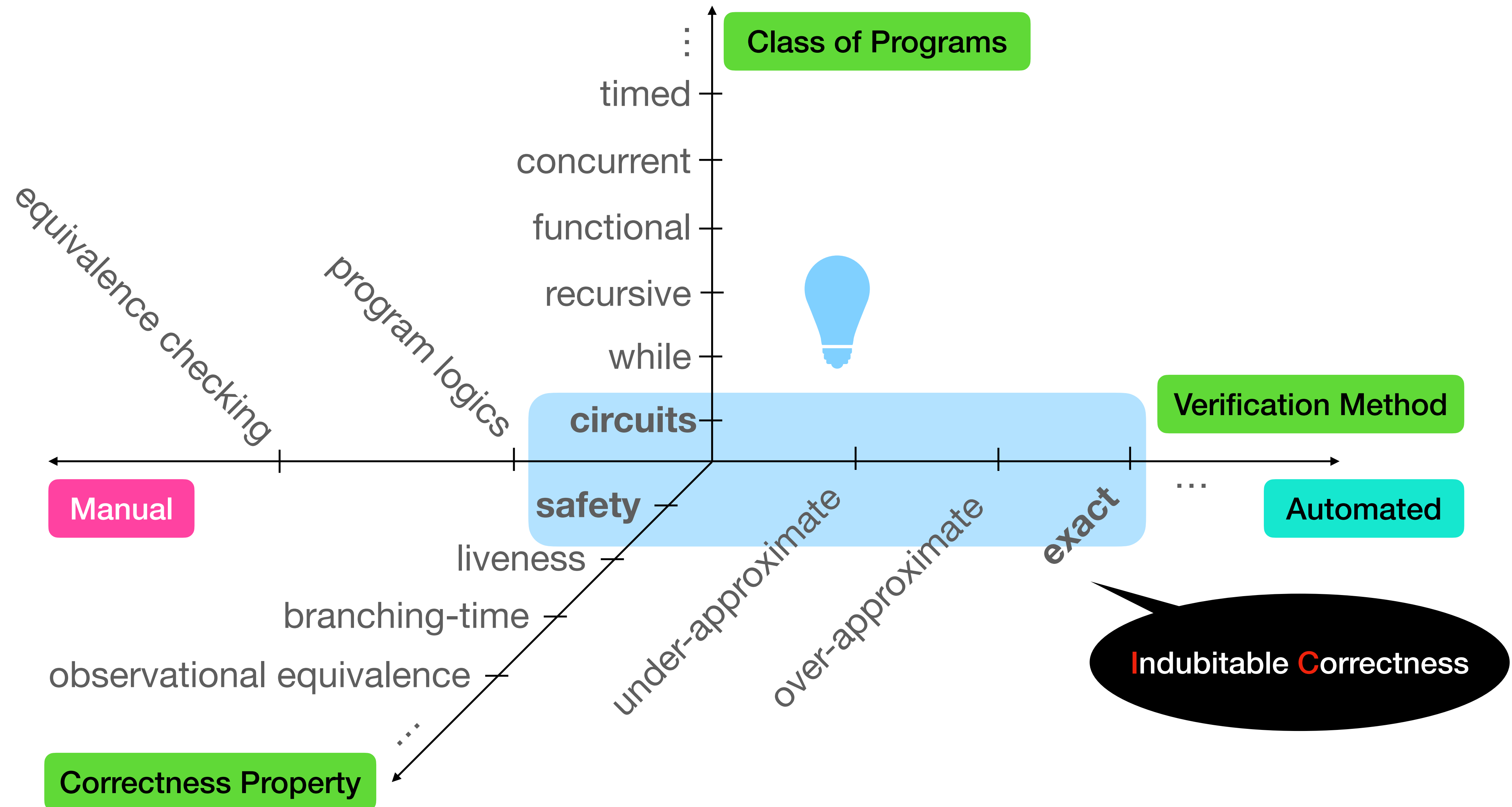
Program Verification



Program Verification

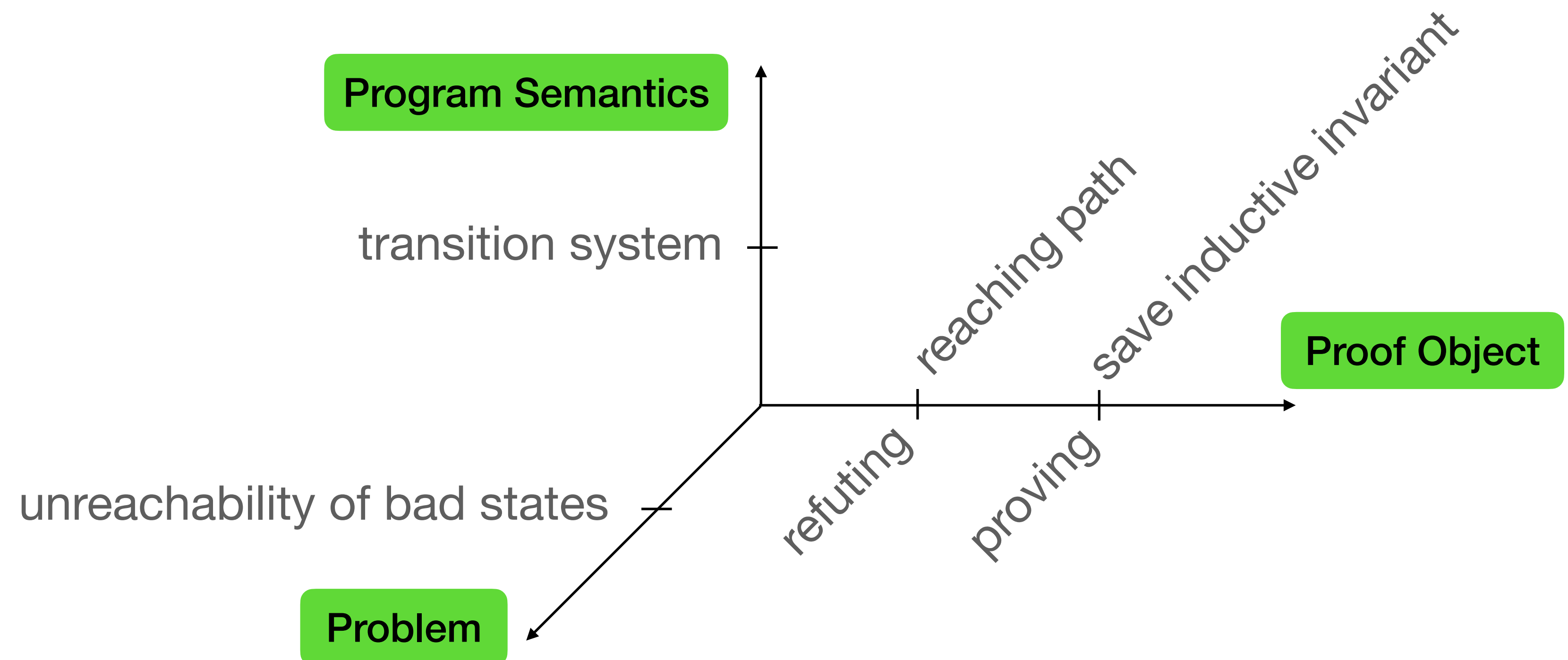


Program Verification



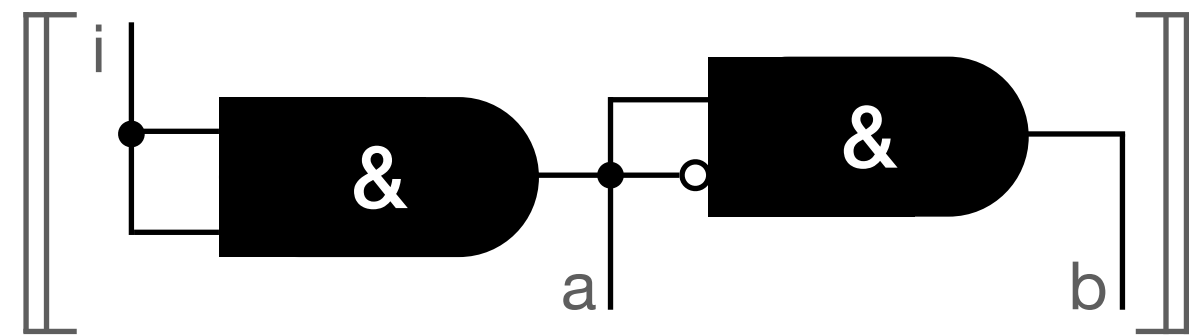
Automated Safety Verification

Recap

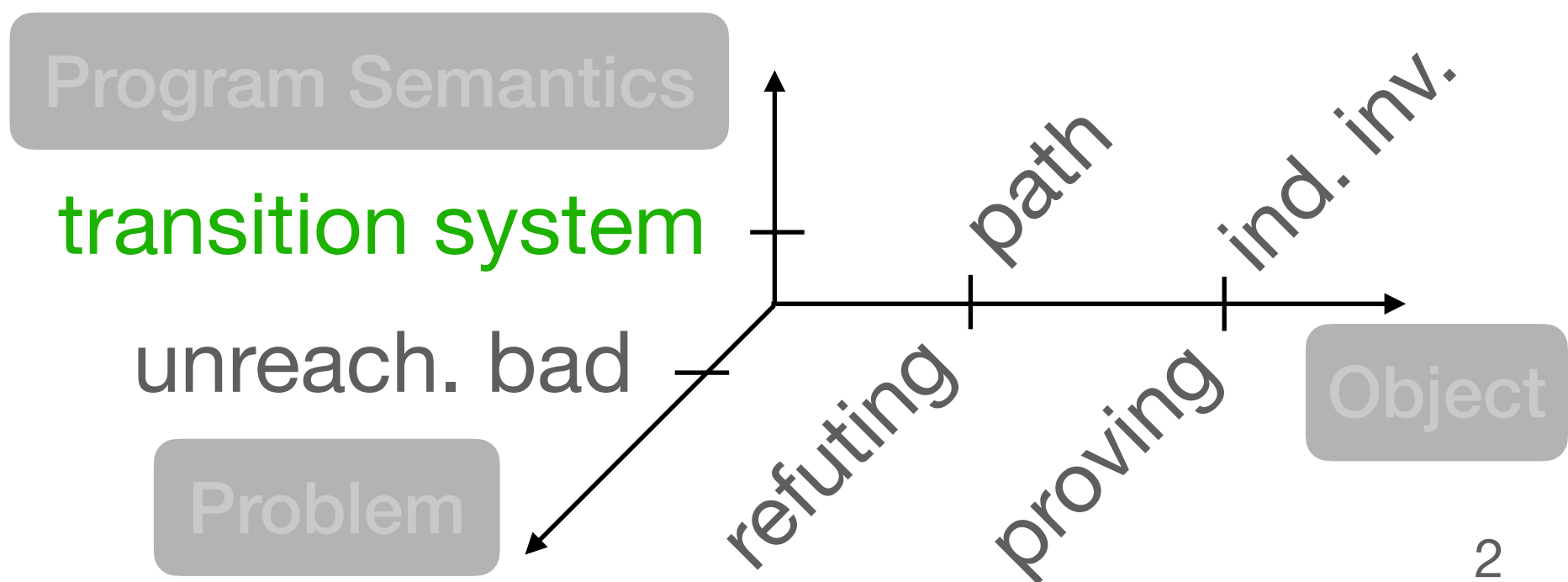


Automated Safety Verification

Transition System:

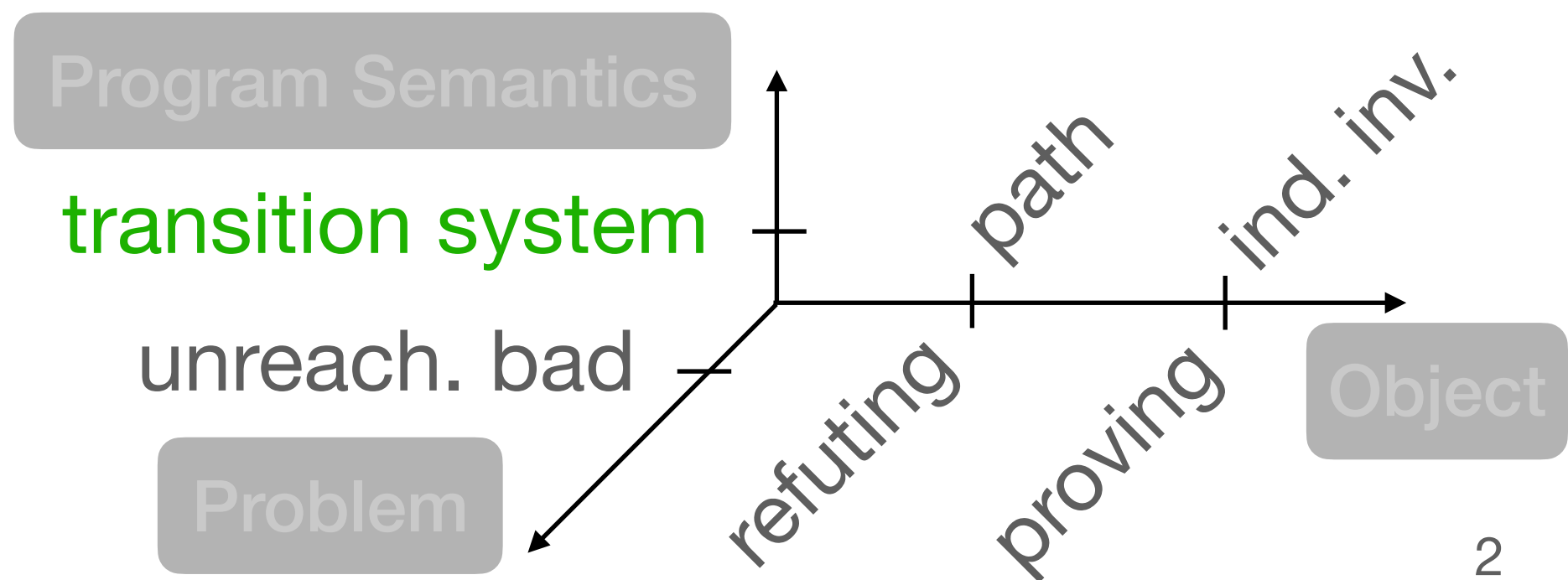
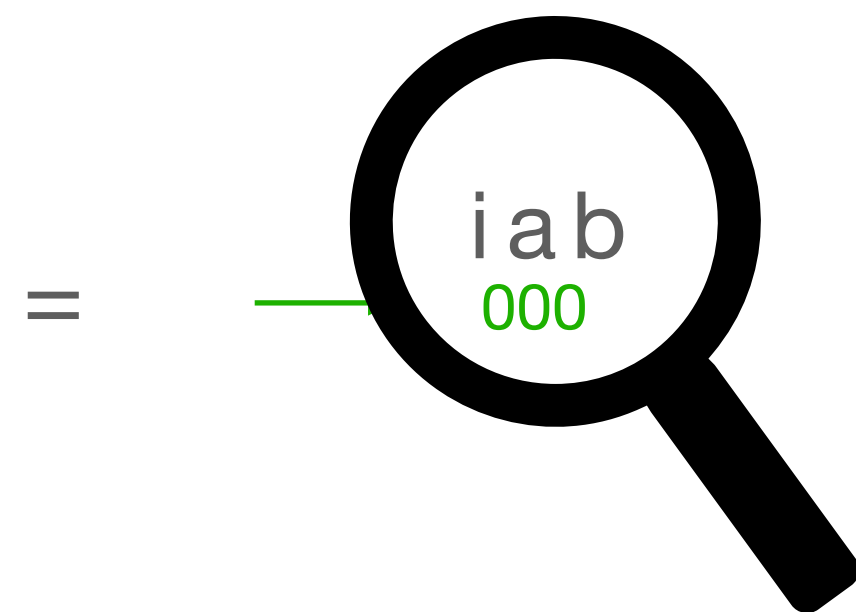
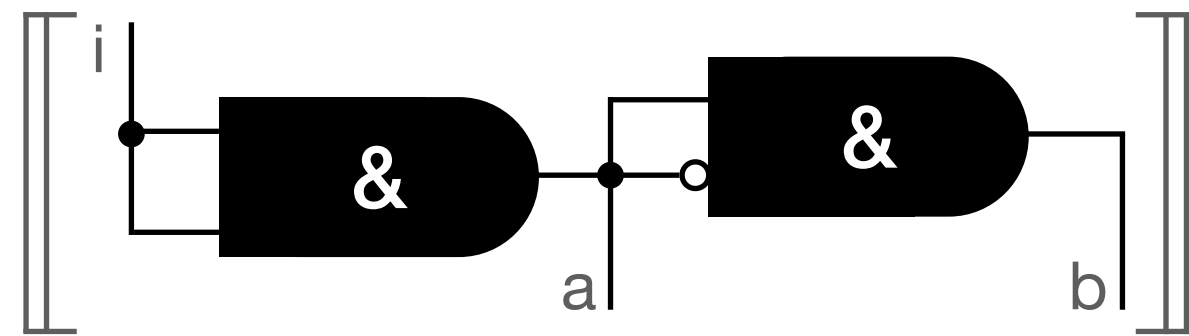


= $\xrightarrow{\text{green}}$ 000



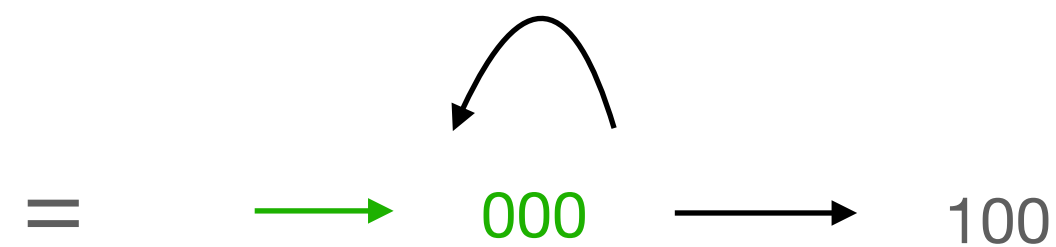
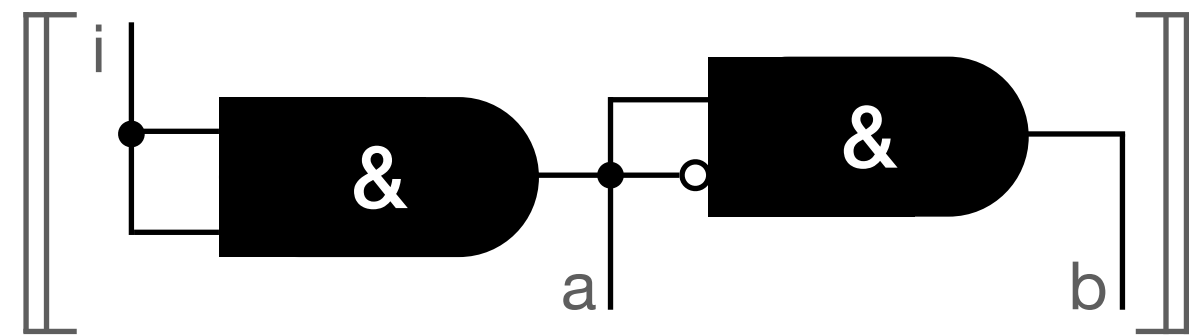
Automated Safety Verification

Transition System:



Automated Safety Verification

Transition System:



Program Semantics

transition system

unreach. bad

Problem

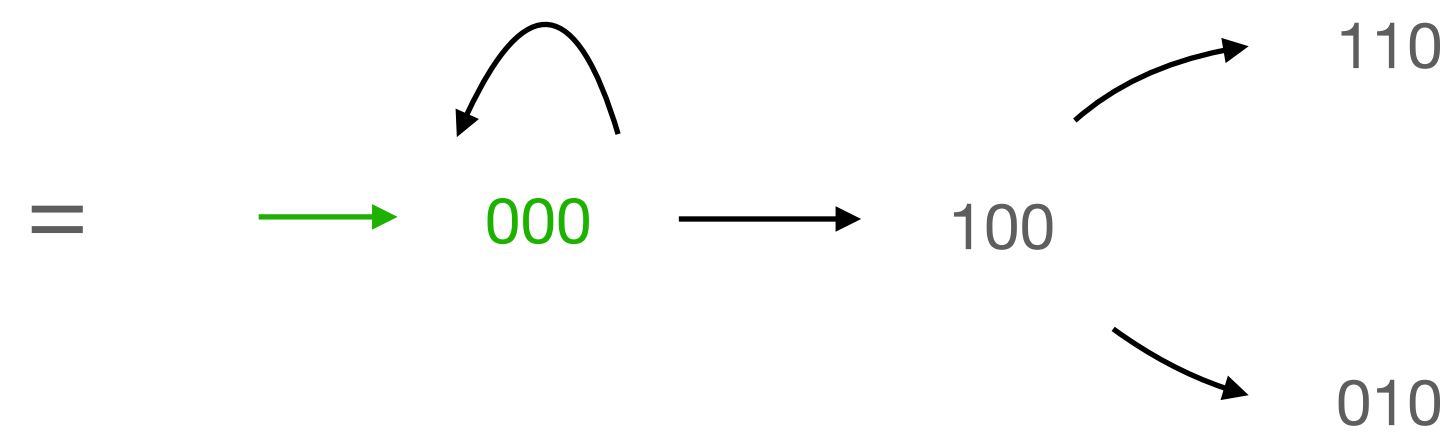
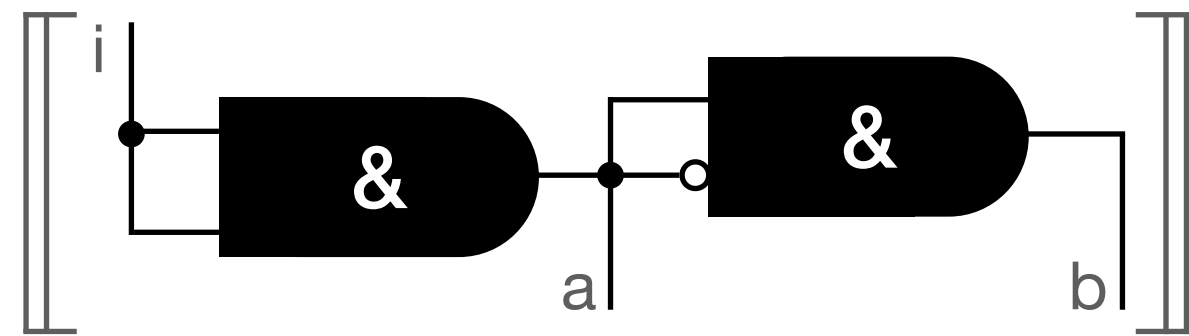
refuting

proving

Object

Automated Safety Verification

Transition System:



Program Semantics

transition system

unreach. bad

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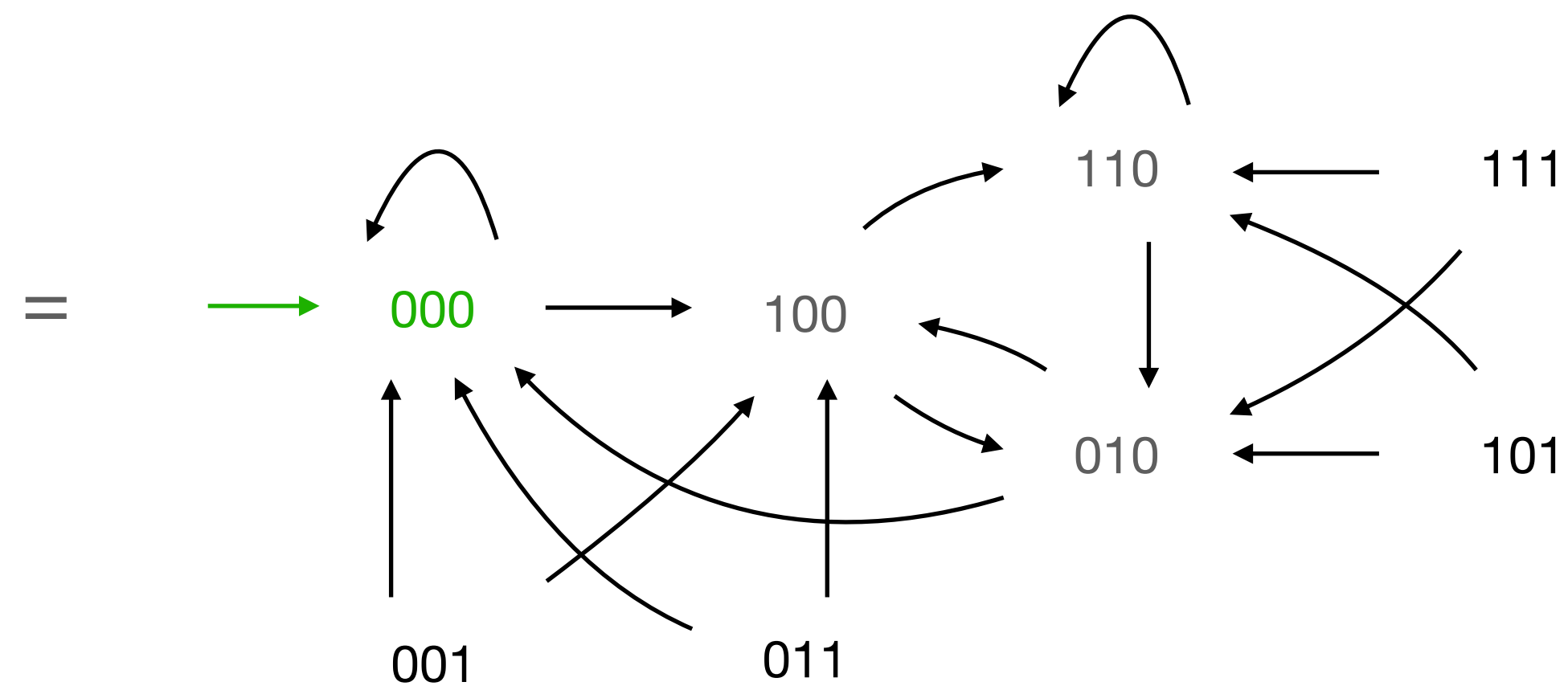
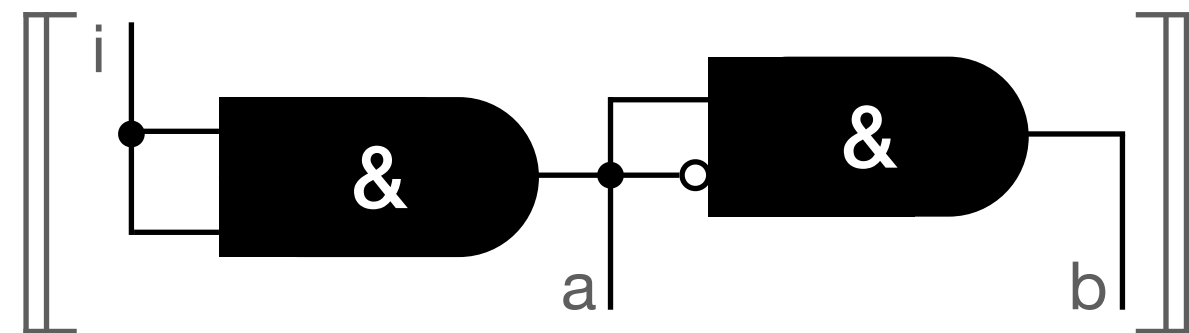
refuting

proving

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Automated Safety Verification

Transition System:



Program Semantics

transition system

unreach. bad

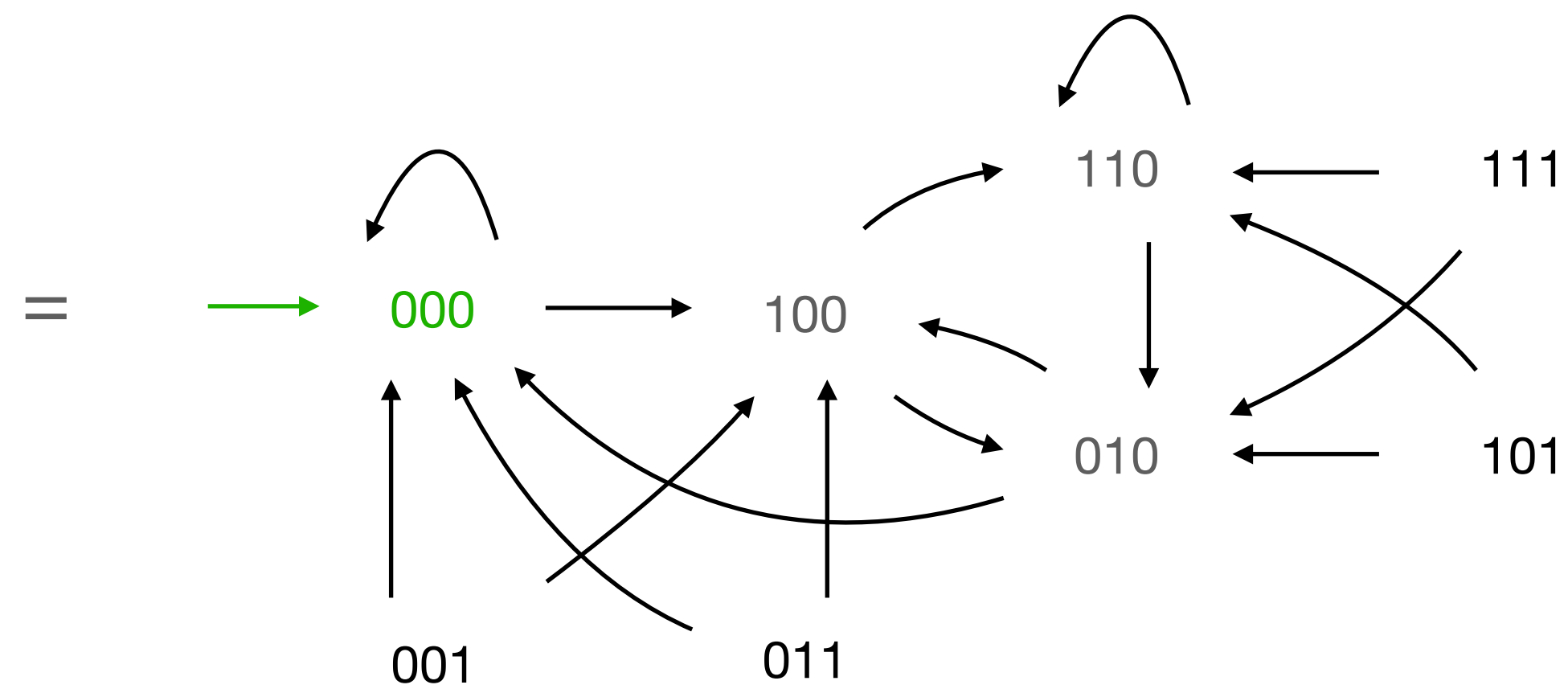
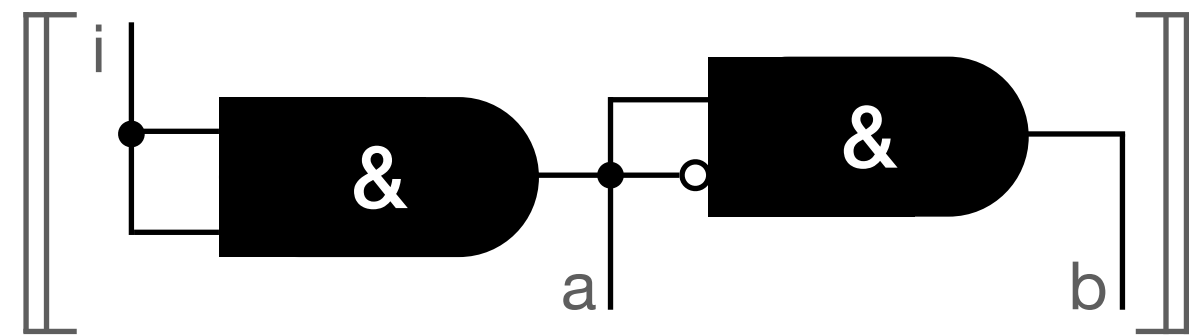
Problem

refuting proving path ind. inv.

