

The Abstract Domain of Segmented Ranking Functions

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Seattle, USA

Introduction

- **liveness properties** \Rightarrow “something **good** eventually happens”
 - **termination**
- **ranking functions**¹
 - functions that strictly **decrease** at each program step...
 - ... and that are bounded from below
- **idea**: computation of ranking functions by abstract interpretation²
- **family of** parameterized **abstract domains** for program termination
 - piecewise-defined ranking functions
 - backward invariance analysis
 - sufficient conditions for termination
- instance based on **intervals** and **affine functions**

¹Floyd - *Assigning Meanings to Programs* (1967)

²Cousot&Cousot - *An Abstract Interpretation Framework for Termination* (POPL 2012)

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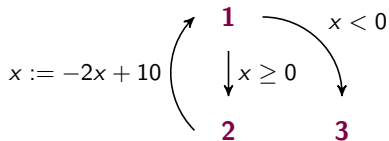
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Example

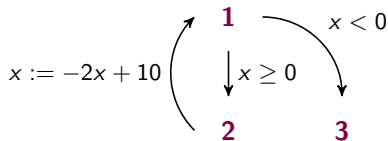
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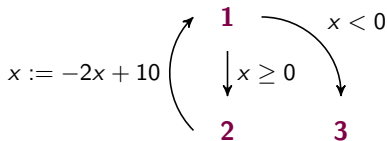
the program terminates
but there exists no
linear ranking function!



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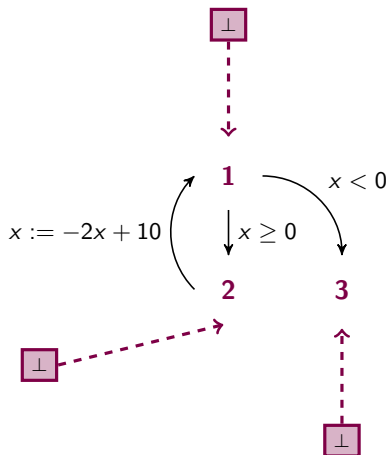
we map each point
to a function of x giving
an **upper bound** on the
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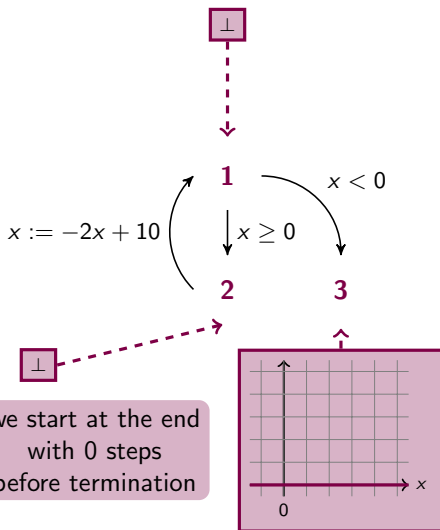
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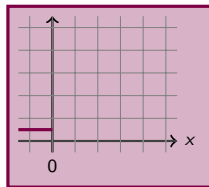
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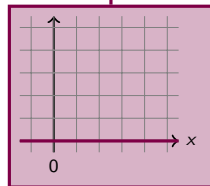
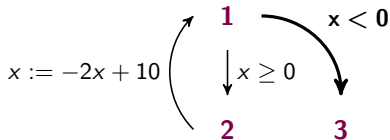


we take into account
 $x < 0$ and we have now
1 step to termination



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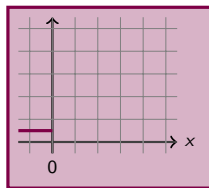
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we consider the assignment
and we are now at
2 steps to termination

$$x := -2x + 10$$



1

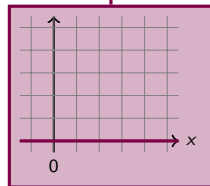
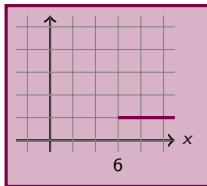
$x < 0$

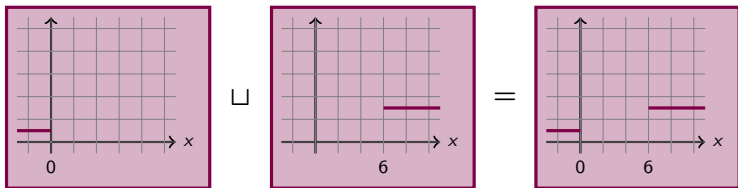


$x \geq 0$

2

3





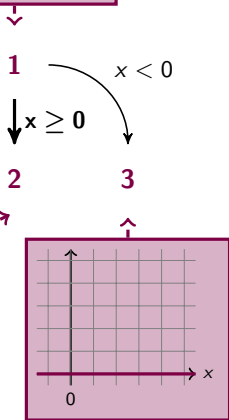
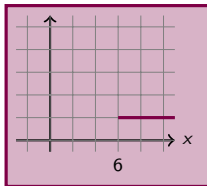
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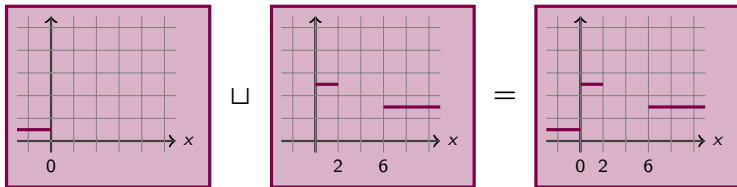
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we consider $x \geq 0$
and we do the join

