

# Abstract Interpretation: Principles and Applications

Patrick Cousot

[cims.nyu.edu/~pcousot](http://cims.nyu.edu/~pcousot)

[di.ens.fr/~cousot](http://di.ens.fr/~cousot)

SCS Distinguished Lecture Series  
Gates & Hillman Centers, Rashid Auditorium 4401  
CMU, Pittsburgh — April 12<sup>th</sup>, 2012

## Abstract

Abstract interpretation is a theory of abstraction and constructive approximation of the mathematical structures used in the formal description of complex or infinite systems and the inference or verification of their combinatorial or undecidable properties. Developed in the late seventies with Radhia Cousot, it has been since then applied to many aspects of computer science (such as static analysis and verification, contract inference, type inference, termination inference, model-checking, abstraction refinement, program transformation (including watermarking), combination of decision procedures, security, malware detection, database queries, etc.) and more recently, to system biology.

The talk will consist in an introduction to the basic notions of abstract interpretation and the induced methodology for the systematic development of sound abstract interpretation-based tools. Examples of abstractions will be provided, from semantics to typing, grammars to safety, reachability to potential/definite termination, numerical to protein-protein abstractions, as well as applications (including in industrial use) to software, hardware and system biology.

# Abstract Interpretation: Principles and Applications

joint work Patrick Cousot  
Radhia Cousot

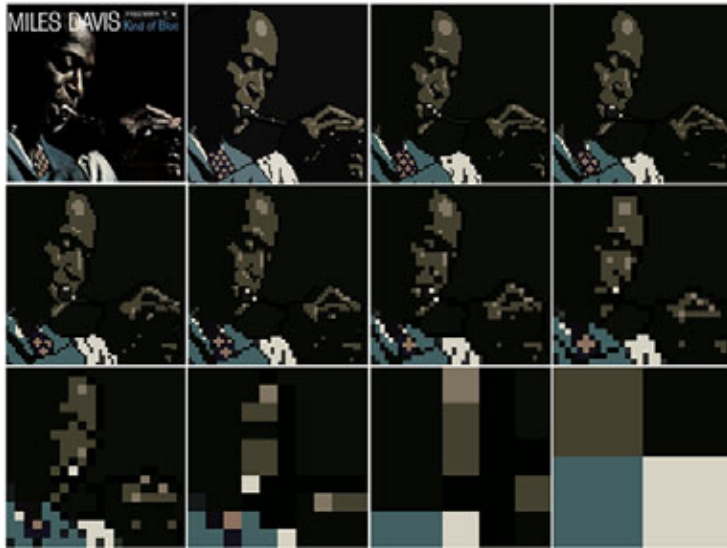
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## Examples of abstraction

## Pixelation of a photo by Jay Maisel



[www.petapixel.com/2011/06/23/how-much-pixelation-is-needed-before-a-photo-becomes-transformed/](http://www.petapixel.com/2011/06/23/how-much-pixelation-is-needed-before-a-photo-becomes-transformed/)

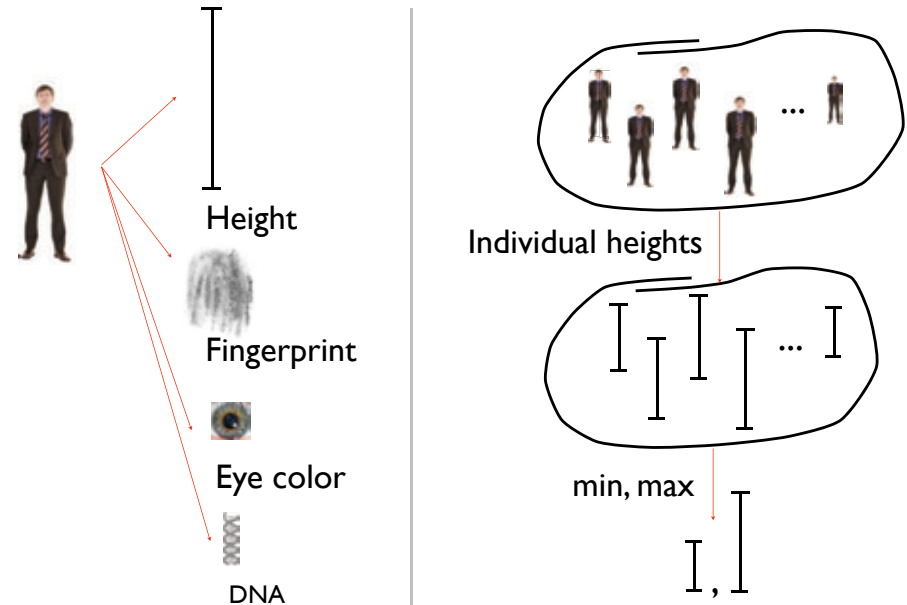
Image credit: Photograph by Jay Maisel

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## Abstractions of a man / crowd



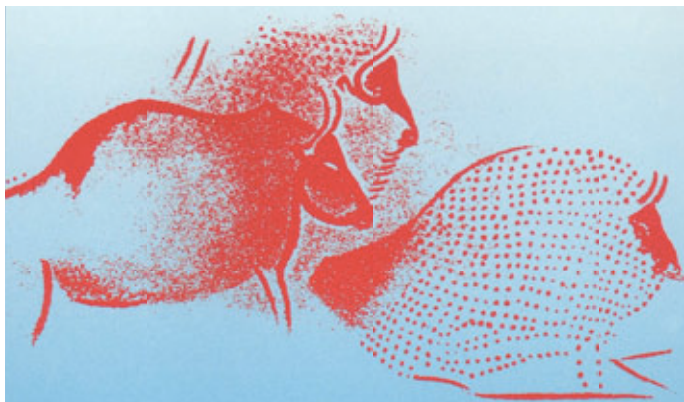
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## An old idea...

20 000 years old picture in a spanish cave:



The concrete is not always well-known!

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## Content

- Motivation
- A touch of **theory of abstract interpretation**, with many examples of **abstractions**
- A short overview of a few **applications and on-going work** on software verification

For a rather complete basic introduction to abstract interpretation and applications to cyber-physical systems, see:

Julien Bertrane, Patrick Cousot, Radhia Cousot, Jérôme Feret, Laurent Mauborgne, Antoine Miné, & Xavier Rival. [Static Analysis and Verification of Aerospace Software by Abstract Interpretation](#). In *AIAA Infotech@Aerospace 2010*, Atlanta, Georgia. American Institute of Aeronautics and Astronautics, 20–22 April 2010. © AIAA.

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# Fundamental motivations

## Example: reasoning on computational structures

WCET  
 Axiomatic semantics  
 Confidentiality analysis  
 Program synthesis  
 Grammar analysis  
 Statistical model-checking  
 Invariance proof  
 Probabilistic verification  
 Parsing

Security protocols verification  
 Dataflow analysis  
 Partial evaluation  
 Effect systems  
 Trace semantics  
 Symbolic execution  
 Quantum entanglement detection  
 Type theory

Systems biology analysis  
 Model checking  
 Obfuscation  
 Denotational semantics  
 Theories combination  
 Code contracts  
 Quantum entanglement detection  
 Steganography

Operational semantics  
 Abstraction refinement  
 Type inference  
 Dependence analysis  
 CEGAR  
 Program transformation  
 Interpolants  
 Integrity analysis  
 Bisimulation  
 SMT solvers

Separation logic  
 Termination proof  
 Shape analysis  
 Malware detection  
 Code refactoring

## Scientific research

- in **Mathematics/Physics**:  
 works towards **unification** and **synthesis**  
 it is **science** of structure and change aiming at **universal principles**
  - in **Computer science**  
 works towards **dispersion** and **parcelization**  
 it is a collection of local **techniques** for computational structures aiming at **specific applications**
- An exponential process, will stop!

## Example: reasoning on computational structures

### Abstract interpretation

WCET  
 Axiomatic semantics  
 Confidentiality analysis  
 Program synthesis  
 Grammar analysis  
 Statistical model-checking  
 Invariance proof  
 Probabilistic verification  
 Parsing

Security protocols verification  
 Dataflow analysis  
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 SMT solvers

Separation logic  
 Termination proof  
 Shape analysis  
 Malware detection  
 Code refactoring

# Applied motivations

# A Touch of Abstract Interpretation Theory

Patrick Cousot & Radhia Cousot. Vérification statique de la cohérence dynamique des programmes. In *Rapport du contrat IRIA SESORI No 75-035*, Laboratoire IMAG, University of Grenoble, France, 125 pages, 23 September 1975.

Patrick Cousot & Radhia Cousot. Static Determination of Dynamic Properties of Programs. In B. Robinet, editor, *Proceedings of the second international symposium on Programming*, Paris, France, pages 106–130, April 13-15 1976, Dunod, Paris.

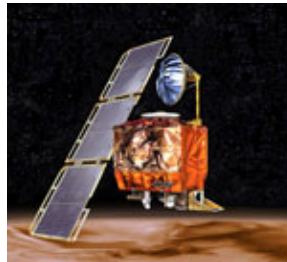
Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. *POPL* 1977: 238-252

Patrick Cousot, Radhia Cousot: Systematic Design of Program Analysis Frameworks. *POPL* 1979: 269-282

Patrick Cousot. Méthodes itératives de construction et d'approximation de points fixes d'opérateurs monotones sur un treillis, analyse sémantique des programmes. *Thèse Ès Sciences Mathématiques*, Université Joseph Fourier, Grenoble, France, 21 March 1978

Patrick Cousot. Semantic foundations of program analysis. In S.S. Muchnick & N.D. Jones, editors, *Program Flow Analysis: Theory and Applications*, Ch. 10, pages 303–342, Prentice-Hall, Inc., Englewood Cliffs, New Jersey, U.S.A., 1981.

# All computer scientists have experienced bugs



- Checking the **presence** of bugs is great
- Proving their **absence** is even better!

# Semantics



## Semantics

- **Formal system:** syntax to describe computations (e.g. programming language = set of programs):

$$P \in \mathbb{L}$$

- **Semantics:** formal model of computations (e.g. set of execution traces)
- **Semantic domain** (set of semantics):

$$\mathcal{D}$$

- **Formal system semantics** (maps syntactic system descriptions to their semantics)

$$S \in \mathbb{L} \rightarrow \mathcal{D}$$

## Example: partial trace semantics

- Partial trace semantics  $\tau^{\ddot{\infty}}[[P]]$  generated by the small-step operational semantics  $\langle \Sigma, \tau \rangle$  of a program  $P$ :

$$\tau^{\ddot{n}}[[P]] \triangleq \left\{ \sigma \in \Sigma^n \mid \forall i \in [0, n-1) : \langle \sigma_i, \sigma_{i+1} \rangle \in \tau[[P]] \right\},$$

$$\tau^{\ddot{\infty}}[[P]] \triangleq \bigcup_{n>0} \tau^{\ddot{n}}[[P]],$$

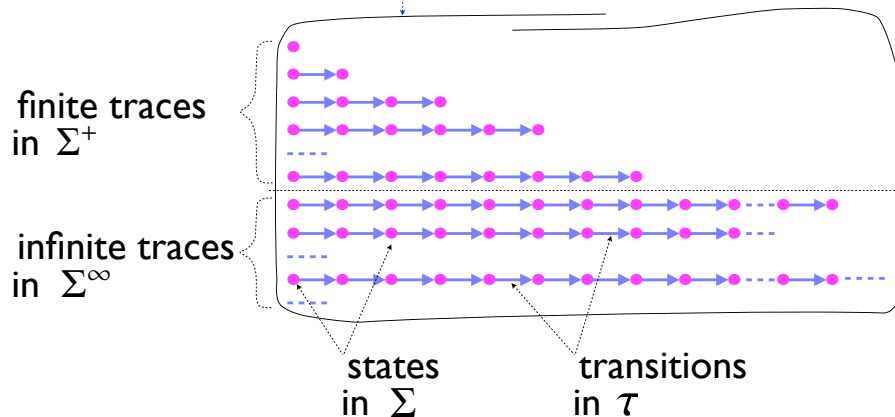
$$n \geq 0$$

$$\tau^{\infty}[[P]] \triangleq \left\{ \sigma \in \Sigma^{\infty} \mid \forall i \in \mathbb{N} : \langle \sigma_i, \sigma_{i+1} \rangle \in \tau[[P]] \right\}$$

$$\tau^{\ddot{\infty}}[[P]] \triangleq \tau^{\ddot{\infty}}[[P]] \cup \tau^{\infty}[[P]]$$