Object

Automated Safety Verification

Transition System:



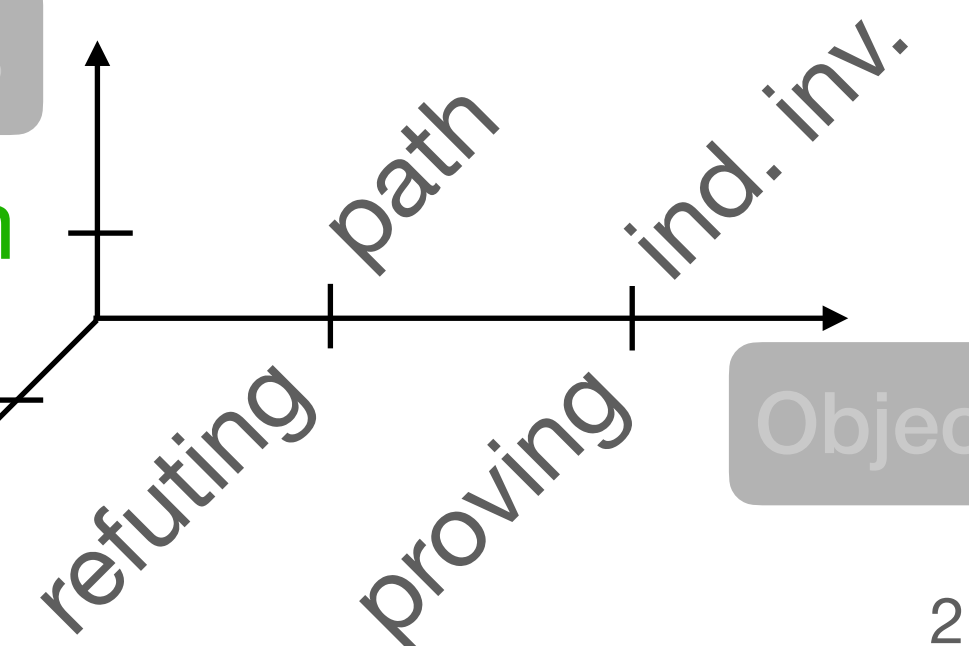
= (States, **Init**, post)

Program Semantics

transition system

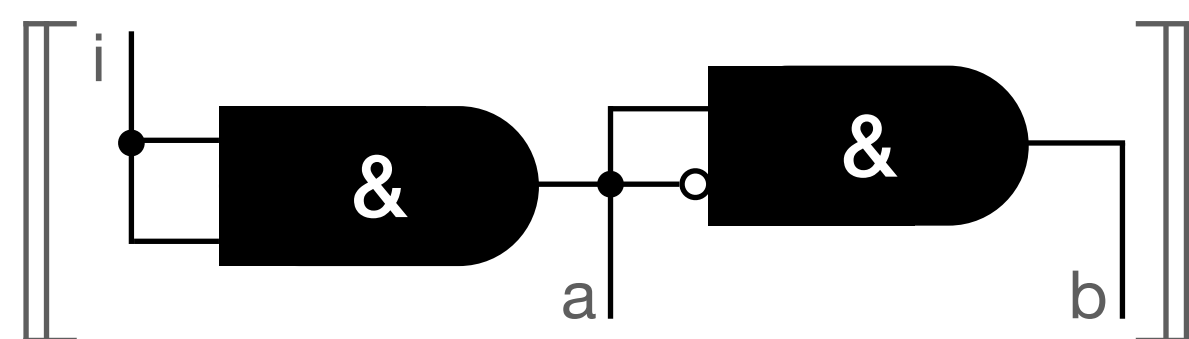
unreach. bad

Problem



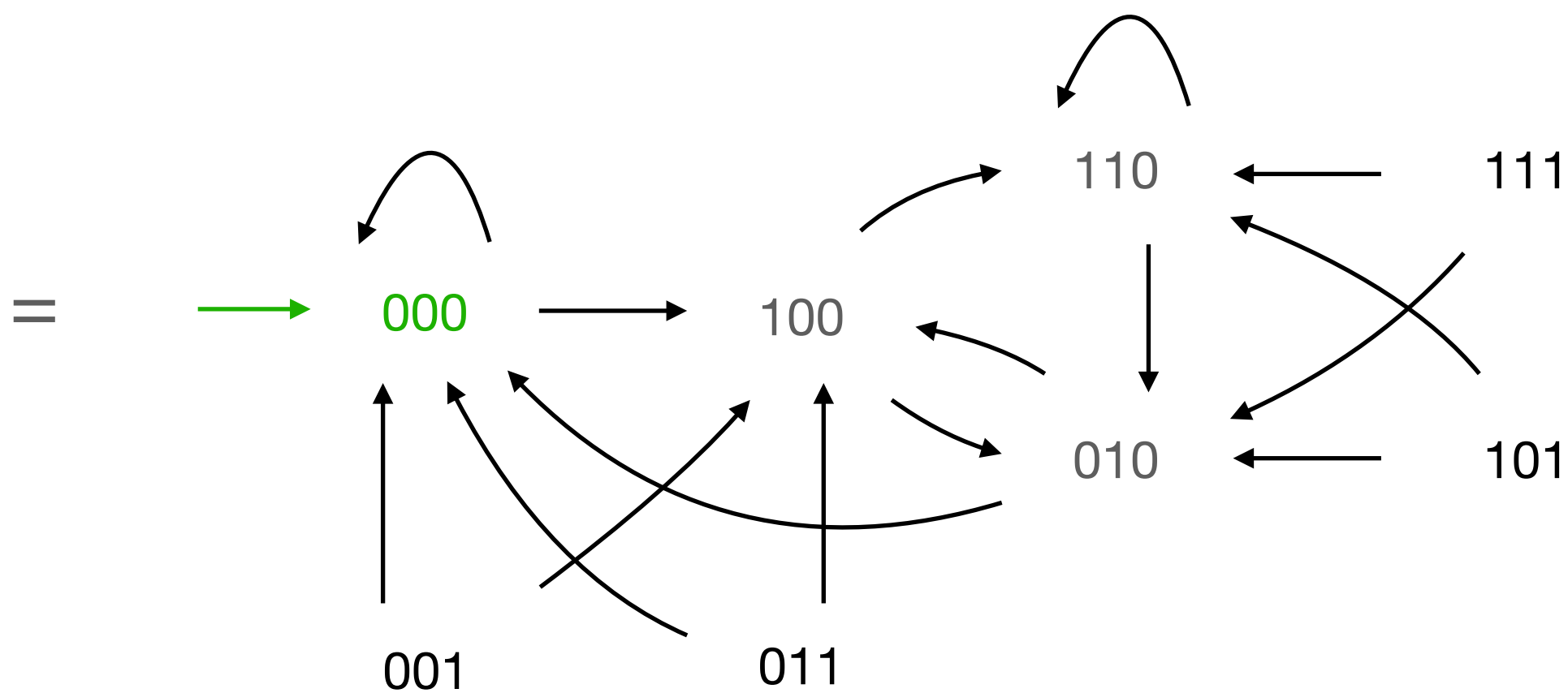
Automated Safety Verification

Transition System:

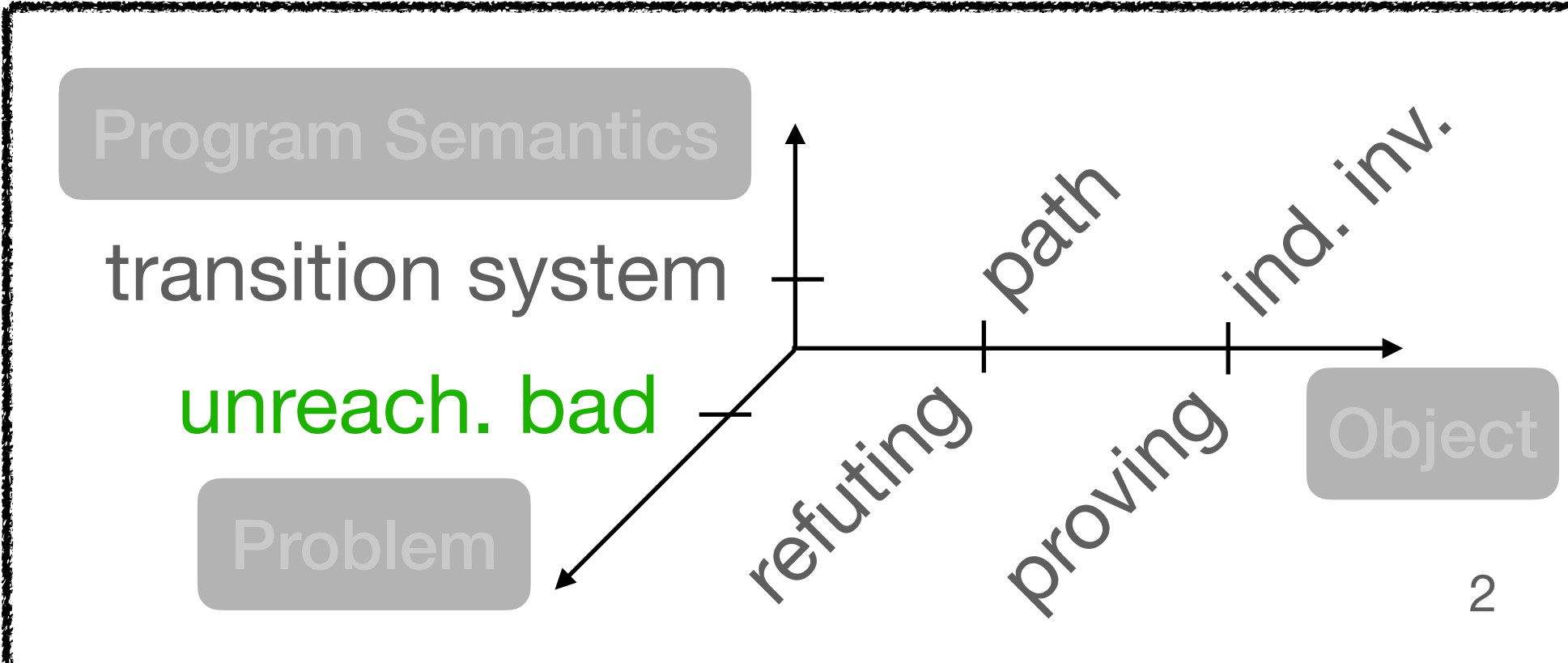


Reachable States:

$$\text{post}^*(\text{Init}) = \bigcup_{i \in \mathbb{N}} \text{post}^i(\text{Init}) \subseteq \text{States}$$

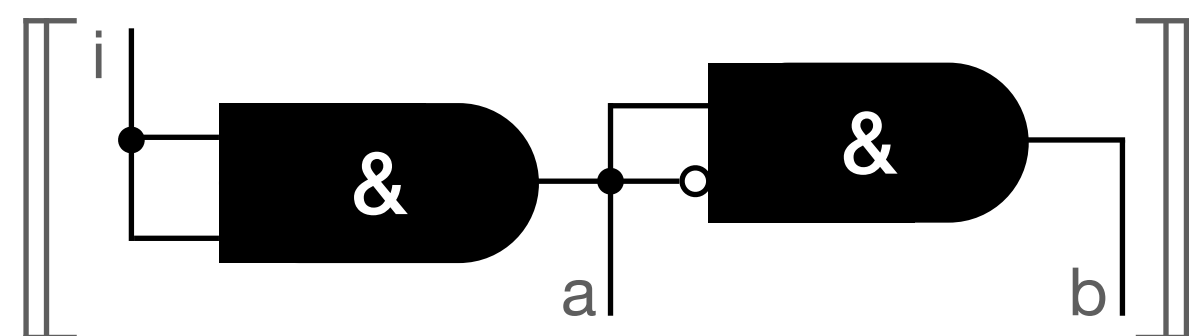


$$= (\text{States}, \text{Init}, \text{post})$$



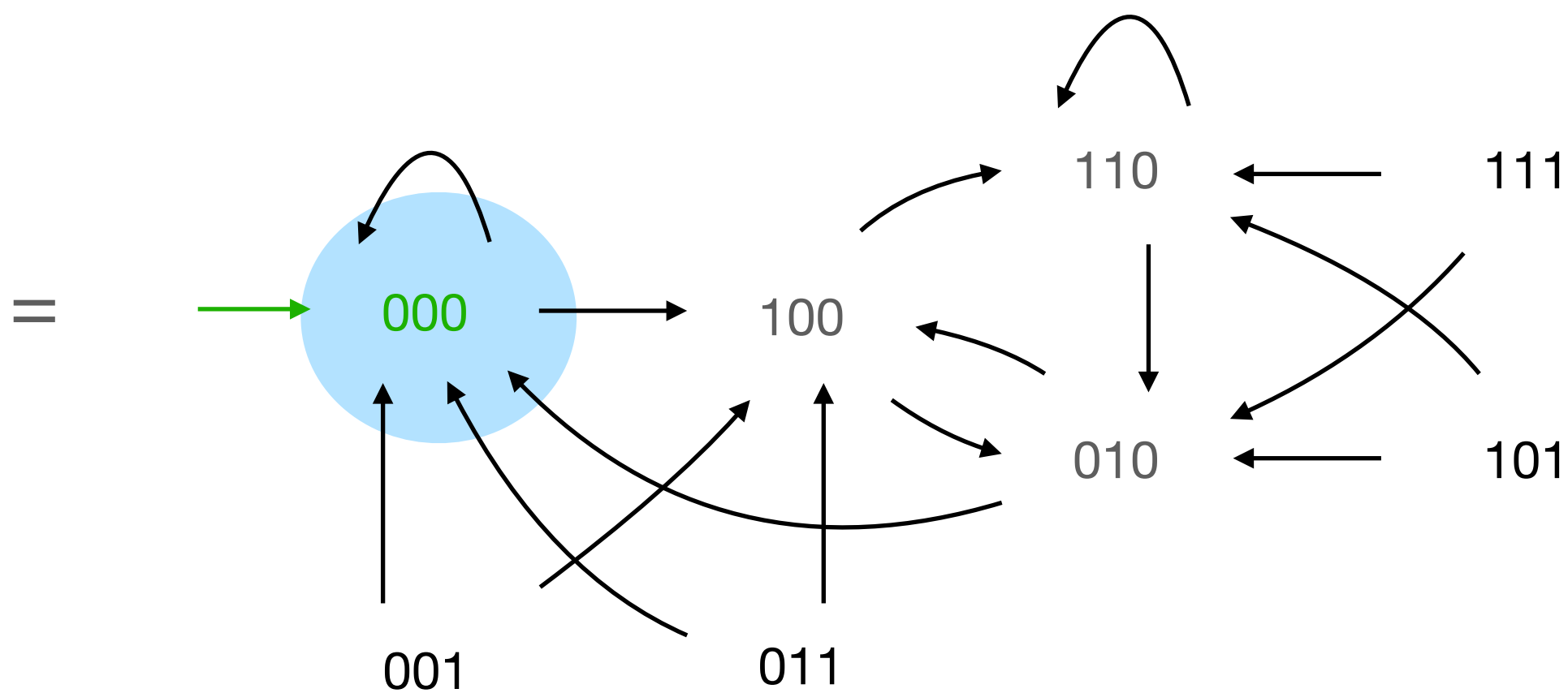
Automated Safety Verification

Transition System:

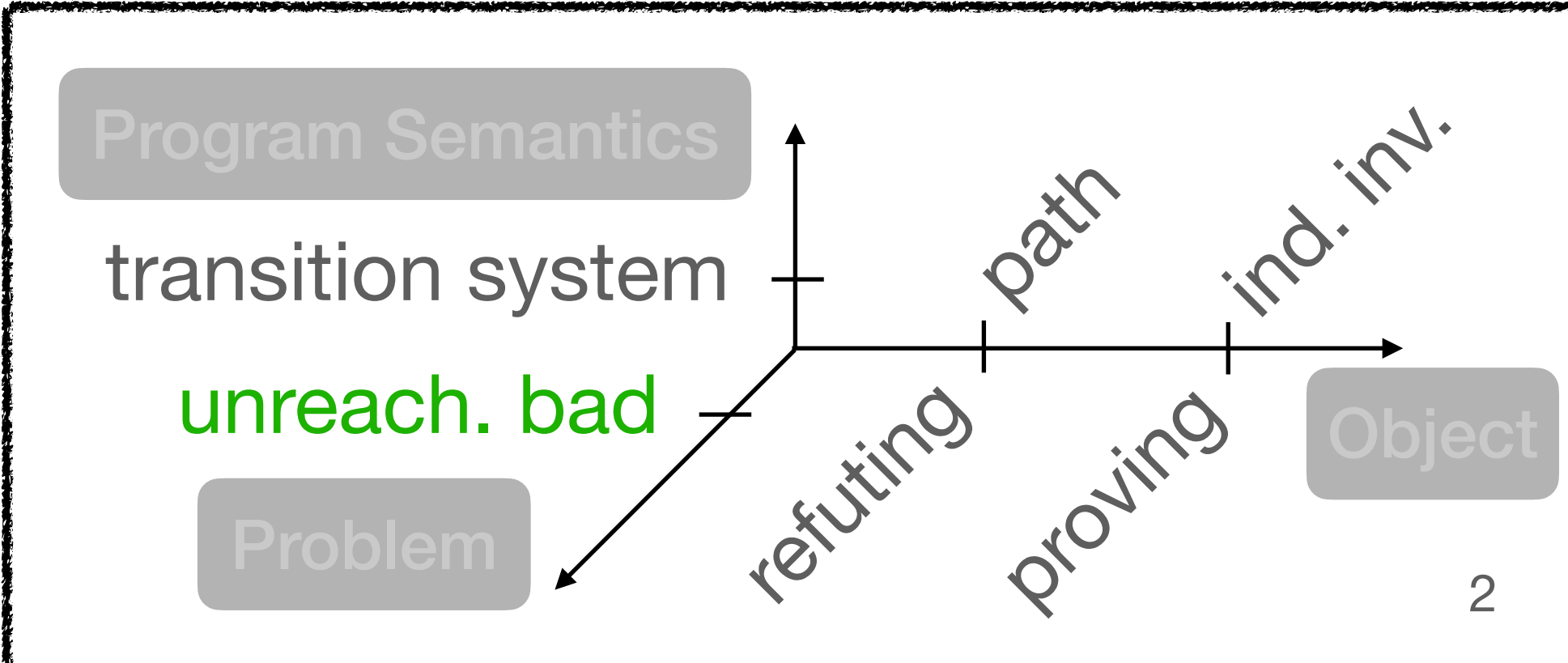


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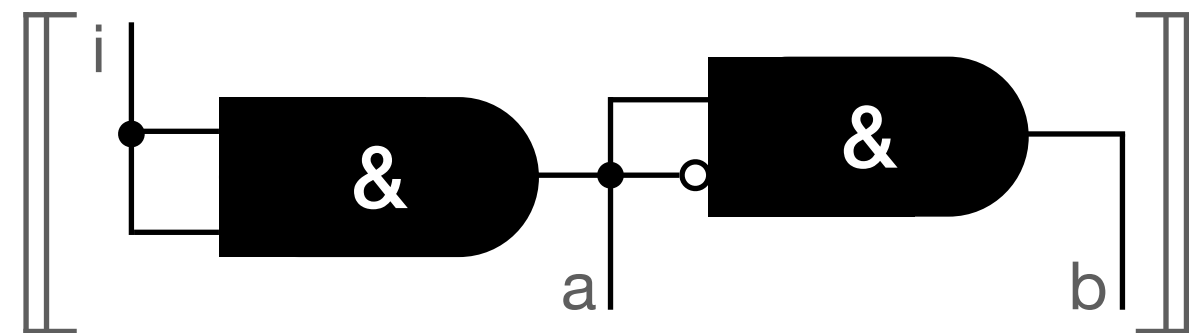


= (States, Init, post)



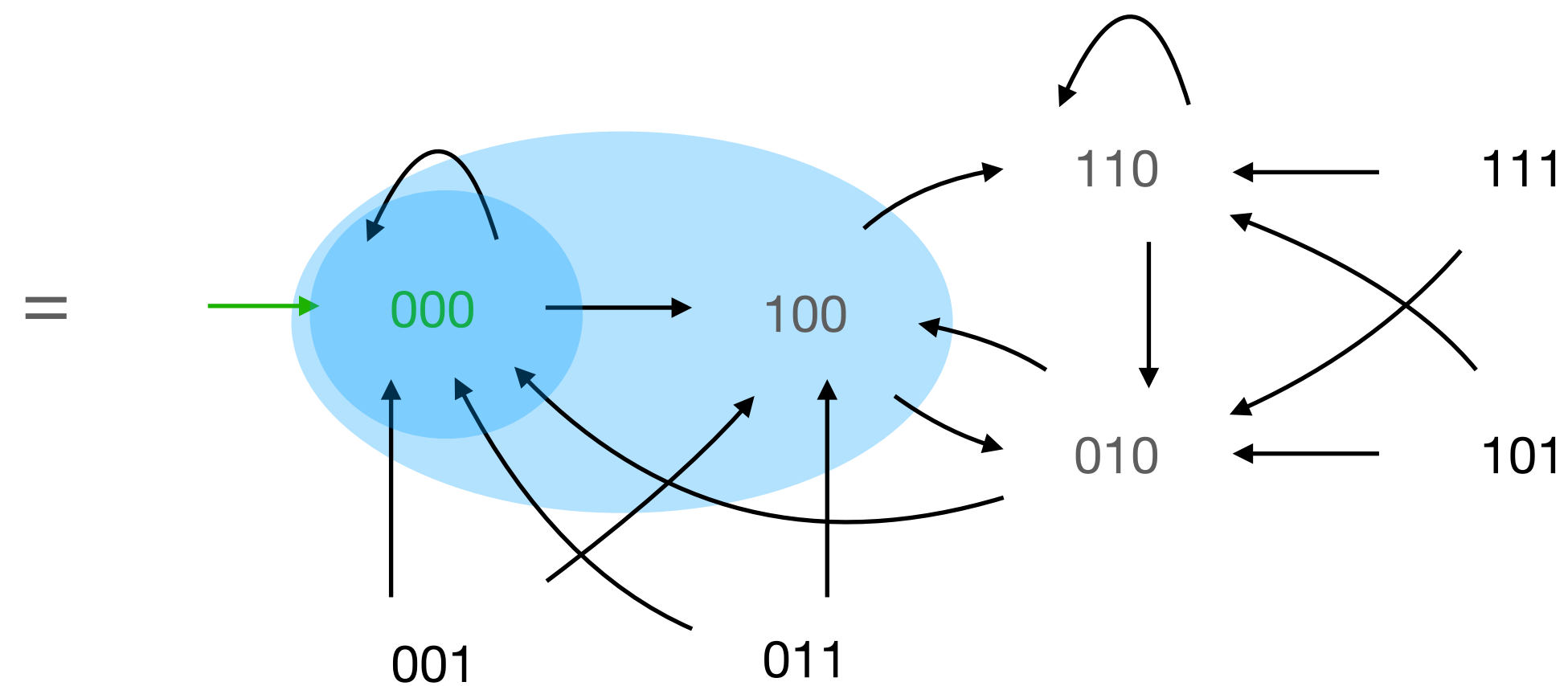
Automated Safety Verification

Transition System:



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$$\text{post}^*(\text{Init}) = \bigcup_{i \in \mathbb{N}} \text{post}^i(\text{Init}) \subseteq \text{States}$$



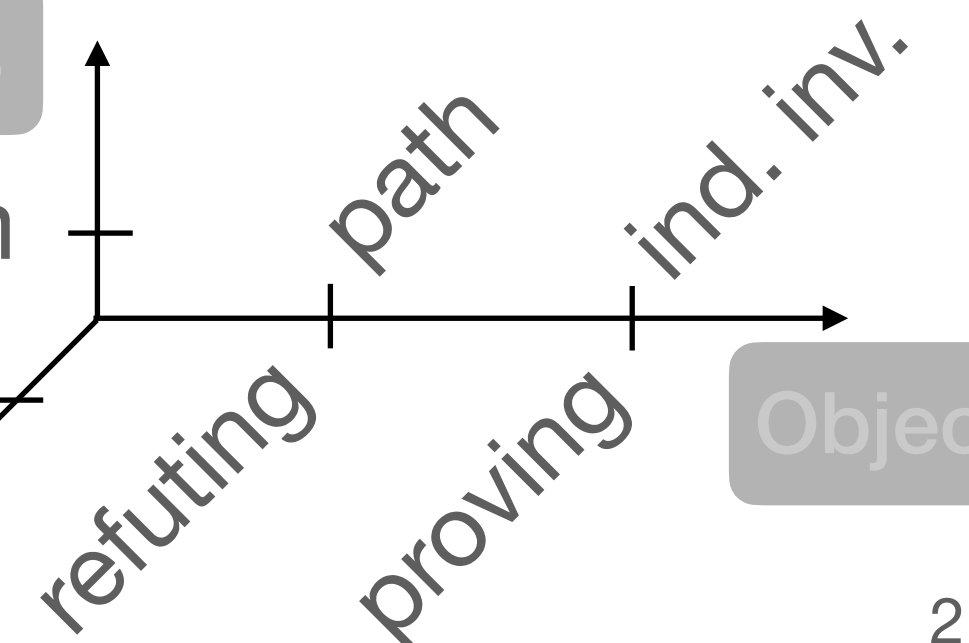
= (States, Init, post)

Program Semantics

transition system

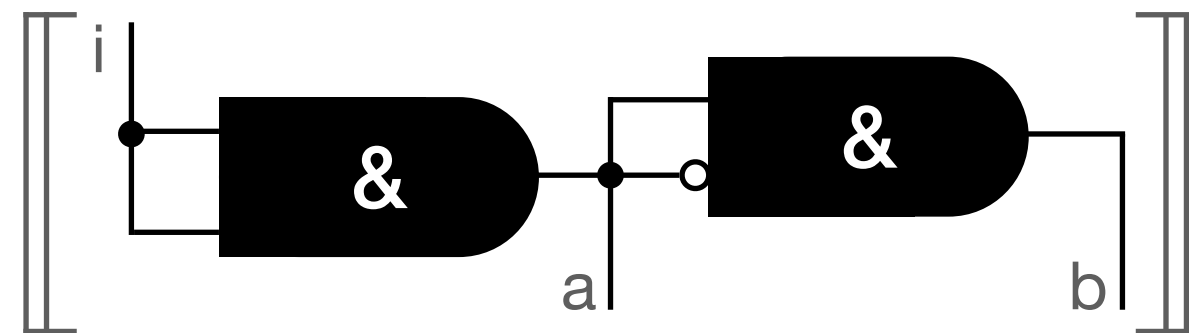
unreach. bad

Problem



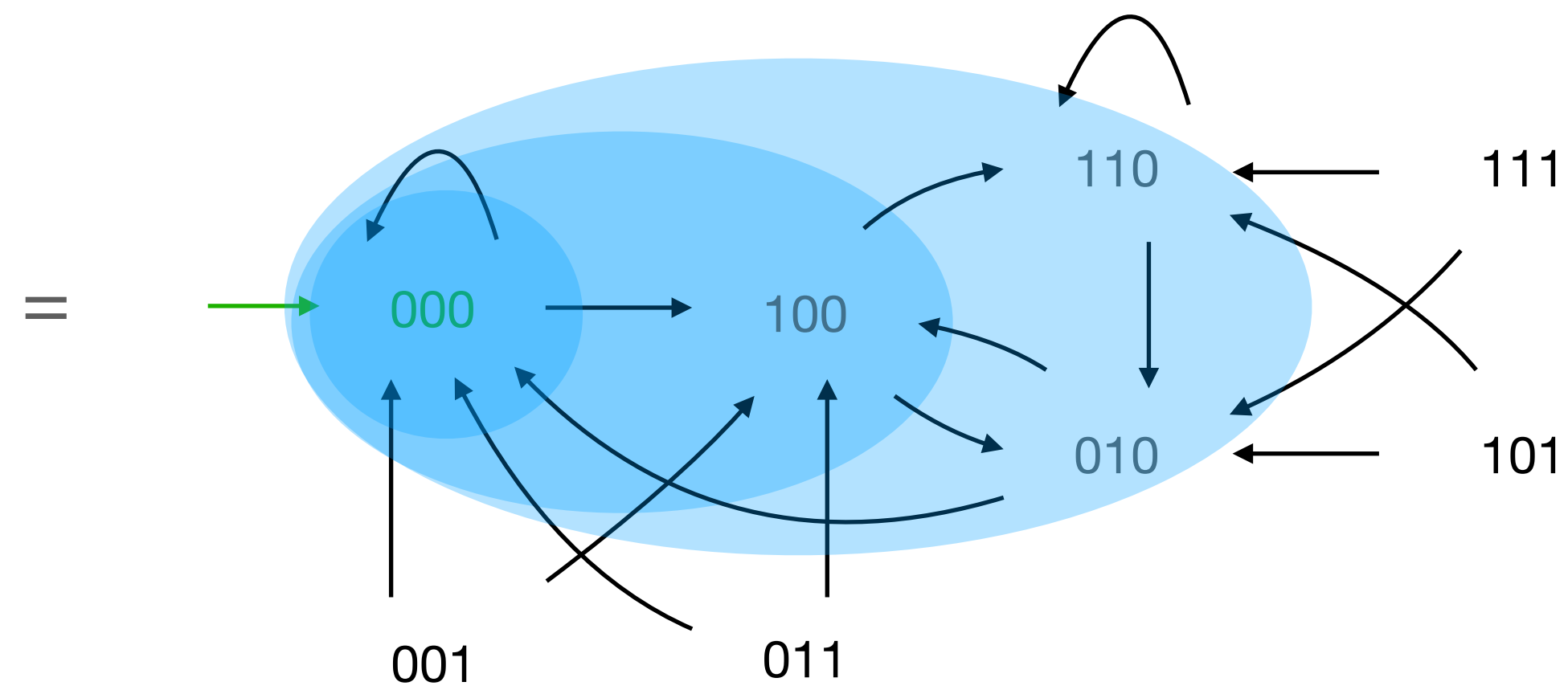
Automated Safety Verification

Transition System:



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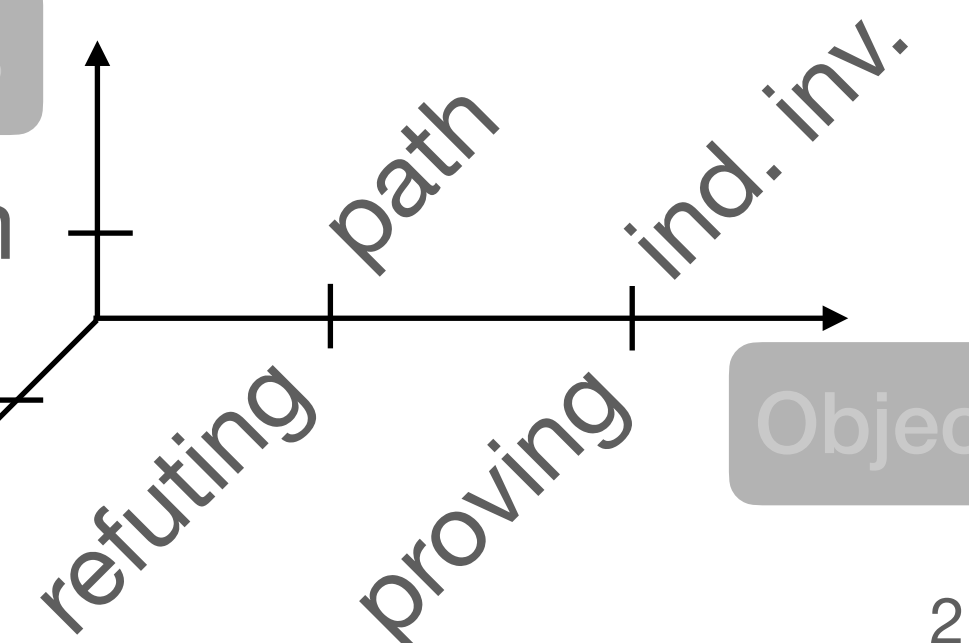
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Program Semantics

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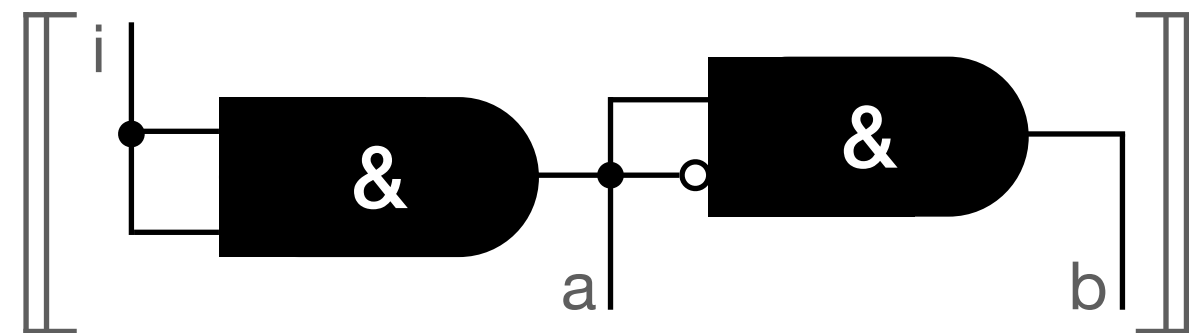
unreach. bad

Problem



Automated Safety Verification

Transition System:

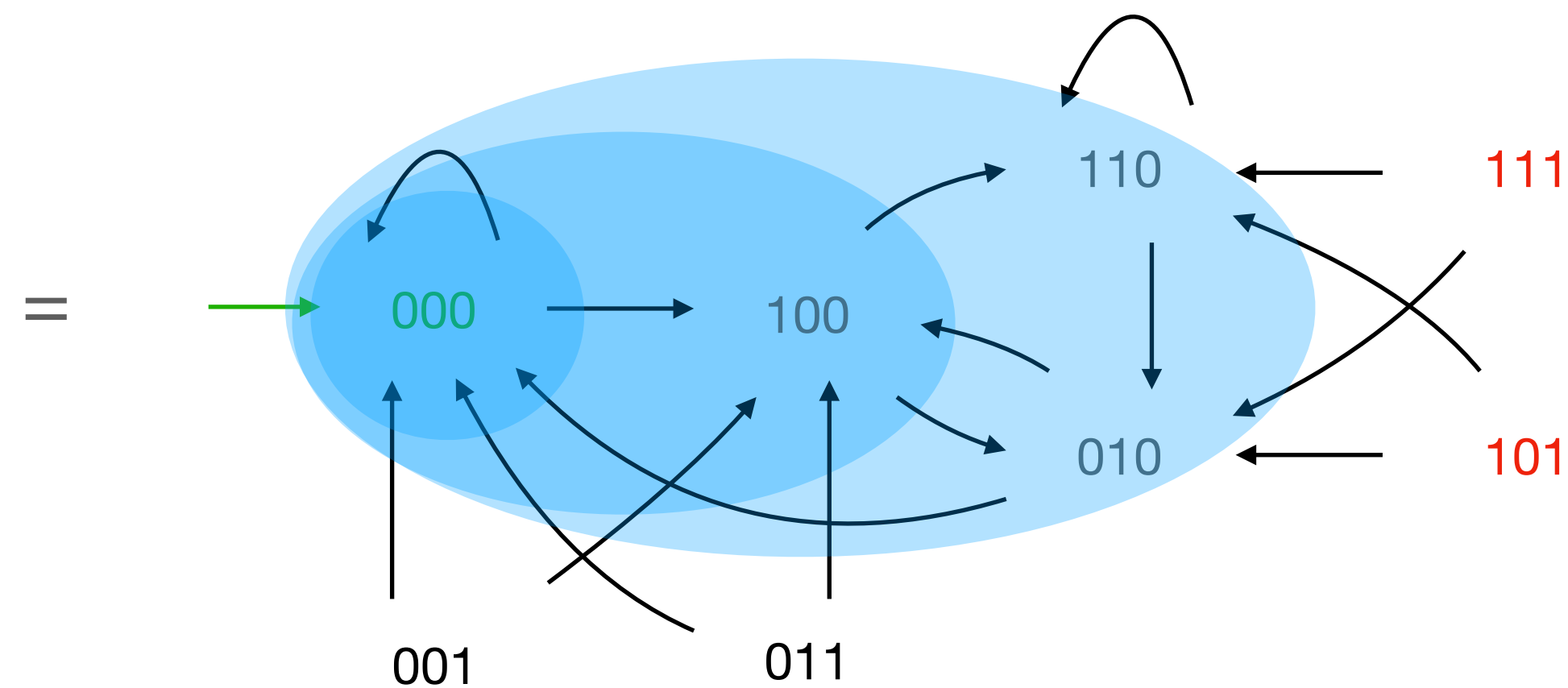


Reachable States:

$$\text{post}^*(\text{Init}) = \bigcup_{i \in \mathbb{N}} \text{post}^i(\text{Init}) \subseteq \text{States}$$

Problem:

Given: TS and **Bad** $\subseteq$ States.