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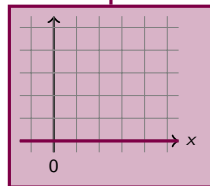
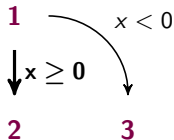
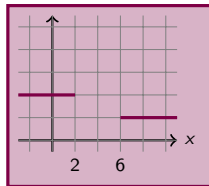
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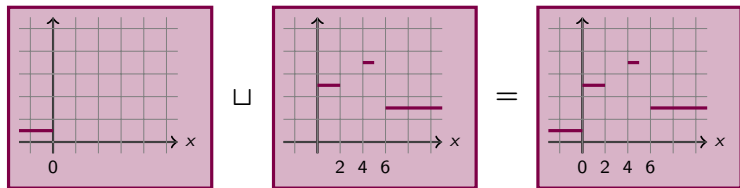
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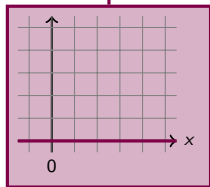
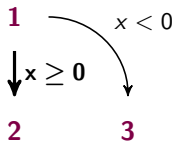
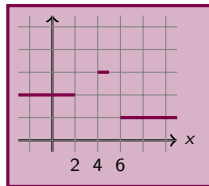


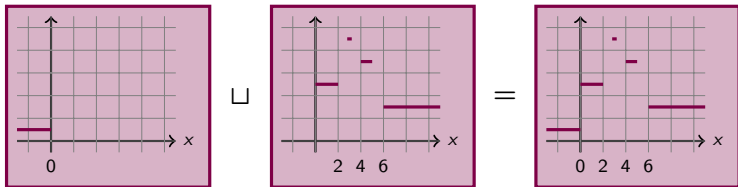
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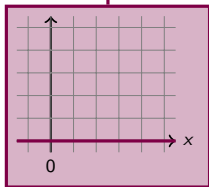
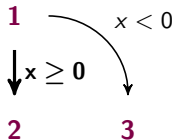
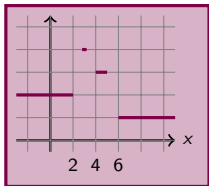
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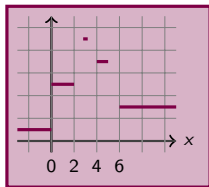
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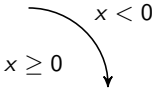
we are able to find a
 piecewise-defined ranking
 function for the program!

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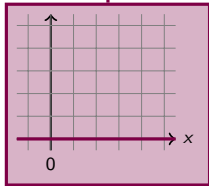
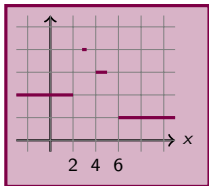


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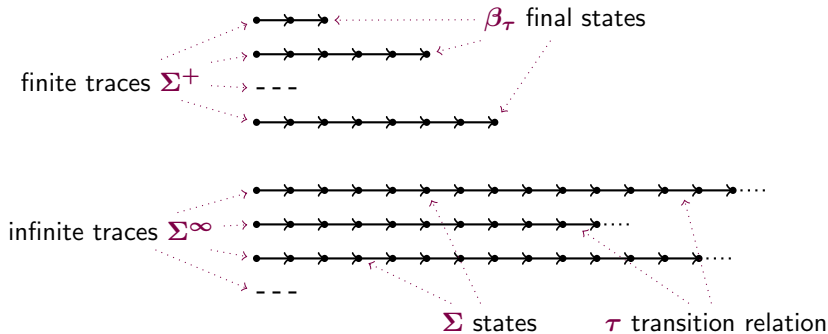
2

3



Concrete Semantics

program $P \mapsto$ **trace semantics**

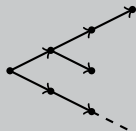


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$$v_\tau \triangleq \text{lfp } \phi_\tau$$

$$\phi_\tau(v) \triangleq \lambda s. \begin{cases} 0 & \text{if } s \in \beta_\tau \\ \sup\{v(s') + 1 \mid \langle s, s' \rangle \in \tau\} & \text{if } s \in \widetilde{\text{pre}}(\text{dom}(v)) \end{cases}$$

Example



Theorem (Soundness and Completeness)

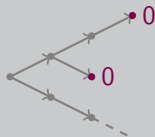
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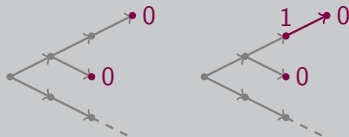
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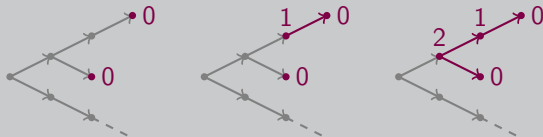
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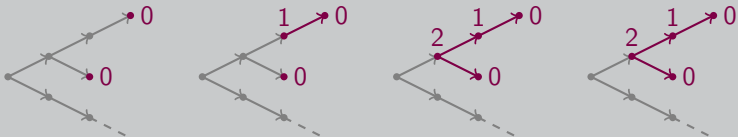
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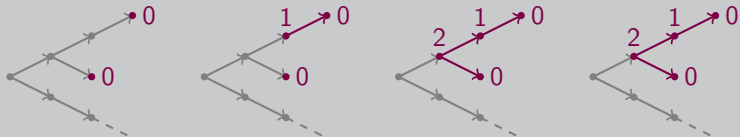
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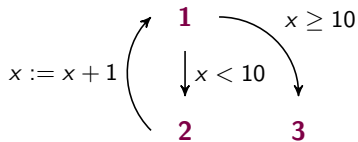


