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Principles and Applications of Abstract Interpretation

Abstract Interpretation Primer



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A gentle introduction...

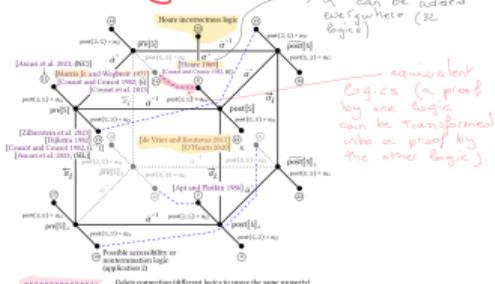
Assertional Post condition Transformer

- $\text{post}[S] = \Delta P. \{ \sigma' \mid \exists \sigma \in P. \langle \sigma, \sigma' \rangle \in S \}$
- Preserves joins $\text{Post}[S] \cup P_i \leftarrow \cup_i \text{Post}[S] P_i$
- Isomorphism

$$\begin{aligned} T &= \text{post}[R] \\ \Leftrightarrow R &= \{ \langle \sigma, \sigma' \rangle \mid \sigma' \in T(\{\sigma\}) \} \\ &\stackrel{?}{=} \text{post}^{-1}(T) \end{aligned}$$
- $\langle G(\Sigma \times \Sigma_1), \subseteq \rangle \xleftrightarrow[\text{post}]{\text{post}^{-1}} \langle G(\Sigma) \rightarrow G(\Sigma_1), \subseteq \rangle$



The subhierarchy of assertional logics



Iteration **symbolic rules** **Aczel semantics of the rules**

$$\sigma \vdash W \stackrel{i}{\Rightarrow} \sigma$$

e.g. $\frac{\emptyset}{\langle \sigma, \sigma \rangle} \quad \forall \Sigma \text{ axioms}$

$B[[B]]\sigma, \quad \sigma \vdash S \stackrel{f}{\Rightarrow} \sigma', \quad \sigma' \vdash W \stackrel{i}{\Rightarrow} \sigma''$

i.e. $\frac{\langle \sigma, \sigma'' \rangle}{\langle \sigma, \sigma' \rangle} \quad \text{if } \langle \sigma, \sigma' \rangle \in [[S]]^e$

$\sigma \vdash W \stackrel{i}{\Rightarrow} \sigma''$ structured induction!

Consequence operator

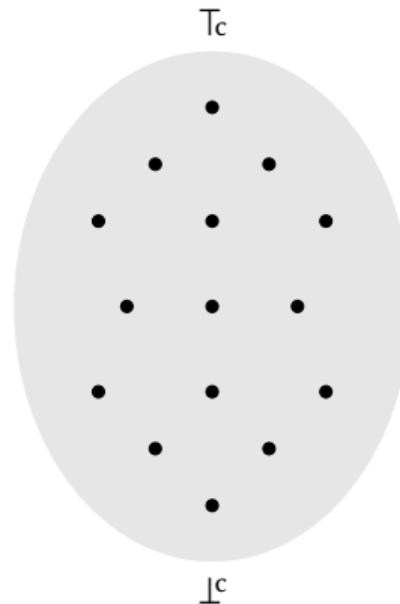
$$\begin{aligned} F^e(X) &= \{ \langle \sigma, \sigma \rangle \mid \sigma \in \Sigma \} \cup \{ \langle \sigma, \sigma' \rangle \mid B[[B]]\sigma \wedge \langle \sigma, \sigma' \rangle \in [[S]]^e \wedge \langle \sigma', \sigma'' \rangle \in X \} \\ &\simeq \text{id} \cup (B[[B]] \circ [[S]]^e \circ (X \setminus \Sigma \times \{\perp\})), \end{aligned}$$

defined $\text{op}^e \subseteq F^e = (B[[B]] \circ [[S]]^e)^*$

this is the termination case.