= (States, **Init**, post)

Program Semantics

transition system

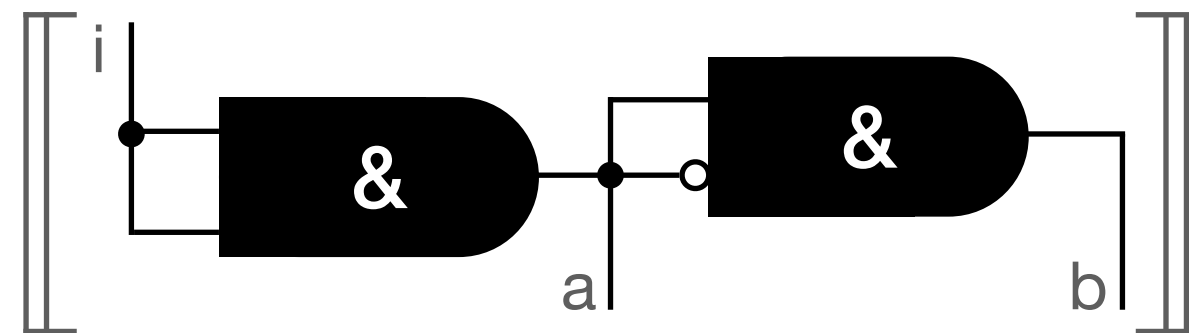
unreach. bad

Problem

refuting path proving ind. inv. Object

Automated Safety Verification

Transition System:



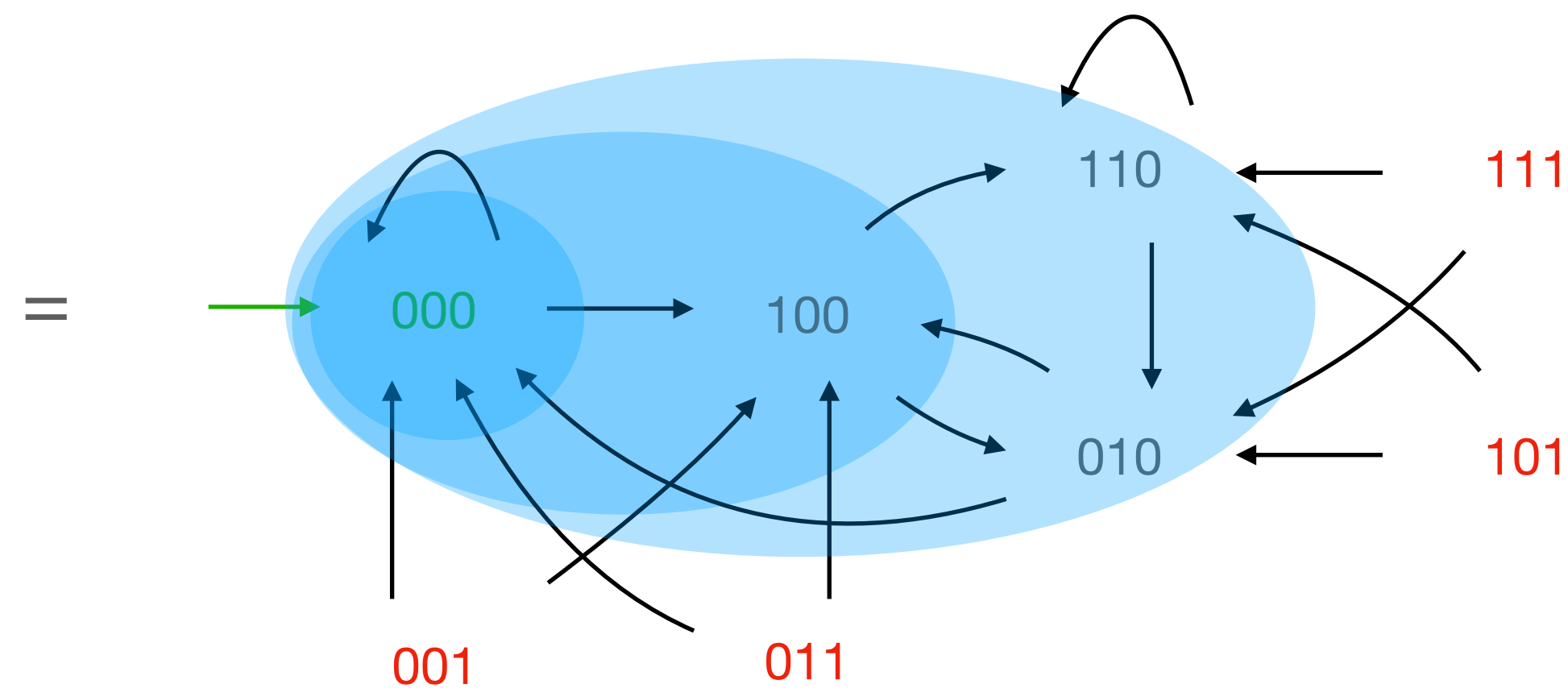
Reachable States:

$$\text{post}^*(\text{Init}) = \bigcup_{i \in \mathbb{N}} \text{post}^i(\text{Init}) \subseteq \text{States}$$

Problem:

Given: TS and $\text{Bad} \subseteq \text{States}$.

Question: $\text{post}^*(\text{Init}) \cap \text{Bad} = \emptyset$?



= (States, Init , post)

Program Semantics

transition system

unreach. bad

Problem

refuting path proving ind. inv. Object

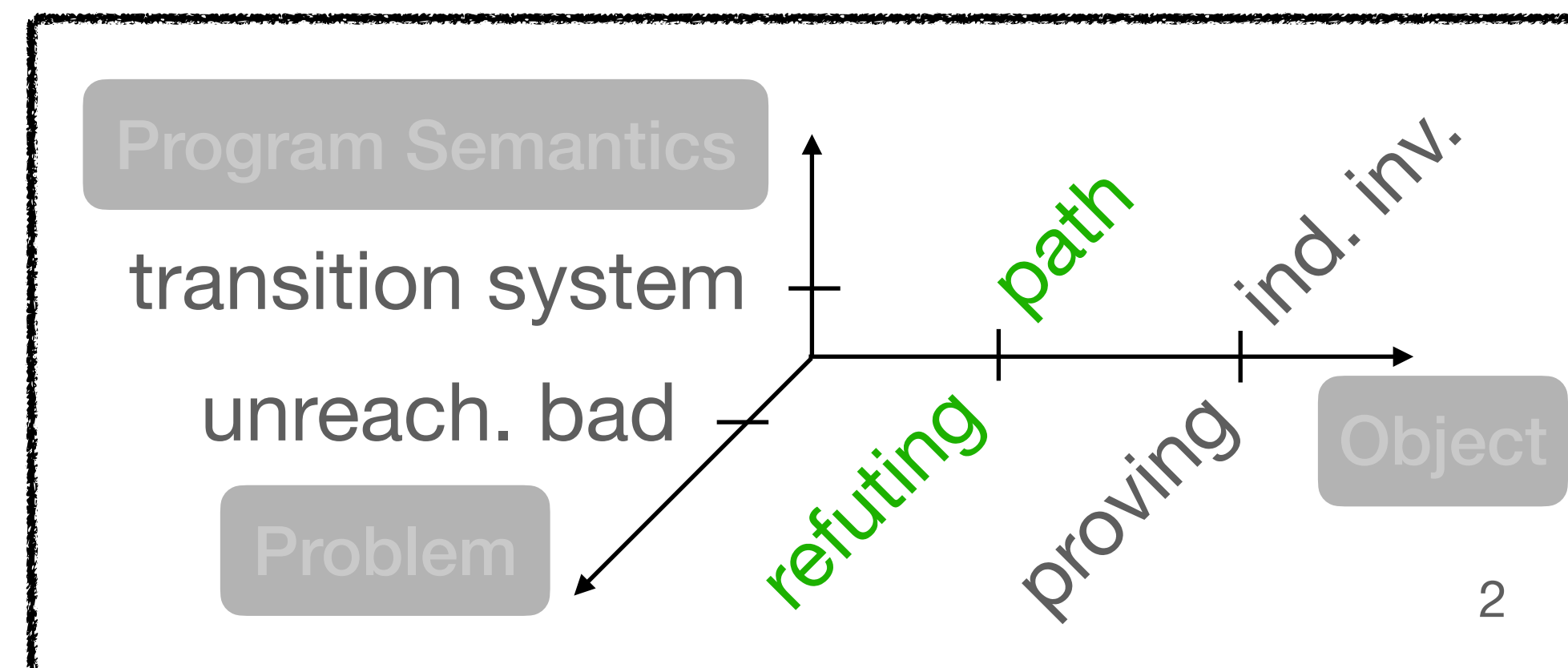
Automated Safety Verification

Path $p \in \text{States}^+$ with

$p_0 \in \text{Init}$

$p_{i+1} \in \text{post}(p_i)$ for all $0 \leq i < |p|$.

Reaches Bad, if $\text{last}(p) \in \text{Bad}$.



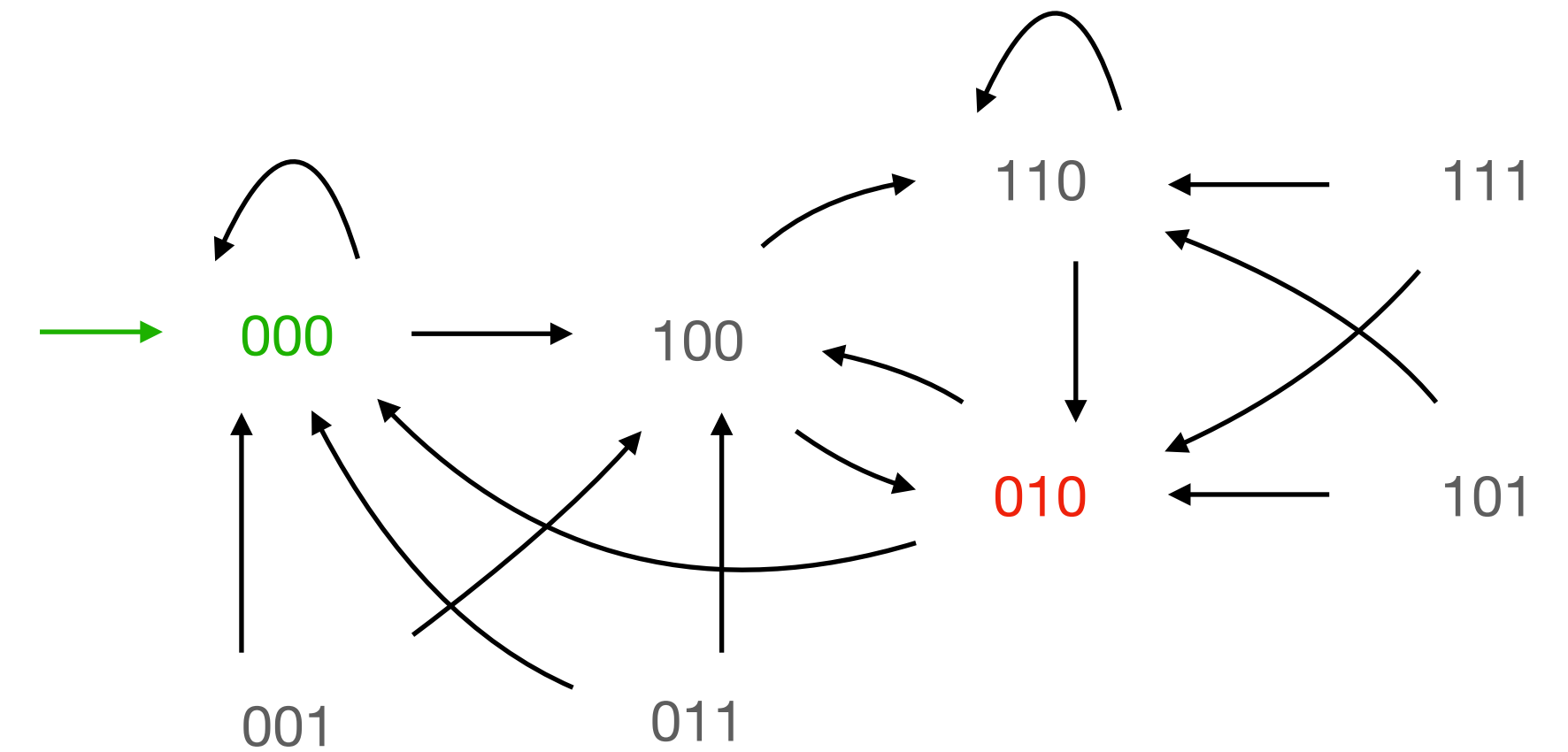
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Program Semantics

transition system

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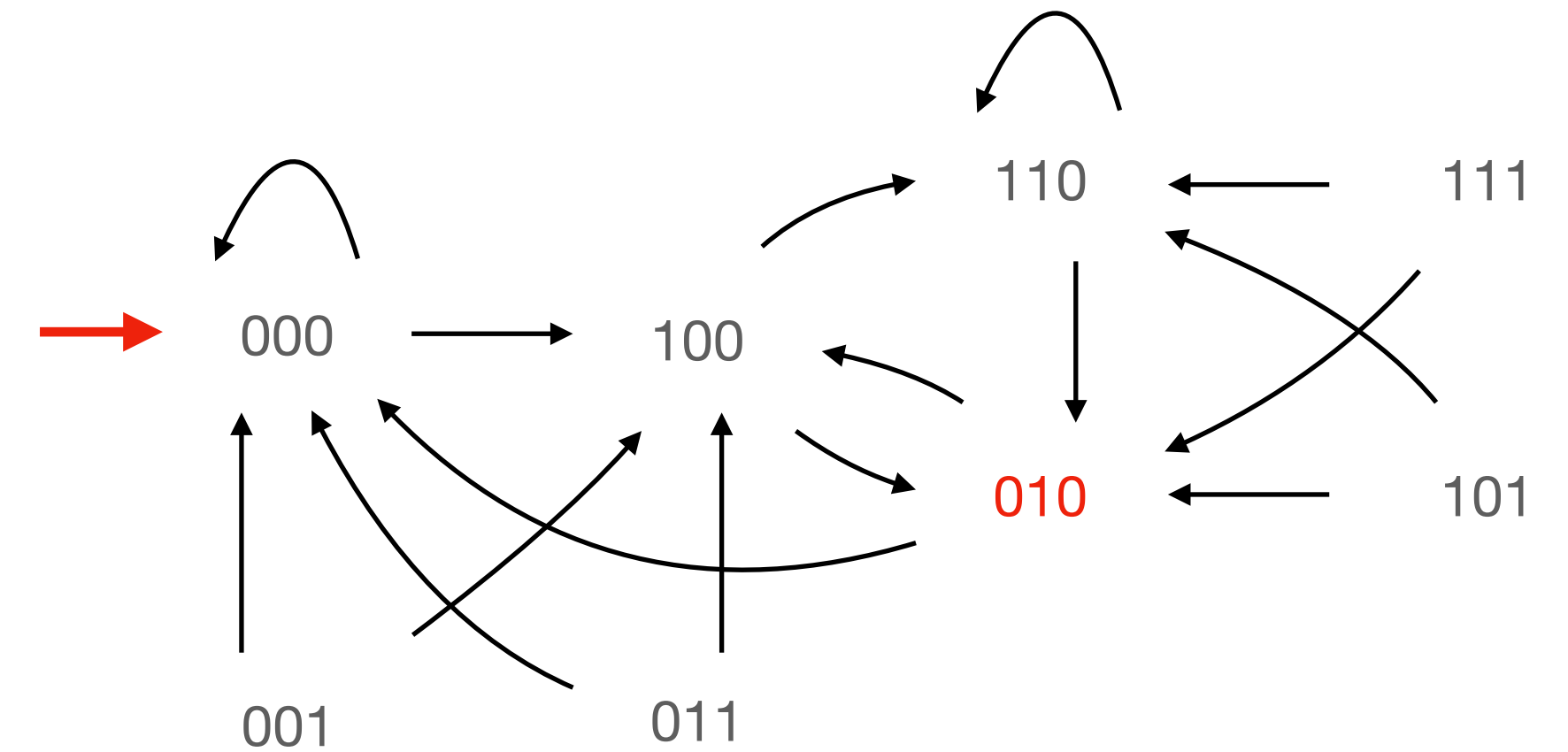
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Program Semantics

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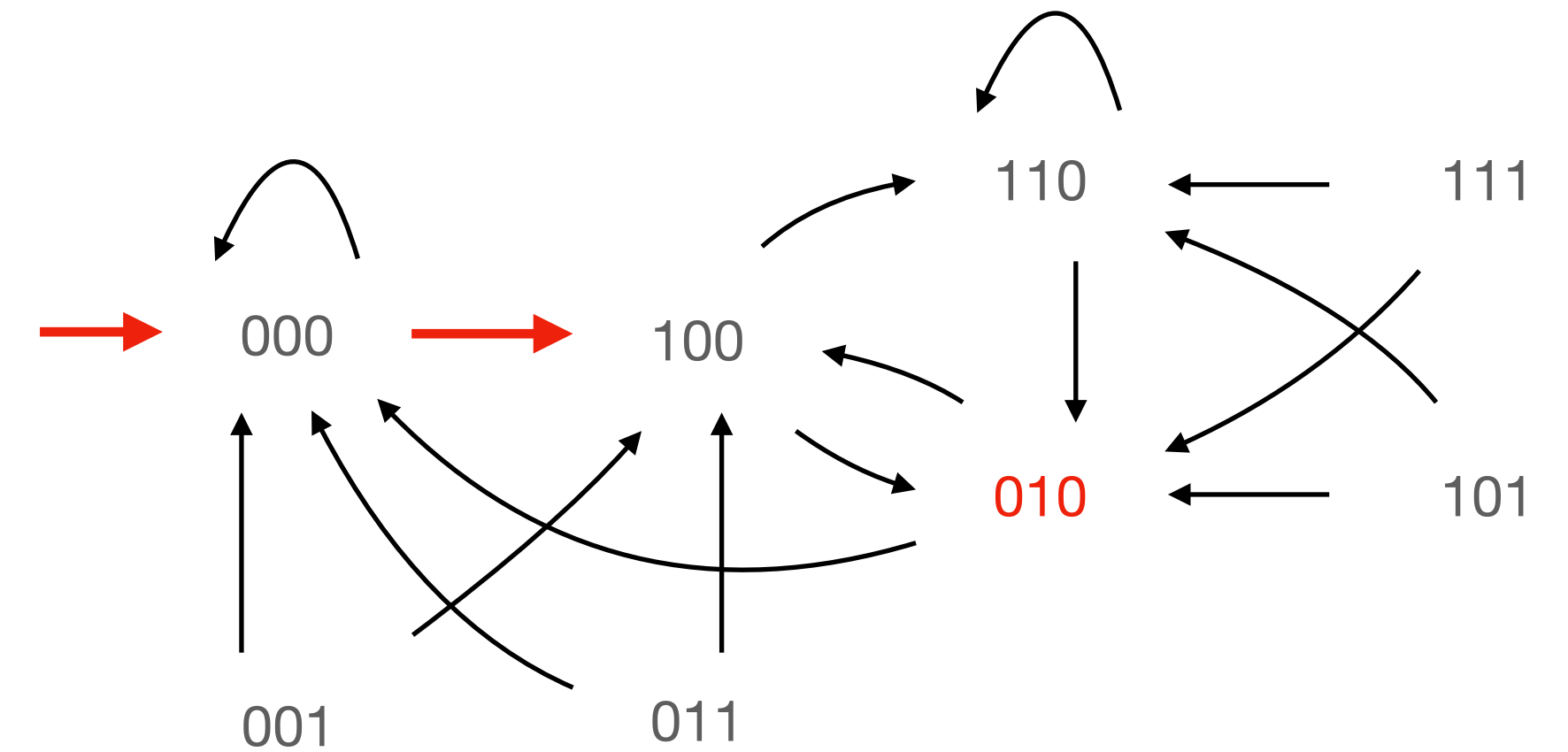
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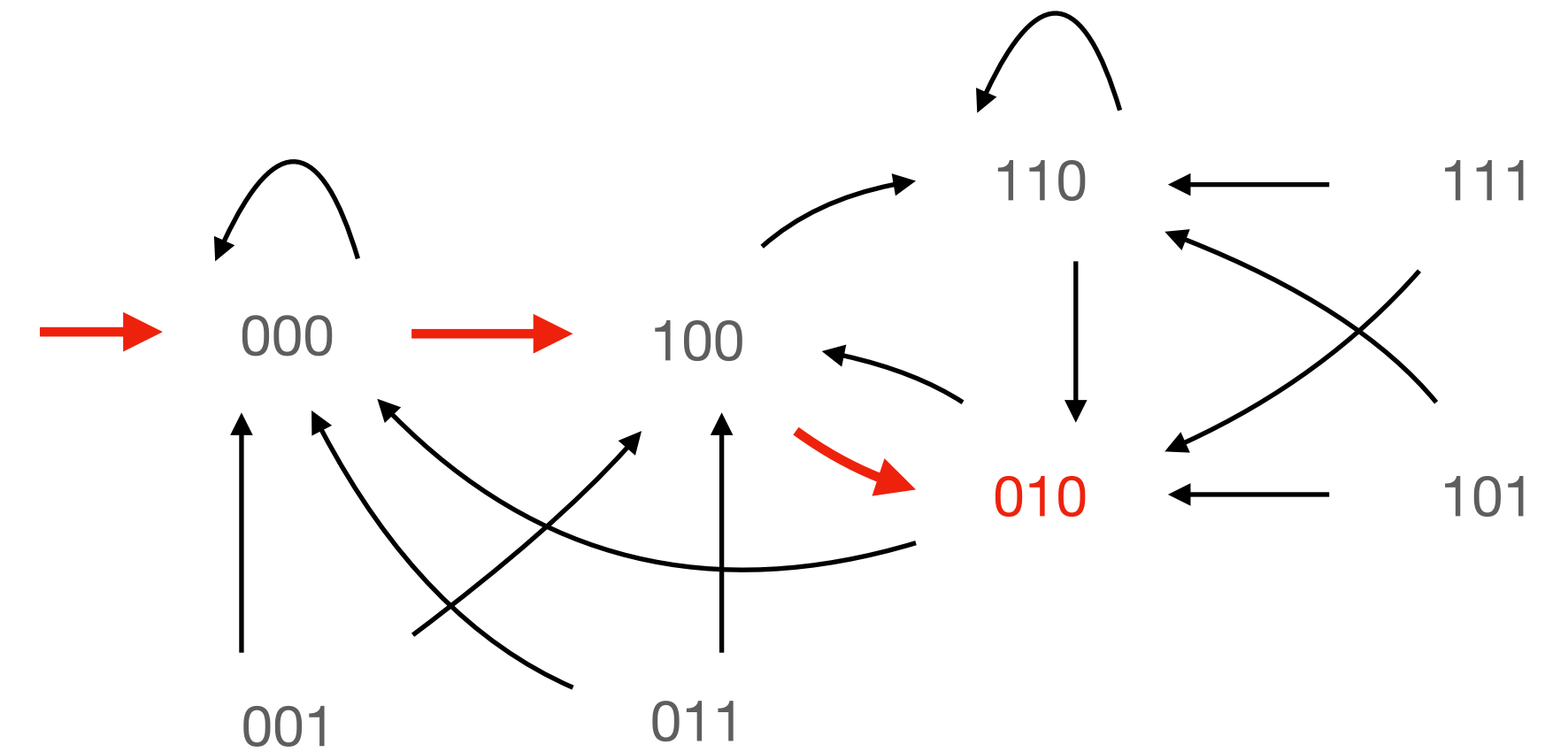
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Program Semantics

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unreach. bad

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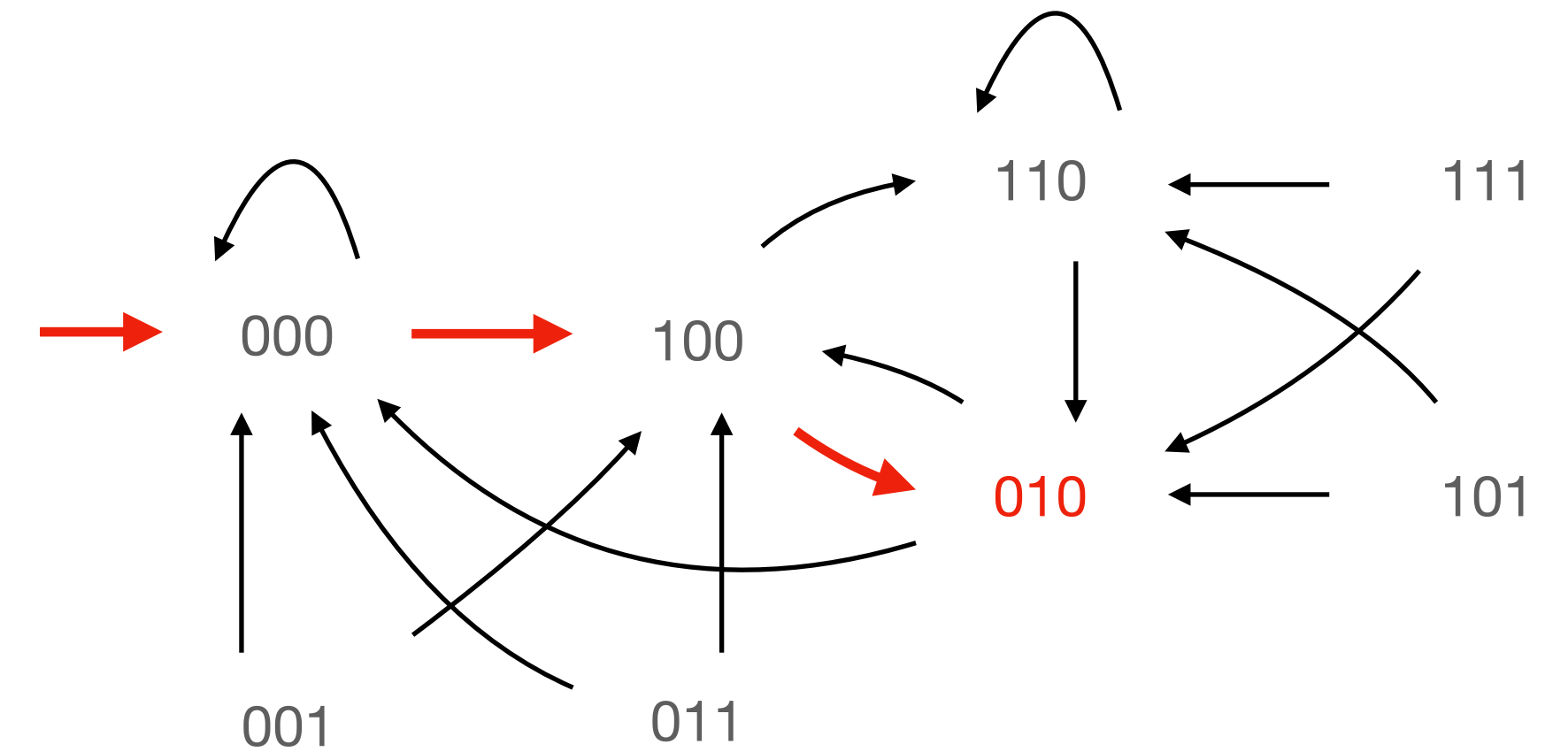
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Lemma (S+C for Finding Bugs):

$\text{post}^*(\text{Init}) \cap \text{Bad} \neq \emptyset$ if and only if
 $\exists$ **path** that reaches **Bad**.

Program Semantics

transition system

unreach. bad

Problem

refuting path proving ind. inv.

Object

Automated Safety Verification: Invariants

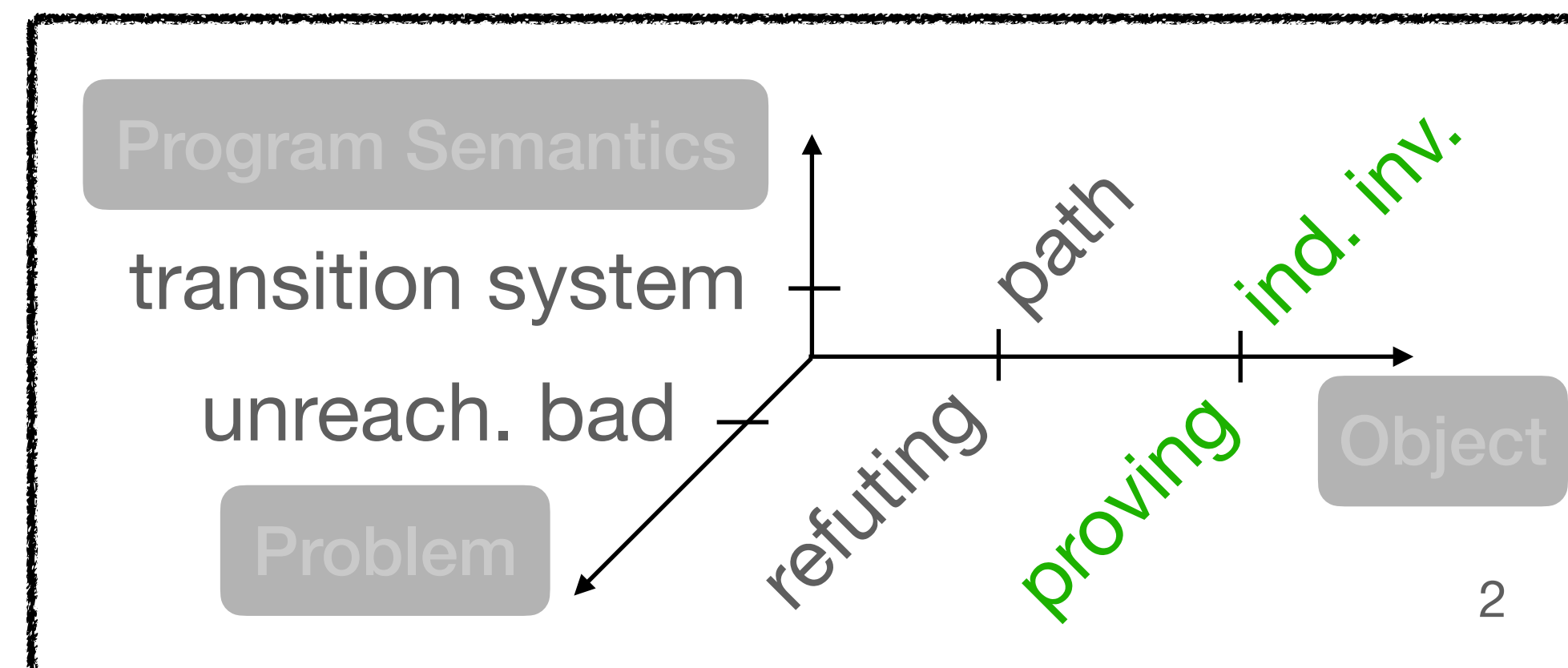
Inductive Invariant $I \subseteq$ States with

$$\begin{aligned} \text{Init} &\subseteq I \\ \text{post}(I) &\subseteq I. \end{aligned}$$

Save wrt. **Bad**, if $I \cap \text{Bad} = \emptyset$.