## Example: partial trace semantics

- Program  $P \longmapsto \tau^{\ddot{\infty}}[[P]] \in \wp(\Sigma^{+\infty})$



## Concrete properties

## Concrete properties

- **Program concrete property:** set of possible semantics of the program
- **Concrete property domain:**

$$\mathcal{P} \triangleq \wp(\mathcal{D}) \quad \langle \mathcal{P}, \subseteq, \emptyset, \mathcal{D}, \cup, \cap \rangle$$

more generally  $\langle \mathcal{P}, \leq, 0, 1, \vee, \wedge \rangle$  or  $\langle \mathcal{P}, \leq, 0, \vee \rangle$

- **Collecting semantics:** (maps programs to their strongest property)

$$\mathcal{C}[\![P]\!] \triangleq \{ \mathcal{S}[\![P]\!] \}$$

(it implies “ $\subseteq$ ” all other properties)

Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252  
Patrick Cousot, Radhia Cousot: Systematic Design of Program Analysis Frameworks. POPL 1979: 269-282

## Abstract properties

### Example: concrete properties of trace semantics

- A **trace** in  $\Sigma^{+\infty}$  is a finite or infinite sequence of states in  $\Sigma$
- A **trace semantics** in  $\wp(\Sigma^{+\infty})$  is a set of traces
- A **trace semantics property** in  $\wp(\wp(\Sigma^{+\infty}))$  is a set of trace semantics
- The **collecting semantics** of a program  $P$  with trace semantics  $\Theta^{+\infty}[\![P]\!] \in \wp(\Sigma^{+\infty})$  is the *strongest trace semantics property*

$$\{ \Theta^{+\infty}[\![P]\!] \} \in \wp(\wp(\Sigma^{+\infty}))$$

### Abstract properties

- **Abstract property:** encodes a concrete property (e.g. a logical formula, a geometric object, etc)
- **Abstract property domain:**
  - a set of abstract properties
  - encodes *selected concrete properties of interest*

$$\langle \mathcal{A}, \subseteq, \perp, \top, \sqcup, \sqcap \rangle$$

Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252  
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## Example of abstract properties: reachability

- A **reachability property** in  $\wp(\Sigma)$  is a set of states in  $\Sigma$  that can be reached during execution from given initial states

## Example of abstract properties: intervals

$[\ell, h]$  : interval of values between  $\ell$  and  $h$   
(including  $-\infty$  and  $+\infty$ )

$\perp$  : empty set (false)

$$\mathcal{A} \triangleq \{[\ell, h] \mid \ell \in \mathbb{Z} \cup \{-\infty\} \wedge h \in \mathbb{Z} \cup \{+\infty\} \wedge \ell \leq h\} \cup \{\perp\}$$

Patrick Cousot & Radhia Cousot. Vérification statique de la cohérence dynamique des programmes. In *Rapport du contrat IRIA SESORI No 75-035*. Laboratoire IMAG, University of Grenoble, France. 125 pages. 23 September 1975.

Patrick Cousot & Radhia Cousot. Static Determination of Dynamic Properties of Programs. In B. Robinet, editor, *Proceedings of the second international symposium on Programming*, Paris, France, pages 106–130, April 13–15 1976. Dunod, Paris.

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## Abstraction

- **Abstraction**: maps concrete to abstract properties

$$\alpha \in \mathcal{P} \rightarrow \mathcal{A}$$

$\alpha$  is assumed to be *increasing* (so  $\sqsubseteq$  is the abstraction of  $\subseteq$ ).

- **Abstract semantics**: abstraction of the collecting semantics

$$\bar{S} \in \mathbb{L} \rightarrow \mathcal{A}$$

$$\bar{S}[\mathbf{P}] \triangleq \alpha(C[\mathbf{P}]) = \alpha(\{S[\mathbf{P}]\})$$

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# Abstraction

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# Concretization

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## Concretization

- **Concretization**: maps abstract properties to concrete properties

$$\gamma \in \mathcal{A} \rightarrow \mathcal{P}$$

$\gamma$  is assumed to be *increasing* (so  $\sqsubseteq$  is the concretization of  $\sqsubseteq$  )

- Abstract properties **either describe exactly** the concrete properties in  $\gamma(\mathcal{A})$  , or
- Abstract properties **must approximate** the concrete properties in  $\mathcal{P} \setminus \gamma(\mathcal{A})$

Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252  
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## Soundness

- **Definition**: An abstract property  $Q \in \mathcal{A}$  **over-approximates** a concrete property  $P \in \mathcal{P}$  if and only if

$$P \subseteq \gamma(Q)$$

- **Definition**: an abstraction is **sound** if and only if

$$\forall P \in \mathcal{P} : P \subseteq \gamma(\alpha(P))$$

- **Under-approximation** is dual<sup>(\*)</sup>

Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252  
Patrick Cousot, Radhia Cousot: Systematic Design of Program Analysis Frameworks. POPL 1979: 269-282

(\*) Patrick Cousot. Méthodes itératives de construction et d'approximation de points fixes d'opérateurs monotones sur un treillis, analyse sémantique des programmes. *Thèse Ès Sciences Mathématiques*, Université Joseph Fourier, Grenoble, France, 21 March 1978.

## Soundness

## Best abstraction

## Best abstraction

- Concrete properties:  $\langle \mathcal{P}, \leq \rangle$
- Abstract properties:  $\langle \mathcal{A}, \sqsubseteq \rangle$
- If any concrete property  $P \in \mathcal{P}$  has a best abstraction  $\alpha(P) \in \mathcal{A}$ , then the correspondence is given by a *Galois connection* <sup>[1,2]</sup>

$$\langle \mathcal{P}, \leq \rangle \xrightleftharpoons[\alpha]{\gamma} \langle \mathcal{A}, \sqsubseteq \rangle$$

i.e.

$$\forall P \in \mathcal{P} : \forall Q \in \mathcal{A} : \alpha(P) \sqsubseteq Q \Leftrightarrow P \leq \gamma(Q)$$

Sound abstraction  $\Rightarrow$

Best abstraction  $\Leftarrow$

[1] Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252

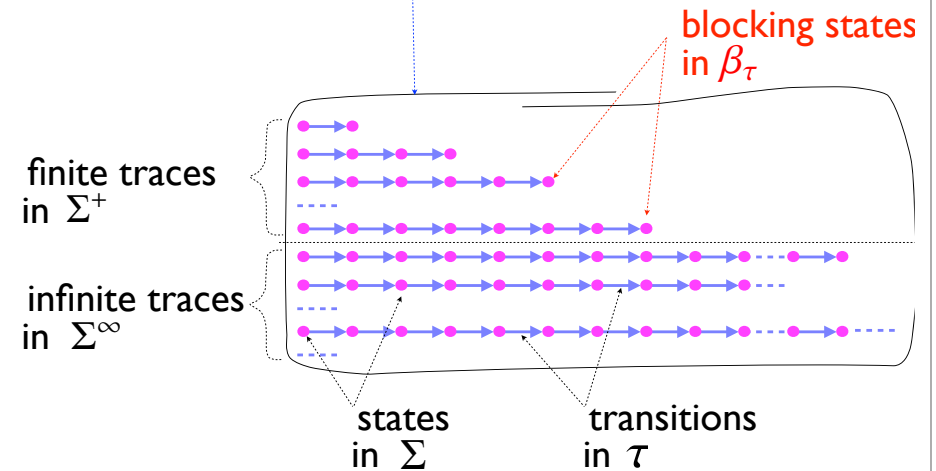
[2] Equivalently upper closures, principal ideals, complete join congruences, Moore families, etc. see [3]

[3] Patrick Cousot, Radhia Cousot: Systematic Design of Program Analysis Frameworks. POPL 1979: 269-282

## Examples of abstraction/ concretization

## Example I of abstraction: maximal trace semantics

- Program  $P \longmapsto \tau^{+\infty} \llbracket P \rrbracket \in \wp(\Sigma^{+\infty})$



Patrick Cousot: Constructive design of a hierarchy of semantics of a transition system by abstract interpretation. Theor. Comput. Sci. 277(1-2): 47-103 (2002)

## Example I of abstraction: maximal trace semantics

- **Blocking states** of a transition system  $\langle \Sigma, \tau \rangle$ :

$$\beta_\tau \llbracket P \rrbracket \triangleq \{s \in \Sigma \llbracket P \rrbracket \mid \forall s' \in \Sigma \llbracket P \rrbracket : \langle s, s' \rangle \notin \tau \llbracket P \rrbracket\}$$

- **Maximal trace abstraction** (eliminates all traces that are not terminated):

$$\alpha_M(T) \triangleq \bigcup_{n \in \mathbb{N}} \{ \sigma \in T \cap \Sigma^n \mid \sigma_{n-1} \in \beta_\tau \llbracket P \rrbracket \} \cup T^\infty$$

$$\langle \wp(\Sigma^{+\infty}), \subseteq \rangle \xrightleftharpoons[\alpha_M]{\gamma_M} \langle \wp(\Sigma^{+\infty}), \subseteq \rangle$$

Patrick Cousot: Constructive design of a hierarchy of semantics of a transition system by abstract interpretation. Theor. Comput. Sci. 277(1-2): 47-103 (2002)

## Example II of abstraction: trace property

- Trace property abstraction:

$$\alpha_{\Theta}(P) \triangleq \bigcup P$$

$$\langle \wp(\wp(\Sigma^{+\infty})), \subseteq \rangle \xrightleftharpoons[\alpha_{\Theta}]{\gamma_{\Theta}} \langle \wp(\Sigma^{+\infty}), \subseteq \rangle$$

- Trace property abstraction of the collecting semantics:

$$\alpha_{\Theta}(\{\tau^{+\infty} \llbracket P \rrbracket\}) = \tau^{+\infty} \llbracket P \rrbracket \in \wp(\Sigma^{+\infty})$$

(common confusion between semantics and properties)

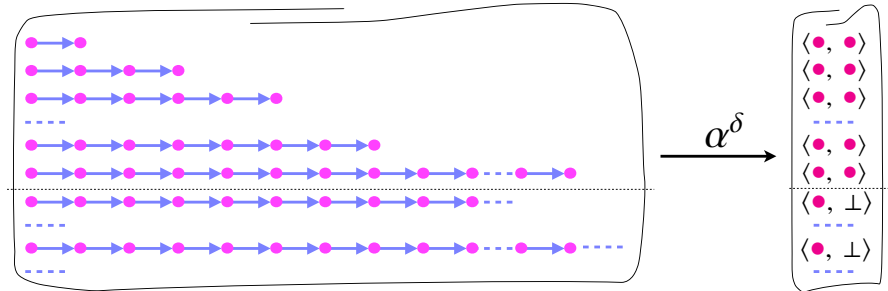
## Example III of abstraction: relational abstraction

- Relational abstraction:

$$\alpha^{\delta}(T) \triangleq \{ \langle \sigma_0, \sigma_{n-1} \rangle \mid \sigma \in T \cap \Sigma^n \} \cup \{ \langle \sigma_0, \perp \rangle \mid \sigma \in T \cap \Sigma^{*\infty} \}$$

$$\langle \wp(\Sigma^{+\infty}), \subseteq \rangle \xrightleftharpoons[\alpha^{\delta}]{\gamma^{\delta}} \langle \wp((\Sigma \times \Sigma) \cup (\Sigma \times \{\perp\})), \subseteq \rangle$$

- Intuition:

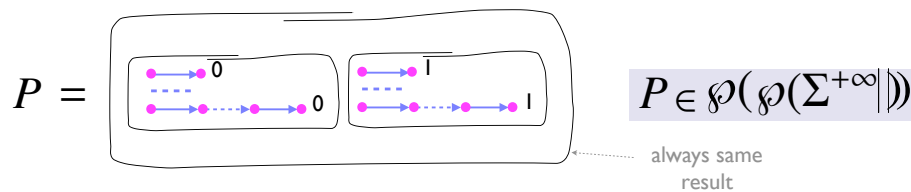


Patrick Cousot, Radhia Cousot: Invited Talk: Higher Order Abstract Interpretation (and Application to Component Analysis Generalizing Strictness, Termination, Projection, and PER Analysis. ICCL 1994: 95-112