The Abstraction Process

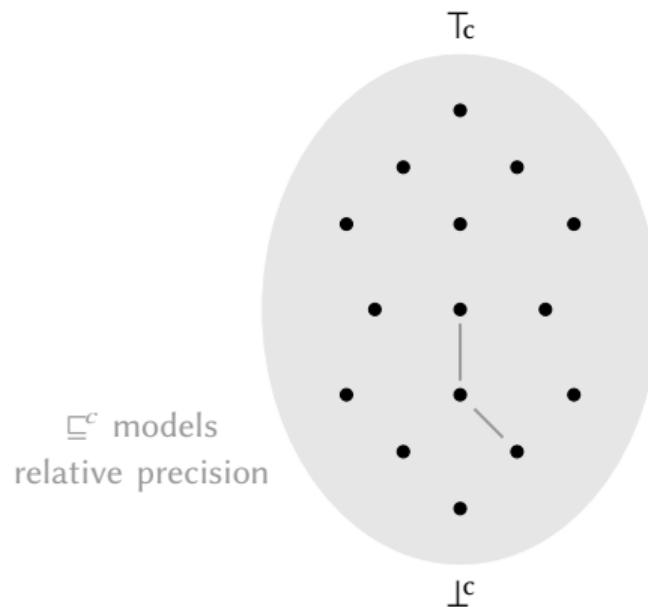
Concrete domain

 $\langle C, \sqsubseteq^c \rangle$ 

What is abstraction? (formally)

Concrete domain

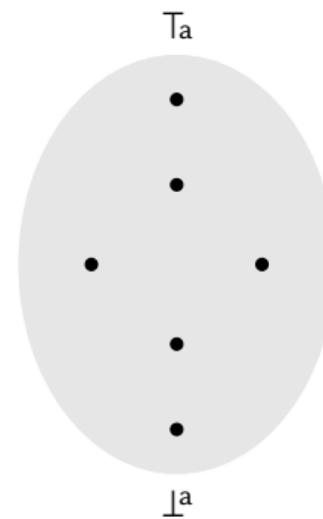
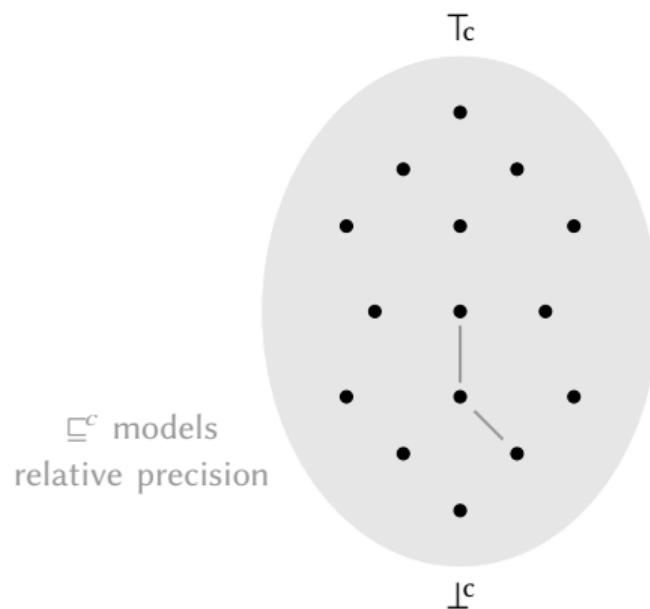
$\langle C, \sqsubseteq^c \rangle$