1967



Automated Safety Verification: Invariants

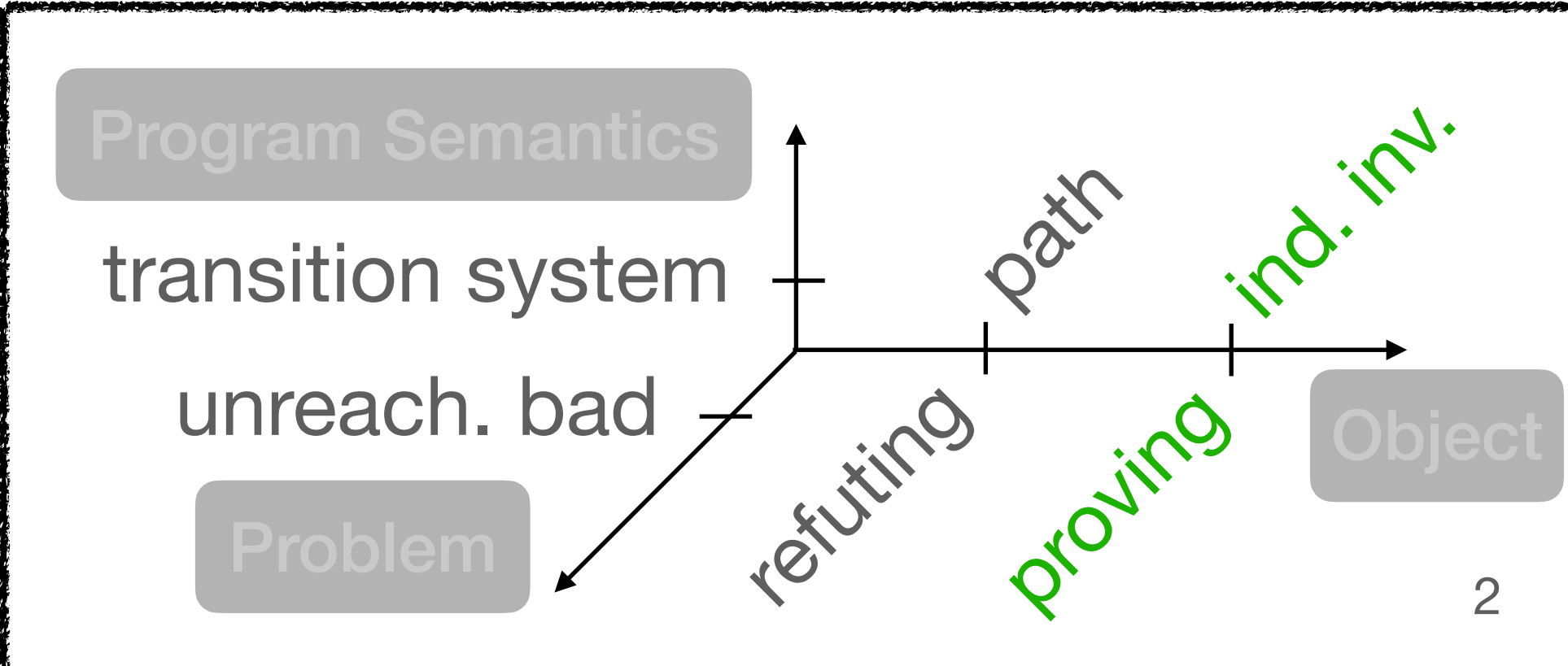
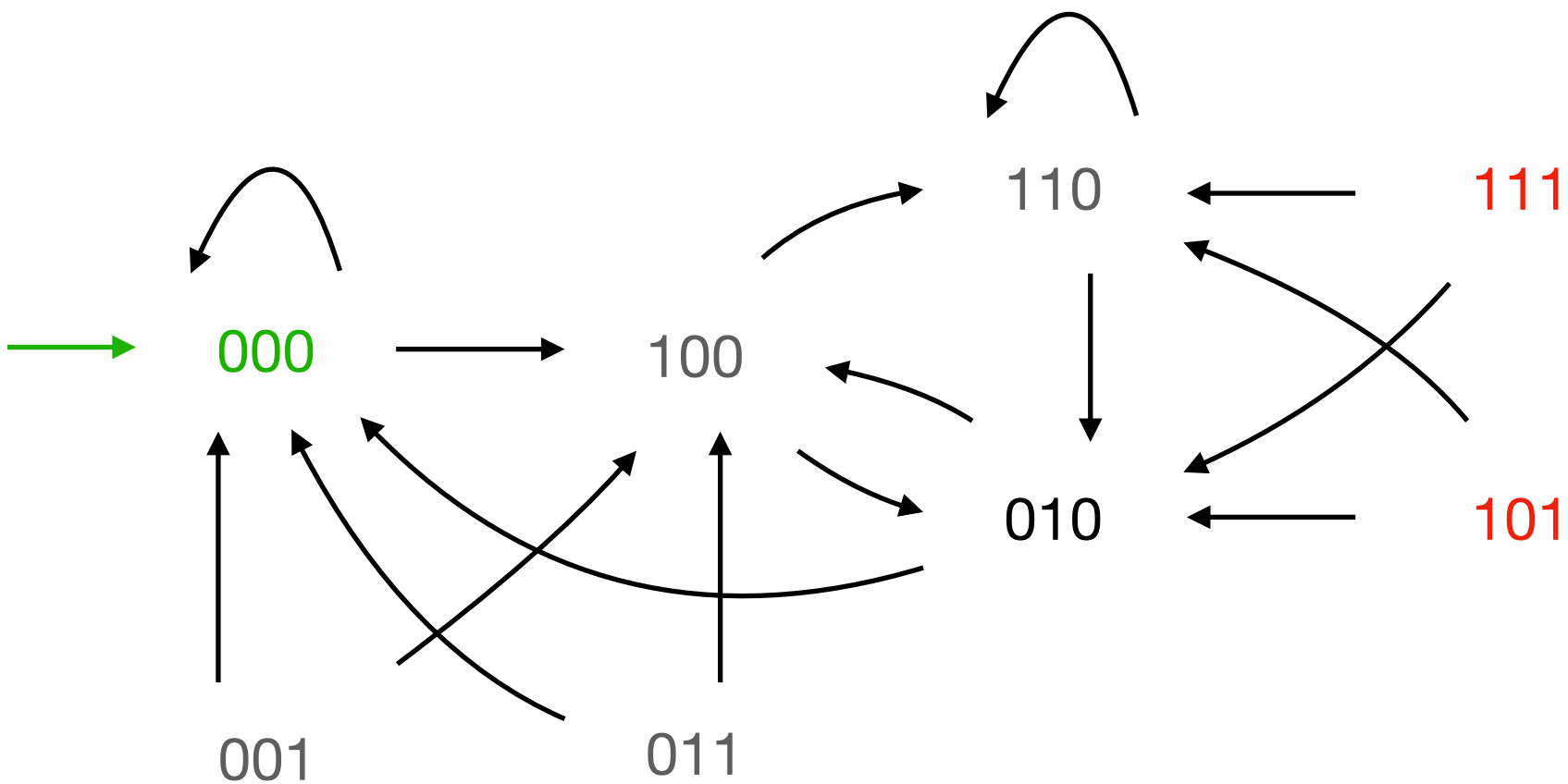
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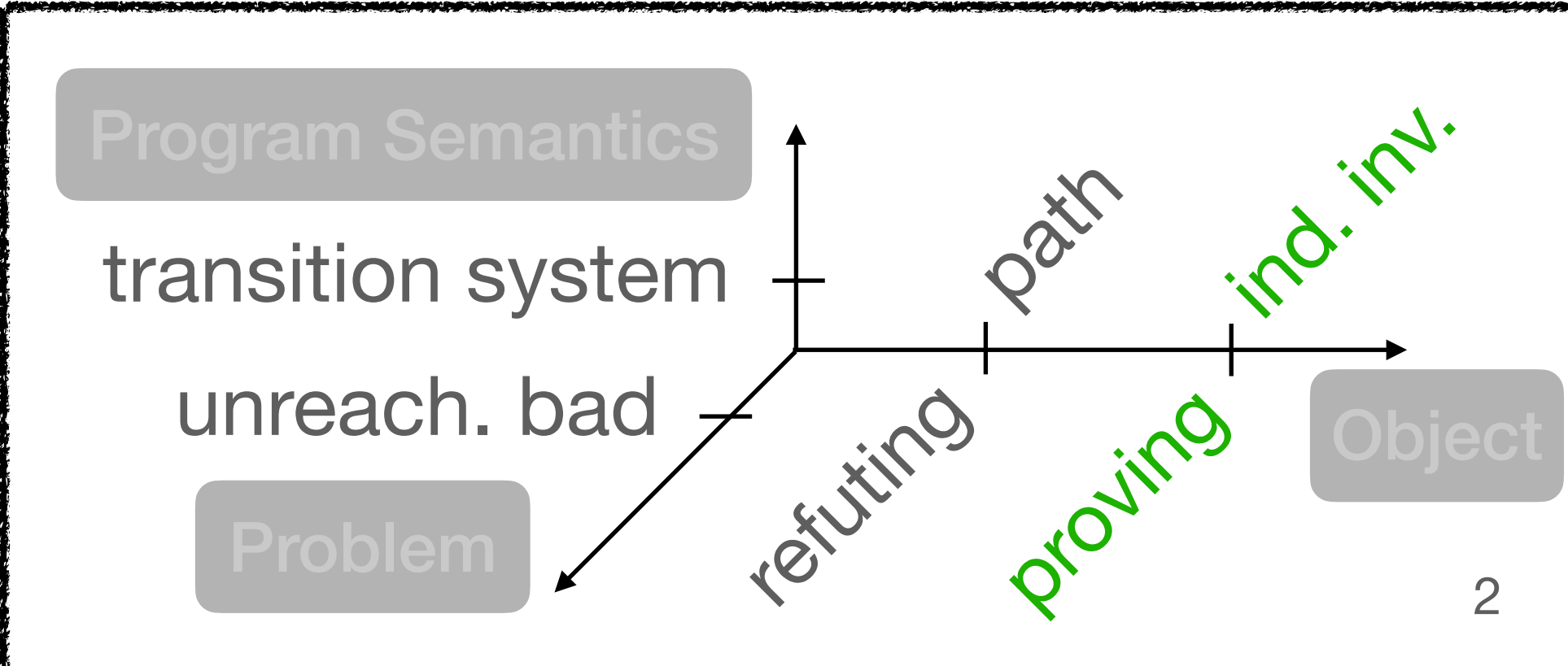
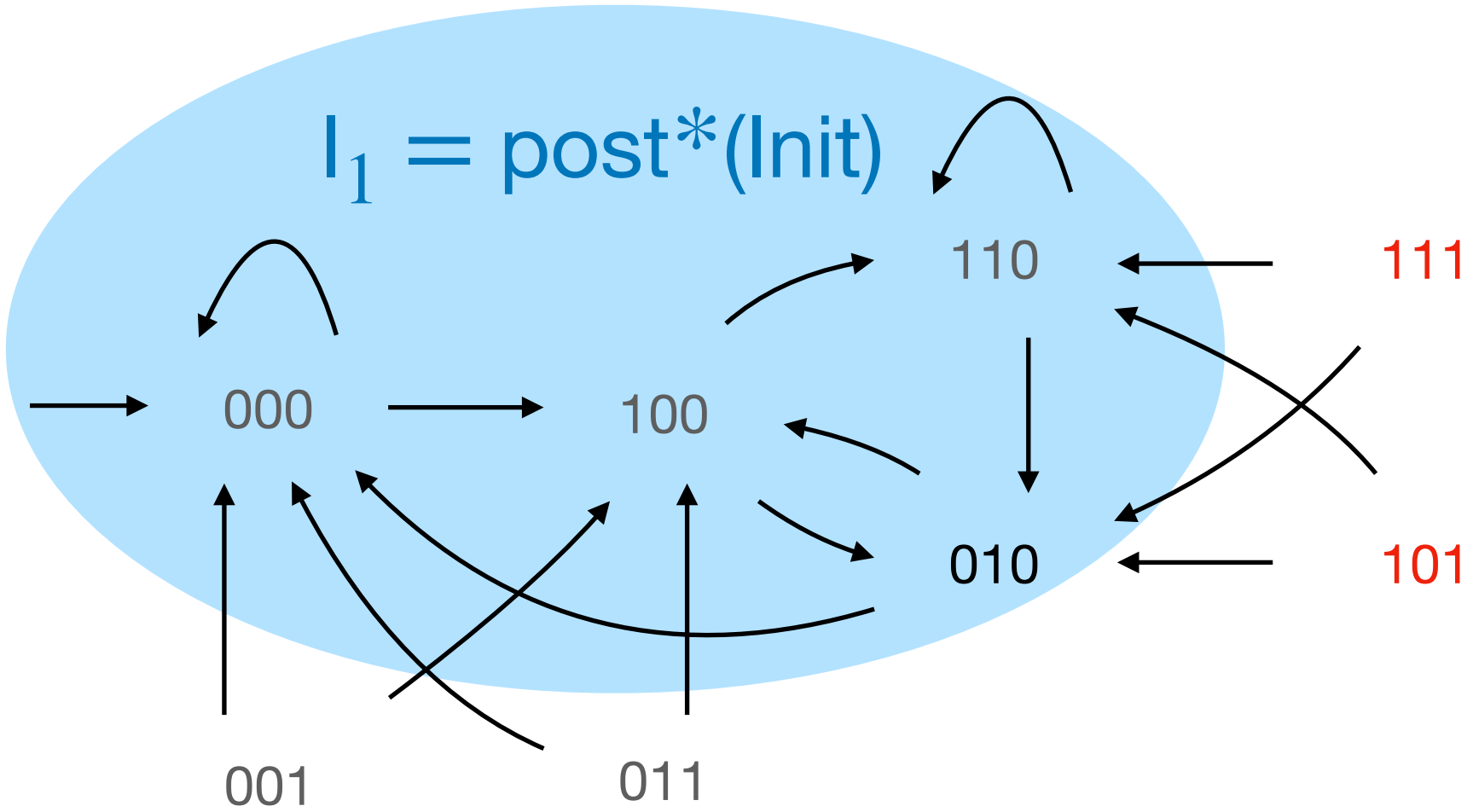
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Automated Safety Verification: Invariants

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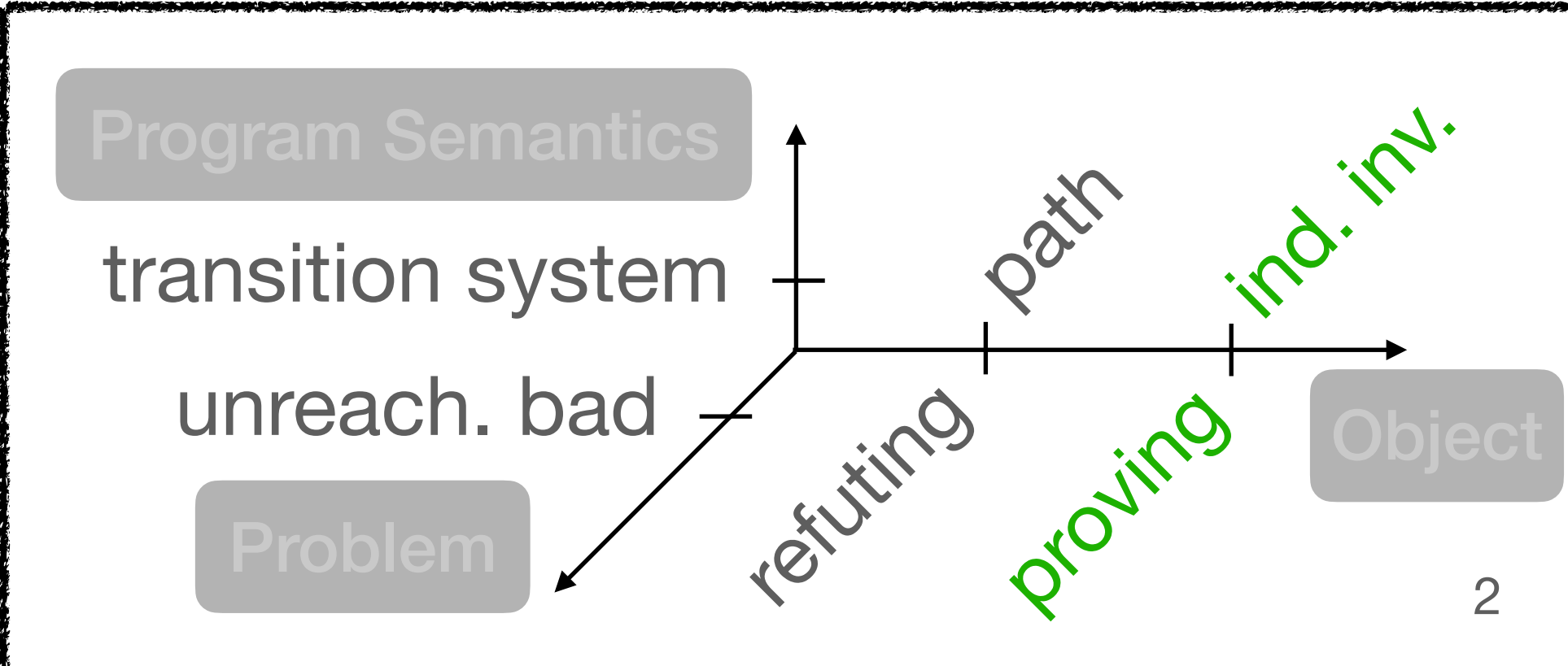
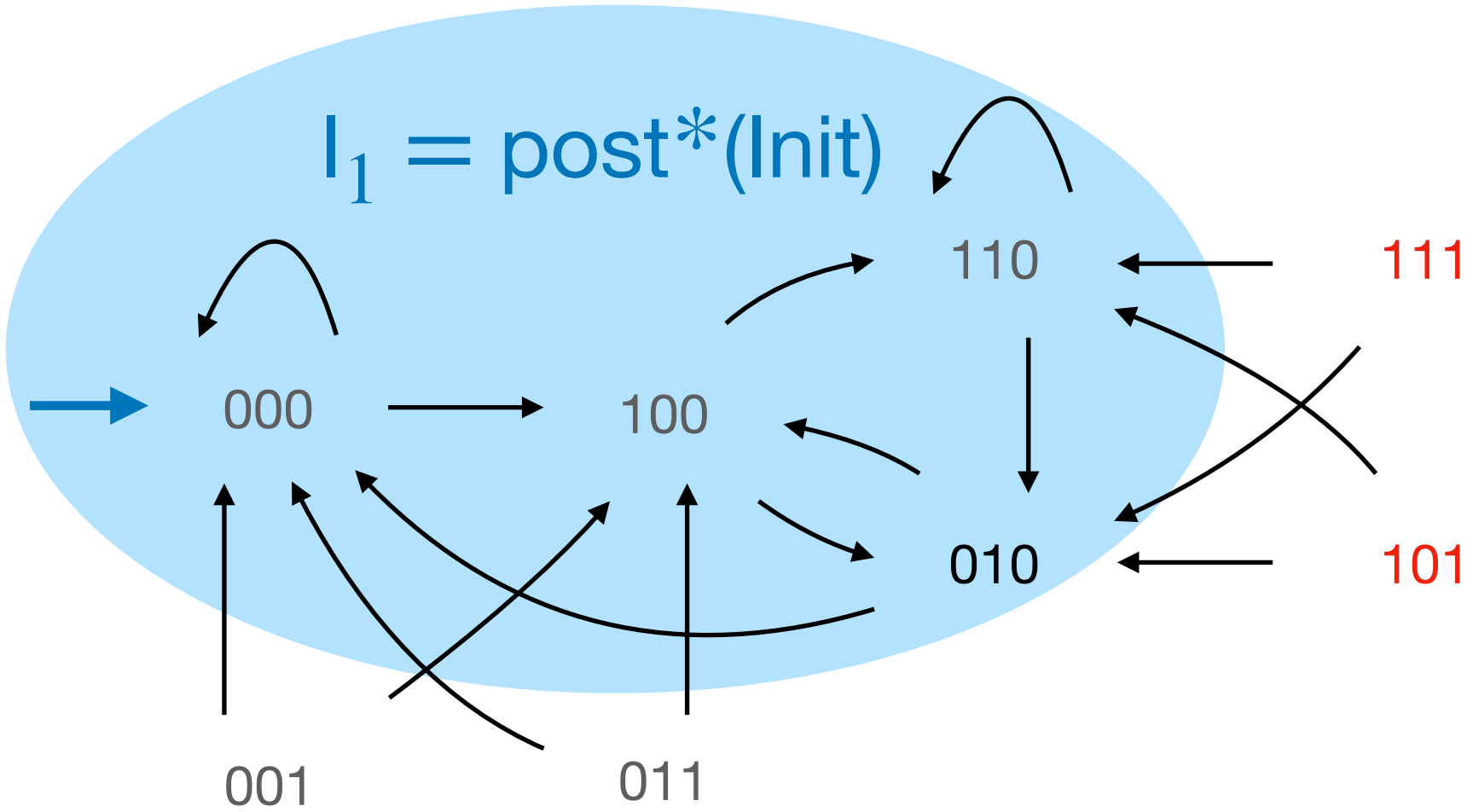
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1967

Inductiveness!



Automated Safety Verification: Invariants

Inductive Invariant $I \subseteq$ States with

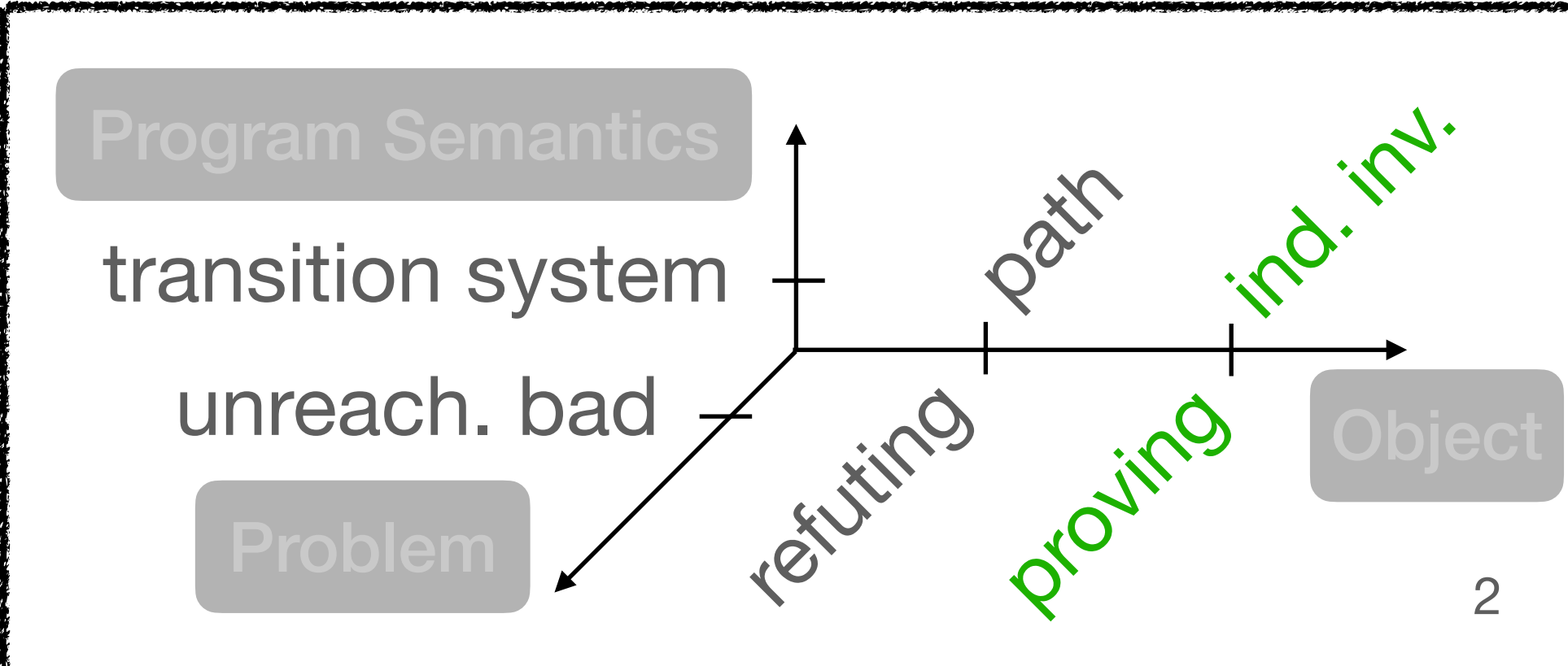
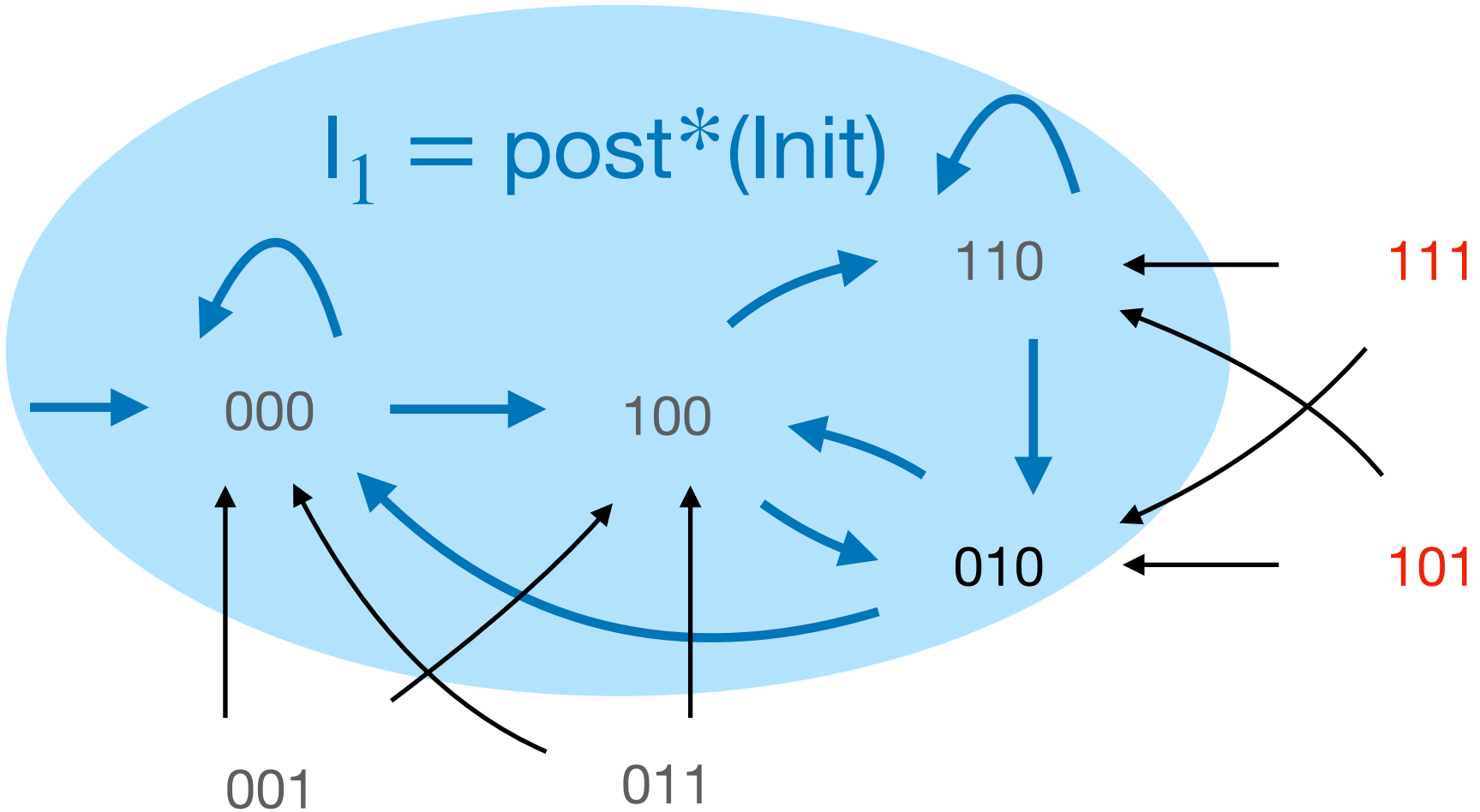
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Automated Safety Verification: Invariants