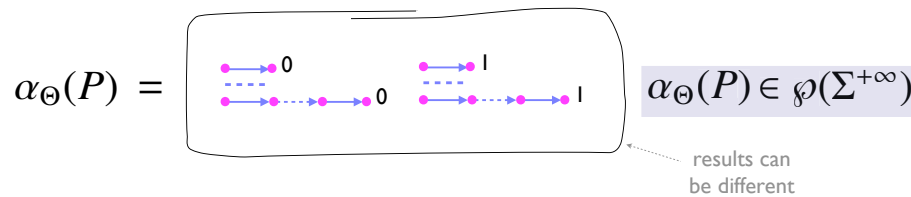
Patrick Cousot: Constructive design of a hierarchy of semantics of a transition system by abstract interpretation. Theor. Comput. Sci. 277(1-2): 47-103 (2002)

## Loss of information in the trace property abstraction

- “Always terminate with the same value, either 0 or 1”



- Trace property abstraction:



“Always terminate, either with 0 or 1”

## Example IV of abstraction: safety trace property

- Prefix abstraction (program executions can be observed only for a finite time):

$$\text{pf}(\sigma) \triangleq \{ \sigma' \in \Sigma^{+\infty} \mid \exists \sigma'' \in \Sigma^{*\infty} : \sigma = \sigma' \sigma'' \}$$

$$\text{pf}(T) \triangleq \bigcup \{ \text{pf}(\sigma) \mid \sigma \in T \}$$

- Limit abstraction (non-termination cannot be observed):

$$\text{lm}(T) \triangleq T \cup \{ \sigma \in \Sigma^{\infty} \mid \forall n \in \mathbb{N} : \sigma[0, n] \in T \}$$

- Safety abstraction (finite observations of executions):

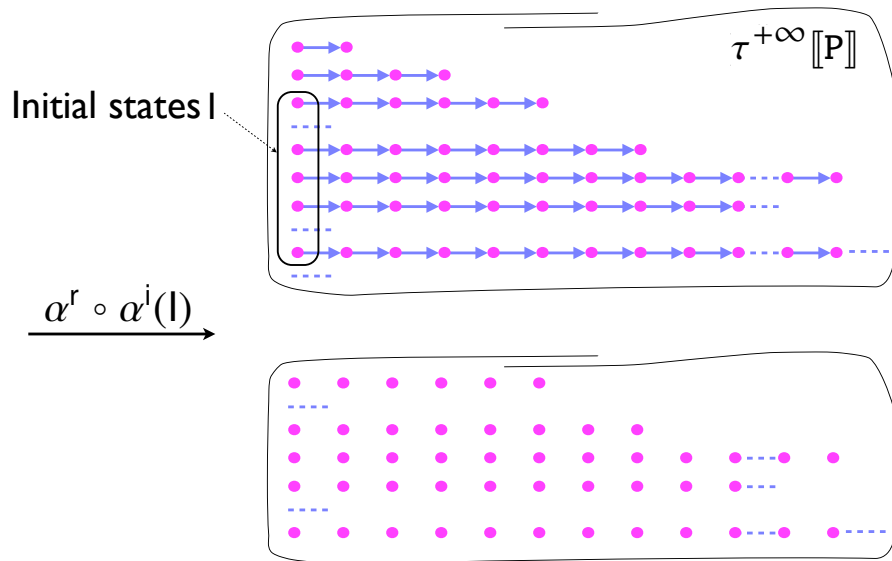
$$\text{sf} \triangleq \text{lm} \circ \text{pf} = \text{pf} \circ \text{lm} \circ \text{pf}$$

$$\langle \wp(\Sigma^{+\infty}), \subseteq \rangle \xrightleftharpoons[\text{sf}]{\mathbb{1}} \langle \wp(\Sigma^{+\infty}), \subseteq \rangle$$

Patrick Cousot, Radhia Cousot: An abstract interpretation framework for termination. POPL 2012: 245-258



## Example V of abstraction: reachability

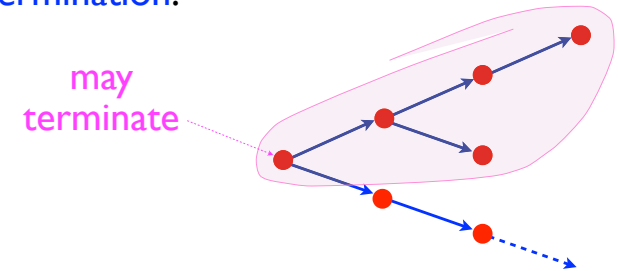


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## Example VI of abstraction: potential termination

- Potential termination:



- Potential termination abstraction:

$$\alpha^{mt}(T) \triangleq T \cap \Sigma^+$$

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## Example V of abstraction: reachability

- Initialization abstraction:

$$\alpha^i(I)T \triangleq \{\sigma \in T \mid \sigma_0 \in I\}$$

$$\alpha^i \in \wp(\Sigma) \rightarrow (\wp(\Sigma^{+\infty}) \rightarrow \wp(\Sigma^{+\infty}))$$

- Reachability abstraction:

$$\alpha^r(T) \triangleq \{s \mid \exists \sigma \in \Sigma^*, \sigma' \in \Sigma^{*\infty} : \sigma s \sigma' \in T\}$$

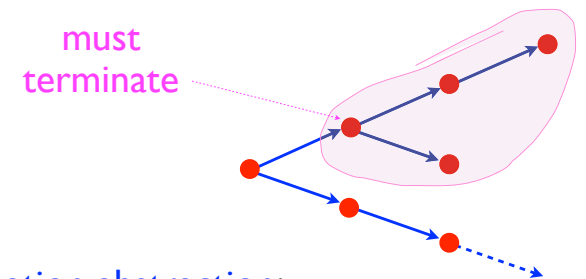
$$\langle \wp(\Sigma^{+\infty}), \subseteq \rangle \xleftrightarrow[\alpha^r]{\gamma^r} \langle \wp(\Sigma), \subseteq \rangle$$

Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252  
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## Example VII of abstraction: definite termination

- Definite termination:



- Definite termination abstraction:

$$\alpha^{Mt}(T) \triangleq \{\sigma \in T^+ \mid \text{pf}(\sigma) \cap \text{pf}(T^\infty) = \emptyset\}$$

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## Example VIII: elementwise abstraction

- Morphism

$$h \in \mathcal{P} \mapsto \mathcal{A}$$

- Abstraction

$$\alpha(X) \triangleq \{h(x) \mid x \in X\}$$

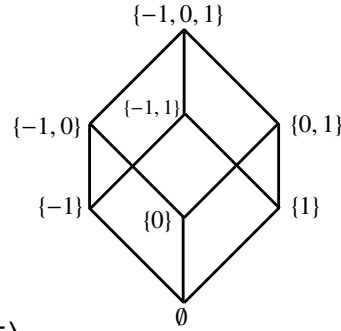
- Galois connection

$$\langle \wp(\mathcal{P}), \subseteq \rangle \xleftrightarrow[\alpha]{\gamma} \langle \wp(\mathcal{A}), \subseteq \rangle$$

- Example: rule of signs

$$h : \mathbb{Z} \rightarrow \{-1, 0, 1\}$$

$$h(z) \triangleq z/|z|$$



## Example IX: typing

- Denotational semantics:  $\mathcal{S}[\bullet] \in \mathbb{E} \mapsto \mathcal{S}$

$$\mathcal{S}[x] \triangleq \Lambda R \cdot R(x)$$

$$\mathcal{S}[\lambda x \cdot e] \triangleq \Lambda R \cdot \uparrow \left( \Lambda u \cdot (u = \perp \vee u = \Omega ? u \mid \mathcal{S}[e]R[x \leftarrow u]) \right) :: [U \mapsto U]_{\perp}$$

$$\mathcal{S}[e_1(e_2)] \triangleq \Lambda R \cdot (\mathcal{S}[e_1]R = \perp \vee \mathcal{S}[e_2]R = \perp ? \perp \mid \mathcal{S}[e_1]R = f :: [U \mapsto U]_{\perp} ? \downarrow(f)(\mathcal{S}[e_2]R) \mid \Omega)$$

$$\mathcal{S}[\mu f \cdot \lambda x \cdot e] \triangleq \Lambda R \cdot \text{Ifp}_{\uparrow(\Lambda u \cdot \perp) :: [U \mapsto U]_{\perp}}^{\mathbb{E}} \Lambda \varphi \cdot \mathcal{S}[\lambda x \cdot e]R[f \leftarrow \varphi]$$

$$\mathcal{S}[1] \triangleq \Lambda R \cdot \uparrow(1) :: \mathbb{Z}_{\perp}$$

$$\mathcal{S}[e_1 - e_2] \triangleq \Lambda R \cdot (\mathcal{S}[e_1]R = \perp \vee \mathcal{S}[e_2]R = \perp ? \perp \mid \mathcal{S}[e_1]R = z_1 :: \mathbb{Z}_{\perp} \wedge \mathcal{S}[e_2]R = z_2 :: \mathbb{Z}_{\perp} ? \uparrow(\downarrow(z_1) - \downarrow(z_2)) :: \mathbb{Z}_{\perp} \mid \Omega)$$

$$\mathcal{S}[(e_1 ? e_2 : e_3)] \triangleq \Lambda R \cdot (\mathcal{S}[e_1]R = \perp ? \perp \mid \mathcal{S}[e_1]R = z :: \mathbb{Z}_{\perp} ? (\downarrow(z) = 0 ? \mathcal{S}[e_2]R \mid \mathcal{S}[e_3]R) \mid \Omega)$$

## Example IX: typing

- Eager lambda calculus:

$x, f, \dots \in \mathbb{X}$  : program variables

$e \in \mathbb{E}$  : program expressions

$e ::= x \mid \lambda x \cdot e \mid e_1(e_2) \mid \mu f \cdot \lambda x \cdot e \mid$

$1 \mid e_1 - e_2 \mid (e_1 ? e_2 : e_3)$

- Semantic domains:

$\mathbb{W} \triangleq \{\omega\}$  wrong

$\mathbb{Z} \in \mathbb{Z}$  integers

$\mathbb{U}, \mathbb{F}, \varphi \in \mathbb{U} \cong \mathbb{W}_{\perp} \oplus \mathbb{Z}_{\perp} \oplus [U \mapsto U]_{\perp}$  values

$\mathbb{R} \in \mathbb{R} \triangleq \mathbb{X} \mapsto \mathbb{U}$  environments

$\mathbb{S} \in \mathbb{S} \triangleq \mathbb{R} \mapsto \mathbb{U}$  semantic domain

## Example IX: typing

- Church/Curry monotypes:

$m \in \mathbb{M}^c, m ::= \text{int} \mid m_1 \rightarrow m_2$  monotype

$H \in \mathbb{H}^c \triangleq \mathbb{X} \mapsto \mathbb{M}^c$  type environment

$\theta \in \mathbb{I}^c \triangleq \mathbb{H}^c \times \mathbb{M}^c$  typing

$T \in \mathbb{T}^c \triangleq \wp(\mathbb{I}^c)$  program type

## Example IX: typing

- **Properties:**  $\mathbb{P} \triangleq \wp(\mathbb{S})$

- **Monotype concretization:**

$$\gamma_1^c \in \mathbb{M}^c \mapsto \wp(\mathbb{U})$$

$$\gamma_1^c(\text{int}) \triangleq \{\uparrow(z) :: \mathbb{Z}_\perp \mid z \in \mathbb{Z}\} \cup \{\perp\}$$

$$\gamma_1^c(m_1 \rightarrow m_2) \triangleq \{\uparrow(\varphi) :: [\mathbb{U} \mapsto \mathbb{U}]_\perp \mid \varphi \in [\mathbb{U} \mapsto \mathbb{U}] \wedge \forall u \in \gamma_1^c(m_1) : \varphi(u) \in \gamma_1^c(m_2)\} \cup \{\perp\}$$

$$\gamma_2^c \in \mathbb{H}^c \mapsto \wp(\mathbb{R})$$

$$\gamma_2^c(H) \triangleq \{R \in \mathbb{R} \mid \forall x \in \mathbb{X} : R(x) \in \gamma_1^c(H(x))\}$$

$$\gamma_3^c \in \mathbb{I}^c \mapsto \mathbb{P}$$

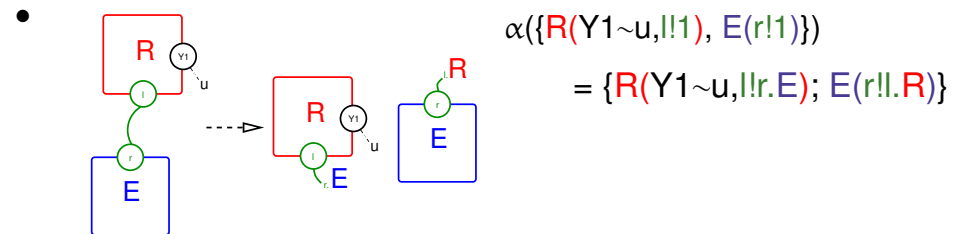
$$\gamma_3^c(\langle H, m \rangle) \triangleq \{\phi \in \mathbb{S} \mid \forall R \in \gamma_2^c(H) : \phi(R) \in \gamma_1^c(m)\}$$

$$\gamma^c \in \mathbb{T}^c \mapsto \mathbb{P}$$

$$\gamma^c(T) \triangleq \bigcap_{\theta \in T} \gamma_3^c(\theta), \quad \gamma^c(\emptyset) \triangleq \mathbb{S}$$

## Example X: Protein-Protein interaction abstraction

- Let *Species* be the set of all chemical species ( $C, c_1, c'_1, \dots, c_k, c'_k, \dots \in \text{Species}$ )
- Let *Local\_view* be the set of all local views
- Let  $\alpha \in \wp(\text{Species}) \rightarrow \wp(\text{Local\_view})$  be the function that maps any set of complexes into the set of their local views.