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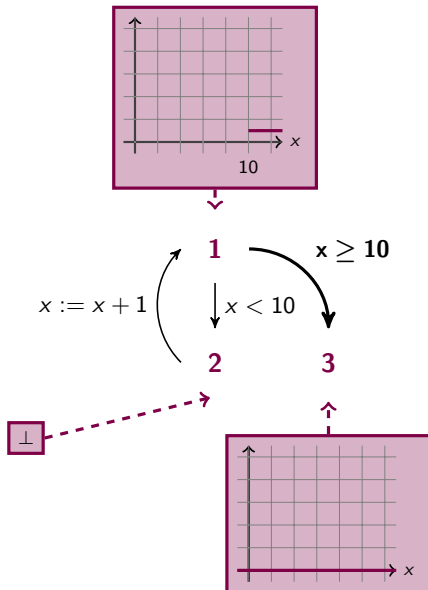
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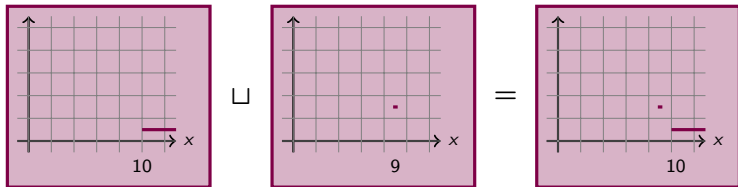
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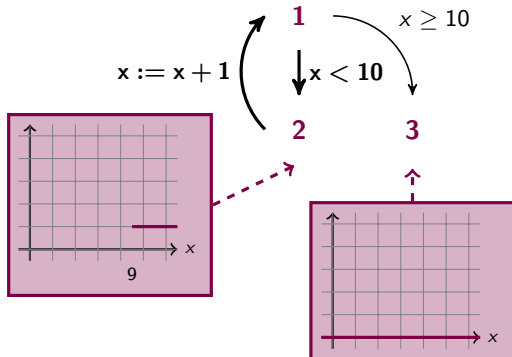
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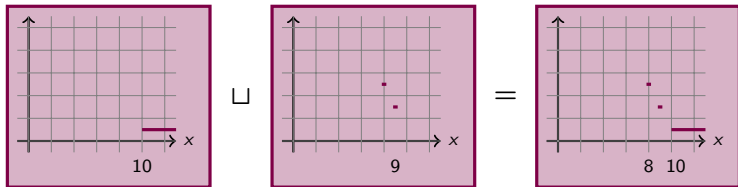




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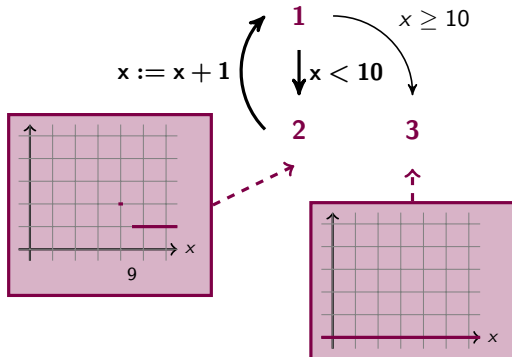
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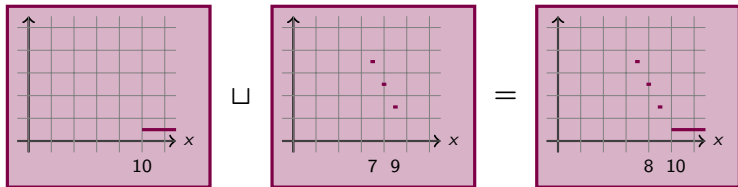




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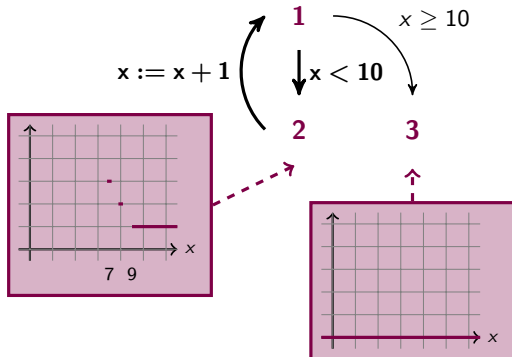
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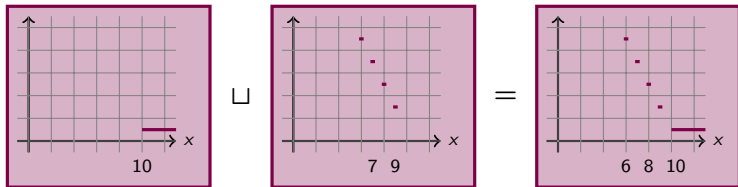