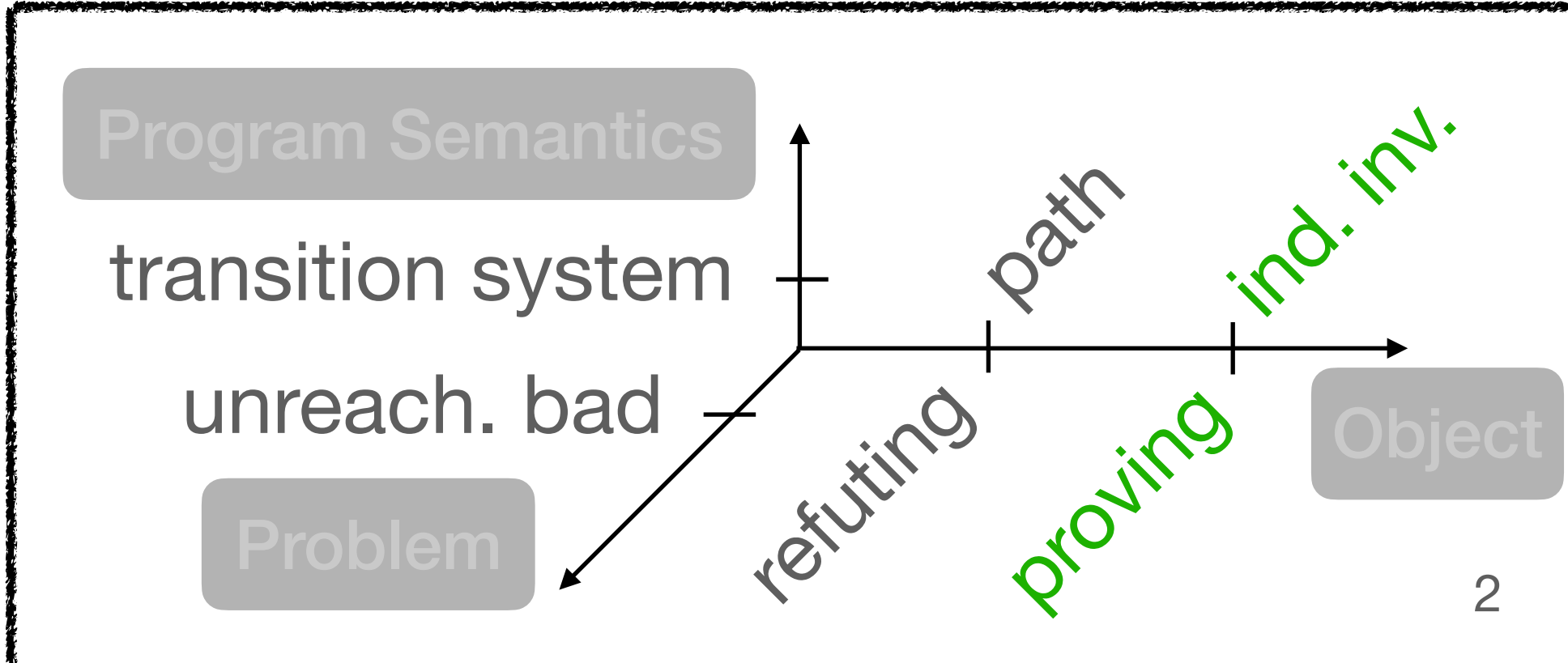
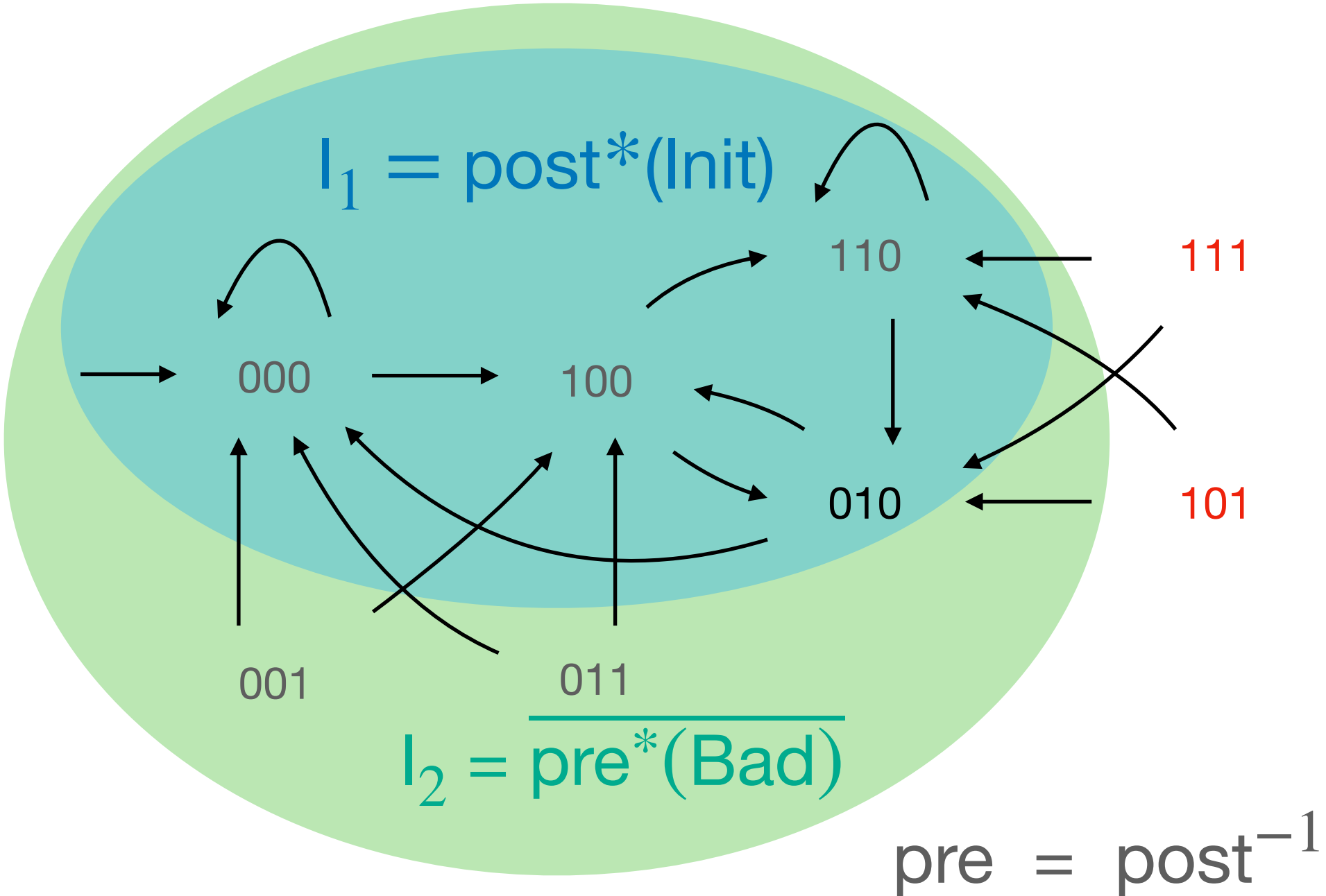
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1967



Automated Safety Verification: Invariants

Inductive Invariant $I \subseteq \text{States}$ with

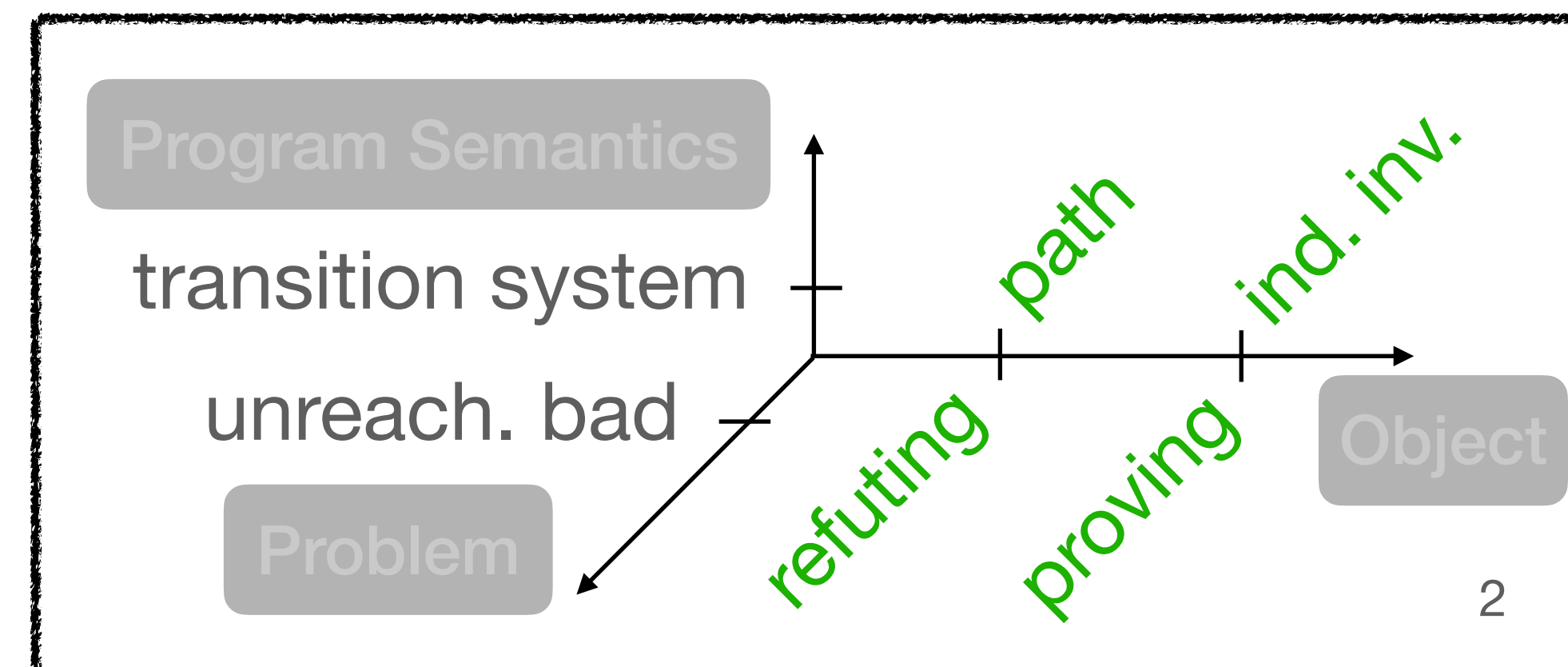
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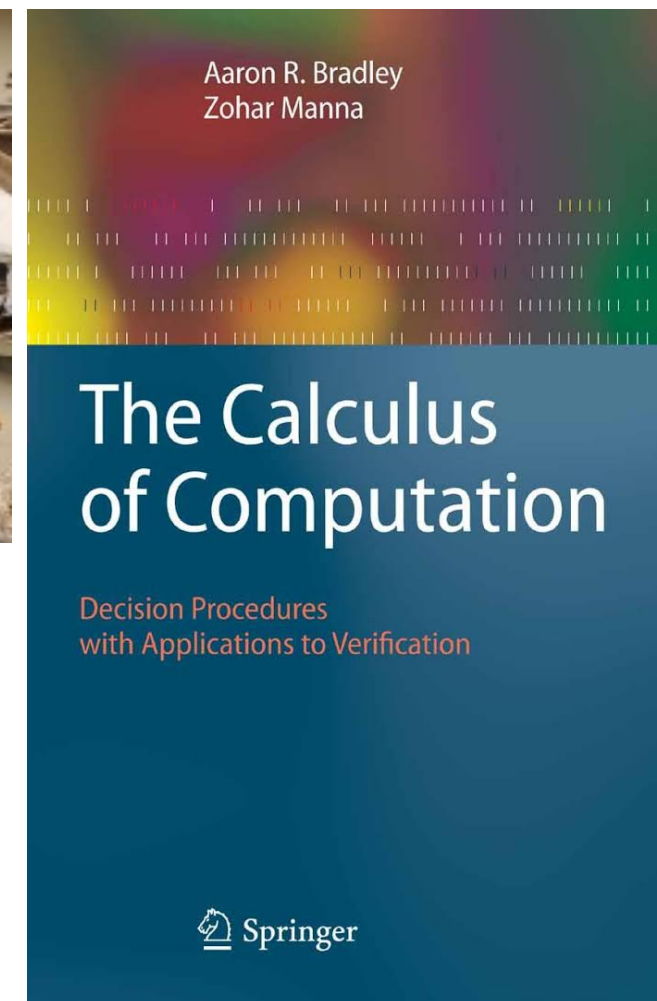
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IC3



[SAT-Based Model Checking without Unrolling, Bradley, VMCAI'11]



Importance

“[...] the *first truly new* bit-level symbolic model checking *algorithm* since Ken McMillan’s *interpolation* based model checking procedure in 2003.”

“[...] the *most important contribution* to bit-level formal verification *in almost a decade.*”

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They suggested the name
PDR for Bradley’s method and
leave IC3 for the implementation!

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[Een et al., FMCAD’11]

HWMCC 2010: Bronze against mature tools.

HWMCC 2012: All tools IC3 based.

HWMCC 2012: **Award!**

HWMCC 2024: avr_dp, fric3, nuXmv, Pono, rIC3, Satvik.

New papers every year at major conferences!

They suggested the name
PDR for Bradley’s method and
leave IC3 for the implementation!

IC3 in Essence

[Hasuo et al., CAV'22]

Invariants are sound (+c) for proving correctness.

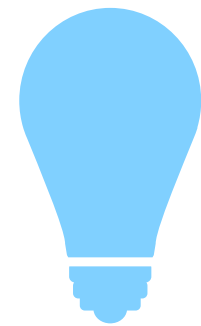
Paths are sound (+c) for finding bugs.

IC3 in Essence

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Combine the two!

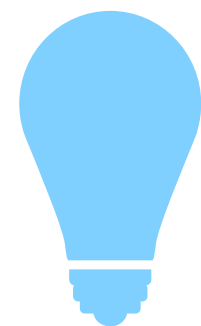


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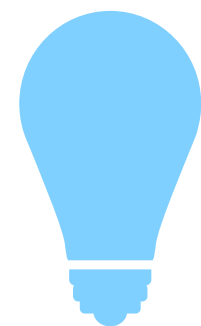
IC3 maintains two sequences of sets of states

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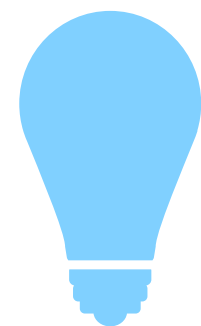


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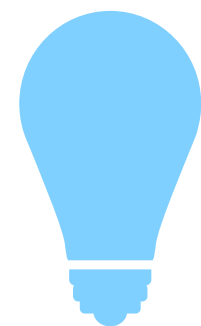
Candidate **invariants** that
over-approximate
forward reachability from **Init**!

IC3 in Essence

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Paths are sound (+c) for finding bugs.



Combine the two!



IC3 maintains two sequences of sets of states



Candidate **invariants** that
over-approximate
forward reachability from **Init**!

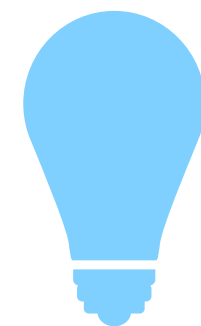
Candidate **paths** that
under-approximate
backward reachability from **Bad**!

IC3 in Essence

[Hasuo et al., CAV'22]

Invariants are sound (+c) for proving correctness.

Paths are sound (+c) for finding bugs.



Combine the two!



Incremental Construction

IC3 maintains two sequences of sets of states



Candidate **invariants** that
over-approximate
forward reachability from **Init**!

Candidate **paths** that
under-approximate
backward reachability from **Bad**!

IC3 in Essence

[Hasuo et al., CAV'22]



Over-approximate forwards

Under-approximate backwards

IC3 maintains sequences of sets of states

$F_0 \subseteq \dots \subseteq F_k$ candidate invariants

$B_0 \subseteq \dots \subseteq B_k$ candidate paths

satisfying

IC3 in Essence

[Hasuo et al., CAV'22]



Over-approximate forwards

Under-approximate backwards

IC3 maintains sequences of sets of states

$F_0 \subseteq \dots \subseteq F_k$ candidate invariants

$B_0 \subseteq \dots \subseteq B_k$ candidate paths

satisfying

Frames and proof obligations
in the literature.

IC3 in Essence

[Hasuo et al., CAV'22]



Over-approximate forwards

Under-approximate backwards

IC3 maintains sequences of sets of states

$F_0 \subseteq \dots \subseteq F_k$ candidate invariants

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satisfying

1. $F_0 = \text{Init}$
 $\text{Bad} = B_0$

IC3 in Essence

[Hasuo et al., CAV'22]



Over-approximate forwards

Under-approximate backwards

IC3 maintains sequences of sets of states

$F_0 \subseteq \dots \subseteq F_k$ candidate invariants

$B_0 \subseteq \dots \subseteq B_k$ candidate paths

satisfying

1. $F_0 = \text{Init}$
 $\text{Bad} = B_0$

3. $F_k \cap B_k = \emptyset$

IC3 in Essence

[Hasuo et al., CAV'22]



Over-approximate forwards

Under-approximate backwards

IC3 maintains sequences of sets of states

$F_0 \subseteq \dots \subseteq F_k$ candidate invariants

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satisfying

1. $F_0 = \text{Init}$
 $\text{Bad} = B_0$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
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IC3 in Essence

[Hasuo et al., CAV'22]



Over-approximate forwards

Under-approximate backwards

IC3 maintains sequences of sets of states

$F_0 \subseteq \dots \subseteq F_k$ candidate invariants

$B_0 \subseteq \dots \subseteq B_k$ candidate paths

satisfying

1. $F_0 = \text{Init}$

$\text{Bad} = B_0$

2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$

// $\text{post}^{\leq i}(\text{Init}) \subseteq F_i$

$B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$

3. $F_k \cap B_k = \emptyset$

IC3 in Essence

[Hasuo et al., CAV'22]



Over-approximate forwards

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$F_0 \subseteq \dots \subseteq F_k$ candidate invariants

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1. $F_0 = \text{Init}$

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2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$

$B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$

// $\text{post}^{\leq i}(\text{Init}) \subseteq F_i$

// $B_i \subseteq \text{pre}^{\leq i}(\text{Bad})$

3. $F_k \cap B_k = \emptyset$

f.a. i .

IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
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IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

$$F_{k+1} := \overline{B_k}$$

$$B_{k+1} := B_k$$

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
3. $F_k \cap B_k = \emptyset$

IC3 in Essence

[Hasuo et al., CAV'22]

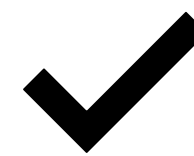


Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

$$F_{k+1} := \overline{B_k} \quad // F_k \subseteq F_{k+1} \text{ by 3.}$$

$$B_{k+1} := B_k$$



1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
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IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

$$\begin{aligned} F_{k+1} &:= \overline{B_k} && // F_k \subseteq F_{k+1} \text{ by 3.} \\ B_{k+1} &:= B_k && // B_{k+1} \subseteq B_k \cup \text{pre}(B_k) \end{aligned}$$



1. $\text{Init} = F_0$
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IC3 in Essence

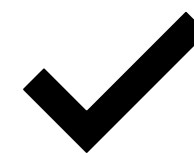
[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

$$\begin{aligned} F_{k+1} &:= \overline{B_k} && // F_k \subseteq F_{k+1} \text{ by 3.} \\ B_{k+1} &:= B_k && // B_{k+1} \subseteq B_k \cup \text{pre}(B_k) \\ &&& // F_{k+1} \cap B_{k+1} = \emptyset \end{aligned}$$



1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
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IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

Problem:

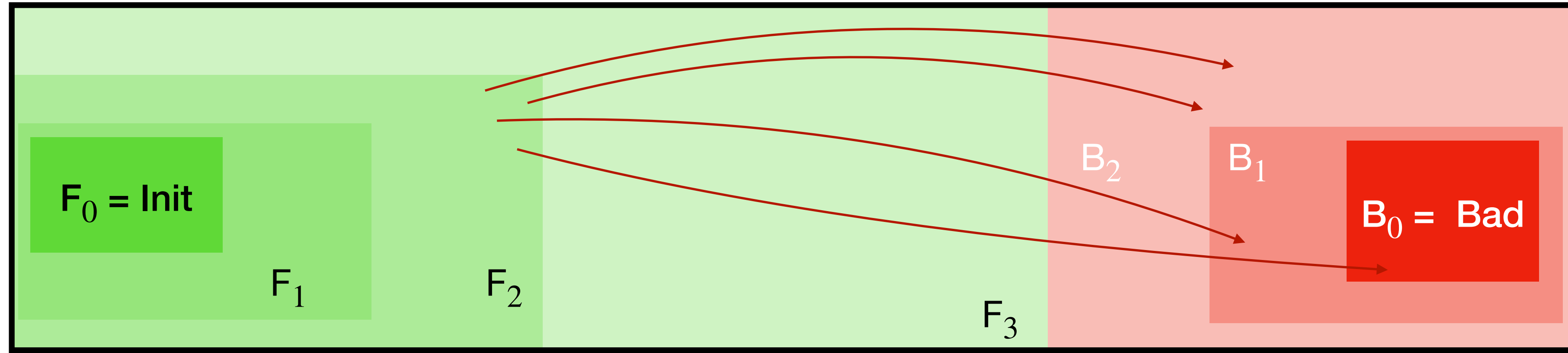
$$F_{k+1} := \overline{B_k} \quad \text{post}(F_k) \not\subseteq F_{k+1}$$

$$B_{k+1} := B_k$$

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
3. $F_k \cap B_k = \emptyset$

IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

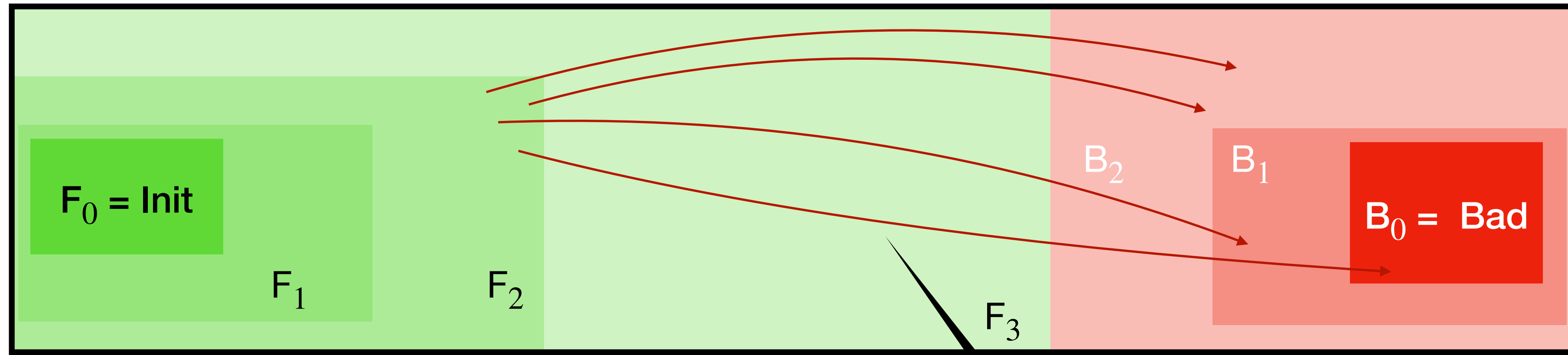
Problem:

$$\begin{aligned}
 F_{k+1} &:= \overline{B_k} & \text{post}(F_k) &\not\subseteq F_{k+1} \\
 B_{k+1} &:= B_k & \text{iff} & \\
 & & \text{post}(F_k) \cap B_k &\neq \emptyset
 \end{aligned}$$

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
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IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

$$F_{k+1} := \overline{B_k}$$

$$B_{k+1} := B_k$$

Problem:

$$\text{post}(F_k) \not\subseteq F_{k+1}$$

iff

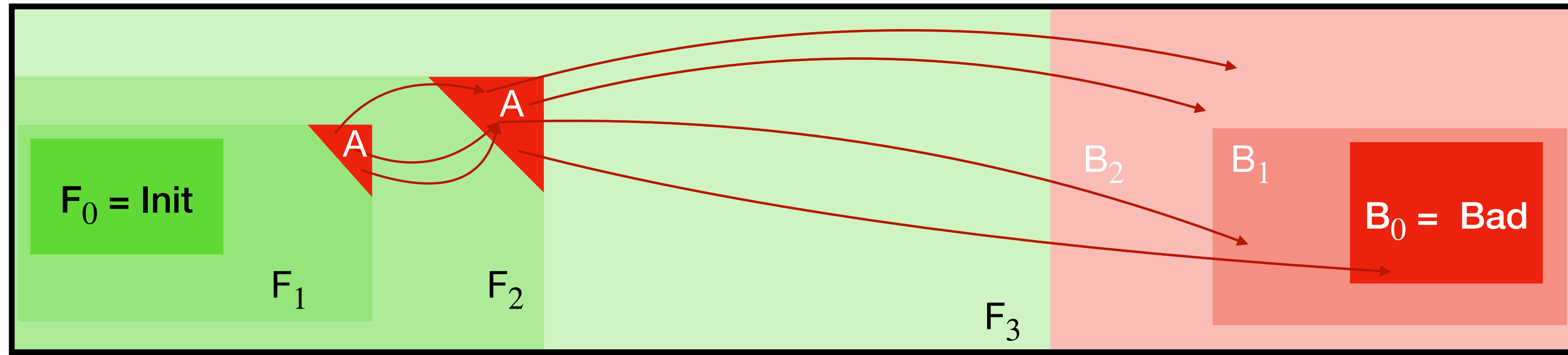
$$\text{post}(F_k) \cap B_k \neq \emptyset$$

Counterexample
to induction (CTI)

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
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IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

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Problem:

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iff

$$\text{post}(F_k) \cap B_k \neq \emptyset$$

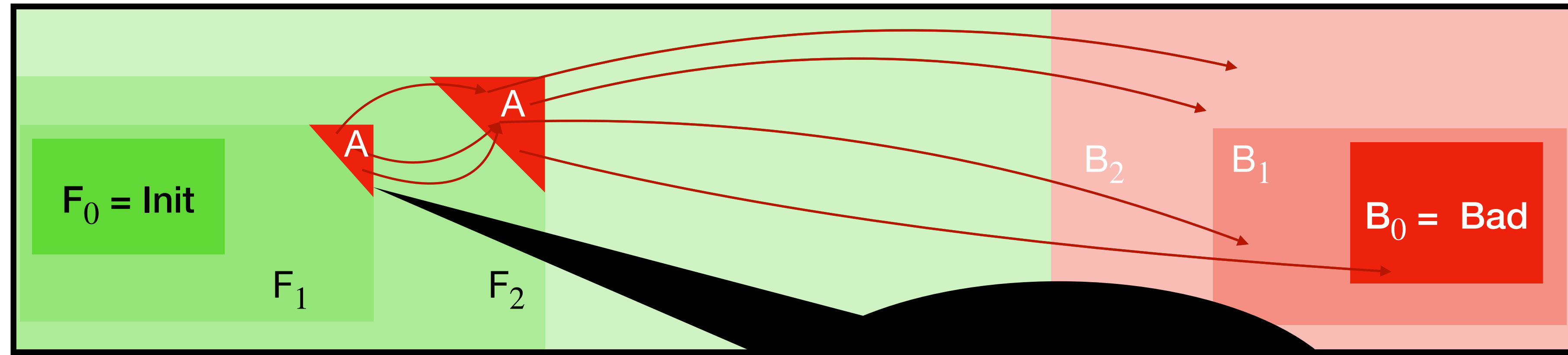
Solution:

$$A := \text{pre}^{F_0 \dots F_k}(B_k)$$

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
3. $F_k \cap B_k = \emptyset$

IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Terminate with false,
when you reach **Init**!

Idea:

$$F_{k+1} := \overline{B_k}$$

$$B_{k+1} := B_k$$

Problem:

$$\text{post}(F_k) \not\subseteq F_{k+1}$$

iff

$$\text{post}(F_k) \cap B_k \neq \emptyset$$

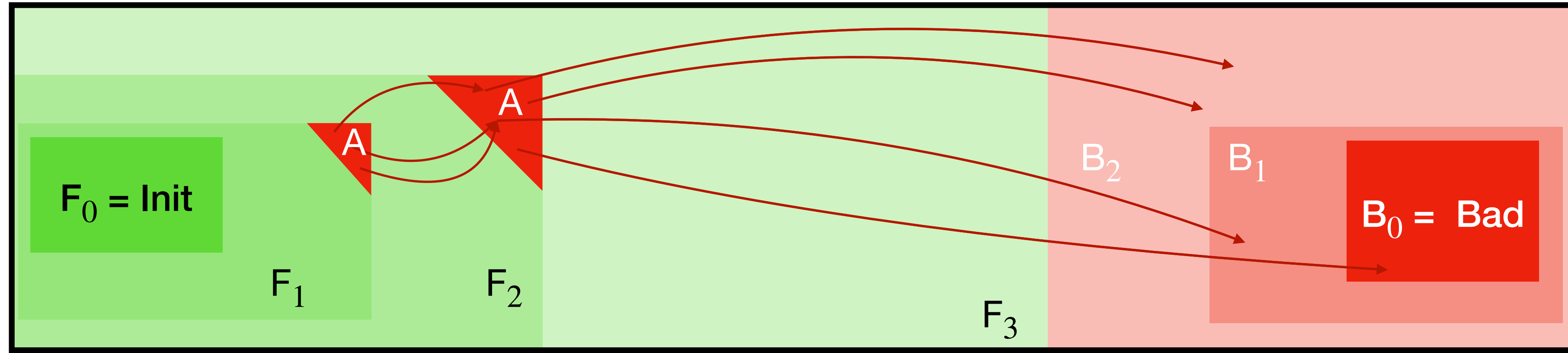
Solution:

$$A := \text{pre}^{F_0 \dots F_k}(B_k)$$

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
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IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

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Problem:

$$\text{post}(F_k) \not\subseteq F_{k+1}$$

iff

$$\text{post}(F_k) \cap B_k \neq \emptyset$$

Solution:

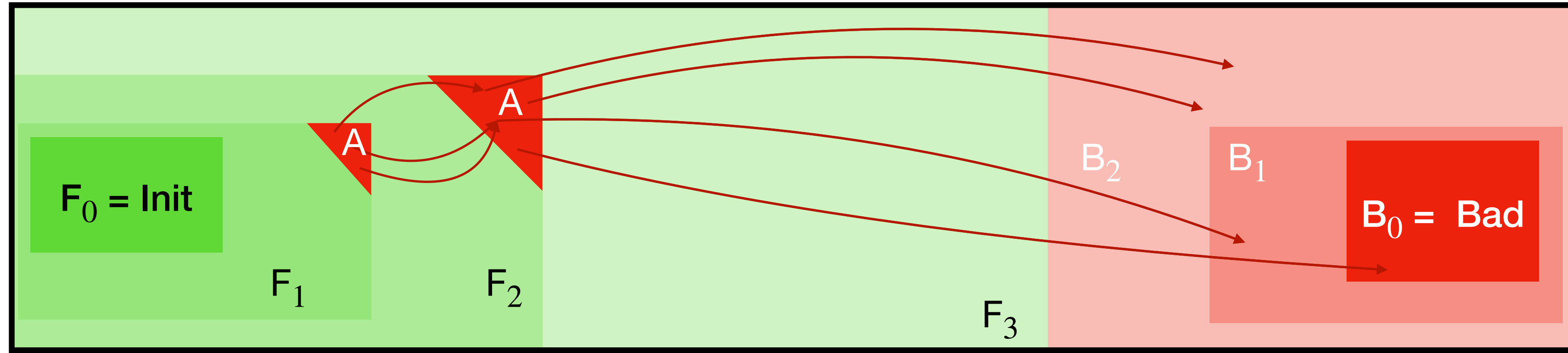
$$A := \text{pre}^{F_0 \dots F_k}(B_k)$$

$$B_{k+1} := B_k \cup A$$

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IC3 in Essence

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Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

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Solution:

$$A := \text{pre}^{F_0 \dots F_k}(B_k)$$

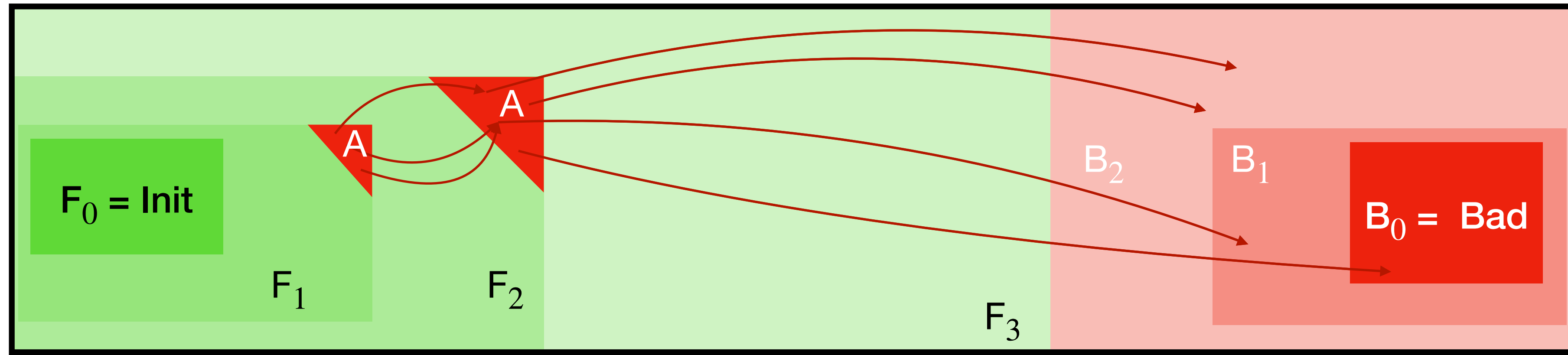
$$(F_0 \cap \overline{A}) \subseteq \dots \subseteq (F_k \cap \overline{A}) \subseteq F_{k+1}$$

$$B_{k+1} := B_k \cup A$$

1. $\text{Init} = F_0$
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IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

$$F_{k+1} := \overline{B_k}$$

$$B_{k+1} := B_k$$

Problem:

$$\text{post}(F_k) \not\subseteq F_{k+1}$$

iff

$$\text{post}(F_k) \cap B_k \neq \emptyset$$

Solution:

$$A := \text{pre}^{F_0 \dots F_k}(B_k)$$

$$(F_0 \cap \overline{A}) \subseteq \dots \subseteq (F_k \cap \overline{A}) \subseteq F_{k+1}$$

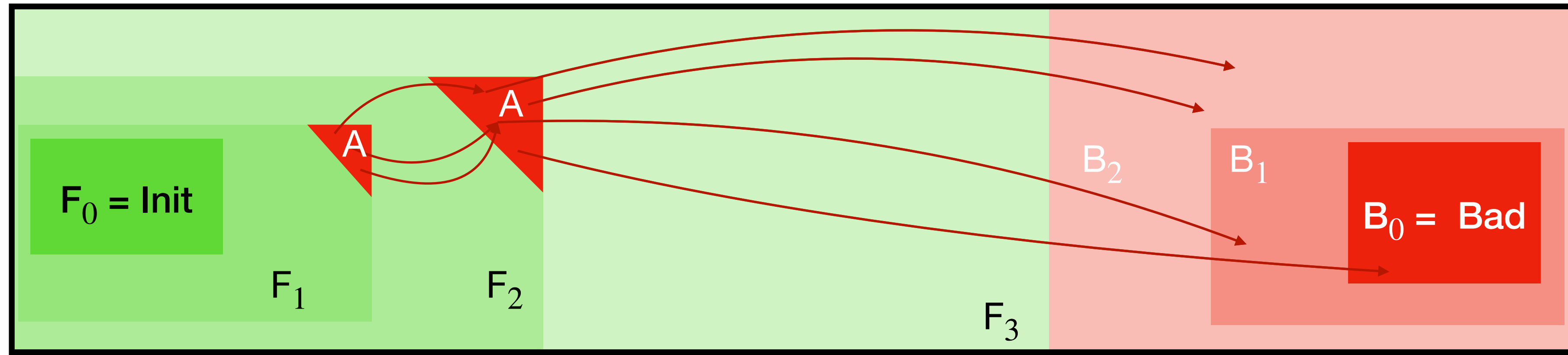
$$B_{k+1} := B_k \cup A$$

This is an operation on sequences [Hasuo et al.'22].