Concrete domain

 $\langle C, \sqsubseteq^c \rangle$ $\langle A, \sqsubseteq^a \rangle$

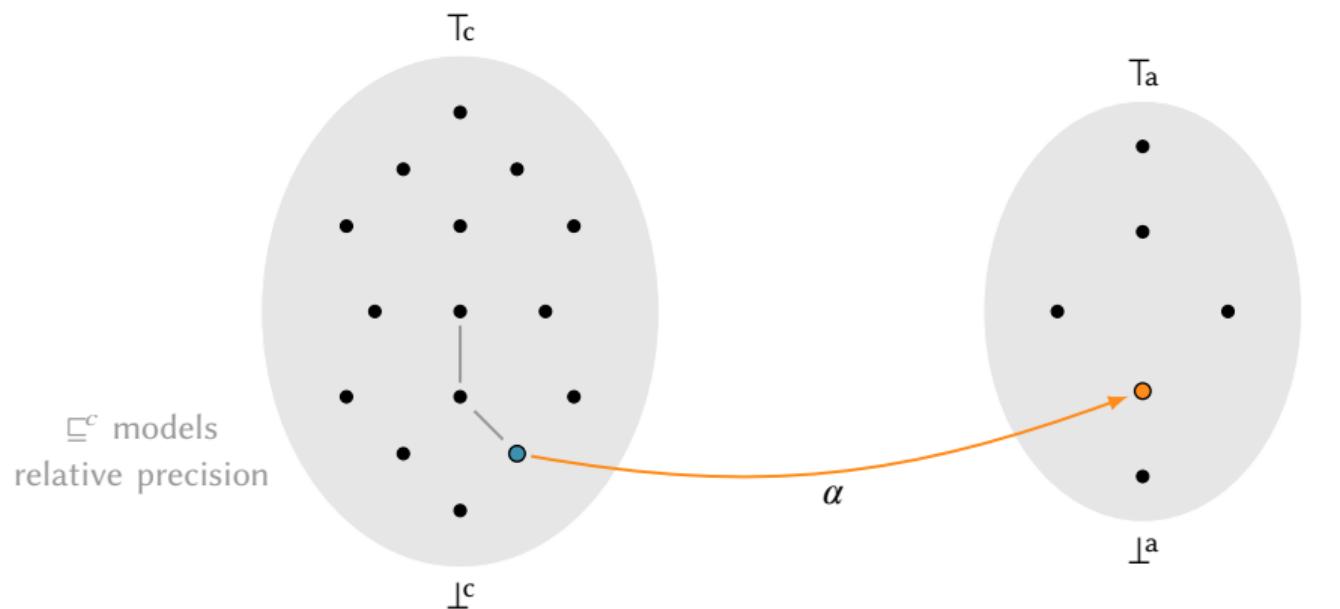
Abstract domain



Concrete domain

 $\langle C, \sqsubseteq^c \rangle$ $\langle A, \sqsubseteq^a \rangle$

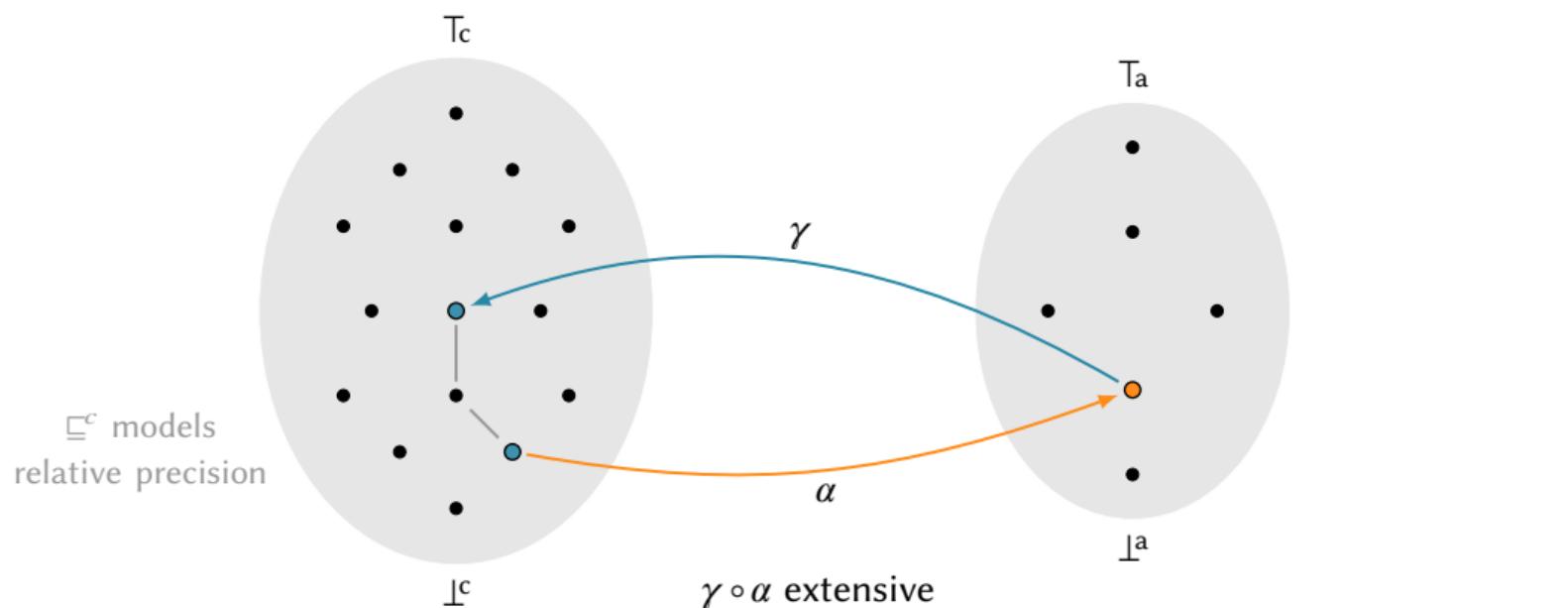
Abstract domain