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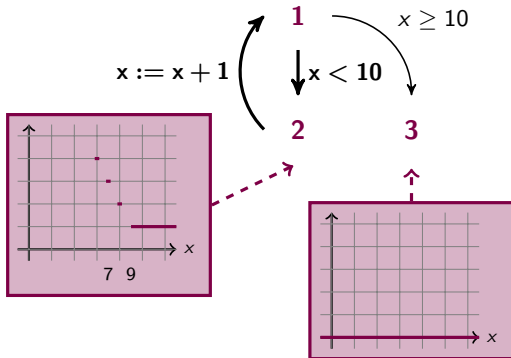
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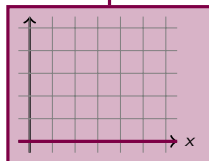
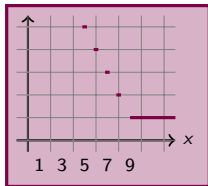
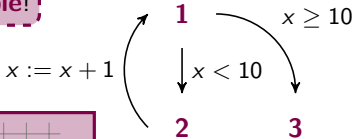
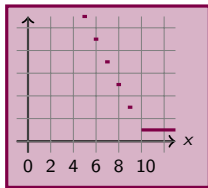
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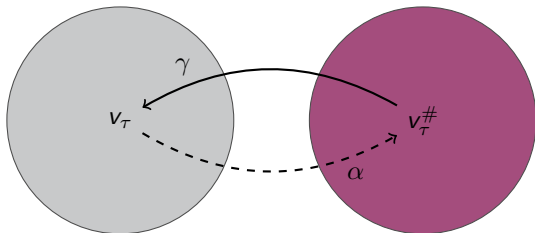
²x := x + 1

od³

v_{τ} is not computable!



An Abstract Domain for Termination



- States Abstract Domain

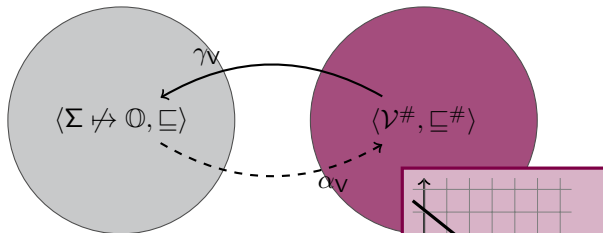
E

- Functions Abstract Domain

P

- Segmented Ranking Functions Abstract Domain

$V(E, P)$



• States Abstract Domain

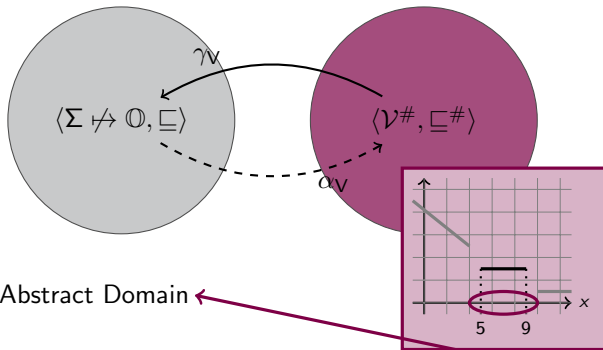
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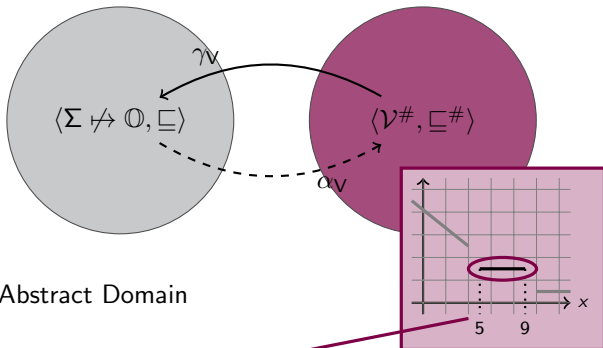
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- States Abstract Domain E
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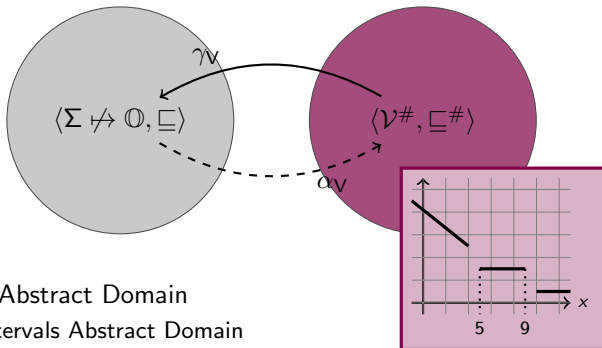
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- Segmented Ranking Functions Abstract Domain

V(E, P)



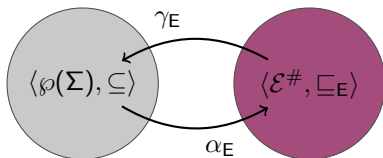
- States Abstract Domain
 - Intervals Abstract Domain
- Functions Abstract Domain
 - Affine Functions Abstract Domain
- Segmented Ranking Functions Abstract Domain
 - Segmented Affine Ranking Functions Abstract Domain

E

P

V(E, P)

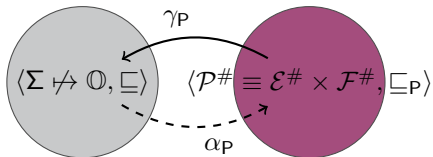
Intervals Abstract Domain³



- $\mathcal{E}^\# \triangleq \{\perp_E\} \cup \{[a, b] \mid a \in \mathbb{I} \cup \{-\infty\}, b \in \mathbb{I} \cup \{+\infty\}\} \quad \mathbb{I} \in \{\mathbb{Z}, \dots\}$
- join: \sqcup_E
- meet: \sqcap_E
- widening: ∇_E
- backward assignments: ASSIGN_E
- tests: FILTER_E

³Cousot&Cousot - *Static Determination of Dynamic Properties of Programs* (1976)