- The function  $\alpha$  defines a Galois connexion:  $\wp(\text{Species}) \xrightleftharpoons[\alpha]{\gamma} \wp(\text{Local\_view})$
- (The function  $\gamma$  maps a set of local views into the set of complexes that can be built with these local views).

## Example IX: typing

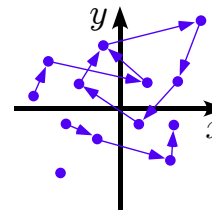
- **Galois connection:**

$$\gamma^c \left( \bigcup_{i \in \Delta} T_i \right) = \bigcap_{i \in \Delta} \gamma^c(T_i)$$

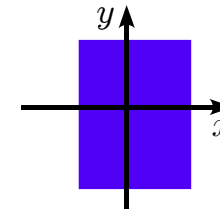
implies

$$\langle \mathbb{P}, \subseteq \rangle \xrightleftharpoons[\alpha^c]{\gamma^c} \langle \mathbb{T}^c, \supseteq \rangle$$

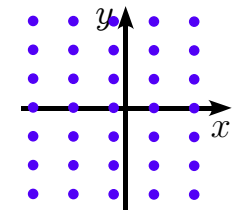
## Example XI: numerical abstractions



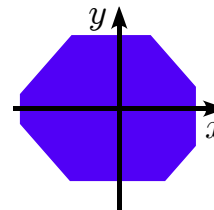
Collecting semantics:  
partial traces



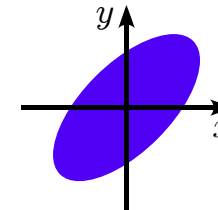
Intervals:  
 $x \in [a, b]$



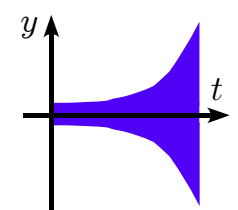
Simple congruences:  
 $x \equiv a[b]$



Octagons:  
 $\pm x \pm y \leq a$



Ellipses:  
 $x^2 + by^2 - axy \leq d$



Exponentials:  
 $-a^{bt} \leq y(t) \leq a^{bt}$

# In absence of best abstraction

## Example XII of abstraction: polyhedra

- Abstract polyhedral properties:

$$\mathcal{A} \triangleq \{\langle A, B, n \rangle \mid A \in \mathbb{R}^n \times \mathbb{R}^n \wedge B \in \mathbb{R}^n \wedge n > 0\}$$

- Concretization:

$$\gamma_P(\langle A, B, n \rangle) \triangleq \{X \in \mathbb{R}^n \mid AX \leq B\}$$

Transformers and widenings have no more precise solution and make arbitrary choices (e.g. governed efficiency considerations)

Patrick Cousot. Méthodes itératives de construction et d'approximation de points fixes d'opérateurs monotones sur un treillis, analyse sémantique des programmes. Thèse Es Sciences Mathématiques, Université Joseph Fourier, Grenoble, France, 21 March 1978.

Patrick Cousot, Nicolas Halbwachs: Automatic Discovery of Linear Restraints Among Variables of a Program. POPL 1978: 84-96

## In absence of best abstraction

- Best abstraction of a disk by a rectangular parallelogram



- No best abstraction of a disk by a polyhedron (Euclid)



use only concretization or abstraction or widening (introduced in the following) <sup>(1)</sup>

<sup>(1)</sup> Patrick Cousot, Radhia Cousot: Abstract Interpretation Frameworks. J. Log. Comput. 2(4): 511-547 (1992)

## Transformer abstraction

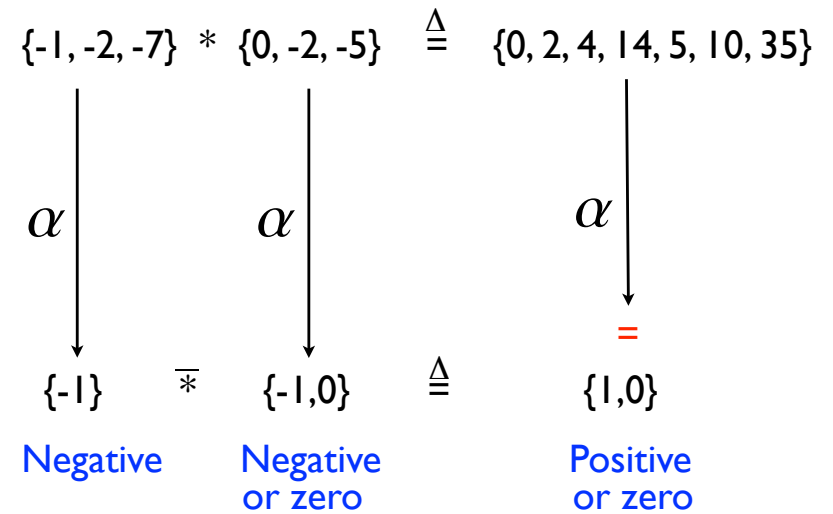
## Transformers

- Concrete transformer:

$$F \in \mathcal{P} \rightarrow \mathcal{P}$$

increasing (or continuous)

## Example abstract transformer: rule of signs



## Transformer abstraction

- An abstract transformer  $\bar{F} \in \mathcal{A} \rightarrow \mathcal{A}$  is

- Sound iff

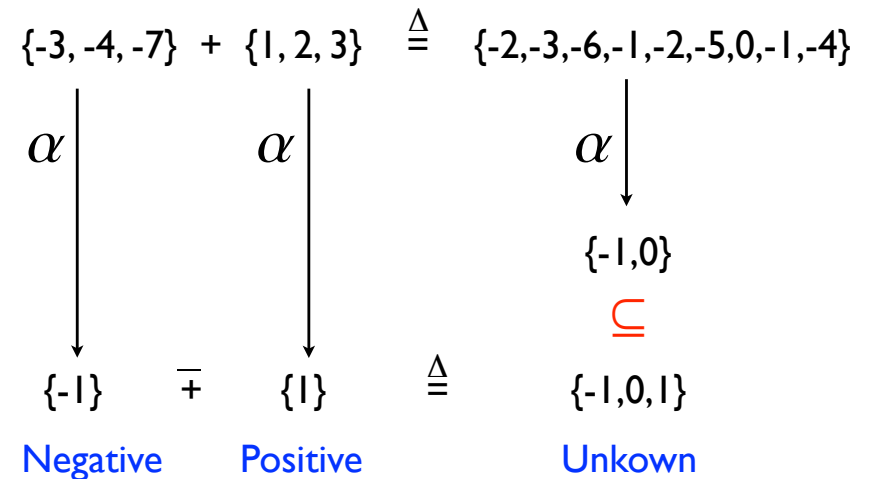
$$\forall P \in \mathcal{P} : \alpha \circ F(P) \sqsubseteq \bar{F} \circ \alpha(P)$$

- Sound and complete iff

$$\forall P \in \mathcal{P} : \alpha \circ F(P) = \bar{F} \circ \alpha(P)$$

- Example (rule of sign)
  - Addition: sound, incomplete
  - Multiplication: sound, complete

## Example abstract transformer: rule of signs



# Fixpoints

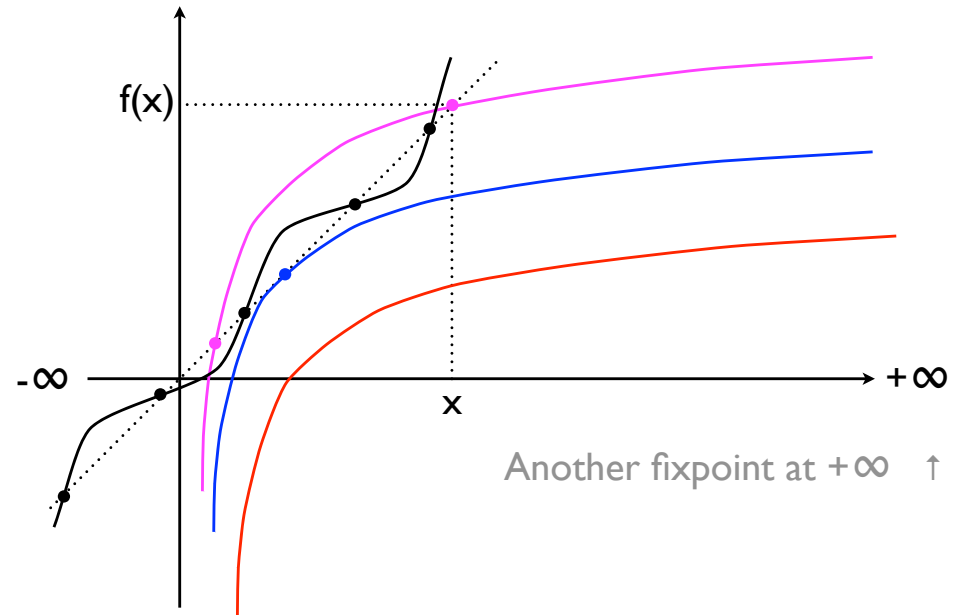
Patrick Cousot & Radhia Cousot. Constructive versions of Tarski's fixed point theorems. In *Pacific Journal of Mathematics*, Vol. 82, No. 1, 1979, pp. 43–57.

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## Fixpoints of increasing functions (Tarski)



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## Fixpoint

- Set  $\mathcal{P}$
- Transformer  $F \in \mathcal{P} \rightarrow \mathcal{P}$
- Fixpoint

$x \in \mathcal{P}$  is a fixpoint of  $F$   
 $\iff F(x) = x$

- Poset  $\langle \mathcal{P}, \leq \rangle$
- Least fixpoint

$x \in \mathcal{P}$  is the least fixpoint of  $F$  (written  $x = \text{lfp}^{\leq} F$ )  
 $\iff F(x) = x \wedge \forall y \in \mathcal{P} : (F(y) = y) \Rightarrow (x \leq y)$

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## Program properties as fixpoints

- Program semantics and program properties can be formalized as least/greatest fixpoints of increasing transformers on complete lattices <sup>(1)</sup>
- Complete lattice / cpo of properties

$\langle \mathcal{P}, \leq, 0, 1, \vee, \wedge \rangle$

- Properties of program  $P$

$S \llbracket P \rrbracket = \text{lfp}^{\leq} F \llbracket P \rrbracket$

- Transformer of program  $P$

$F \llbracket P \rrbracket \in \mathcal{P} \rightarrow \mathcal{P}$ , increasing (or continuous)

(1) Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252  
 Patrick Cousot, Radhia Cousot: Systematic Design of Program Analysis Frameworks. POPL 1979: 269-282

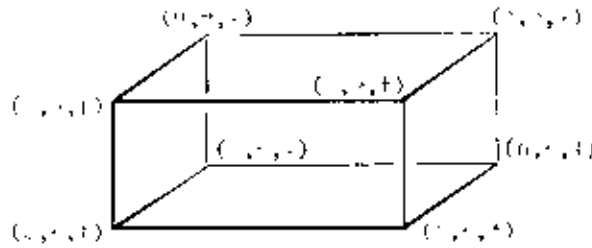
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## Fixpoints: inversion, converse and duality