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IC3 in Essence

[Hasuo et al., CAV'22]



Extend $F_0 \subseteq \dots \subseteq F_k$ and $B_0 \subseteq \dots \subseteq B_k$

Idea:

$$F_{k+1} := \overline{B_k}$$

$$B_{k+1} := B_k$$

Problem:

$$\text{post}(F_k) \not\subseteq F_{k+1}$$

iff

$$\text{post}(F_k) \cap B_k \neq \emptyset$$

Solution:

$$A := \text{pre}^{F_0 \dots F_k}(B_k)$$

$$(F_0 \cap \overline{A}) \subseteq \dots \subseteq (F_k \cap \overline{A}) \subseteq F_{k+1}$$

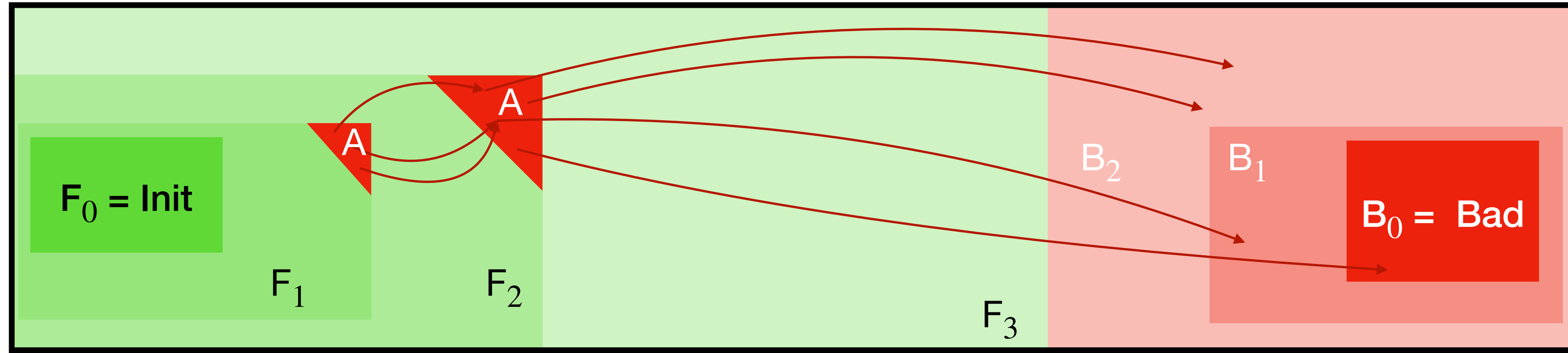
$$B_{k+1} := B_k \cup A$$

Terminate with true,
when $(F_k, B_k) = (F_{k+1}, B_{k+1})$.

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
3. $F_k \cap B_k = \emptyset$

IC3 in Essence

[Hasuo et al., CAV'22]



$$\text{pre}^{F_0 \dots F_k}(B_k):$$

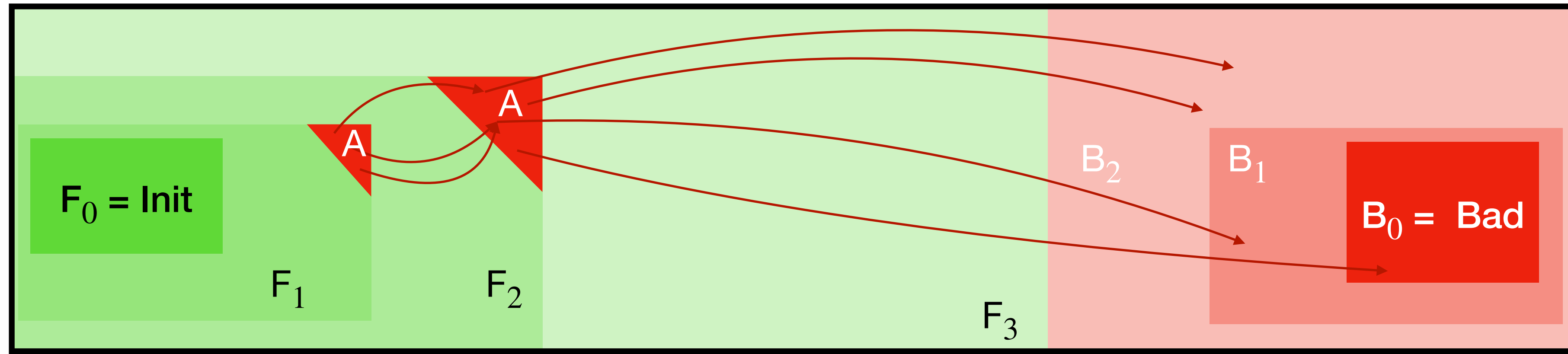
$$\text{pre}^F(X) = F \cap \text{pre}(X)$$

$$\text{pre}^{\mathcal{F}.F}(X) = \text{pre}^F(X) \cup \text{pre}^{\mathcal{F}}(\text{pre}^F(X))$$

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
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IC3 in Essence

[Hasuo et al., CAV'22]



$$\text{pre}^{F_0 \dots F_k}(B_k):$$

$$\text{pre}^F(X) = F \cap \text{pre}(X)$$

$$\text{pre}^{\mathcal{F}.F}(X) = \text{pre}^F(X) \cup \text{pre}^{\mathcal{F}}(\text{pre}^F(X))$$

Theorem(S+C+Termination):

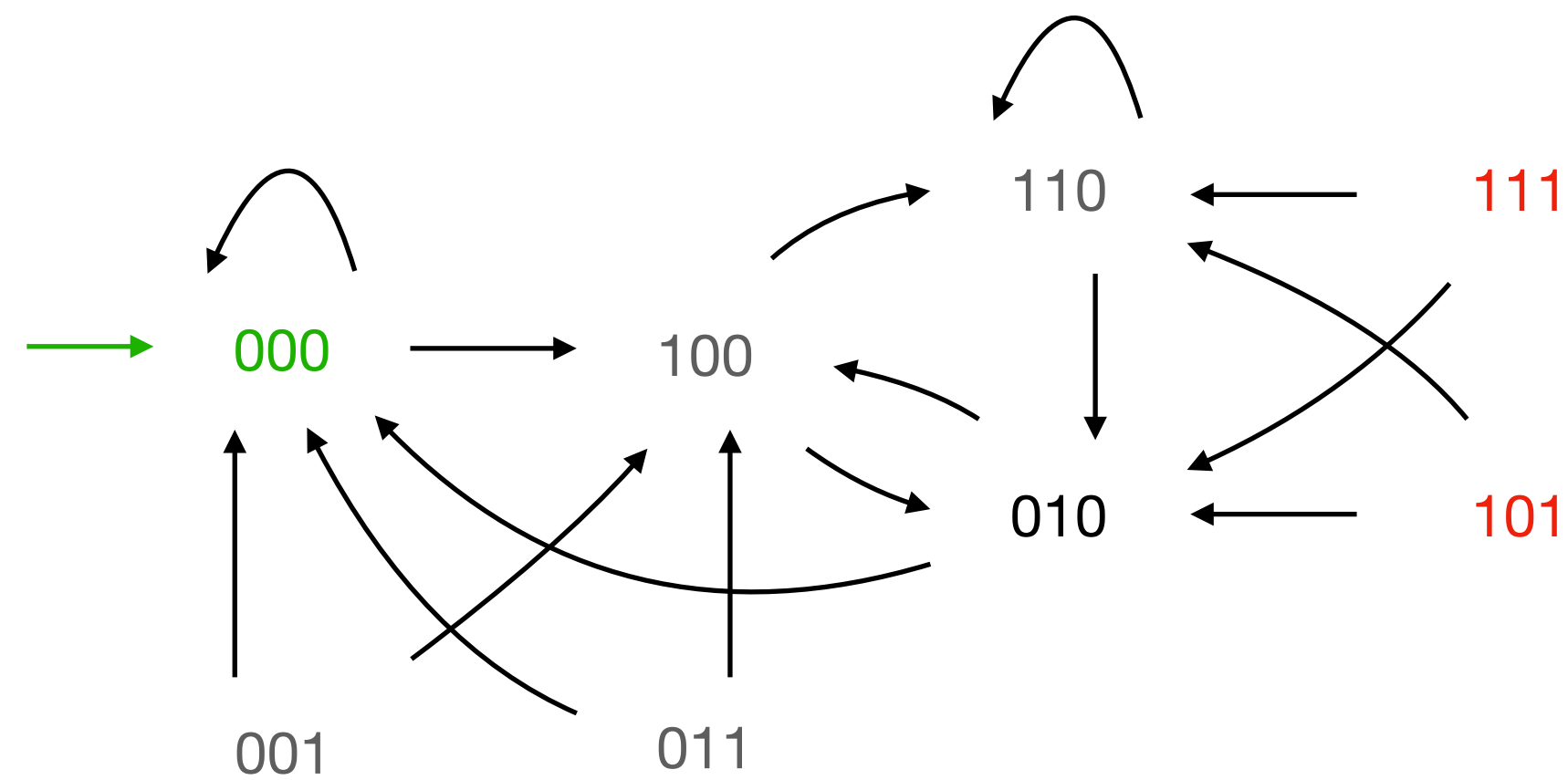
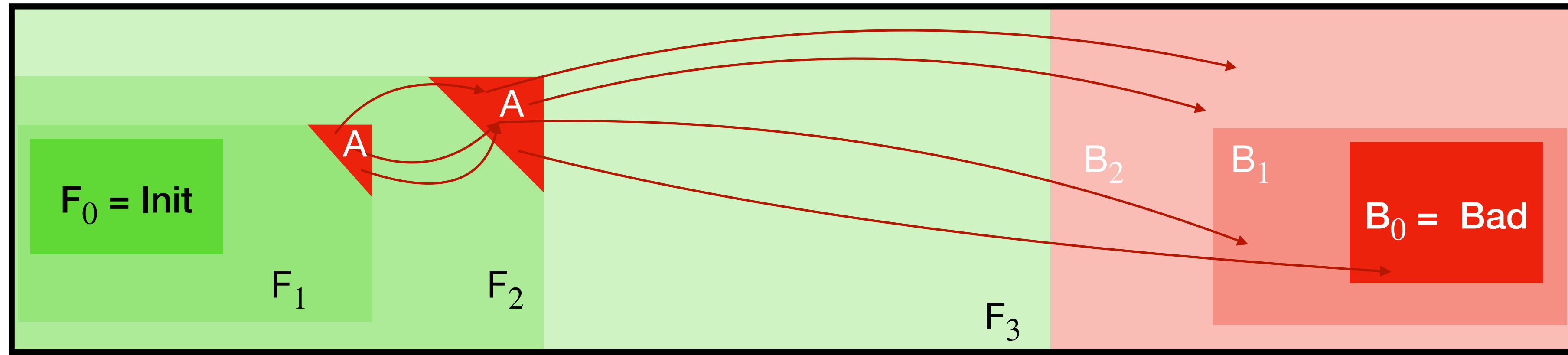
IC3 returns true if and only if $\text{post}^*(\text{Init}) \cap \text{Bad} = \emptyset$.

It is guaranteed to **terminate** even on WSTS [Majumdar et al., CAV'13].

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
3. $F_k \cap B_k = \emptyset$

IC3 on the Example

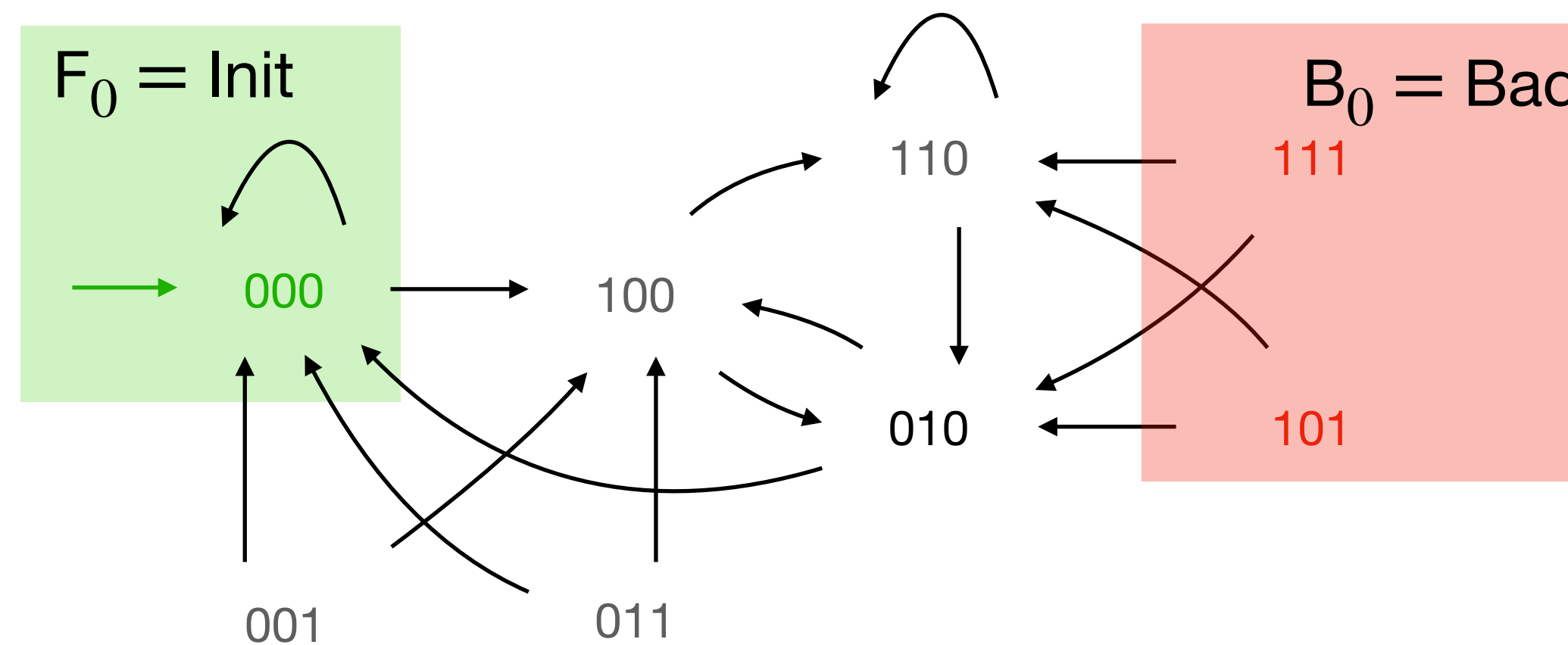
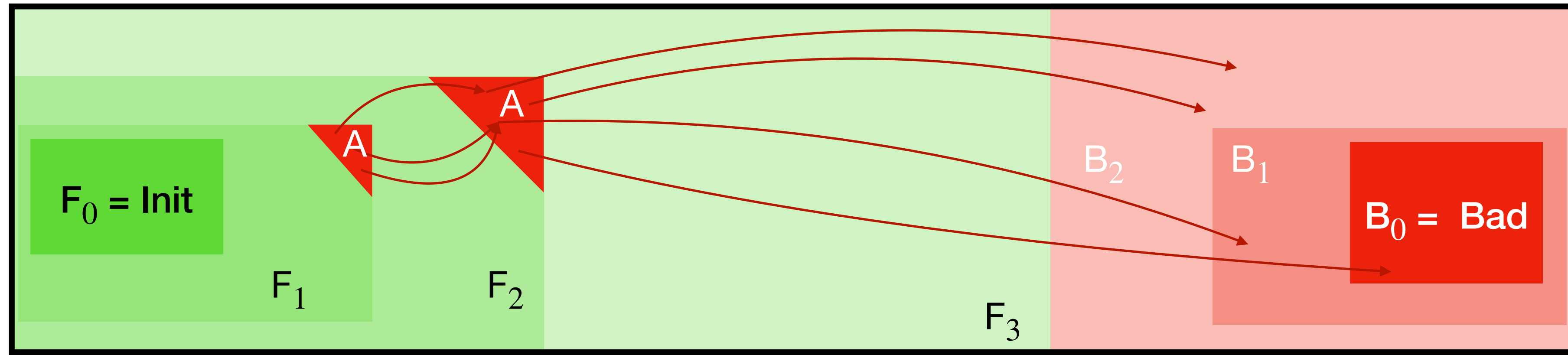
[Hasuo et al., CAV'22]



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IC3 on the Example

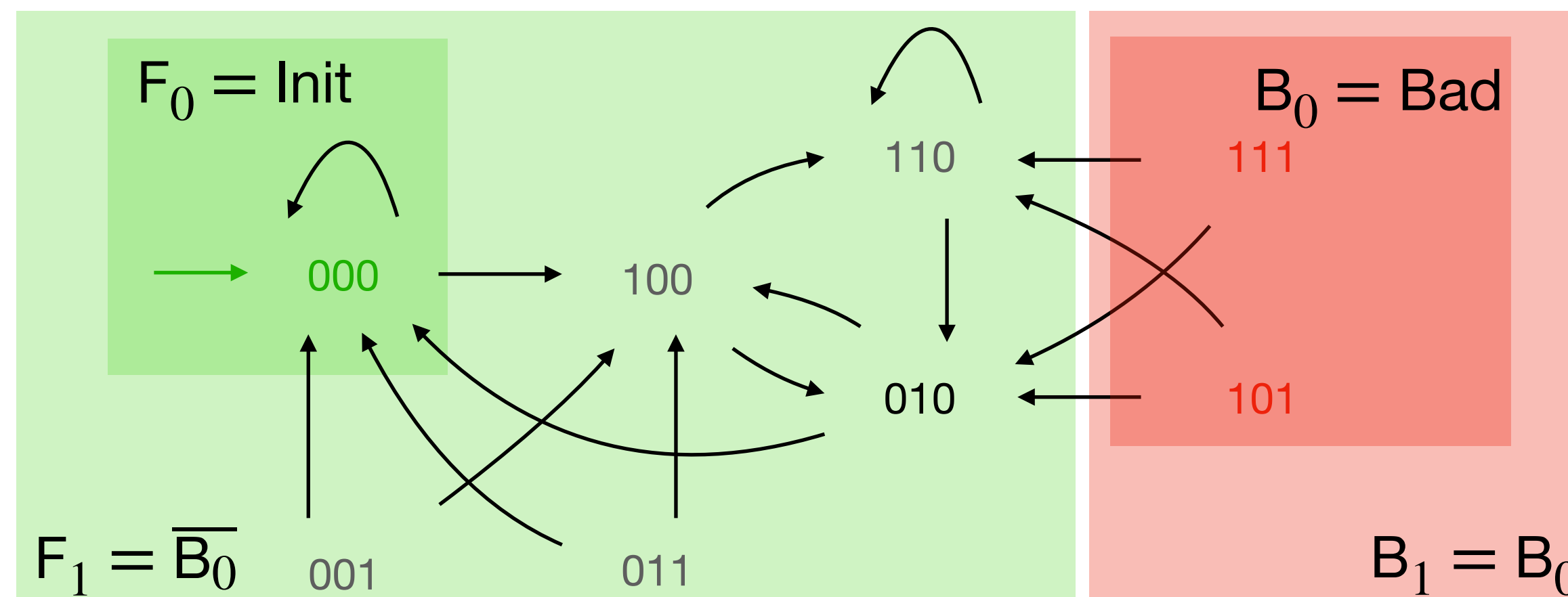
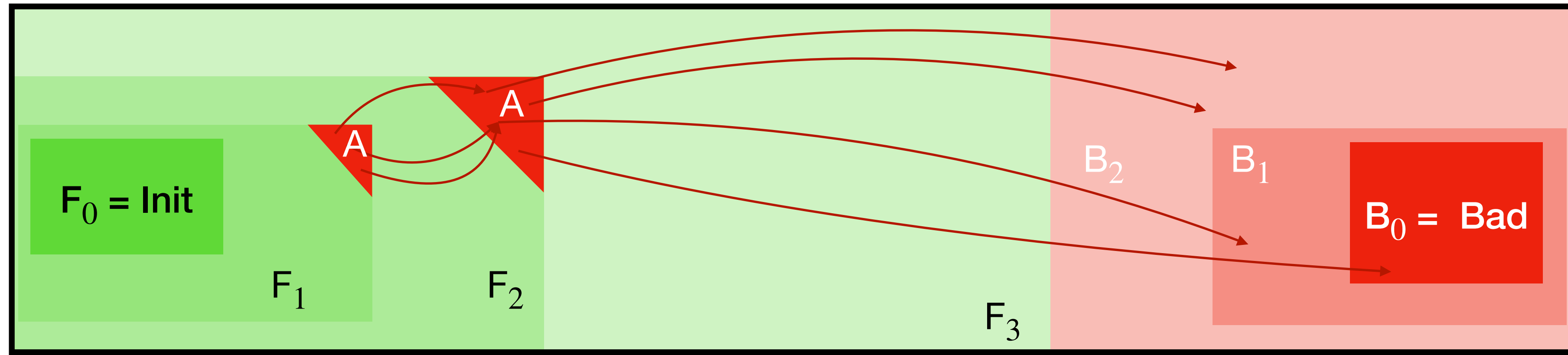
[Hasuo et al., CAV'22]



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IC3 on the Example

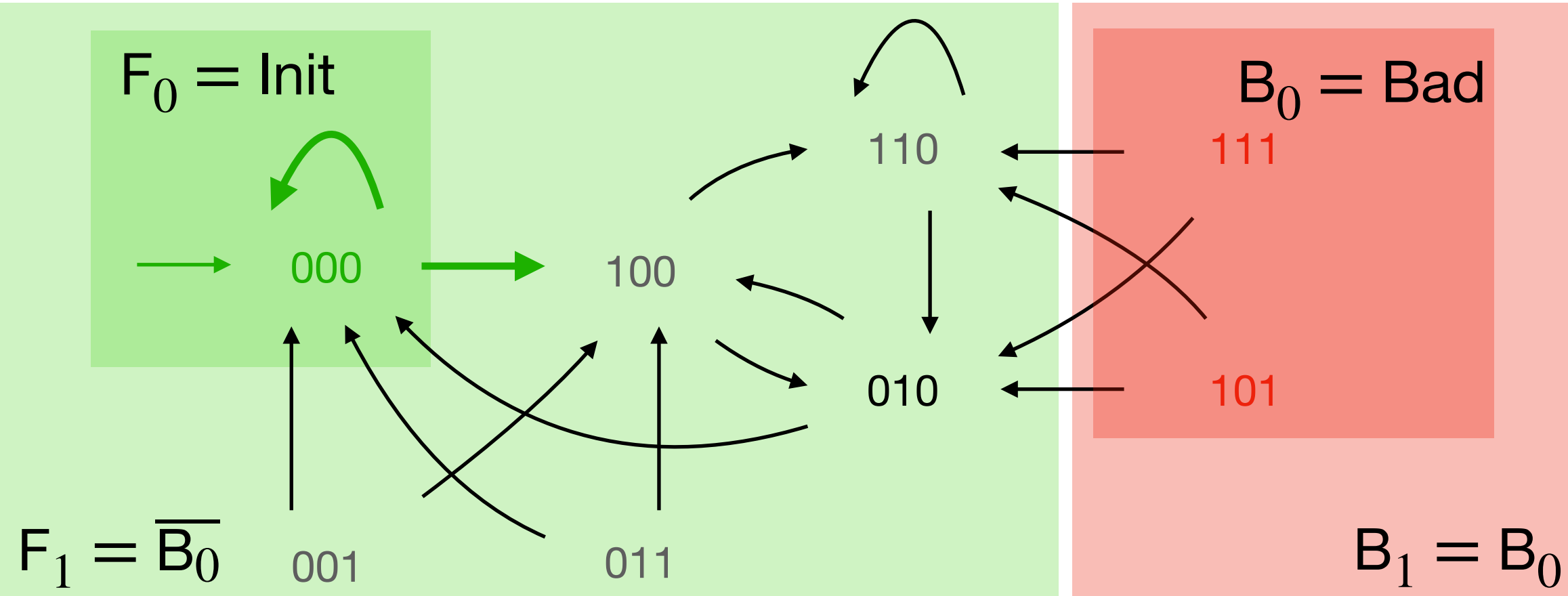
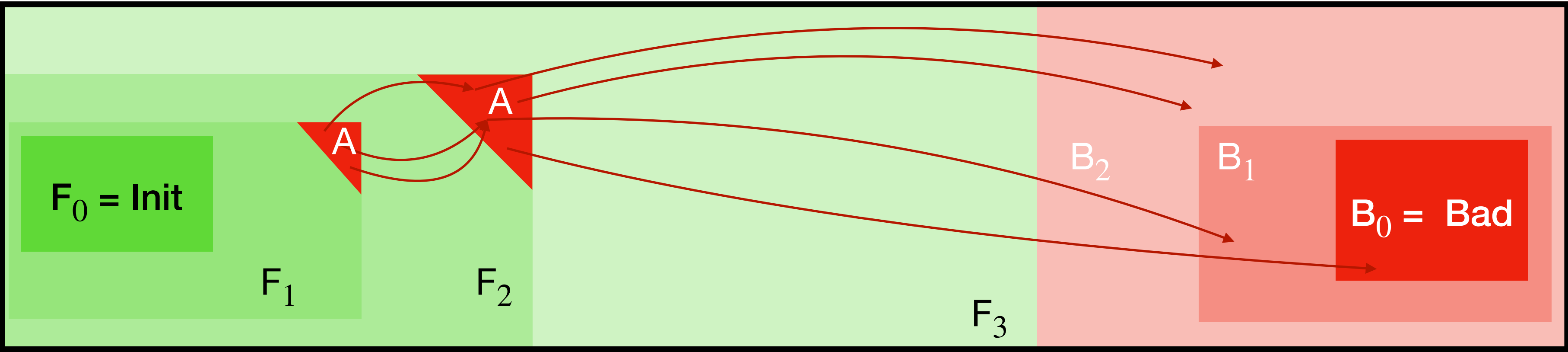
[Hasuo et al., CAV'22]



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IC3 on the Example

[Hasuo et al., CAV'22]

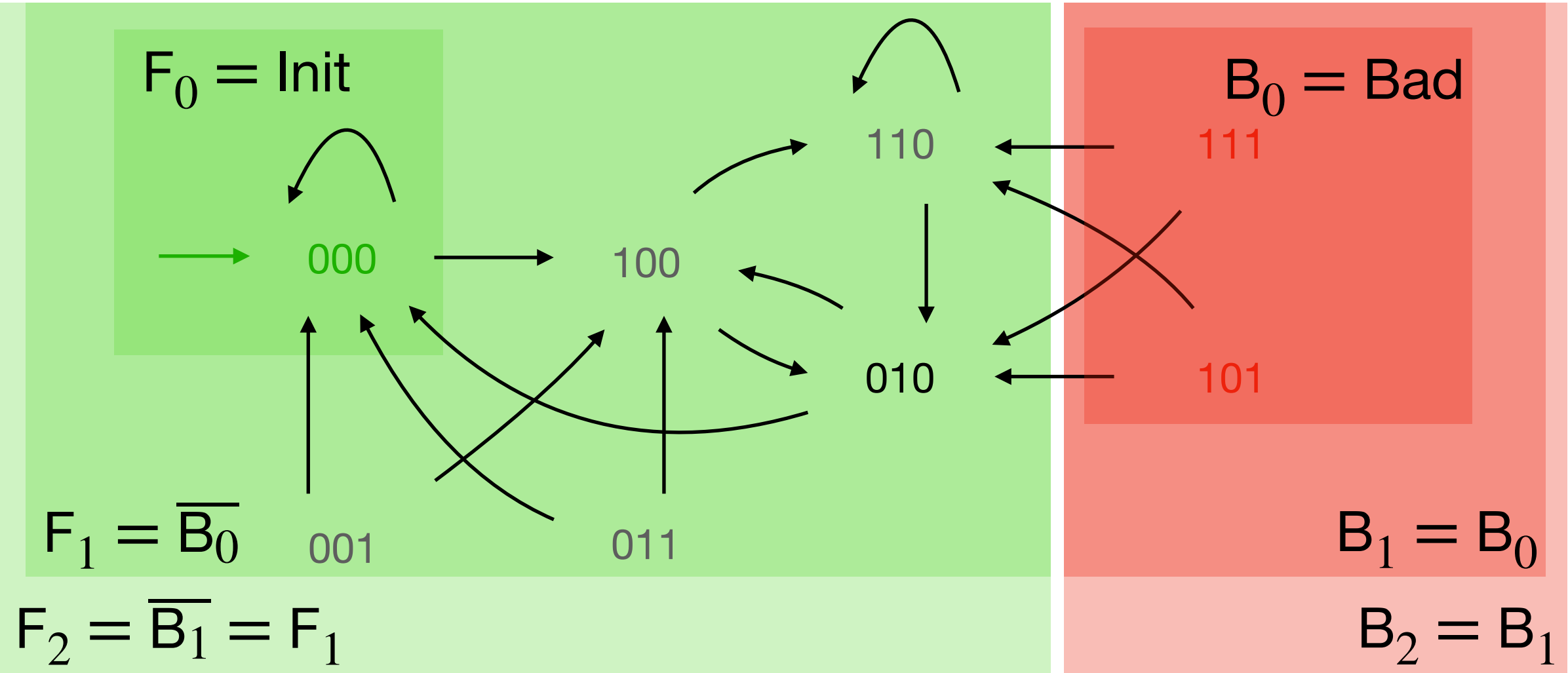
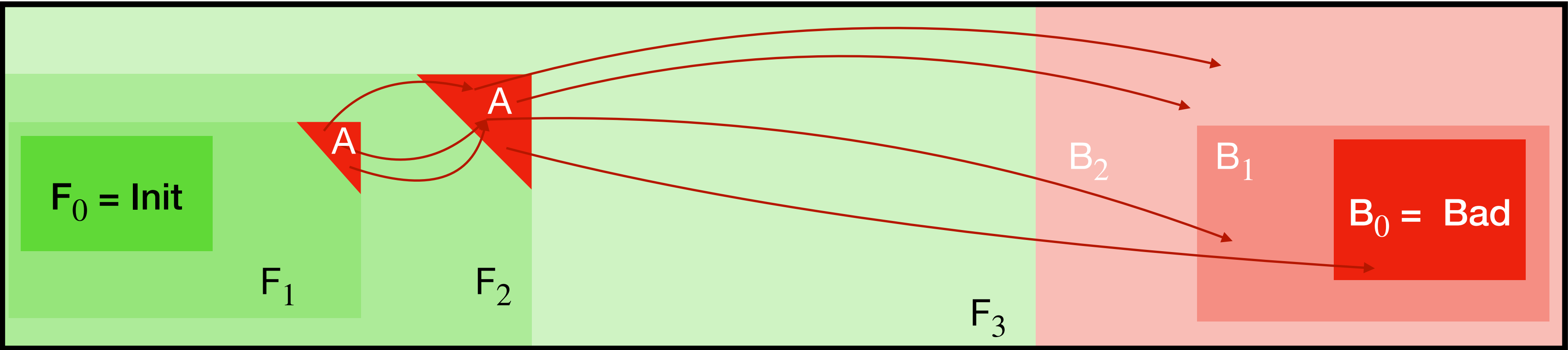


$\text{post}(F_0) \subseteq F_1$ so $A_1 = \emptyset$

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IC3 on the Example

[Hasuo et al., CAV'22]