Concrete domain

 $\langle C, \sqsubseteq^c \rangle$ $\langle A, \sqsubseteq^a \rangle$

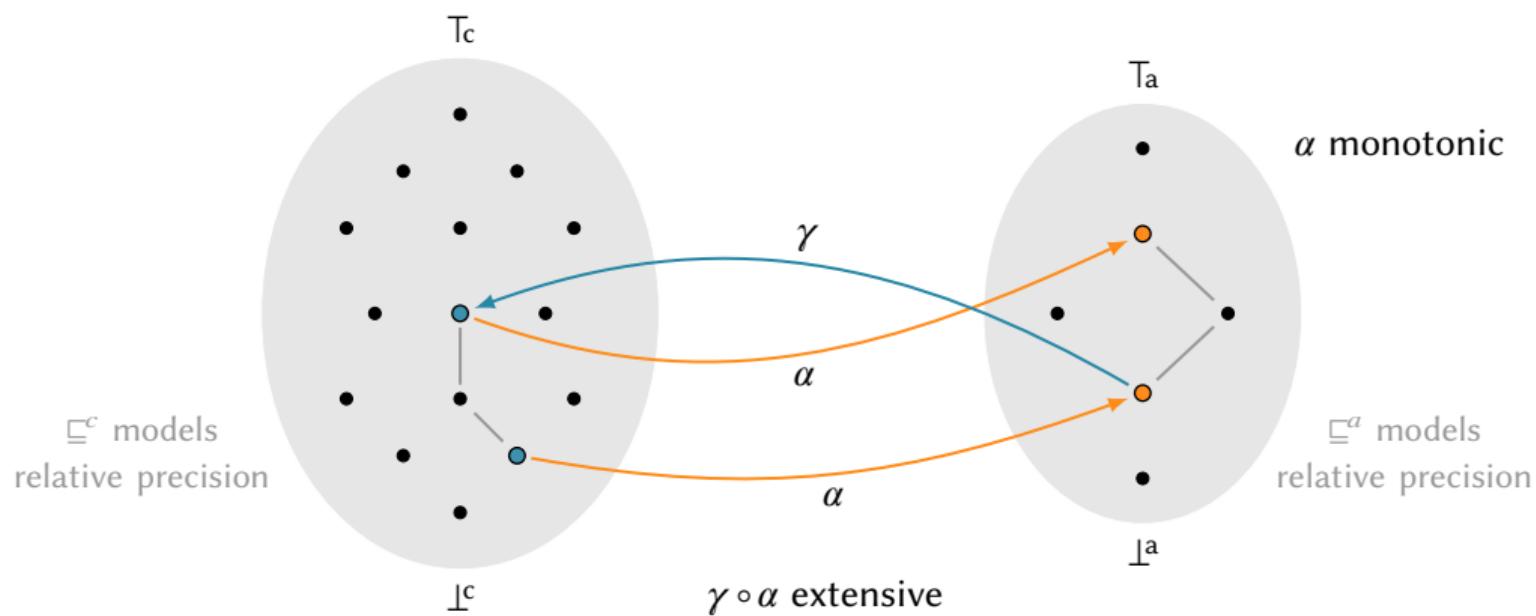
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Concrete domain

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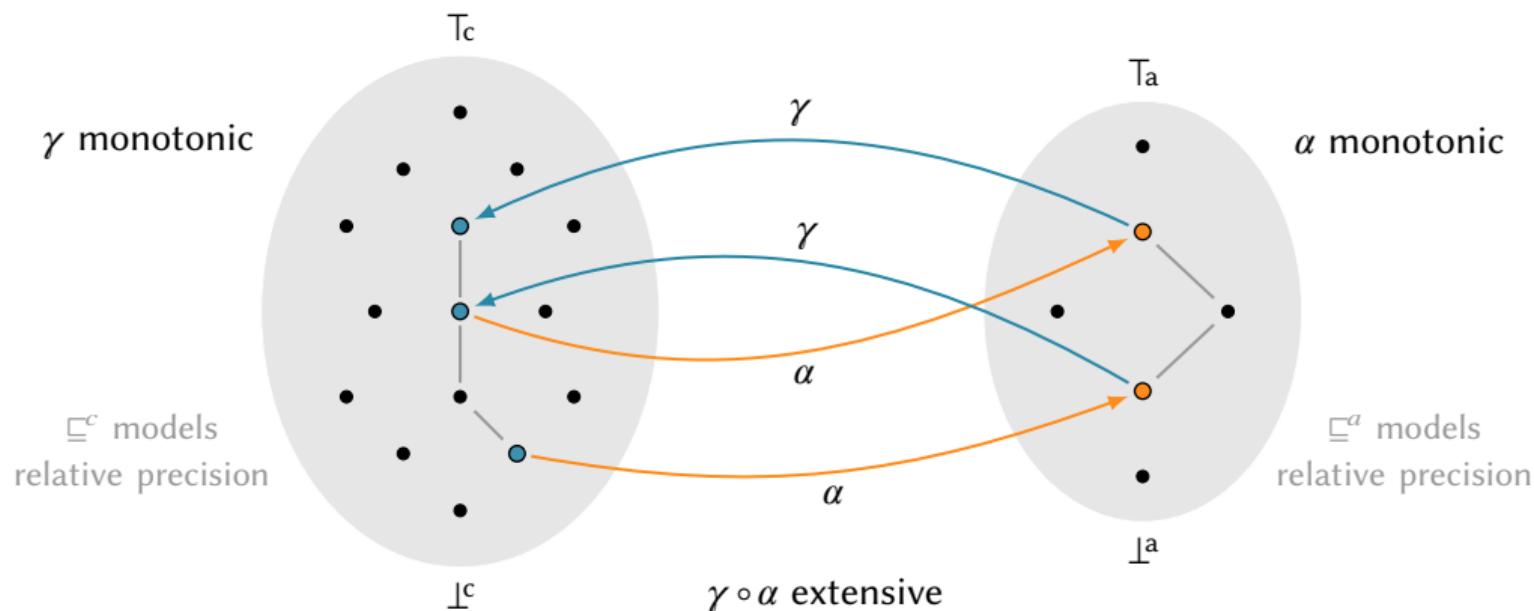
Abstract domain