- Forward ( $\rightarrow$ ) or backward ( $\leftarrow$ ) **transformers**
- Join ( $\cup$ ) or meet ( $\cap$ ) **merge duality**
- Least ( $\downarrow$ ) or greatest ( $\uparrow$ ) **fixpoint duality**

Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252

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## Example II: infinite traces

- $\langle \wp(\Sigma^\infty), \subseteq, \emptyset, \Sigma^\infty, \cup, \cap \rangle$
- Backward transformer:  $\overleftarrow{\phi}_\tau^\infty[[P]]T \triangleq \tau[[P]] \circ T$
- Fixpoint infinite traces:

$$\tau^\infty[[P]] = \text{gfp}_{\Sigma^\infty}^\subseteq \overleftarrow{\phi}_\tau^\infty[[P]]$$

Patrick Cousot: Constructive design of a hierarchy of semantics of a transition system by abstract interpretation. Theor. Comput. Sci. 277(1-2): 47-103 (2002)

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## Example I: partial finite trace semantics

- $\langle \wp(\Sigma^+), \subseteq, \emptyset, \Sigma^+, \cup, \cap \rangle$
- Forward transformer:  $\overrightarrow{\phi}_\tau^\ddagger[[P]]T \triangleq \Sigma^1 \cup T \circ \tau[[P]]$
- Backward transformer:  $\overleftarrow{\phi}_\tau^\ddagger[[P]]T \triangleq \Sigma^1 \cup \tau[[P]] \circ T$
- Fixpoint finite partial traces:

$$\tau^\ddagger[[P]] = \text{lfp}_\emptyset^\subseteq \overleftarrow{\phi}_\tau^\ddagger[[P]] = \text{lfp}_\emptyset^\subseteq \overrightarrow{\phi}_\tau^\ddagger[[P]]$$

Patrick Cousot, Radhia Cousot: Systematic Design of Program Analysis Frameworks. POPL 1979: 269-282

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## Example III: partial finite and infinite traces (a)

- $\langle \wp(\Sigma^{+\infty}), \subseteq, \emptyset, \Sigma^{+\infty}, \cup, \cap \rangle$
- **Fixpoint partial finite and infinite traces semantics:**

$$\tau^{\ddagger\infty}[[P]] = \text{lfp}_\emptyset^\subseteq \overleftarrow{\phi}_\tau^\ddagger[[P]] \cup \text{gfp}_{\Sigma^\infty}^\subseteq \overleftarrow{\phi}_\tau^\infty[[P]]$$

Patrick Cousot: Constructive design of a hierarchy of semantics of a transition system by abstract interpretation. Theor. Comput. Sci. 277(1-2): 47-103 (2002)

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## Example III: partial finite and infinite traces (b)

- **Computational order:**

$$T^+ \triangleq T \cap \Sigma^+$$

$$T^\infty \triangleq T \cap \Sigma^\infty$$

$$(T_1 \sqsubseteq T_2) \triangleq (T_1^+ \sqsubseteq T_2^+) \wedge (T_1^\infty \supseteq T_2^\infty)$$

$$\langle \emptyset(\Sigma^{+\infty}), \sqsubseteq, \Sigma^\infty, \Sigma^+, \sqcup, \sqcap \rangle$$

- **Transformer:**

$$\overleftarrow{\phi}_\tau \ddot{\tau}^\infty \llbracket P \rrbracket T \triangleq \Sigma^1 \sqcup \tau \llbracket P \rrbracket \circ T$$

- **Fixpoint partial finite and infinite traces semantics:**

$$\tau \ddot{\tau}^\infty \llbracket P \rrbracket = \text{lfp}_\emptyset^\sqsubseteq \overleftarrow{\phi}_\tau \ddot{\tau}^\infty \llbracket P \rrbracket \cup \text{gfp}_{\Sigma^\infty}^\sqsubseteq \overleftarrow{\phi}_\tau^\infty \llbracket P \rrbracket = \text{lfp}_{\Sigma^\infty}^\sqsubseteq \overleftarrow{\phi}_\tau \ddot{\tau}^\infty \llbracket P \rrbracket$$

Patrick Cousot: Constructive design of a hierarchy of semantics of a transition system by abstract interpretation. Theor. Comput. Sci. 277(1-2): 47-103 (2002)

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## Example: reachable states

- **Transition system** (set of states  $\Sigma$ , initial states  $\mathcal{I} \subseteq \Sigma$ , transition relation  $\tau$ )

$$\langle \Sigma, \mathcal{I}, \tau \rangle$$

- **Right-image** of a set of states by transitions

$$\text{post}[\tau]X \triangleq \{s' \mid \exists s \in X : \tau(s, s')\}$$

- **Reachable states** from initial states  $\mathcal{I}$

$$\text{post}[\tau^*]\mathcal{I} = \text{lfp}^\sqsubseteq \lambda X \bullet \mathcal{I} \cup \text{post}[\tau]X$$

Patrick Cousot. Méthodes itératives de construction et d'approximation de points fixes d'opérateurs monotones sur un treillis, analyse sémantique des programmes. Thèse Ès Sciences Mathématiques, Université Joseph Fourier, Grenoble, France, 21 March 1978

Patrick Cousot. Semantic foundations of program analysis. In S.S. Muchnick & N.D. Jones, editors, *Program Flow Analysis: Theory and Applications*, Ch. 10, pages 303–342. Prentice-Hall, Inc., Englewood Cliffs, New Jersey, U.S.A., 1981.

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# Proof methods

Patrick Cousot & Radhia Cousot. Abstract interpretation: a unified lattice model for static analysis of programs by construction or approximation of fixpoints. POPL 1977: 238–252.

Patrick Cousot. Méthodes itératives de construction et d'approximation de points fixes d'opérateurs monotones sur un treillis, analyse sémantique des programmes. Thèse Ès Sciences Mathématiques, Université Joseph Fourier, Grenoble, France, 21 March 1978.

Patrick Cousot and Radhia Cousot. Reasoning about program invariance proof methods. *Research Report CRIN-80-P050*, Institut National Polytechnique de Lorraine, Nancy, France, July 1980, 22p.

Patrick Cousot. Semantic foundations of program analysis. In S.S. Muchnick & N.D. Jones, editors, *Program Flow Analysis: Theory and Applications*, Ch. 10, pages 303–342. Prentice-Hall, Inc., Englewood Cliffs, New Jersey, U.S.A., 1981.

Patrick Cousot & Radhia Cousot. Induction principles for proving invariance properties of programs. In D. Néel, editor, *Tools & Notions for Program Construction: an Advanced Course*, pages 75–119. Cambridge University Press, Cambridge, UK, August 1982.

Patrick Cousot. A Hoare-style axiomatization of Burstall's intermittent assertion method for non-deterministic programs. *Research report LRIM-83-04*, University of Metz, September 1983.

Patrick Cousot and Radhia Cousot. "À la Burstall" induction principles for proving inevitability properties of programs. *Research Report LRIM-83-08*, University of Metz, November 1983.

Patrick Cousot & Radhia Cousot. Principe des Méthodes de Preuve de Propriétés d'Invariance et de Fatalité des Programmes Parallèles. (*Principle of invariance and inevitability proof methods of concurrent programs*). In « *Parallélisme, communication et synchronisation* », J.-P. Verjus et G. Roucairol (Eds.), Éditions du CNRS, Paris, pp. 129–149, 1985.

Patrick Cousot & Radhia Cousot. "À la Floyd" induction principles for proving inevitability properties of programs. In « *Algebraic methods in semantics* », M. Nivat & J. Reynolds (Eds.), Cambridge University Press, Cambridge, UK, pp. 277–312, December 1985.

Patrick Cousot & Radhia Cousot. Sometime = Always + Recursion = Always. On the Equivalence of the Intermittent and Invariant Assertions Methods for Proving Inevitability Properties of Programs. *Acta Informatica* 24, 1–31 (1987).

Patrick Cousot & Radhia Cousot. A language independent proof of the soundness and completeness of generalized Hoare logic. *Information and computation* 80(2):165–191 (1989).

Patrick Cousot. Methods and Logics for Proving Programs. In J. van Leeuwen, editor, *Formal Models and Semantics*, volume B of *Handbook of Theoretical Computer Science*, chapter 15, pages 843–993. Elsevier Science Publishers B.V., 1990.

Radhia Cousot. Fondements des méthodes de preuve d'invariance et de fatalité de programmes parallèles. Thèse Ès Sciences Mathématiques, Institut national polytechnique de Lorraine, Nancy, France, 15 November 1985.

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## Proof methods

- **Proof methods** directly follow from the fixpoint definition

$$S \llbracket P \rrbracket \leq P$$

$$\Leftrightarrow \text{lfp}^{\leq} F \llbracket P \rrbracket \leq P$$

$$\Leftrightarrow \exists I : F \llbracket P \rrbracket(I) \leq I \wedge I \leq P$$

(proof by Tarski's fixpoint theorem for increasing transformers on complete lattice or Pataria for cpos)

$$\text{lfp}^{\leq} F = \bigwedge \{x \mid F(x) \leq x\}$$

Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252  
Patrick Cousot, Radhia Cousot: Systematic Design of Program Analysis Frameworks. POPL 1979: 269-282

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## Example: Turing/Floyd Invariance Proof

- Bad states:

$$\mathcal{B} \subseteq \Sigma$$

- Prove that no bad state is reachable:

$$\text{post}[\tau^*]I \subseteq \neg\mathcal{B}$$

$$\text{ie } \text{lfp}^{\subseteq} \lambda X. I \cup \text{post}[\tau]X \subseteq \neg\mathcal{B}$$

- Turing/Floyd proof method:

$$\exists I \in \wp(\Sigma) : I \subseteq I \wedge \text{post}[\tau]I \subseteq I \wedge I \subseteq \neg\mathcal{B}$$

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## Fixpoint abstraction

- For an increasing and sound abstract transformer, we have a *fixpoint approximation*

$$\alpha(\text{lfp}^{\subseteq} F) \subseteq \text{lfp}^{\subseteq} \bar{F}$$

- For an increasing, sound, and complete abstract transformer, we have an *exact fixpoint abstraction*

$$\alpha(\text{lfp}^{\subseteq} F) = \text{lfp}^{\subseteq} \bar{F}$$

Patrick Cousot, Radhia Cousot: Systematic Design of Program Analysis Frameworks. POPL 1979: 269-282

## Fixpoint abstraction

### Example XIII: trace to reachability abstraction

- **Transition system:**  $\langle \Sigma[[P]], \tau[[P]] \rangle$
- **Fixpoint concrete partial trace semantics:**  
 $\tau^{\ddagger}[[P]] = \text{lfp}_{\emptyset}^{\subseteq} \bar{\phi}_{\tau}^{\ddagger}[[P]]$  with  $\bar{\phi}_{\tau}^{\ddagger}[[P]]T \triangleq \Sigma^1 \cup T \circ \tau[[P]]$

- **Reachability abstraction** from initial states I:

$$\langle \wp(\Sigma^{+\infty}), \subseteq \rangle \xleftrightarrow[\alpha^r \circ \alpha^i(I)]{\gamma^i(I) \circ \gamma^r} \langle \wp(\Sigma), \subseteq \rangle$$

- **Sound and complete abstract transformer**

$$\alpha^r \circ \alpha^i(I) \circ \bar{\phi}_{\tau}^{\ddagger}[[P]] = \lambda X. I \cup \text{post}[\tau[[P]]] \circ \alpha^r \circ \alpha^i$$

- **Fixpoint reachability:**

$$\begin{aligned} \alpha^r \circ \alpha^i(I)(\tau^{\ddagger}[[P]]) &= \alpha^r \circ \alpha^i(I) \left( \text{lfp}_{\emptyset}^{\subseteq} \bar{\phi}_{\tau}^{\ddagger}[[P]] \right) \\ &= \text{lfp}_{\emptyset}^{\subseteq} \lambda X. I \cup \text{post}[\tau[[P]]]X \end{aligned}$$

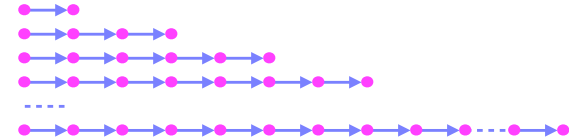
# Fixpoint iteration<sup>(\*)</sup> and convergence acceleration<sup>(\*\*)</sup>

<sup>(\*)</sup> In absence of direct solution (e.g. by elimination)  
<sup>(\*\*)</sup> In absence of finite convergence (e.g. ascending chain condition)

## Expressiveness of finite abstractions is weak<sup>(\*)</sup>

- Finite state abstraction is *impossible* for *termination* and *unsound* for *non-termination* of *unbounded programs*

- Unbounded executions:



- Finite homomorphic abstraction:



- Termination: *impossible* (lasso)
- Non-termination (lasso): *unsound*

<sup>(\*)</sup> Excluding trivial solutions, see: Patrick Cousot: Partial Completeness of Abstract Fixpoint Checking. SARA 2000: 1-25

## Iterative fixpoint computation

- Fixpoint of increasing transformers on cpos can be computed iteratively as limits of (transfinite) iterates

$$F^0 \triangleq \perp$$

$$F^{\beta+1} \triangleq F(F^\beta), \quad \beta + 1 \text{ successor ordinal}$$

$$F^\lambda \triangleq \bigsqcup_{\beta < \lambda} F^\beta, \quad \lambda \text{ limit ordinal}$$

Ultimately stationary at rank  $\epsilon$

Converges to  $F^\epsilon = \text{lfp}^{\sqsubseteq} F$

- $\epsilon = \omega$  when  $F$  is continuous
- Finite iterates when  $F$  operates on a cpo satisfying the ascending chain condition

Patrick Cousot & Radhia Cousot. Constructive versions of Tarski's fixed point theorems. In *Pacific Journal of Mathematics*, Vol. 82, No. 1, 1979, pp. 43–57.