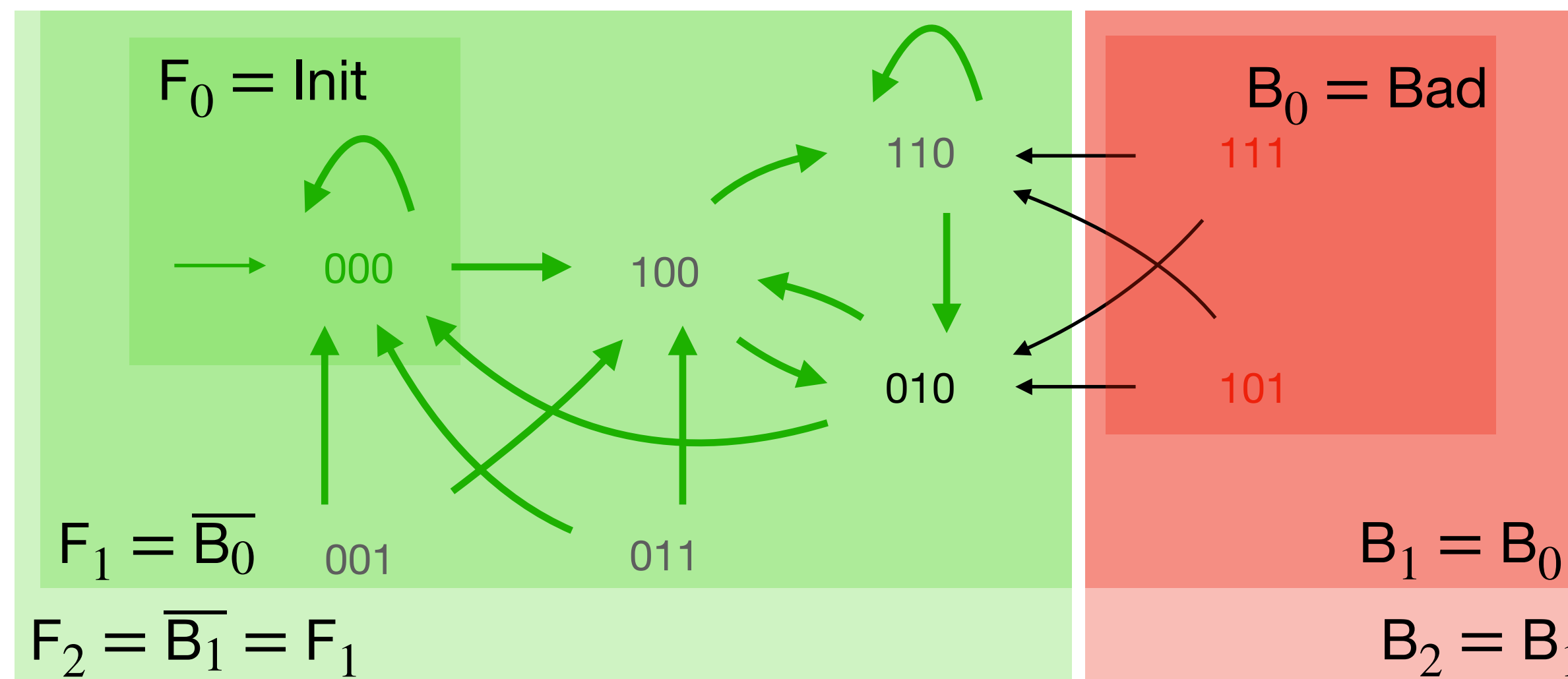
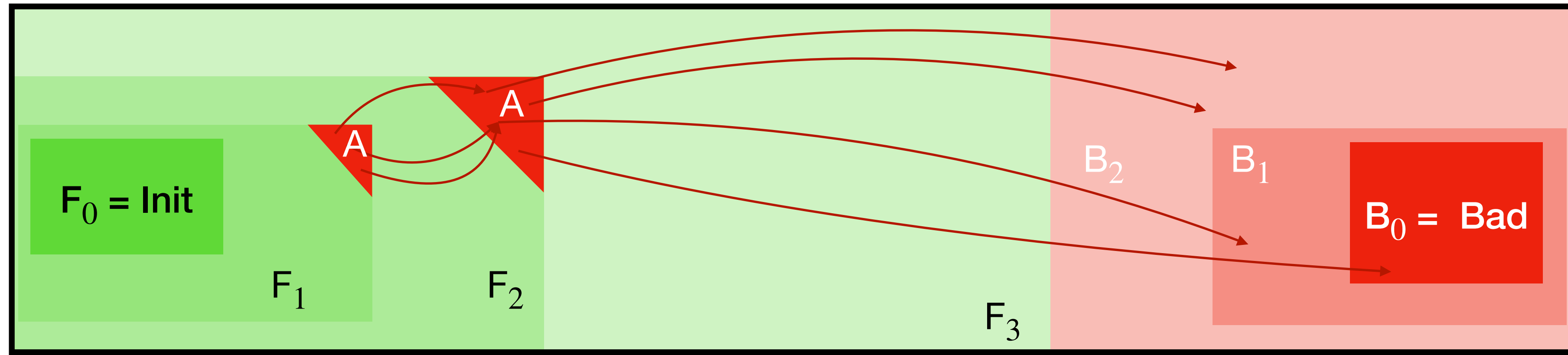


$\text{post}(F_0) \subseteq F_1$ so $A_1 = \emptyset$

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IC3 on the Example

[Hasuo et al., CAV'22]

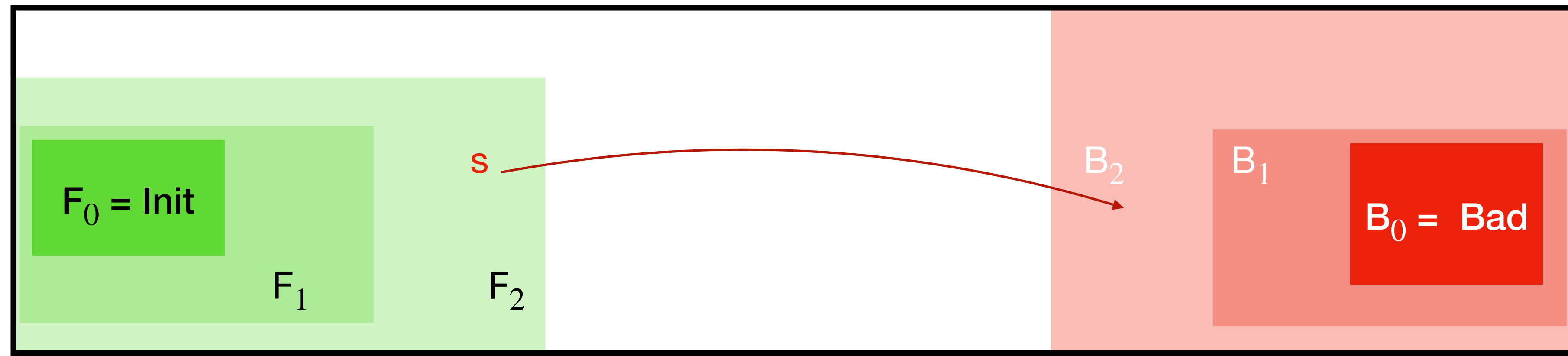


$\text{post}(F_0) \subseteq F_1$ so $A_1 = \emptyset$
 $\text{post}(F_1) \subseteq F_2$ so $A_2 = \emptyset$

1. $\text{Init} = F_0$
 $B_0 = \text{Bad}$
2. $F_i \cup \text{post}(F_i) \subseteq F_{i+1}$
 $B_{i+1} \subseteq B_i \cup \text{pre}(B_i)$
3. $F_k \cap B_k = \emptyset$

IC3 in Detail

[Hasuo et al., CAV'22]

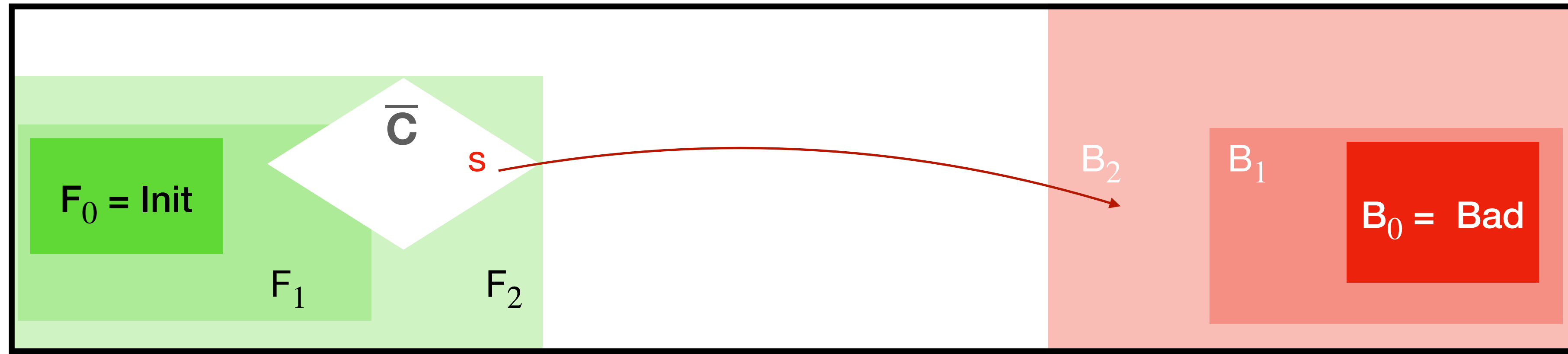


Removing CTIs:

Let $s \in F_k \cap \text{pre}(B_k)$.

IC3 in Detail

[Hasuo et al., CAV'22]



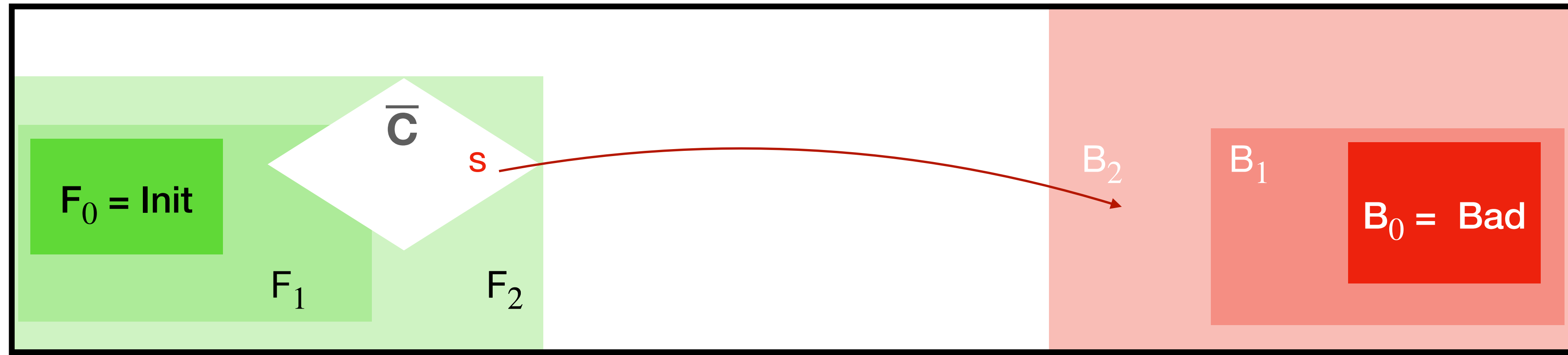
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IC3 in Detail

[Hasuo et al., CAV'22]



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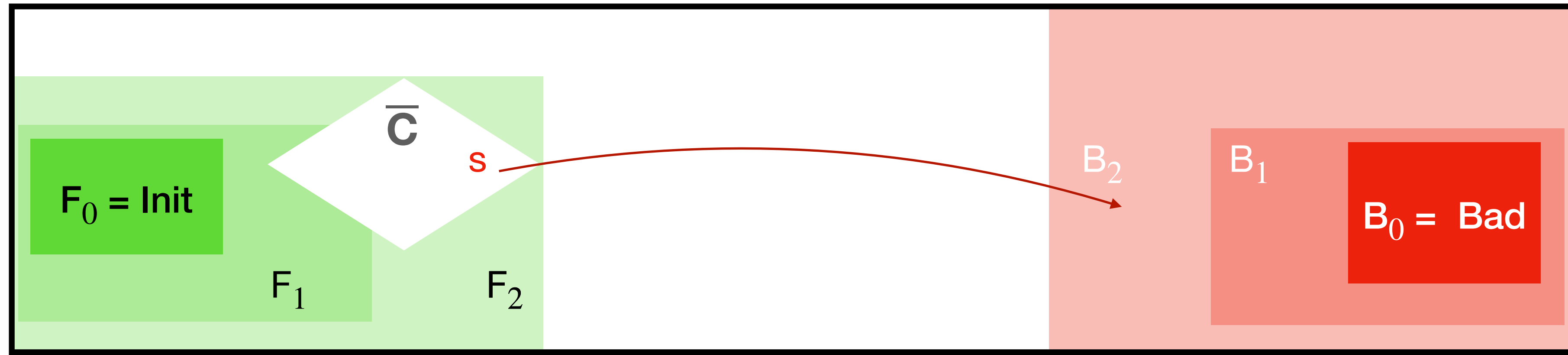
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Inductive **C**lauses

IC3 in Detail

[Hasuo et al., CAV'22]



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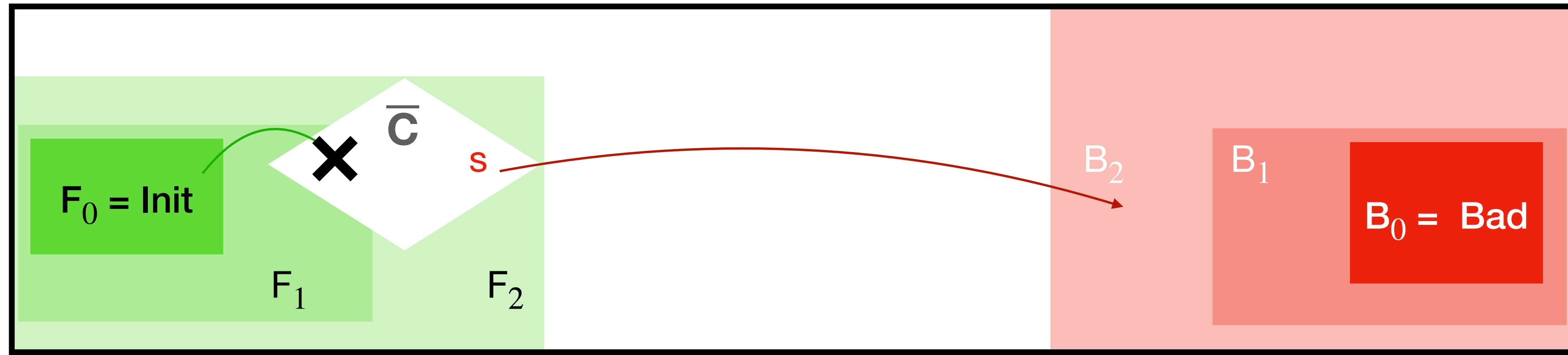
Lemma (**Relative Inductiveness**):

$\text{Init} \subseteq C$

$\text{post}(F_{k-1} \cap C) \subseteq C$

IC3 in Detail

[Hasuo et al., CAV'22]



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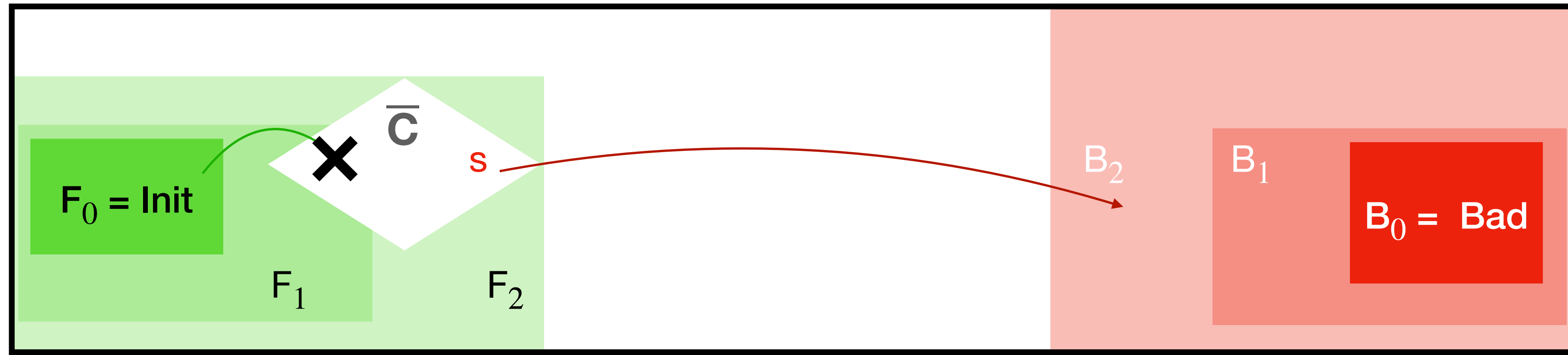
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IC3 in Detail

[Hasuo et al., CAV'22]



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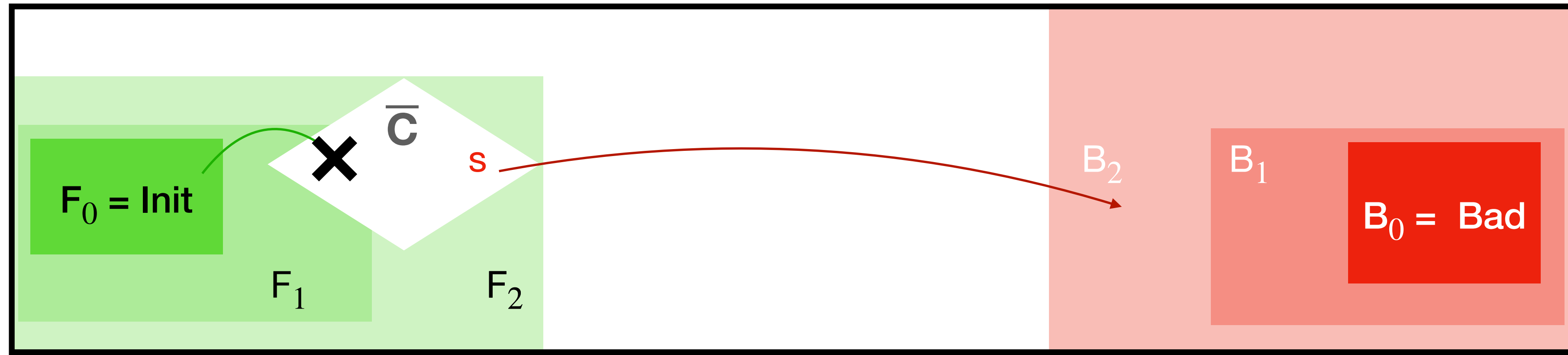
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$\text{post}(F_i) \subseteq F_{i+1}$ by 2.
 $\text{post}(F_i \cap C) \subseteq C$ by monotonicity of post.

IC3 in Detail

[Hasuo et al., CAV'22]



Removing CTIs:

Let $s \in F_k \cap \text{pre}(B_k)$.
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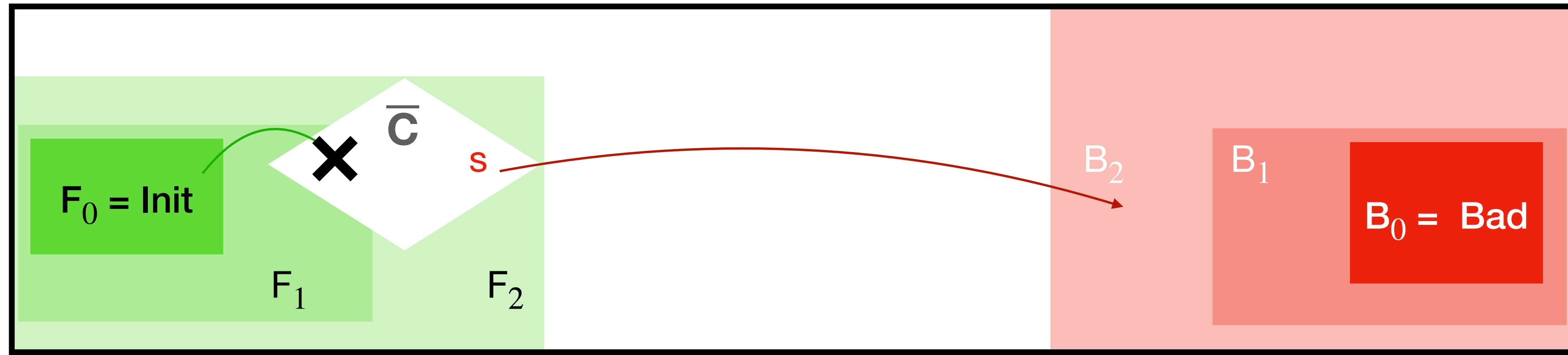
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 $\text{post}(F_{k-1} \cap C) \subseteq C$

With this terminology
 F_{i+1} is inductive **relative to** F_i , by 2.

IC3 in Detail

[Hasuo et al., CAV'22]



Removing CTIs:

Let $s \in F_k \cap \text{pre}(B_k)$.
Let $C \subseteq \overline{\{s\}}$.

Lemma (**Relative Inductiveness**):

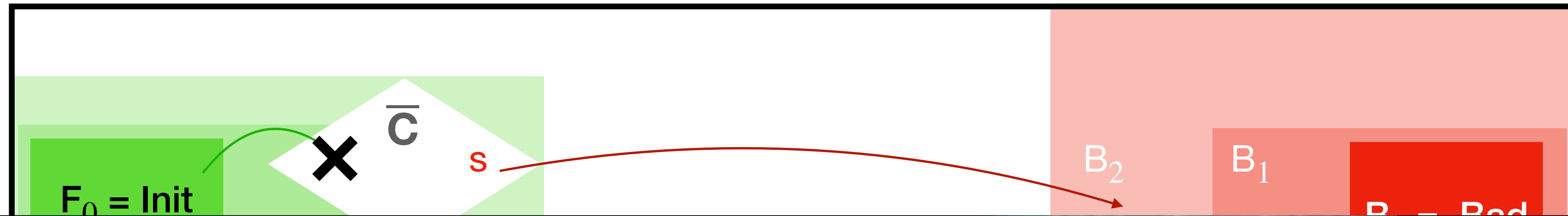
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 $\text{post}(F_{k-1} \cap C) \subseteq C$

Strengthen the sequence of candidate invariants:

$$(F_0 \cap C) \subseteq \dots \subseteq (F_k \cap C)$$

IC3 in Detail

[Hasuo et al., CAV'22]



This is an **incremental construction** of an inductive invariant.
The choice of F_{k+1} is a monolithic step.



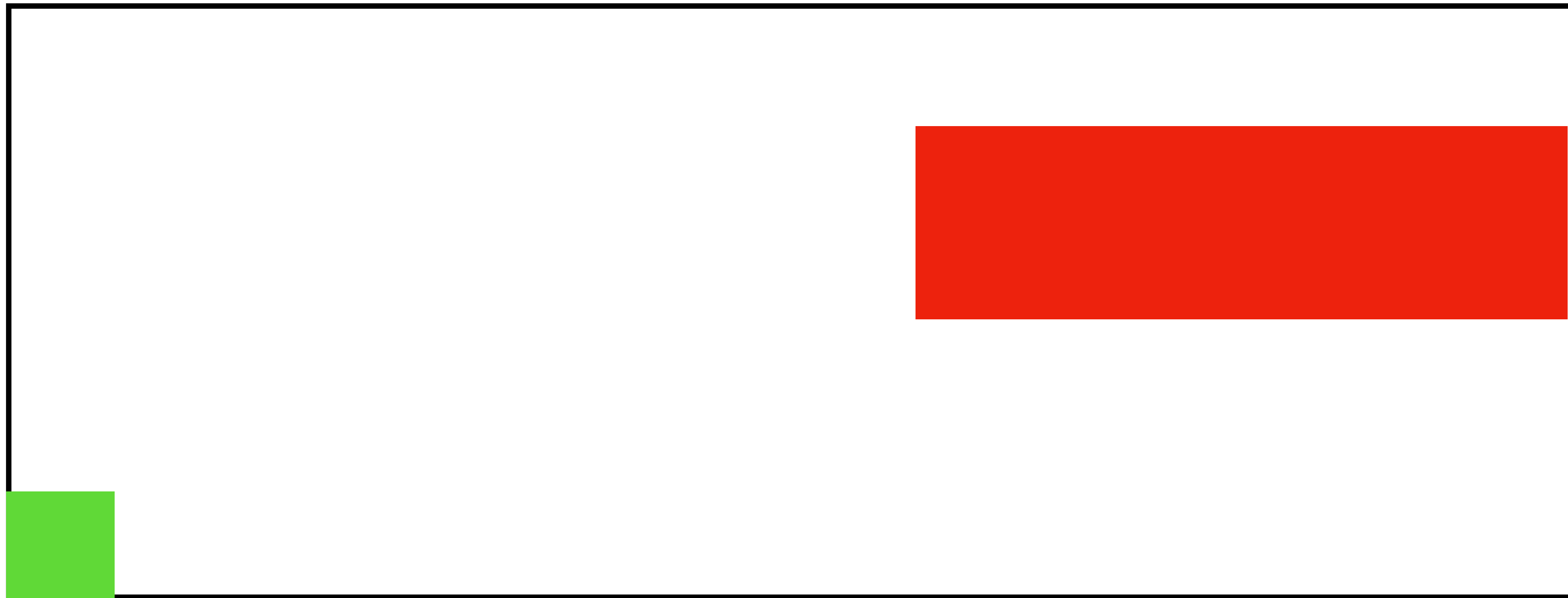
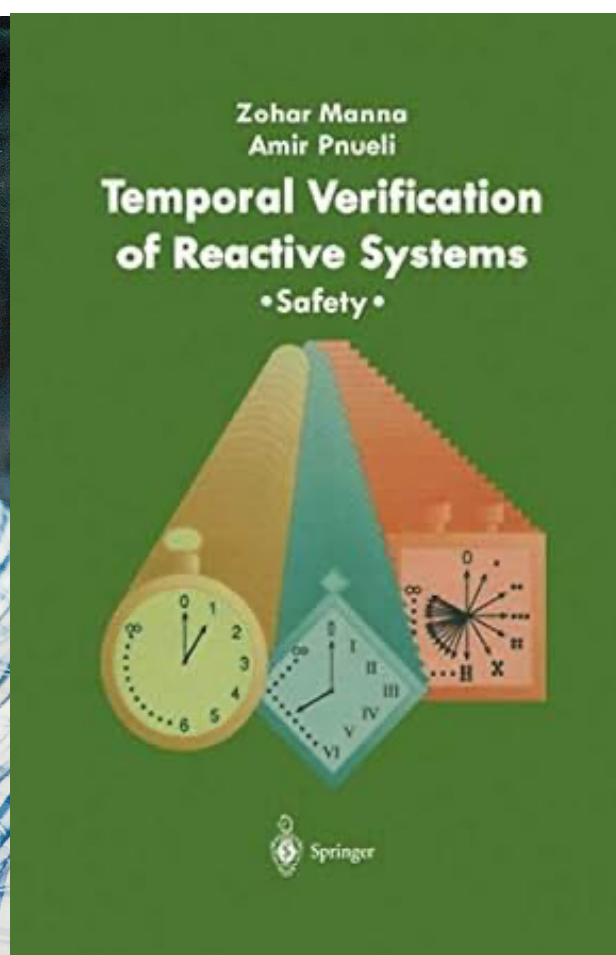
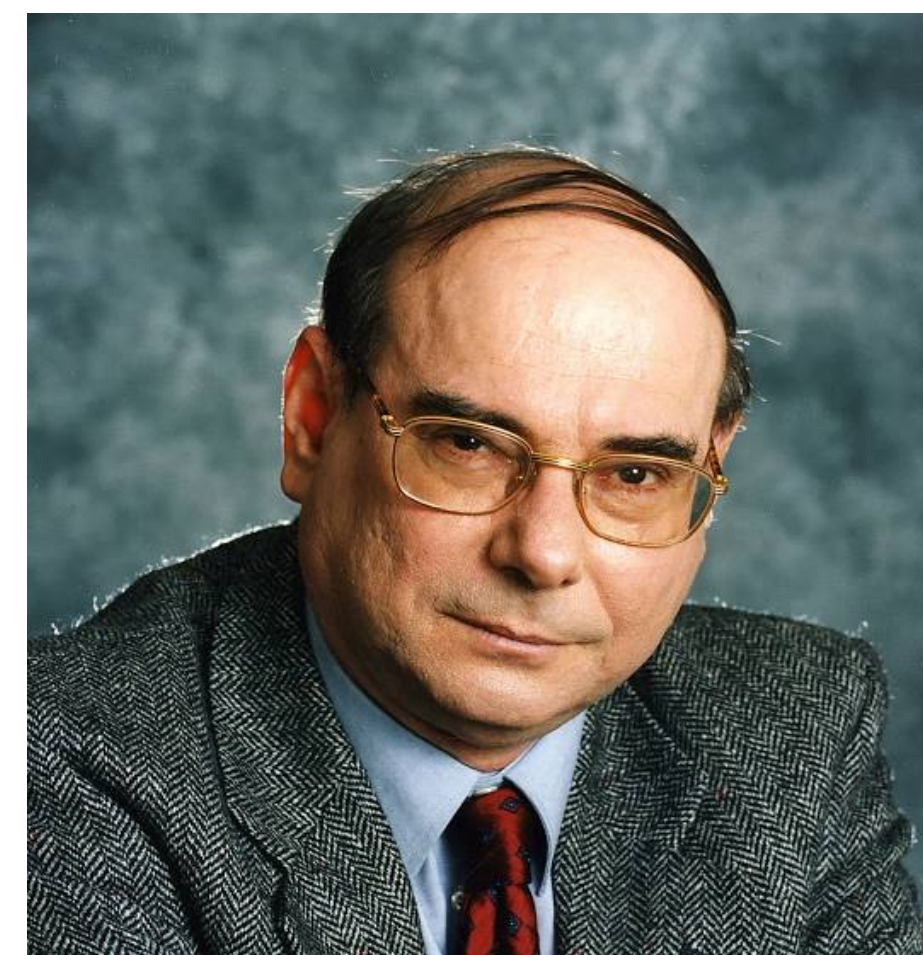
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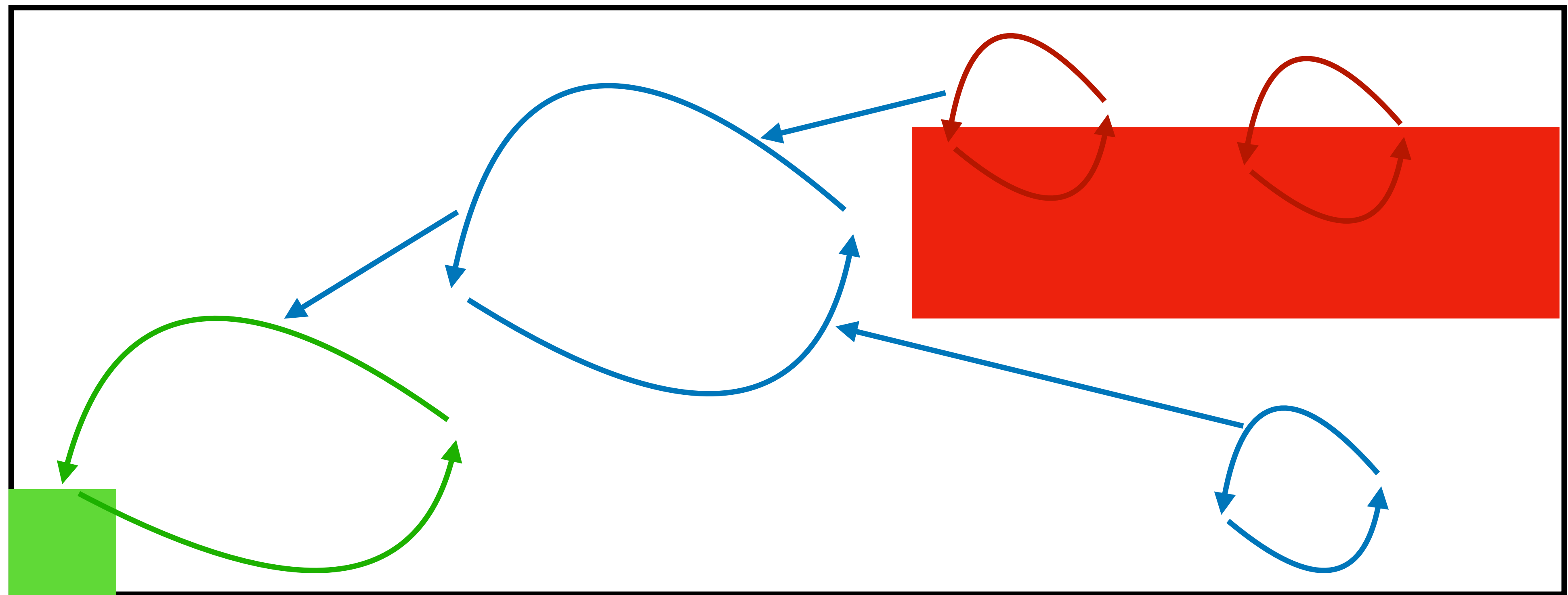
Relative Inductiveness

Determine strongly connected components.