Affine Functions Abstract Domain



- $\mathcal{F}^\# \triangleq \{\perp_F\} \cup \{f^\# \mid f^\# \in \mathbb{I}^n \mapsto \mathbb{N}\} \cup \{T_F\}$
 where $f^\# \equiv y = f(x_1, \dots, x_n) = m_1x_1 + \dots + m_nx_n + q$

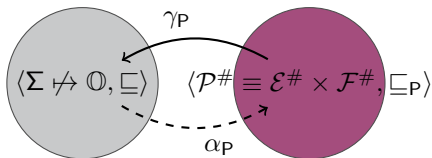
- approximation order:

$$\langle \rho_1^\#, f_1^\# \rangle \sqsubseteq_P \langle \rho_2^\#, f_2^\# \rangle \triangleq \rho_1^\# \supseteq_E \rho_2^\# \wedge f_1^\# \sqsubseteq_F f_2^\#$$

computational order:

$$\langle \rho_1^\#, f_1^\# \rangle \preceq_P \langle \rho_2^\#, f_2^\# \rangle \triangleq \rho_1^\# \sqsubseteq_E \rho_2^\# \wedge f_1^\# \sqsubseteq_F f_2^\#$$

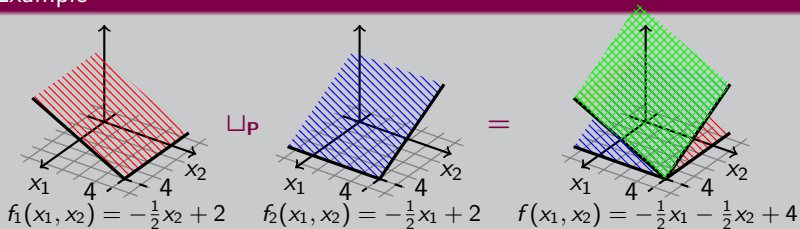
Affine Functions Abstract Domain



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- computational order:
 $\langle \rho_1^\#, f_1^\# \rangle \preceq_P \langle \rho_2^\#, f_2^\# \rangle \triangleq \rho_1^\# \sqsubseteq_E \rho_2^\# \wedge f_1^\# \sqsubseteq_F f_2^\#$

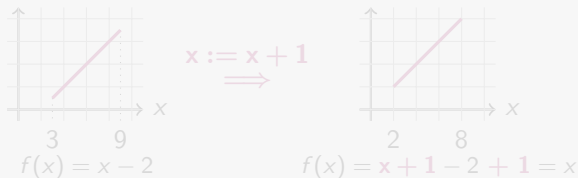
• join: \sqcup_P

Example



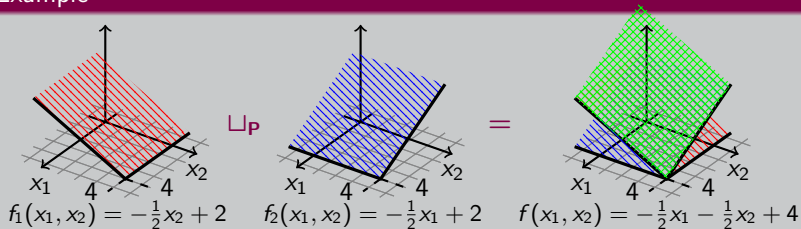
• backward assignments: ASSIGN_P

Example



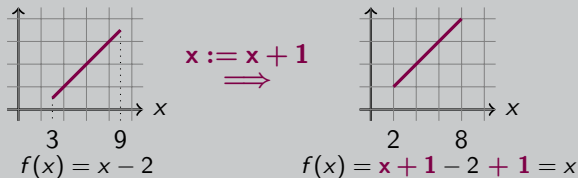
- join: \sqcup_P

Example

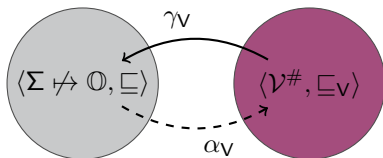


- backward assignments: ASSIGN_P

Example



Segmented Affine Ranking Functions Domain

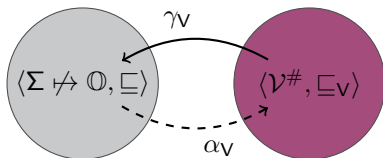


- $\mathcal{V}^\# \triangleq \{(\mathcal{E}^\# \times \mathcal{F}^\#)^k \mid k \geq 0\}$
- segmentation unification

Example

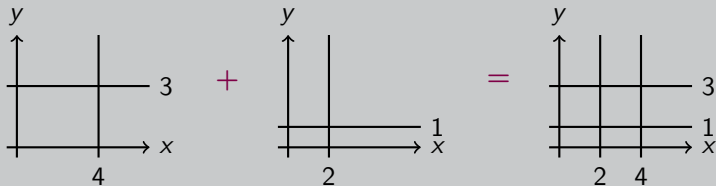


Segmented Affine Ranking Functions Domain



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- segmentation unification

Example



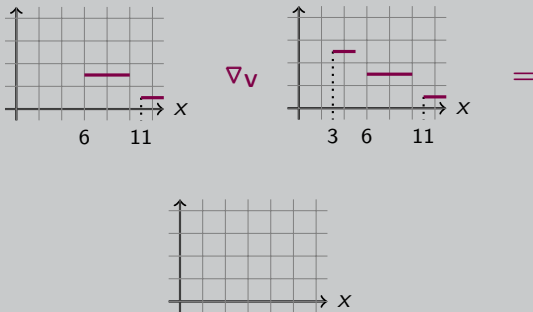
- approximation order: \sqsubseteq_V
computational order: \preceq_V
- join: \sqcup_V
- widening: ∇_V