## Widening

- Definition (widening  $\nabla \in \mathcal{A} \times \mathcal{A} \rightarrow \mathcal{A}$ )
- $\langle \mathcal{A}, \sqsubseteq \rangle$  poset
- Over-approximation

$$\forall x, y \in \mathcal{A} : x \sqsubseteq x \nabla y \wedge y \sqsubseteq x \nabla y$$

- Termination

Given any sequence  $\langle x^n, n \in \mathbb{N} \rangle$ , the widened sequence  $\langle y^n, n \in \mathbb{N} \rangle$

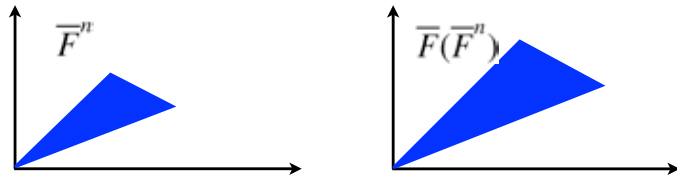
$$y^0 \triangleq x^0, \dots, y^{n+1} \triangleq y^n \nabla x^n, \dots$$

converges to a limit  $y^\ell$  (such that  $\forall m \geq \ell : y^m = y^\ell$ )

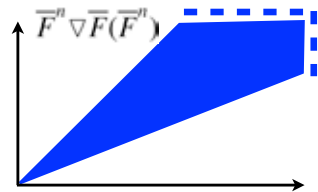
Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252

## Example: (simple) widening for polyhedra

- Iterates



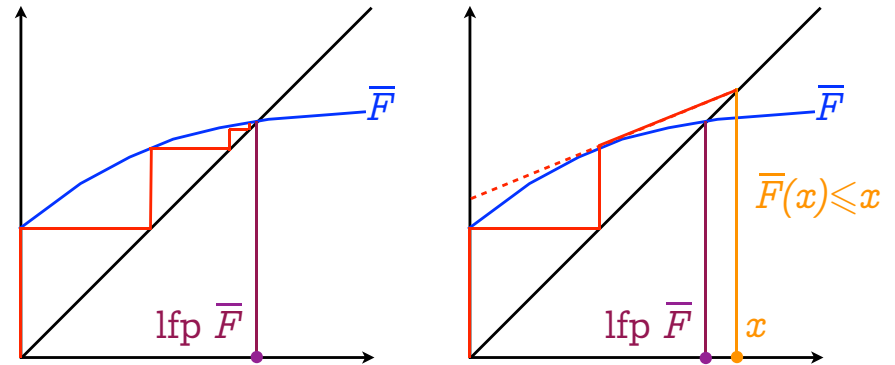
- Widening



Patrick Cousot. Méthodes itératives de construction et d'approximation de points fixes d'opérateurs monotones sur un treillis, analyse sémantique des programmes. Thèse Es Sciences Mathématiques, Université Joseph Fourier, Grenoble, France, 21 March 1978.

Patrick Cousot, Nicolas Halbwachs: Automatic Discovery of Linear Restraints Among Variables of a Program. POPL 1978: 84-96

## Convergence acceleration with widening



Infinite iteration

Accelerated iteration with widening  
(e.g. with a widening based on the derivative as in Newton-Raphson method)

## Iteration with widening

- Iterates with widening* for transformer  $\bar{F} \in \mathcal{A} \rightarrow \mathcal{A}$

$$\begin{aligned} \bar{F}^0 &\triangleq \perp \\ \bar{F}^{n+1} &\triangleq \bar{F}^n \quad \text{when } \bar{F}(\bar{F}^n) \sqsubseteq \bar{F}^n \\ \bar{F}^{n+1} &\triangleq \bar{F}^n \nabla \bar{F}(\bar{F}^n) \quad \text{otherwise} \end{aligned}$$

- The *widening speeds up convergence* (at the cost of imprecision)

**Theorem (Limit of iterates with widening)** The iterates of  $\bar{F}$  with widening  $\nabla$  from  $\perp$  on a poset  $\langle \mathcal{A}, \sqsubseteq, \perp \rangle$  converge to a limit  $\bar{F}^\ell$  such that  $\bar{F}(\bar{F}^\ell) \sqsubseteq \bar{F}^\ell$  (and so  $\text{lfp}^\sqsubseteq \bar{F} \sqsubseteq \bar{F}^\ell$  when  $\bar{F}$  is increasing).

- Can be improved by a *narrowing*.

Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL 1977: 238-252

## Reduced product

- The *reduced product* combines abstractions by performing their conjunction in the abstract

$$\begin{aligned} \langle \mathcal{P}, \leq \rangle &\xrightarrow[\alpha_1]{\gamma_1} \langle \mathcal{A}_1, \sqsubseteq_1 \rangle \\ \langle \mathcal{P}, \leq \rangle &\xrightarrow[\alpha_2]{\gamma_2} \langle \mathcal{A}_2, \sqsubseteq_2 \rangle \\ \mathcal{A}_1 \otimes \mathcal{A}_2 &\triangleq \\ &\{ \langle \alpha_1(\gamma_1(P_1)) \wedge \gamma_2(P_2), \alpha_2(\gamma_1(P_1)) \wedge \gamma_2(P_2) \rangle \mid P_1 \in \mathcal{A}_1 \wedge P_2 \in \mathcal{A}_2 \} \\ \langle \mathcal{P}, \leq \rangle &\xrightarrow[\alpha_1 \times \alpha_2]{\gamma_1 \times \gamma_2} \langle \mathcal{A}_1 \otimes \mathcal{A}_2, \sqsubseteq_1 \times \sqsubseteq_2 \rangle \end{aligned}$$

- Example: (positive or zero)  $\otimes$  odd = <positive, odd>

Patrick Cousot, Radhia Cousot: Systematic Design of Program Analysis Frameworks. POPL 1979: 269-282

Patrick Cousot, Radhia Cousot, Laurent Mauborgne: The Reduced Product of Abstract Domains and the Combination of Decision Procedures. FOSSACS 2011: 456-472

# Undecidability and complexity

# What to do about false alarms? abstraction refinement

## Fighting undecidability and complexity in automatic program verification

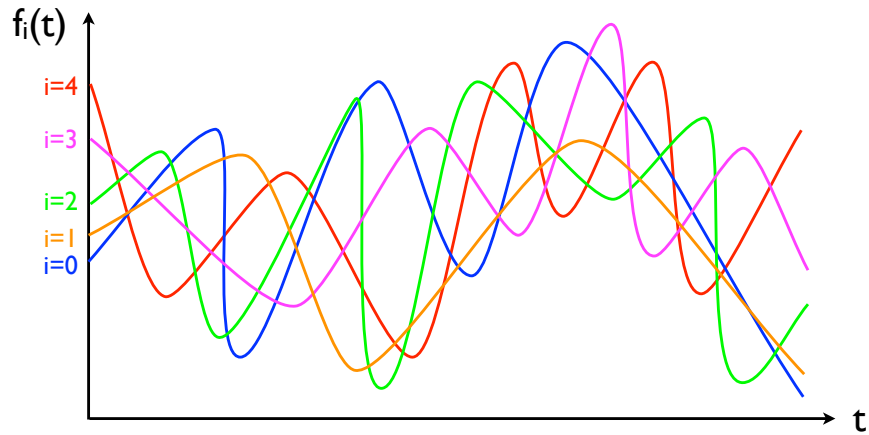
- Any *automatic* semantic program verification method will definitely **fail on infinitely many programs** (Gödel)
- Solutions:
  - Ask for **human help** (theorem-prover/proof assistant based *deductive methods*) → **high labor cost**
  - Consider **finite/decidable systems** (*model-checking*) → **combinatorial explosion**
  - Do sound **approximations** or complete **abstractions** (*abstract interpretation*) → **false alarms**

## What to do about false alarms? (I) Automatic refinement

- Inefficient and may **not terminate** (Gödel)
- Refinement needs **intelligence**

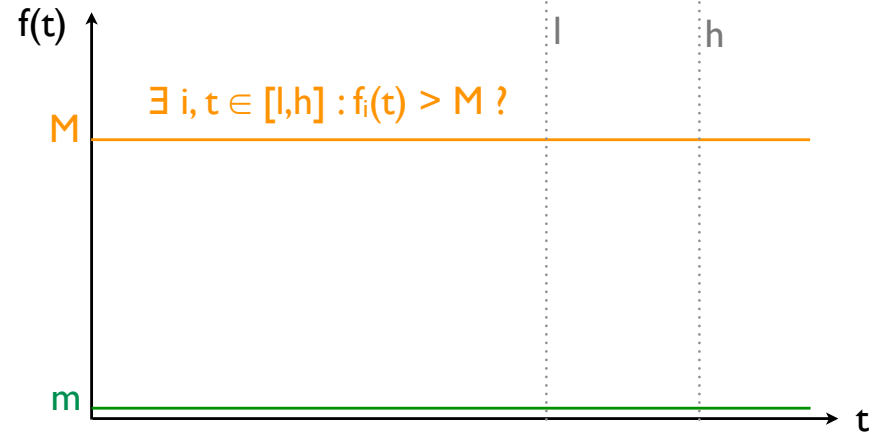


## Set of functions



How to approximate  $\{ f_1, f_2, f_3, f_4 \}$  ?