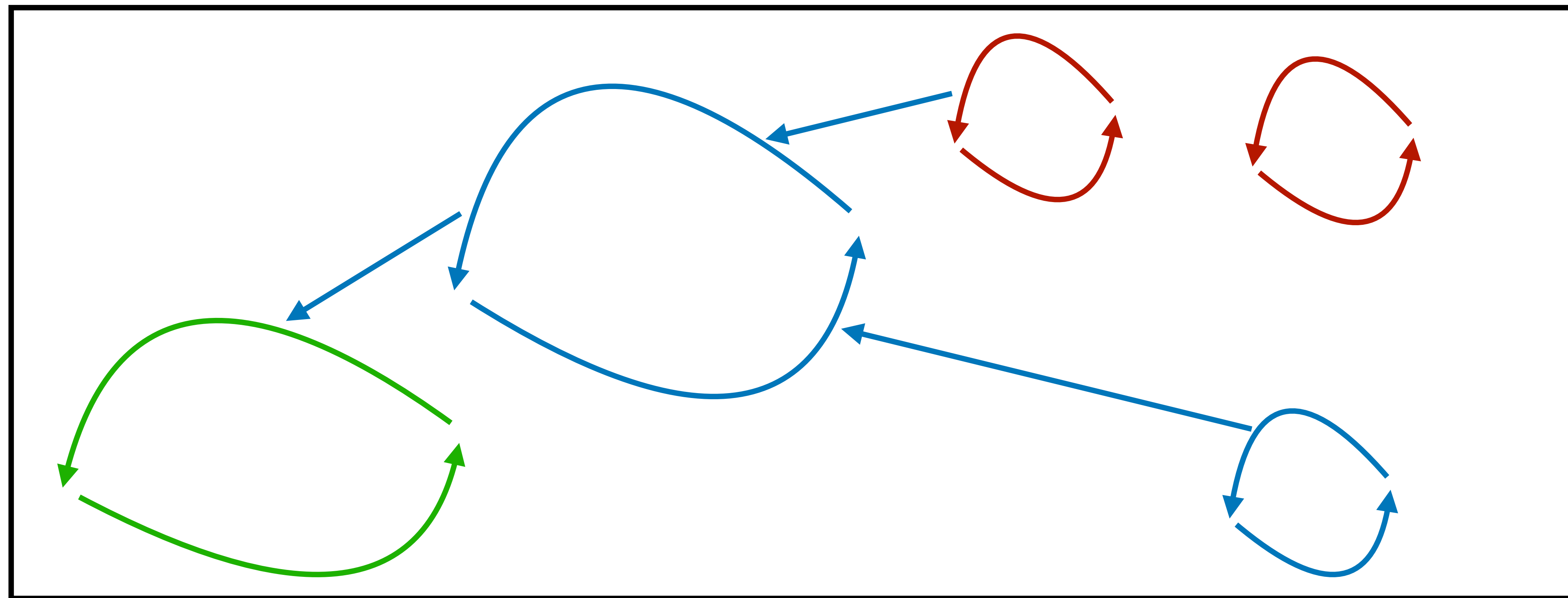
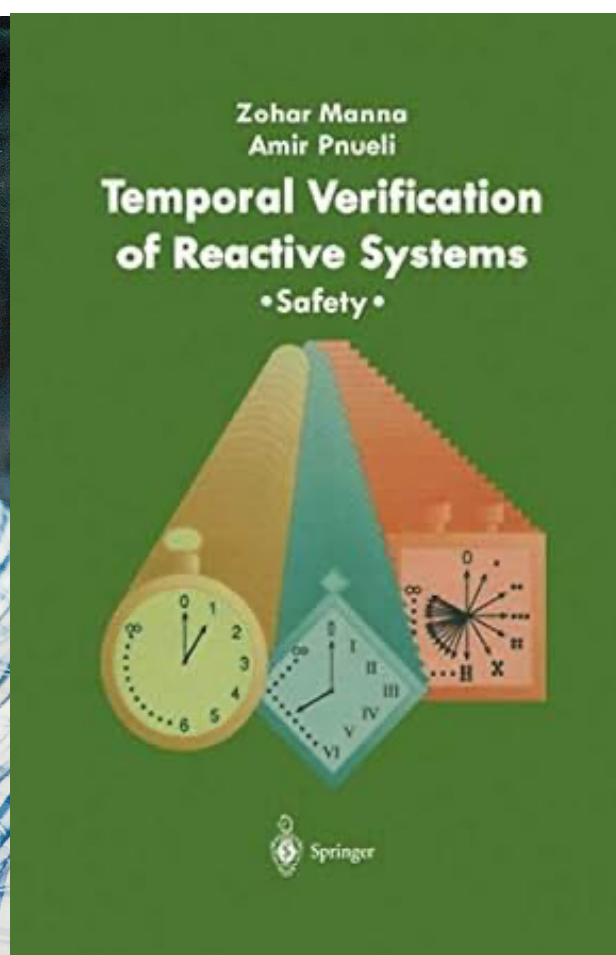
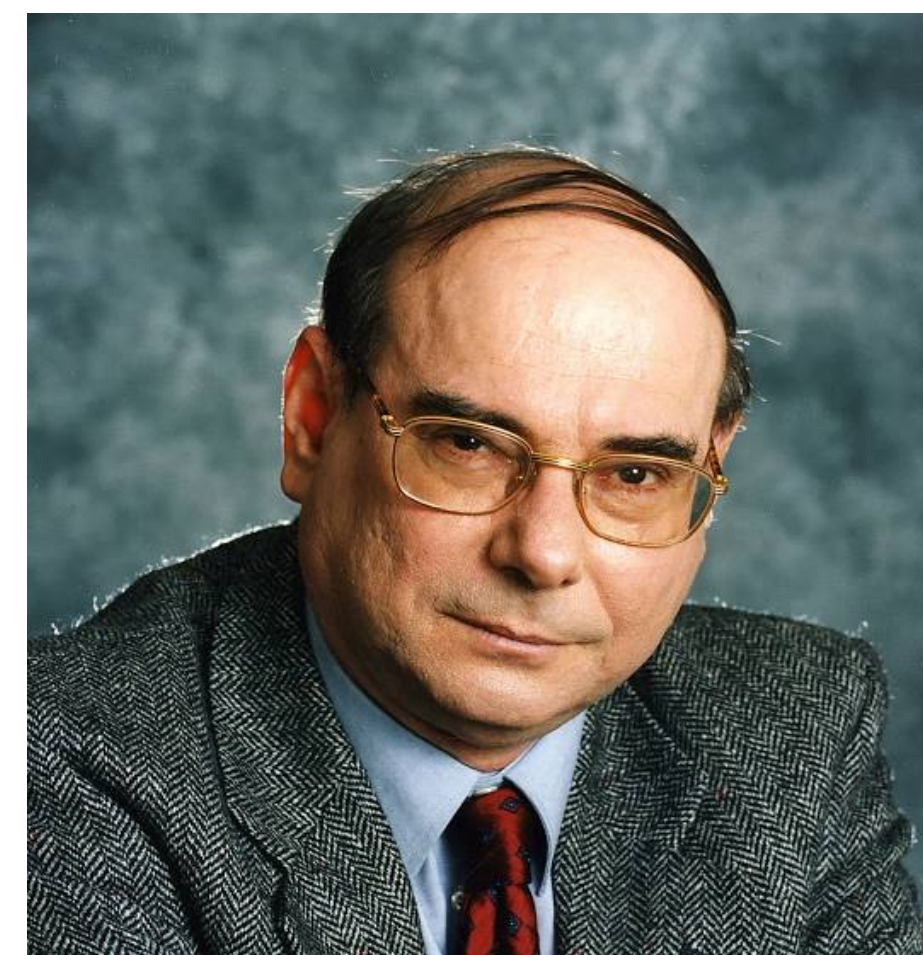
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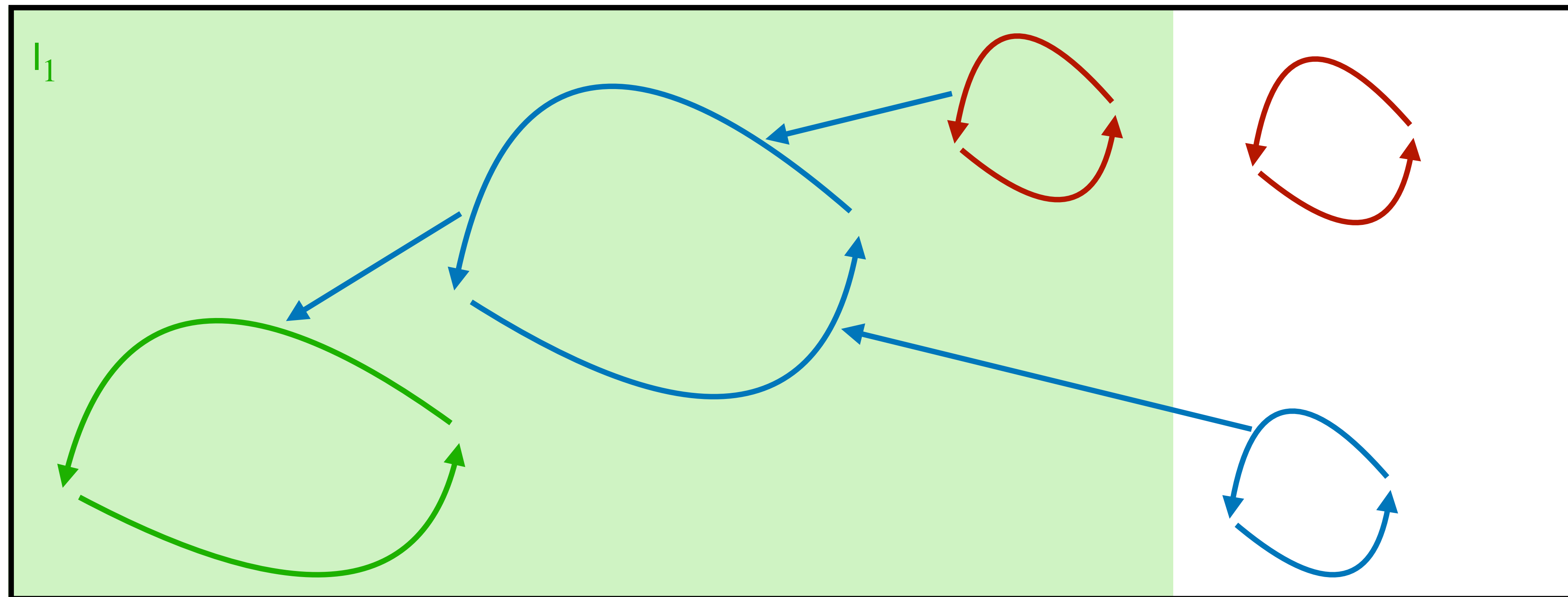
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Relative Inductiveness

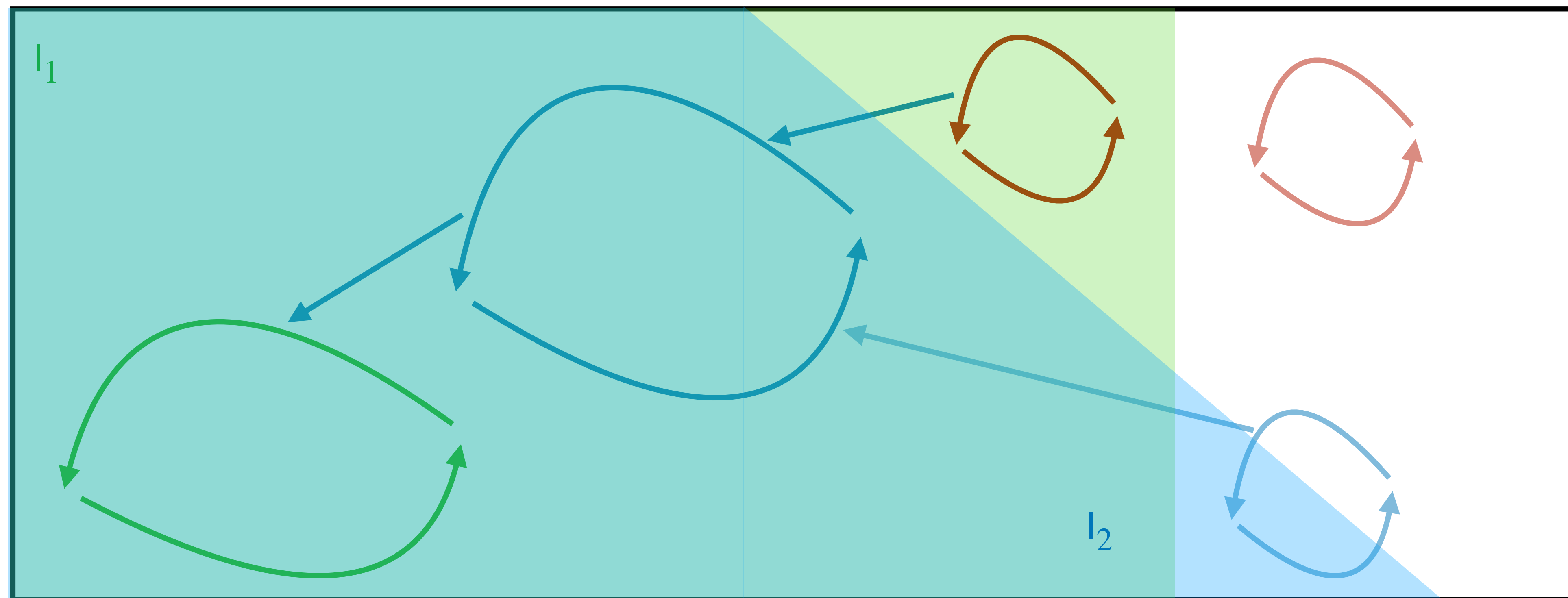
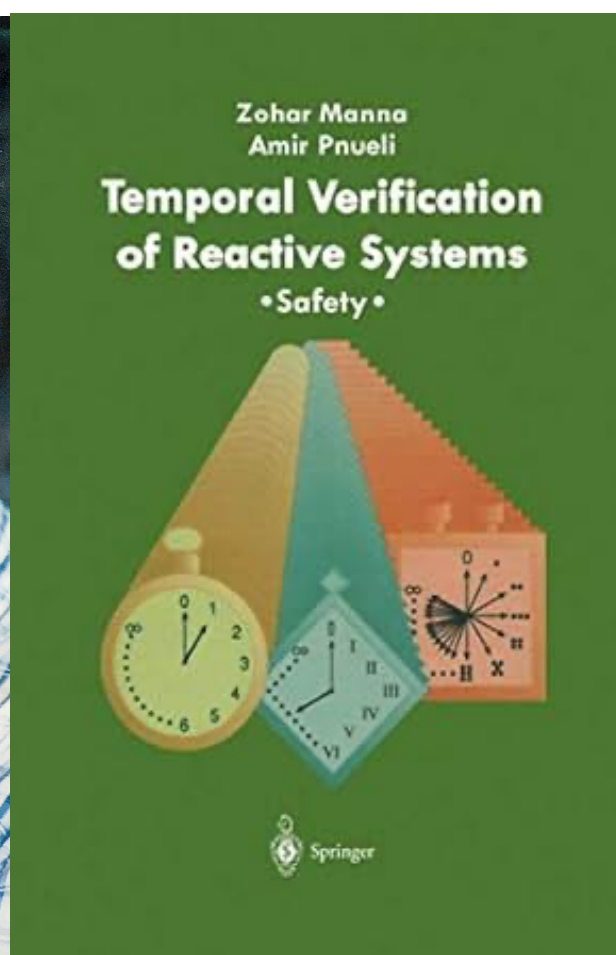
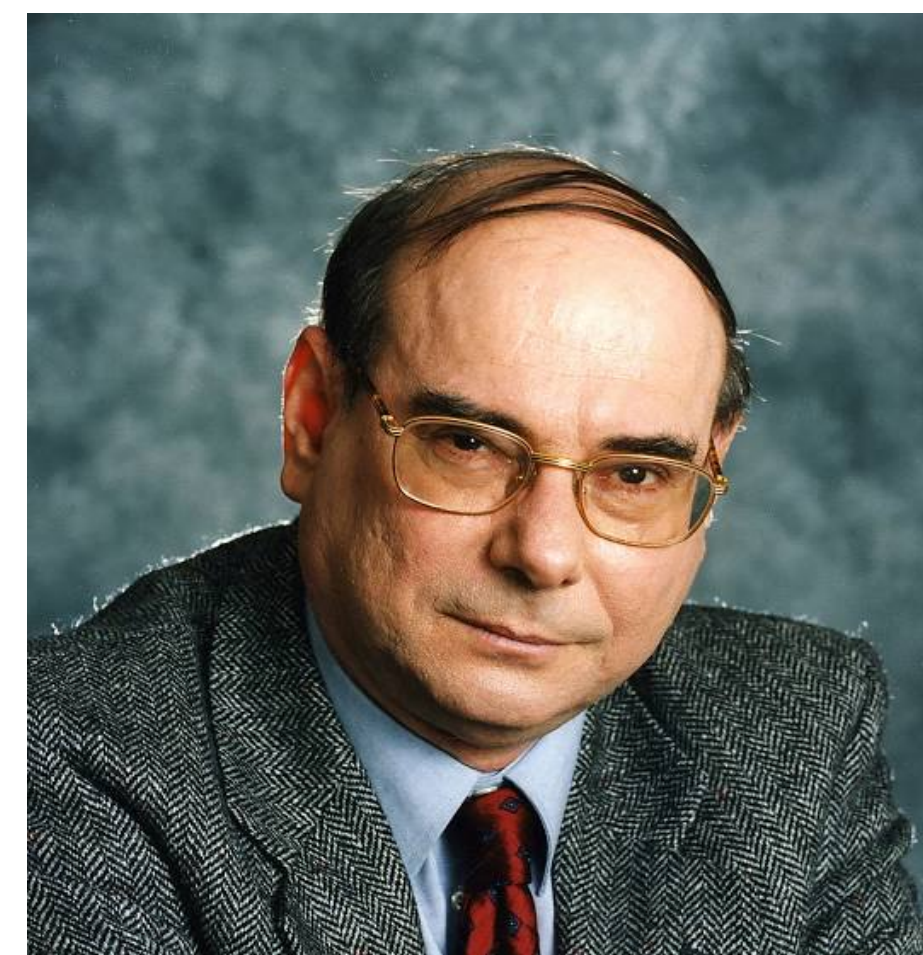
I_1 is inductive.



Relative Inductiveness

I_1 is inductive.

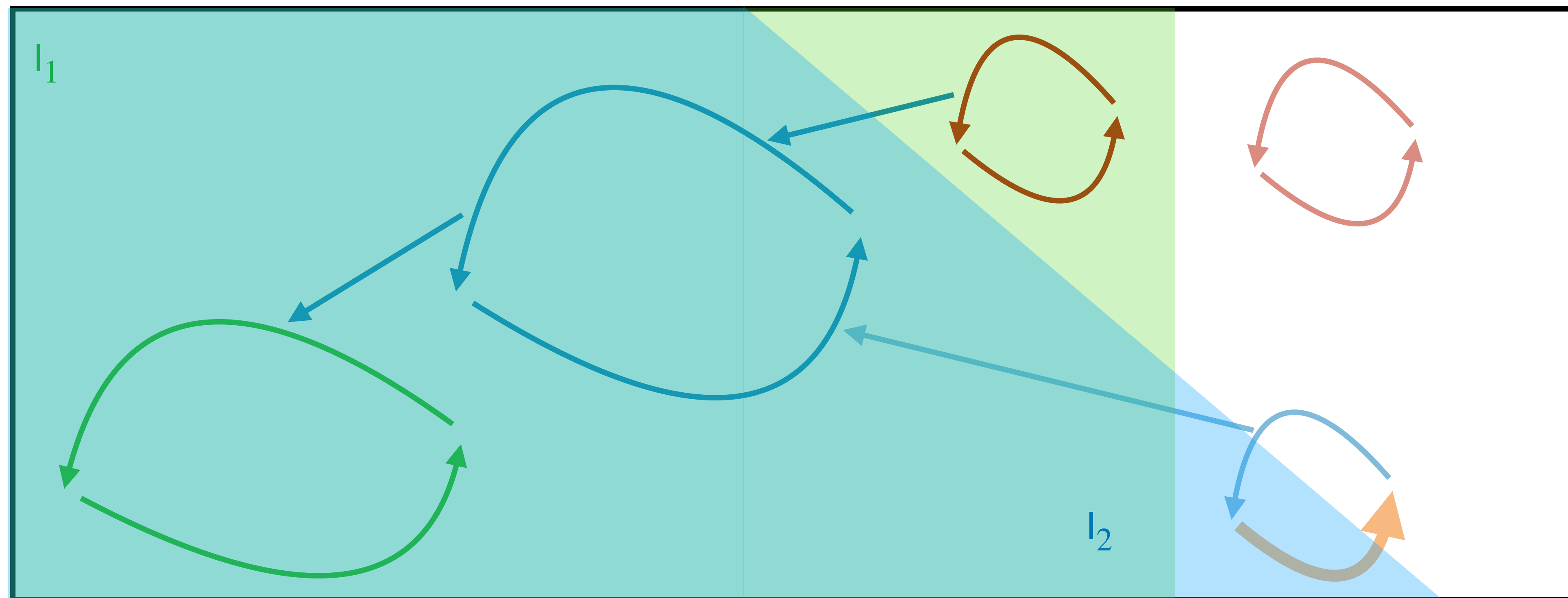
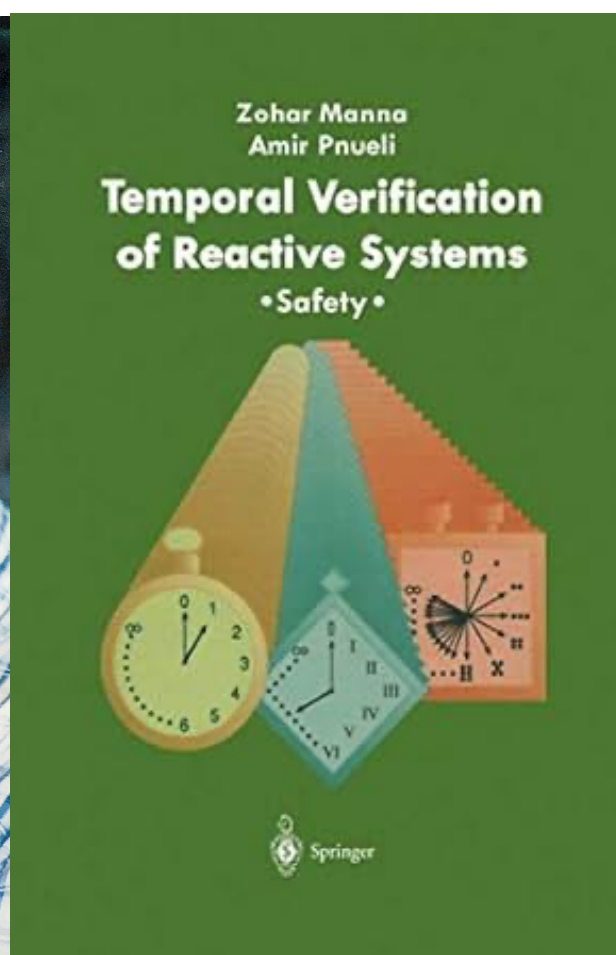
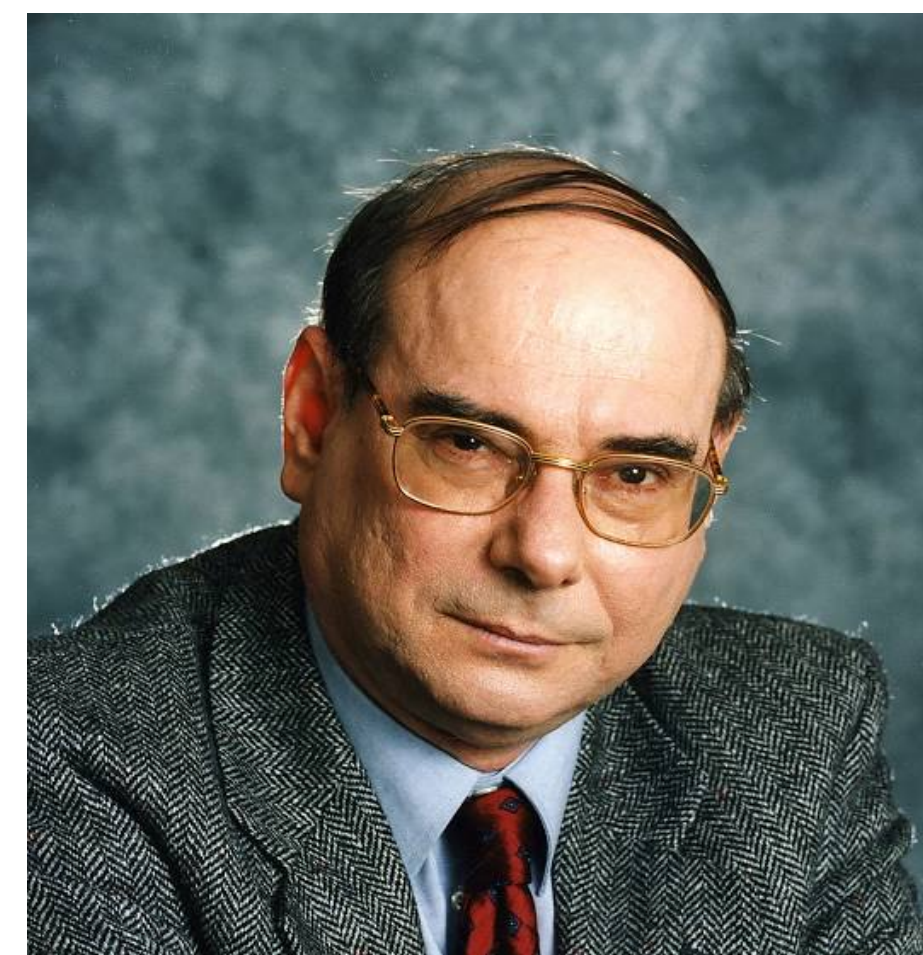
I_2 is not inductive



Relative Inductiveness

I_1 is inductive.

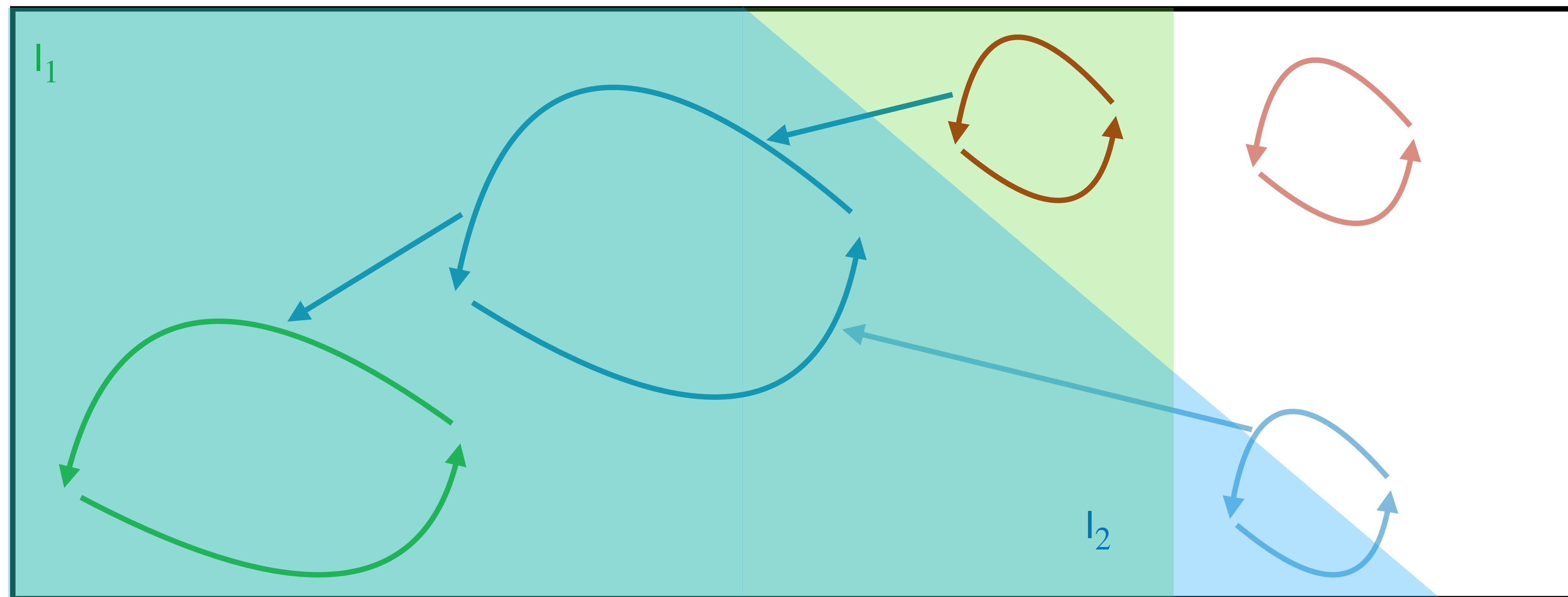
I_2 is **not** inductive



Relative Inductiveness

I_1 is inductive.

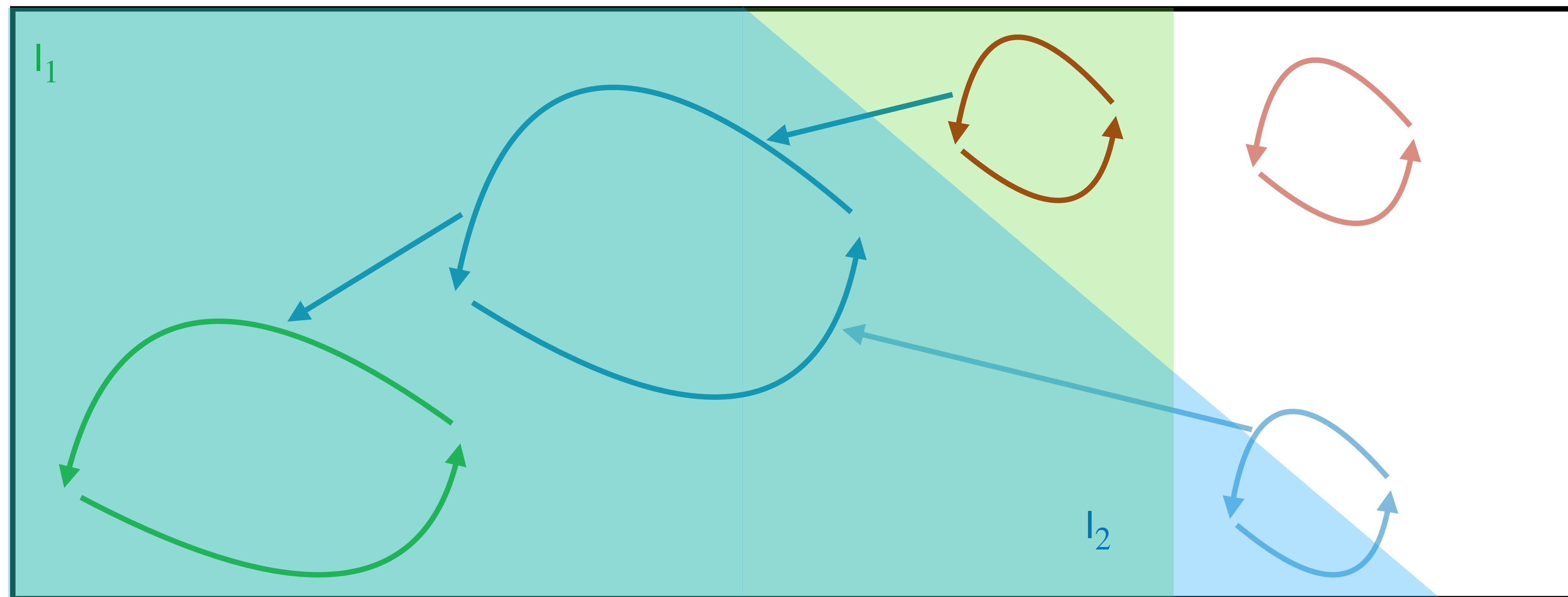
I_2 is not inductive, but inductive relative to I_1 .



Relative Inductiveness

I_1 is inductive.

I_2 is not inductive, but inductive relative to I_1 .



Relative inductiveness (and IC3) iteratively removes unreachable parts of the state space.

IC3 Q&A

Q1. What does all this have to do with circuits?

A1. This is the semantic view and generalizes to other program classes.

Circuits come in when you want to implement (answer relative inductiveness queries with SAT).

Q2. Why is it called property directed?

A2. You take into account initial and bad states.

Q3. Can you do this for nested fixed points?

A3. With a reduction from nested fixed points to safety.

Q4. What is the most recent development?

A4. You learn an invariant with an Angluin's active teacher model.

The ICE algorithm emphasizes this point of view.

Recent papers study the information gain of queries.

Q5. Why does IC3 **not work** well for parallel programs?

A5. Think about the interference pre.

IC3 Q&A

Q6. How do you pick C?

A6. If $\text{post}(F_{k-1}) \cap \{s\} = \emptyset$, read C off of an unsat core.

Q7. Do you have to take $F_{k+1} = \overline{B_k}$?

A7. No, you can use any predicate that has a chance to over-approximate $\text{post}(F_k)$.