Example



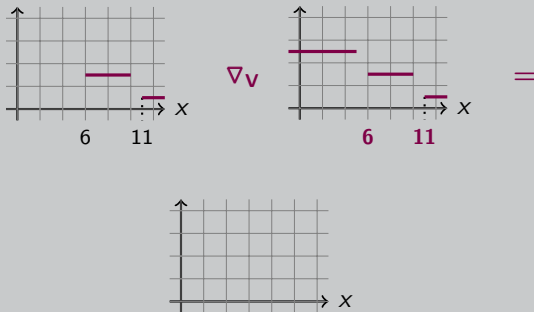
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Example



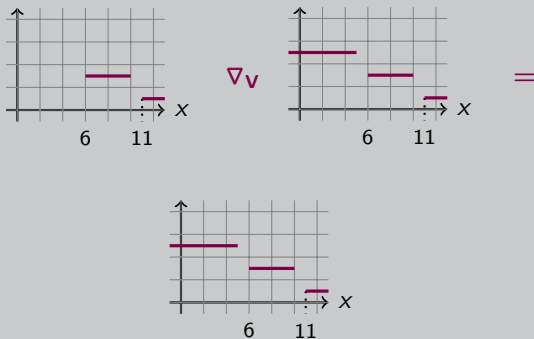
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Example



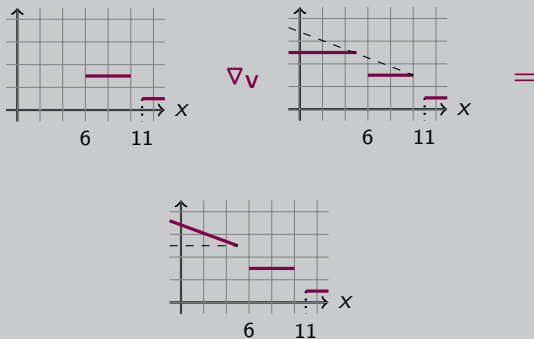
- approximation order: \sqsubseteq_V
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Example



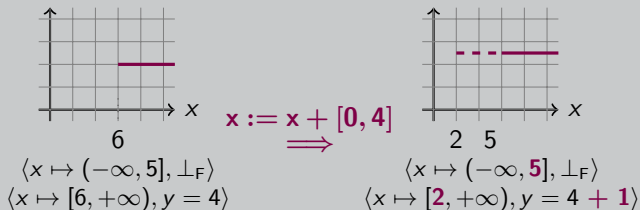
- approximation order: \sqsubseteq_V
computational order: \preceq_V
- join: \sqcup_V
- widening: ∇_V

Example



- backward assignments: ASSIGN_V

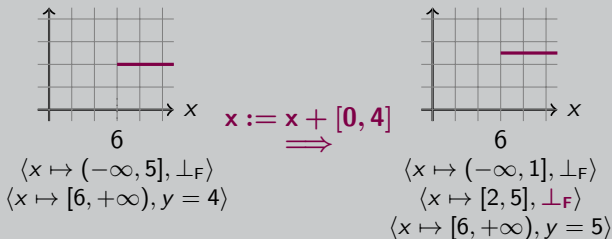
Example



- tests: FILTER_V

- backward assignments: ASSIGN_V

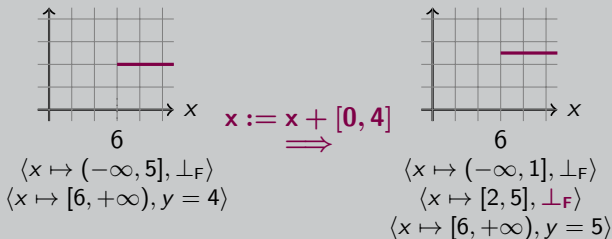
Example



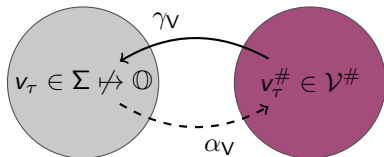
- tests: FILTER_V

- backward assignments: ASSIGN_V

Example



- tests: FILTER_V



$$\mathcal{S}^\#[\text{statement}] \in \mathcal{V}_{\text{POST}}^\# \mapsto \mathcal{V}_{\text{PRE}}^\#$$

$$\mathcal{S}^\#[x := A]_v \triangleq \text{ASSIGN}_V(x := A, v)$$

$$\mathcal{S}^\#[\text{if } B \text{ then } S_1 \text{ else } S_2 \text{ fi}]_v \triangleq$$

$$\text{FILTER}_V(B, \mathcal{S}^\#[S_1]_v) \gamma_V \text{FILTER}_V(\neg B, \mathcal{S}^\#[S_2]_v)$$

$$\mathcal{S}^\#[\text{while } B \text{ do } S \text{ od}]_v \triangleq \text{lfp}_{\perp_V}^{\preceq_V} \phi^\#$$

$$\text{where } \phi^\# \triangleq \lambda x. \text{FILTER}_V(\neg B, v) \gamma_V \text{FILTER}_V(B, \mathcal{S}^\#[S]_x)$$