Concrete domain

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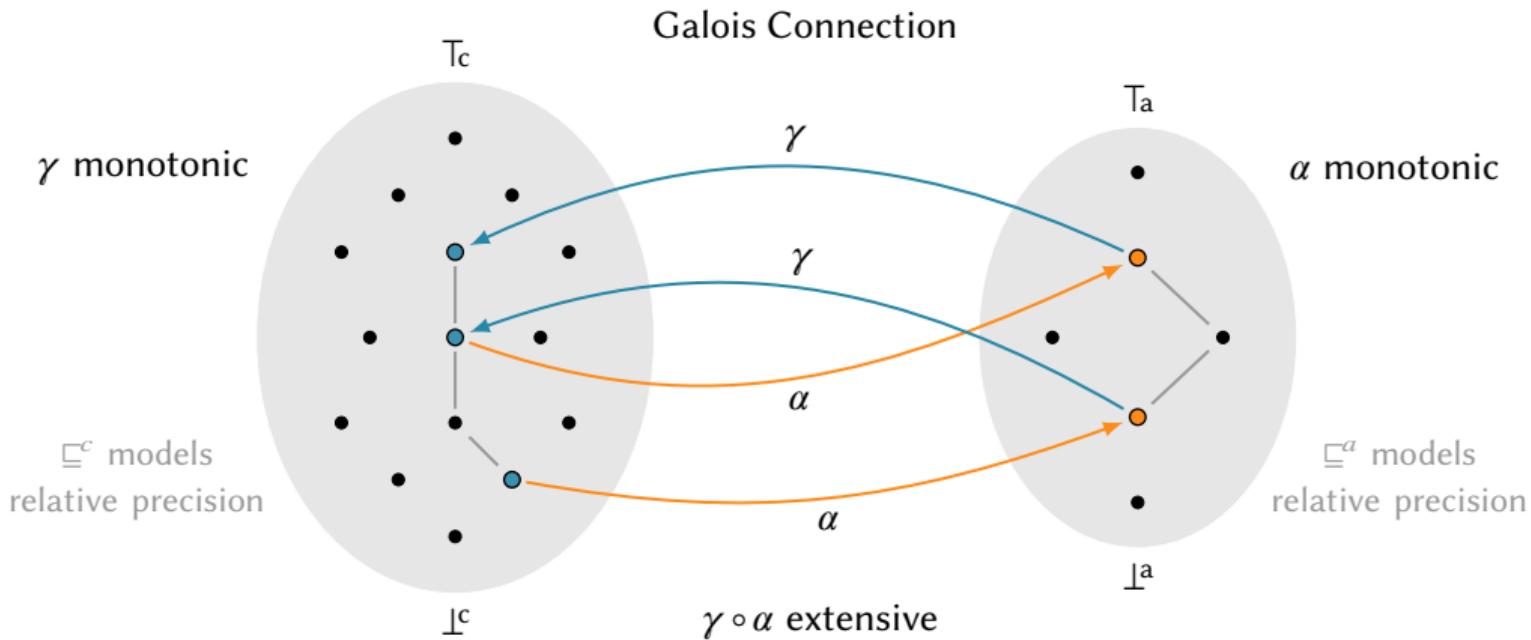
Abstract domain