## Concrete questions on the $f_i$

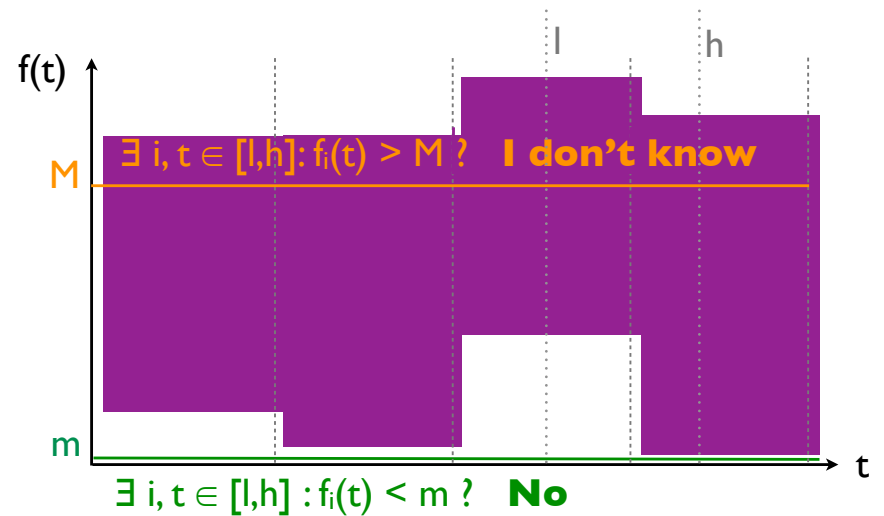


Min/max questions on the  $f_i$

## Set of functions abstraction

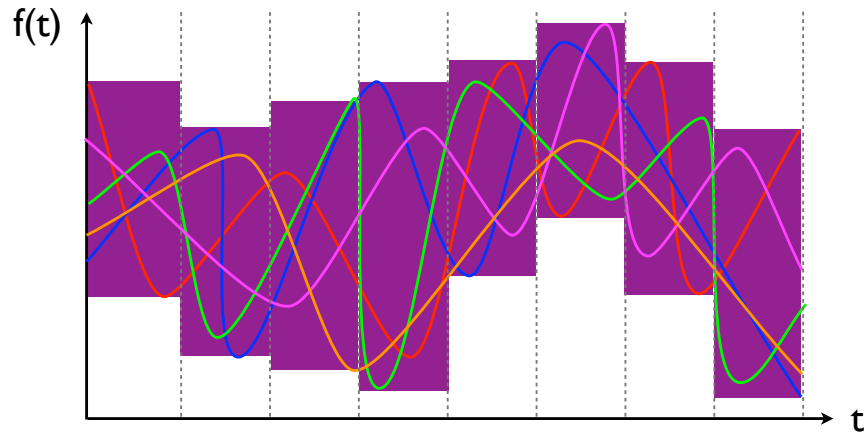


## Concrete questions on the $f_i$ answered in the abstract

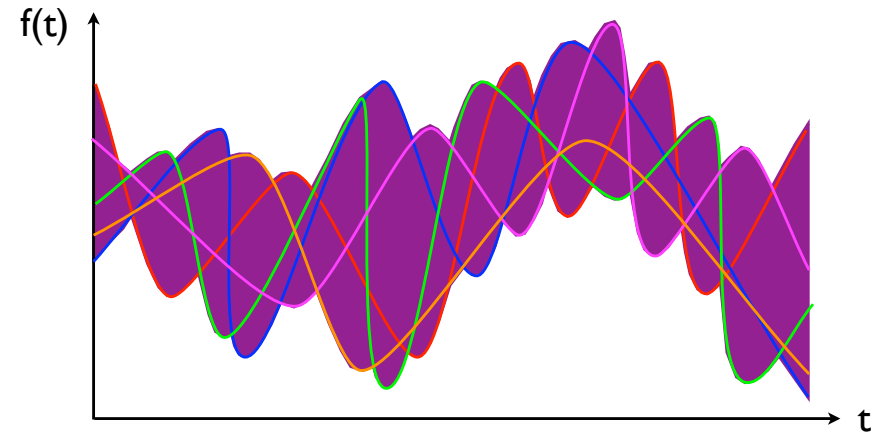


Min/max questions on the  $f_i$

## A more precise/refined abstraction

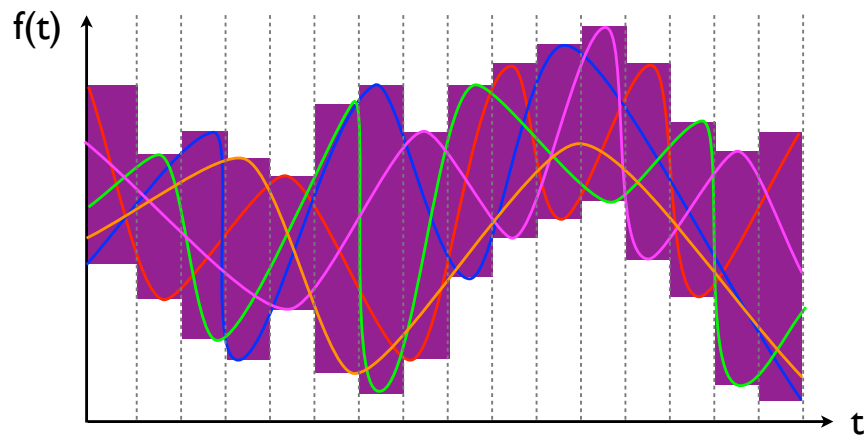


## Intelligent passing to the limit



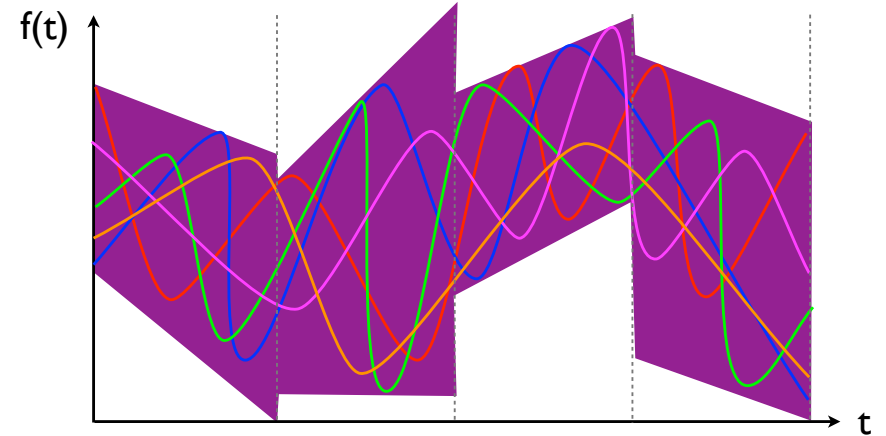
Sound and *complete* abstraction for min/max questions on the  $f_i$

## An even more precise/refined abstraction



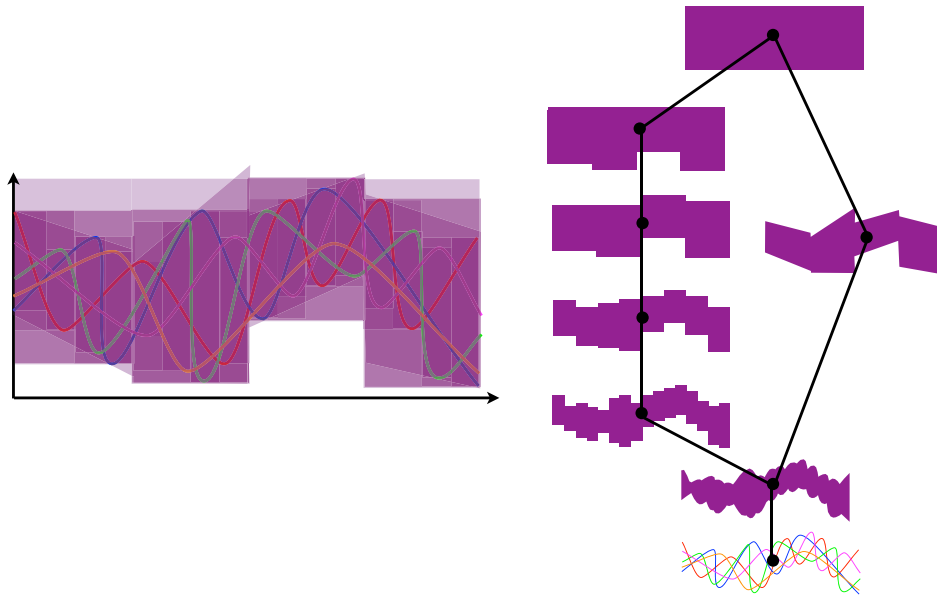
Note: this is already much more elaborate than CEGAR that goes counter-example by counter-example!

## A non-comparable abstraction



Sound and *incomplete* abstraction for min/max questions on the  $f_i$

## The hierarchy of abstractions



Patrick Cousot, Radhia Cousot: Abstract Interpretation: A Unified Lattice Model for Static Analysis of Programs by Construction or Approximation of Fixpoints. POPL. 1977: 238-252

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## What to do about false alarms? (II) Domain specific refinement

- Adapt the abstraction to the *programming paradigms* typically used in given *domain-specific applications*
- e.g. *Astrée* for *synchronous control/command programs*: no recursion, no dynamic memory allocation, maximum execution time, filters, integrators, quaternions, etc.

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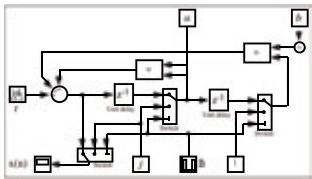
99

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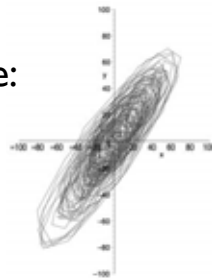
## (I) Automatic refinement: Astrée example

- Filter invariant abstraction:

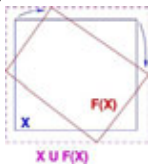
2nd order filter:



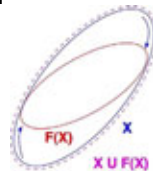
Execution trace:



Unstable polyhedral abstraction:



Stable ellipsoidal abstraction:



Julien Bertrane, Patrick Cousot, Radhia Cousot, Jérôme Feret, Laurent Mauborgne, Antoine Miné, & Xavier Rival. *Static Analysis and Verification of Aerospace Software by Abstract Interpretation*. In *AIAA Infotech@ Aerospace 2010*, Atlanta, Georgia, American Institute of Aeronautics and Astronautics, 20–22 April 2010. © AIAA.

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# So, what is Abstract Interpretation

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## A narrow view ...

- Define the **syntax** of the system descriptions
- Define the **semantics** of the system descriptions
- Define the **collecting semantics** (strongest property of interest)
- Preferably express the collecting semantics in **fixpoint** form
- Define **abstractions of properties**
- Infer **abstractions of transformers**
- Infer **abstractions of fixpoints** to get abstract semantics
- **Iterate** to compute fixpoints with **convergence acceleration** (widening/narrowing)
- **Combine abstractions** (e.g. reduced product) to refine

## Abstraction in a more general setting...

- Reasoning on complex [computer] system behaviors is too **complex** (for humans)
- Analyzing/verifying [computer] system behaviors is **undecidable** or subject to **combinatorial explosion** (for machines)
- **Abstraction** is necessary to apprehend complexity
- **Abstract interpretation** is a formal framework for reasoning/computing on **formal models** of [computer] objects, systems and computations and their **relations**
- **Applications** include the systematic construction of methods and effective algorithms to solve/approximate undecidable or very complex problems in various areas of computer science (and more recently system biology)

## Example XIV: grammar abstraction

- **Meta-syntax** of grammars
- **Semantics of grammars** (by induction on the meta-syntax): the language generated by the grammar
- **Fixpoint semantics**: Chomsky-Schützenberger th.

$$\mathcal{S}[\mathbf{X} ::= \mathbf{Xa} \mid \mathbf{b}] = \text{lfp}^{\subseteq} \lambda X \cdot X \cdot \{a\} \cup \{b\}$$

- Example of **abstraction**: **FIRST**

$$\alpha_{\text{FIRST}}(X) \triangleq \{a \mid \exists \sigma : a\sigma \in X\}$$

- **Fixpoint abstraction**: FIRST classical algorithm (expressed as a fixpoint)

$$\begin{aligned} \mathcal{F}[\mathbf{X} ::= \mathbf{Xa} \mid \mathbf{b}] &\triangleq \alpha_{\text{FIRST}}(\mathcal{S}[\mathbf{X} ::= \mathbf{Xa} \mid \mathbf{b}]) \\ &= \text{lfp}^{\subseteq} \lambda X \cdot X \cup \{a \mid \varepsilon \in X\} \cup \{b\} \end{aligned}$$

Patrick Cousot, Radhia Cousot: Grammar semantics, analysis and parsing by abstract interpretation. Theor. Comput. Sci. 412(44): 6135-6192 (2011)

Patrick Cousot, Radhia Cousot: Grammar Analysis and Parsing by Abstract Interpretation. Program Analysis and Compilation, LNCS 4444, 2006: 175-200

Patrick Cousot, Radhia Cousot: Parsing as abstract interpretation of grammar semantics. Theor. Comput. Sci. 290(1): 531-544 (2003)

## Recent advances

- The same principles apply to **termination verification**

Patrick Cousot, Radhia Cousot: *An abstract interpretation framework for termination*. POPL 2012: 245-258

- and to **probabilistic verification**

Patrick Cousot and Michaël Monerau. [Probabilistic Abstract Interpretation](#). In H. Seidel (Ed), *22nd European Symposium on Programming (ESOP 2012)*, Tallinn, Estonia, 24 March—1 April 2012. Lecture Notes in Computer Science, vol. 7211, pp. 166—190, © Springer, 2012.