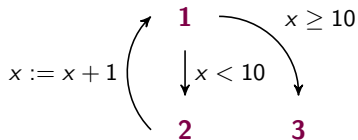
$$\mathcal{S}^\#[S_1 ; S_2]_v \triangleq \mathcal{S}^\#[S_1]_v(\mathcal{S}^\#[S_2]_v)$$

Theorem (Soundness)

$v_T^\#$ is **sound** to prove the termination of programs

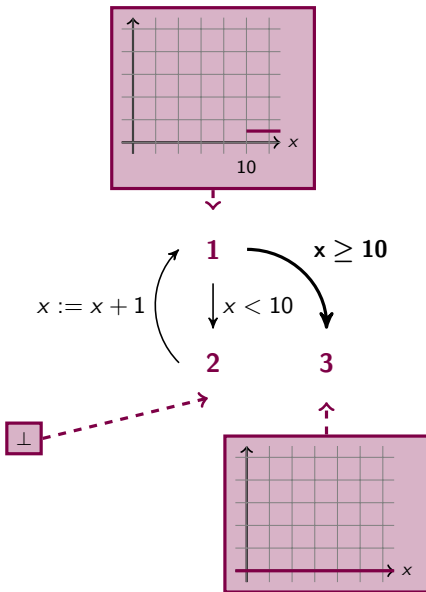
Example

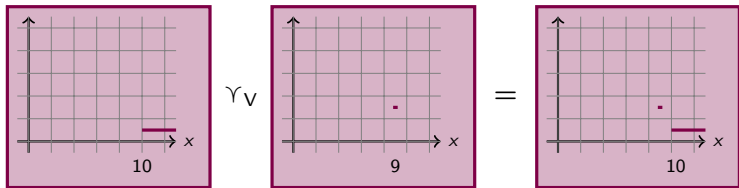
```
int : x  
while 1(x < 10) do  
  2x := x + 1  
od3
```



Example

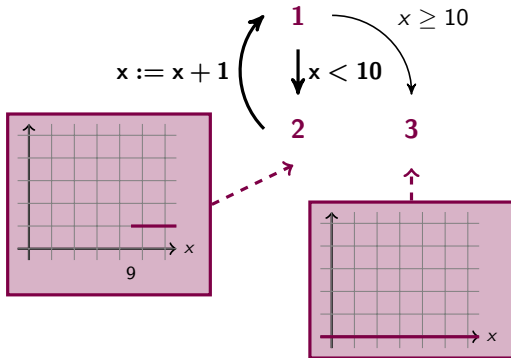
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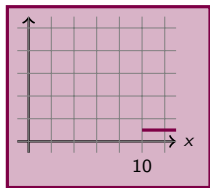




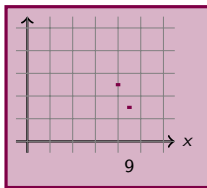
Example

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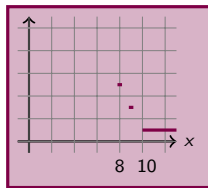




Υ_V



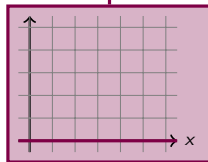
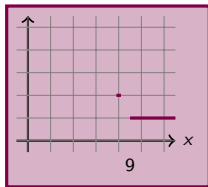
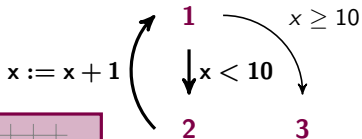
=

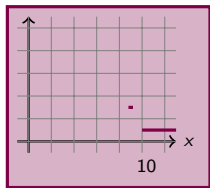


↓

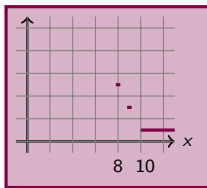
Example

```
int : x
while 1(x < 10) do
  2x := x + 1
od 3
```

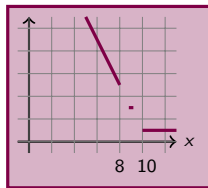




∇_V



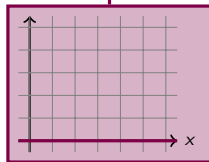
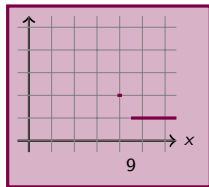
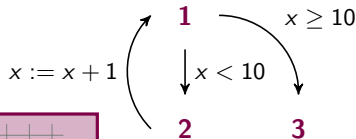
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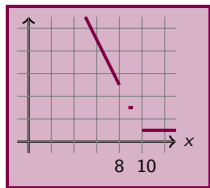


↓

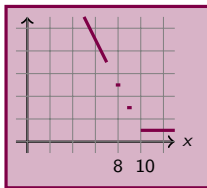
Example

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od3
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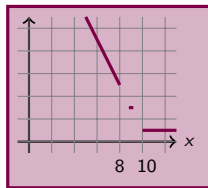




∇_V



=



↓

Example

int : x

while ¹(x < 10) do

²x := x + 1

od ³

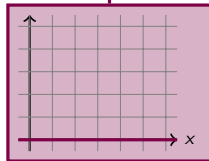
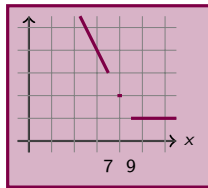
x := x + 1