Concrete domain

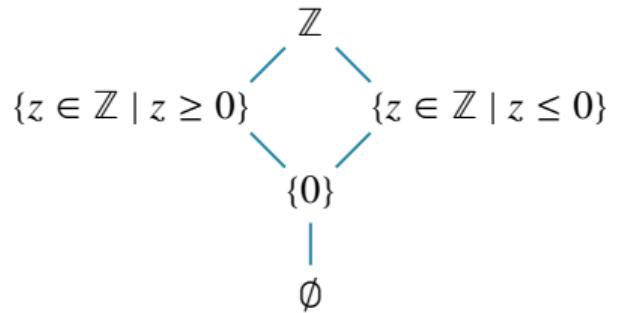
$$\langle C, \sqsubseteq^c \rangle \xrightleftharpoons[\alpha]{\gamma} \langle A, \sqsubseteq^a \rangle$$

Abstract domain

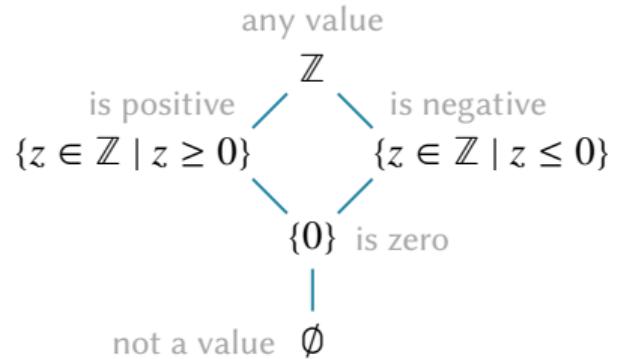


Isolate the subsets of integers \mathbb{Z} we are interested in

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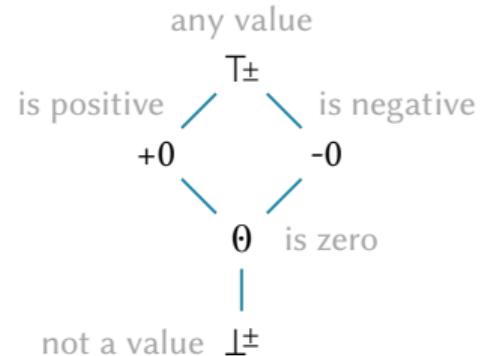


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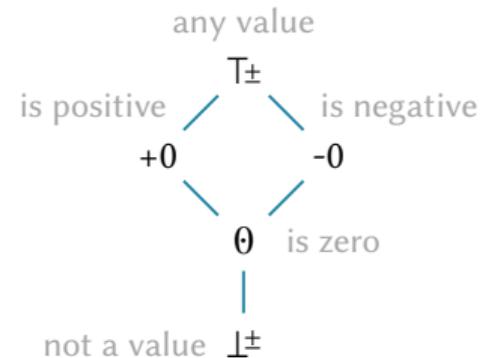
Encode subsets into a machine-representable domain \mathbb{Z}^\pm



Isolate the subsets of integers \mathbb{Z} we are interested in

Encode subsets into a machine-representable domain \mathbb{Z}^\pm

Define an **abstraction** (encoding) function $\alpha : \wp(\mathbb{Z}) \rightarrow \mathbb{Z}^\pm$

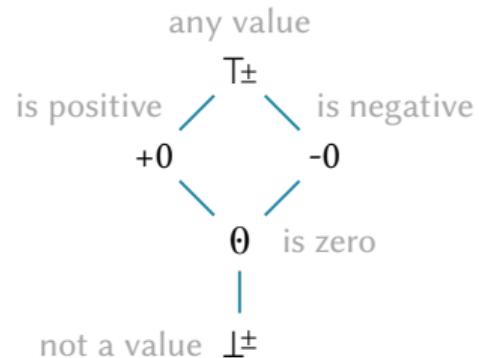


$$\alpha(X) \triangleq \begin{cases} \perp^\pm & \text{if } X = \emptyset \\ 0 & \text{if } X = \{0\} \\ +0 & \text{if } X \subseteq \{z \in \mathbb{Z} \mid z \geq 0\} \wedge X \neq \emptyset \\ -0 & \text{if } X \subseteq \{z \in \mathbb{Z} \mid z \leq 0\} \wedge X \neq \emptyset \\ T^\pm & \text{otherwise} \end{cases}$$