# Applications of abstract interpretation

## Software

- **Ait**: static analysis of the worst-case execution time of control/command software ([www.absint.com/ait/](http://www.absint.com/ait/))
- **Astrée**: proof of absence of runtime errors in embedded synchronous real time control/command software ([www.absint.com/astree/](http://www.absint.com/astree/)), **AstréeA** for asynchronous programs ([www.astreea.ens.fr/](http://www.astreea.ens.fr/))
- **C Global Surveyor**, NASA, static analyzer for flight software of NASA missions ([www.cmu.edu/silicon-valley/faculty-staff/venet-arnaud.html](http://www.cmu.edu/silicon-valley/faculty-staff/venet-arnaud.html))
- **IKOS** (Inference Kernel for Open Static Analyzers), ([www.cmu.edu/silicon-valley/software-systems-management/software-verification.html](http://www.cmu.edu/silicon-valley/software-systems-management/software-verification.html))
- **Checkmate**: static analyzer of multi-threaded Java programs ([www.pietro.ferrara.name/checkmate/](http://www.pietro.ferrara.name/checkmate/))
- **CodeContracts Static Checker**, Microsoft ([msdn.microsoft.com/en-us/devlabs/dd491992.aspx](http://msdn.microsoft.com/en-us/devlabs/dd491992.aspx))
- **Fluctuat**: static analysis of the precision of numerical computations ([www-list.cea.fr/labos/qb/LSL/fluctuat/index.html](http://www-list.cea.fr/labos/qb/LSL/fluctuat/index.html))

# Static analysis and verification

## Software

- **Infer**: Static analyzer for C/C++ ([monoidics.com/](http://monoidics.com/))
- **Julia**: static analyzer for Java and Android programs ([www.juliasoft.com/juliasoft-android-java-verification.aspx?Id=201177234649](http://www.juliasoft.com/juliasoft-android-java-verification.aspx?Id=201177234649))
- **Predator**: static analyzer of C dynamic data structures using separation logic ([www.fit.vutbr.cz/research/groups/verifit/tools/predator/](http://www.fit.vutbr.cz/research/groups/verifit/tools/predator/))
- **Terminator**: termination proof ([www.cs.ucl.ac.uk/staff/p.ohearn/Invader/Invader/Invader\\_Home.html](http://www.cs.ucl.ac.uk/staff/p.ohearn/Invader/Invader/Invader_Home.html))
- etc.
  
- **Apron** numerical domains library ([apron.cri.enscm.fr/library/](http://apron.cri.enscm.fr/library/))
- **Parma Polyhedral Library** ([bugseng.com/products/ppl/](http://bugseng.com/products/ppl/))
- etc.

# Hardware

- (Generalized) symbolic trajectory evaluation (Intel)

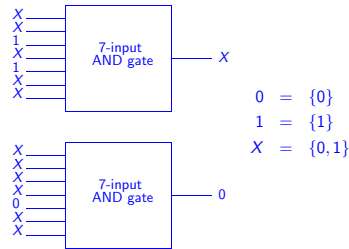
## Intel's Successes with Formal Methods

John Harrison  
Intel Corporation  
15 March 2012

Tsinghua software day, March 15, 2012, Tsinghua University, Beijing, China

## Example of ternary simulation

If some inputs are undefined, the output is too, but not always:



Jin Yang and Carl-Johan H. Seger. *Generalized Symbolic Trajectory Evaluation – Abstraction in Action*. Formal Methods in Computer-Aided Design. Lecture Notes in Computer Science, 2002, Volume 2517/2002, 70–87.

Jin Yang, C. J. H. Seger. *Introduction to generalized symbolic trajectory evaluation*. IEEE Transactions on Very Large Scale Integration (VLSI) Systems 11(3), June 2003, 345–353.

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# Biology

- **Kappa** – A language for modeling protein interaction networks by a set of rules and analyse that set directly deploying techniques from abstract interpretation ([www.kappalanguage.org/](http://www.kappalanguage.org/) and [fontana.med.harvard.edu/www/Documents/Lab/research.signaling.htm](http://fontana.med.harvard.edu/www/Documents/Lab/research.signaling.htm))

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# ASTRÉE

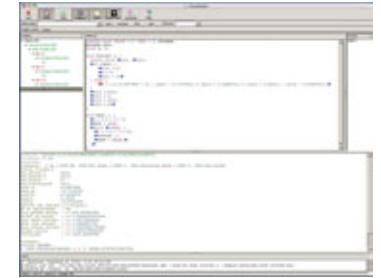


Bruno BLANCHET<sup>68</sup> Patrick COUSOT Radhia COUSOT Jérôme FERET



Laurent MAUBORGNE<sup>70</sup> Antoine MINÉ David MONNIAUX<sup>69</sup> Xavier RIVAL

<sup>68</sup> Nov. 2001 – Nov. 2003.  
<sup>69</sup> Nov. 2001 – Aug. 2007.  
<sup>70</sup> Nov. 2001 – Aug. 2010.



Patrick Cousot, Radhia Cousot, Jérôme Feret, Laurent Mauborgne, Antoine Miné, Xavier Rival: Why does Astrée scale up? Formal Methods in System Design 35(3): 229-264 (2009)

Patrick Cousot, Radhia Cousot, Jérôme Feret, Antoine Miné, Laurent Mauborgne, David Monniaux, Xavier Rival: Varieties of Static Analyzers: A Comparison with ASTREE. TASE 2007: 3-20

Patrick Cousot, Radhia Cousot, Jérôme Feret, Laurent Mauborgne, Antoine Miné, David Monniaux, Xavier Rival: Combination of Abstractions in the ASTRÉE Static Analyzer. ASIAN 2006: 272-300

Patrick Cousot, Radhia Cousot, Jérôme Feret, Laurent Mauborgne, Antoine Miné, David Monniaux, Xavier Rival: The ASTRÉE Analyzer. ESOP 2005: 21-30

Bruno Blanchet, Patrick Cousot, Radhia Cousot, Jérôme Feret, Laurent Mauborgne, Antoine Miné, David Monniaux, Xavier Rival: A static analyzer for large safety-critical software. PLDI 2003: 196-207

Bruno Blanchet, Patrick Cousot, Radhia Cousot, Jérôme Feret, Laurent Mauborgne, Antoine Miné, David Monniaux, Xavier Rival: Design and Implementation of a Special-Purpose Static Program Analyzer for Safety-Critical Real-Time Embedded Software. The Essence of Computation 2002: 85-108

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# Target language and applications

- **C programming language**
  - Without recursion, long jump, dynamic memory allocation, conflicting side effects, backward jumps, system calls (stubs)
  - With all its horrors (union, pointer arithmetics, etc)
  - Reasonably extending the standard (e.g. size & endianness of integers, IEEE 754-1985 floats, etc)
- **Originally for synchronous control/command**
  - e.g. generated from Scade

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## The semantics of C implementations is very hard to define

What is the effect of out-of-bounds array indexing?

```
% cat unpredictable.c
#include <stdio.h>
int main () { int n, T[1];
  n = 2147483647;
  printf("n = %i, T[n] = %i\n", n, T[n]);
}
```

Yields different results on different machines:

n = 2147483647, T[n] = 2147483647	Macintosh PPC
n = 2147483647, T[n] = -1208492044	Macintosh Intel
n = 2147483647, T[n] = -135294988	PC Intel 32 bits
Bus error	PC Intel 64 bits

## Example of domain-specific abstraction: ellipses

```
typedef enum {FALSE = 0, TRUE = 1} BOOLEAN;
BOOLEAN INIT; float P, X;

void filter () {
  static float E[2], S[2];
  if (INIT) { S[0] = X; P = X; E[0] = X; }
  else { P = (((((0.5 * X) - (E[0] * 0.7)) + (E[1] * 0.4))
    + (S[0] * 1.5)) - (S[1] * 0.7)); }
  E[1] = E[0]; E[0] = X; S[1] = S[0]; S[0] = P;
  /* S[0], S[1] in [-1327.02698354, 1327.02698354] */
}

void main () { X = 0.2 * X + 5; INIT = TRUE;
  while (1) {
    X = 0.9 * X + 35; /* simulated filter input */
    filter (); INIT = FALSE; }
}
```



## Implicit specification

- **Absence of runtime errors:** overflows, division by zero, buffer overflow, null & dangling pointers, alignment errors, ...
- **Semantics of runtime errors:**
  - **Terminating execution: stop** (e.g. floating-point exceptions when traps are activated)
  - **Predictable outcome: go on with worst case** (e.g. signed integer overflows result in some integer, some options: e.g. modulo arithmetics)
  - **Unpredictable outcome: stop** (e.g. memory corruption)

## An erroneous common belief on static analyzers

“The properties that can be proved by static analyzers are often simple” [2]

Like in mathematics:

- May be simple to **state** (no overflow)
- But harder to **discover** ( $S[0], S[1]$  in  $[-1327.02698354, 1327.02698354]$ )
- And difficult to **prove** (since it requires finding a non trivial non-linear invariant for second order filters with complex roots [Fer04], which can hardly be found by exhaustive enumeration)

### Reference

- [2] Vijay D'Silva, Daniel Kroening, and Georg Weissenbacher. A Survey of Automated Techniques for Formal Software Verification. IEEE Transactions on Computer-Aided Design of Integrated Circuits and Systems, Vol. 27, No. 7, July 2008.
- [Fer04] Jérôme Ferret: Static Analysis of Digital Filters. ESOP 2004: 33-48

# Industrial applications

Daniel Kästner, Christian Ferdinand, Stephan Wilhelm, Stefana Nevena, Olha Honcharova, Patrick Cousot, Radhia Cousot, Jérôme Feret, Laurent Mauborgne, Antoine Miné, Xavier Rival, and Elodie-Jane Sims. Astrée: Nachweis der Abwesenheit von Laufzeitfehlern. In *Workshop "Entwicklung zuverlässiger Software-Systeme"*, Regensburg, Germany, June 18<sup>th</sup>, 2009.

Olivier Bouissou, Éric Conquet, Patrick Cousot, Radhia Cousot, Jérôme Feret, Khalil Ghorbal, Éric Goubault, David Lesens, Laurent Mauborgne, Antoine Miné, Sylvie Putot, Xavier Rival, & Michel Turin. Space Software Validation using Abstract Interpretation. In *Proc. of the Int. Space System Engineering Conf., Data Systems in Aerospace (DASIA 2009)*, Istanbul, Turkey, May 2009, 7 pages. ESA.

Jean Souyris, David Delmas: Experimental Assessment of Astrée on Safety-Critical Avionics Software. SAFECOMP 2007: 479-490

David Delmas, Jean Souyris: Astrée: From Research to Industry. SAS 2007: 437-451

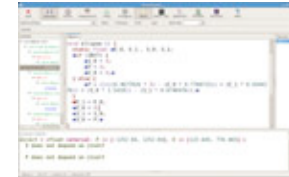
Jean Souyris: Industrial experience of abstract interpretation-based static analyzers. IFIP Congress Topical Sessions 2004: 393-400

Stephan Thesing, Jean Souyris, Reinhold Heckmann, Famantantsoa Randimbivolona, Marc Langenbach, Reinhard Wilhelm, Christian Ferdinand: An Abstract Interpretation-Based Timing Validation of Hard Real-Time Avionics Software. DSN 2003: 625-632

## Industrialization

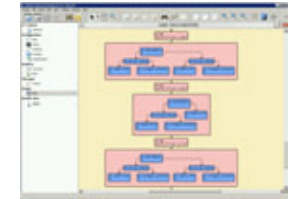
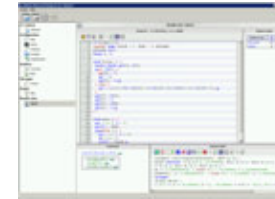
- 8 years of research/development (CNRS/ENS/INRIA):

[www.astree.ens.fr](http://www.astree.ens.fr)



- Industrialization by AbsInt (since Jan. 2010):

[www.absint.com/astree/](http://www.absint.com/astree/)



- Can be used for formal software certification in avionics (DO-178C & DO-333)

## Examples of applications

- Verification of the absence of runtime-errors in
  - Fly-by-wire flight control systems<sup>(\*)</sup>



- ATV docking system<sup>(\*)</sup>



- Flight warning system (on-going work)



(\*) No false alarm at all!

## Conclusion

## On research

If you reason/compute on computer/biological/... systems behaviors, you probably do **abstract interpretation**

# The End, Thank You

## On applications

If the simulation/analysis/checking of your computer/biological/... systems model does not scale up, consider using (sound (and complete)) **abstract interpretations**