¹ $x \geq 10$

↓ $x < 10$

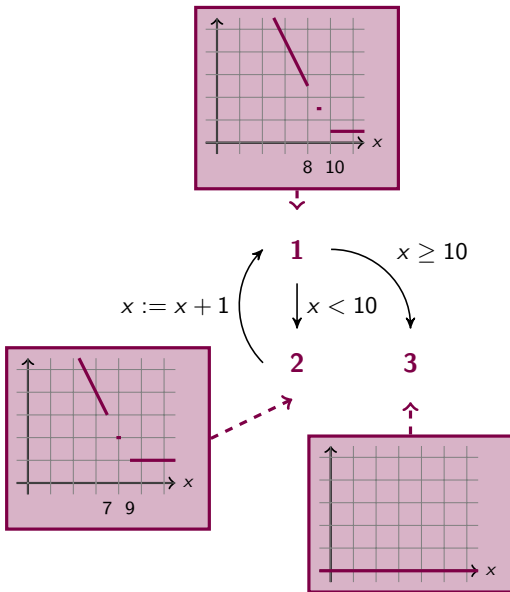
²

³



Example

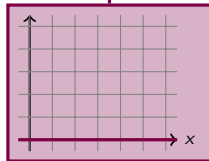
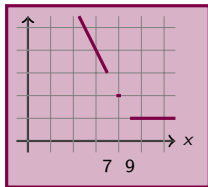
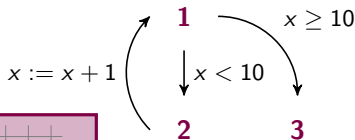
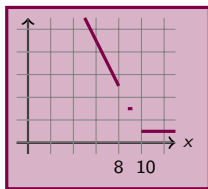
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Alias&Darte&Feautrier&Gonnord -
*Multi-Dimensional Rankings, Program
Termination, and Complexity Bounds
of Flowchart Programs* (SAS 2010)

Example

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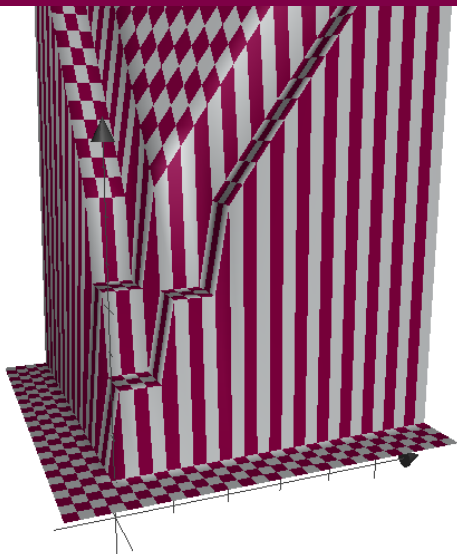


Berdine&al. - *Variance Analyses
from Invariance Analyses* (POPL 2007)

Simple Loops

Example

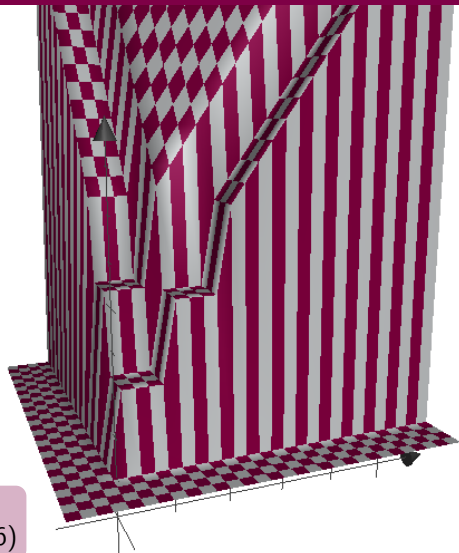
```
int :  $x_1, x_2$   
while 1 $(x_1 \geq 0 \wedge x_2 \geq 0)$  do  
  if 2 $(?)$  then  
    3 $x_1 := x_1 - 1$   
  else  
    4 $x_2 := x_2 - 1$   
  fi  
od5
```



Simple Loops

Example

```
int :  $x_1, x_2$   
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Cook&Podelski&Rybalchenko -
Terminator: Beyond Safety (CAV 2006)

Sufficient Preconditions for Termination

Example

```
int : x  
while 1(x < 10) do  
  2x := 2 * x  
od3
```

$$f(x) = \begin{cases} 3 & 5 \leq x \leq 9 \\ 1 & 10 \leq x \end{cases}$$

$$f(x) = \begin{cases} 9 & x = 1 \\ 7 & x = 2 \\ 5 & 3 \leq x \leq 4 \\ 3 & 5 \leq x \leq 9 \\ 1 & 10 \leq x \end{cases}$$

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`http://www.di.ens.fr/~urban/Function.html`

- written in OCaml
- implemented on top of Apron⁴
- forward reachability analysis to improve precision

Example

```
int : x1, x2  
1x2 := 1  
while 2(x1 < 10) do  
  3x1 := x1 + x2  
od4
```

⁴`http://apron.cri.enscm.fr/library/`

<http://www.di.ens.fr/~urban/Function.html>

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Conclusions

- **family of** parameterized **abstract domains** for program termination
 - piecewise-defined ranking functions
 - backward invariance analysis
- instance based on **intervals** and **affine functions**
 - segmentation overcomes non-existence of linear ranking functions
 - analysis not limited to simple loops
 - sufficient conditions for termination

Future Work

- **more abstract domains** (e.g. non-linear functions)
- other liveness properties
- cost analysis
- non-termination

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Questions?

“... the purpose of abstraction is not to be vague, but to create a new semantic level in which one can be absolutely precise.”
(Edsger Dijkstra)