Isolate the subsets of integers \mathbb{Z} we are interested in

Encode subsets into a machine-representable domain \mathbb{Z}^\pm

Define a **concretization** (decoding) function $\gamma : \mathbb{Z}^\pm \rightarrow \wp(\mathbb{Z})$

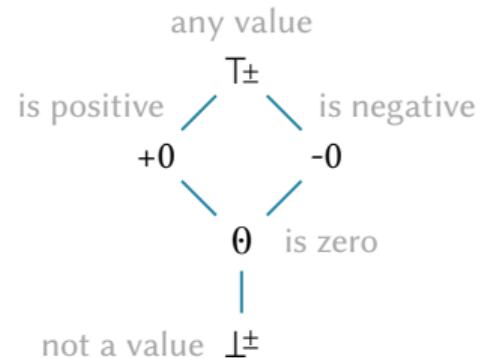


$$\gamma(z^\pm) \triangleq \begin{cases} \emptyset & \text{if } z^\pm = \perp^\pm \\ \{0\} & \text{if } z^\pm = \theta \\ \{z \in \mathbb{Z} \mid z \geq 0\} & \text{if } z^\pm = +0 \\ \{z \in \mathbb{Z} \mid z \leq 0\} & \text{if } z^\pm = -0 \\ \mathbb{Z} & \text{if } z^\pm = T\pm \end{cases}$$

Isolate the subsets of integers \mathbb{Z} we are interested in

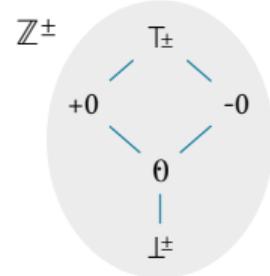
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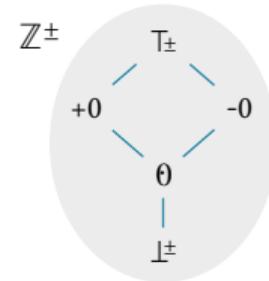


$$\gamma(z^\pm) \triangleq \begin{cases} \emptyset & \text{if } z^\pm = \perp^\pm \\ \{0\} & \text{if } z^\pm = 0 \\ \{z \in \mathbb{Z} \mid z \geq 0\} & \text{if } z^\pm = +0 \\ \{z \in \mathbb{Z} \mid z \leq 0\} & \text{if } z^\pm = -0 \\ \mathbb{Z} & \text{if } z^\pm = T\pm \end{cases}$$

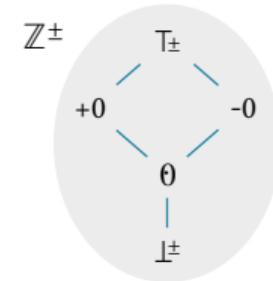
$$\begin{aligned} \text{Extensivity: } & \{1, 4, 7\} \subseteq \gamma(+0) \\ & \subseteq \gamma(0) \\ & \subseteq \{z \in \mathbb{Z} \mid z \geq 0\} \end{aligned}$$



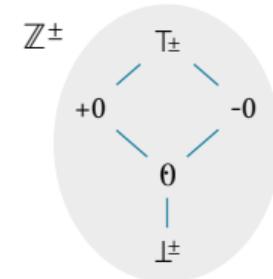
$\times^\#$	\perp^\pm	θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	θ	θ	θ
$+0$	\perp^\pm	θ	$+0$	-0	$T\pm$
-0	\perp^\pm	θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	θ	$T\pm$	$T\pm$	$T\pm$


 1×2

$\times^\#$	\perp^\pm	θ	$+0$	-0	\top^\pm
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	θ	θ	θ
$+0$	\perp^\pm	θ	$+0$	-0	\top^\pm
-0	\perp^\pm	θ	-0	$+0$	\top^\pm
\top^\pm	\perp^\pm	θ	\top^\pm	\top^\pm	\top^\pm

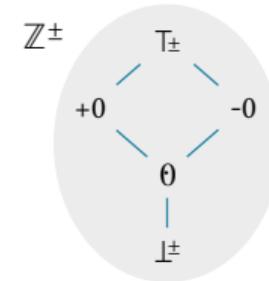
 1×2 $\alpha(1) \times^\# \alpha(2)$

$\times^\#$	\perp^\pm	θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	θ	θ	θ
$+0$	\perp^\pm	θ	$+0$	-0	$T\pm$
-0	\perp^\pm	θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	θ	$T\pm$	$T\pm$	$T\pm$

 1×2

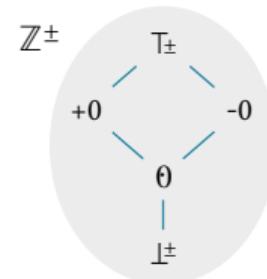
$$\alpha(1) \times^\# \alpha(2) = +0 \times^\# +0$$

$\times^\#$	\perp^\pm	θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	θ	θ	θ
$+0$	\perp^\pm	θ	$+0$	-0	$T\pm$
-0	\perp^\pm	θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	θ	$T\pm$	$T\pm$	$T\pm$



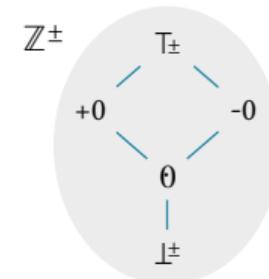
$$1 \times 2 \quad +0 = \alpha(1) \times^\# \alpha(2) = +0 \times^\# +0$$

$\times^\#$	\perp^\pm	θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	θ	θ	θ
$+0$	\perp^\pm	θ	$+0$	-0	$T\pm$
-0	\perp^\pm	θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	θ	$T\pm$	$T\pm$	$T\pm$



$$\alpha(1 \times 2) = +0 = \alpha(1) \times^\# \alpha(2) = +0 \times^\# +0$$

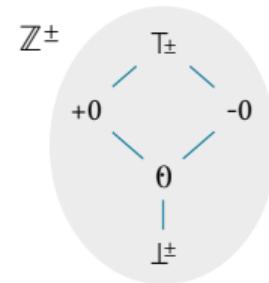
$\times^\#$	\perp^\pm	θ	$+0$	-0	\top^\pm
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	θ	θ	θ
$+0$	\perp^\pm	θ	$+0$	-0	\top^\pm
-0	\perp^\pm	θ	-0	$+0$	\top^\pm
\top^\pm	\perp^\pm	θ	\top^\pm	\top^\pm	\top^\pm



$$\alpha(1 \times 2) = +0 = \alpha(1) \times^\# \alpha(2) = +0 \times^\# +0$$

$$\alpha(-1 \times 0) = \theta = \alpha(-1) \times^\# \alpha(0) = -0 \times^\# \theta$$

$\times^\#$	\perp^\pm	θ	$+0$	-0	\top^\pm
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	θ	θ	θ
$+0$	\perp^\pm	θ	$+0$	-0	\top^\pm
-0	\perp^\pm	θ	-0	$+0$	\top^\pm
\top^\pm	\perp^\pm	θ	\top^\pm	\top^\pm	\top^\pm



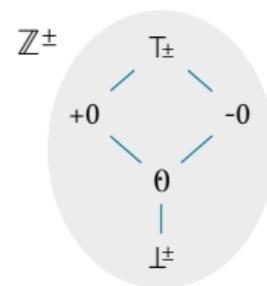
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$$\alpha(-1 \times 2) = -0 = \alpha(-1) \times^\# \alpha(2) = -0 \times^\# +0$$

$\times^\#$	\perp^\pm	θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	θ	θ	θ
$+0$	\perp^\pm	θ	$+0$	-0	$T\pm$
-0	\perp^\pm	θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	θ	$T\pm$	$T\pm$	$T\pm$

$+\#$	\perp^\pm	θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	$+0$	-0	$T\pm$
$+0$	\perp^\pm	$+0$	$+0$	$T\pm$	$T\pm$
-0	\perp^\pm	-0	$T\pm$	-0	$T\pm$
$T\pm$	\perp^\pm	θ	$T\pm$	$T\pm$	$T\pm$



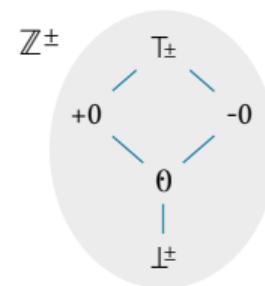
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$\times^\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	Θ	Θ	Θ
$+0$	\perp^\pm	Θ	$+0$	-0	$T\pm$
-0	\perp^\pm	Θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$

$+\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	$+0$	-0	$T\pm$
$+0$	\perp^\pm	$+0$	$+0$	$T\pm$	$T\pm$
-0	\perp^\pm	-0	$T\pm$	-0	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$



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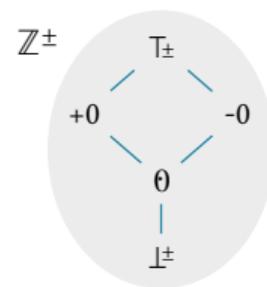
$$\alpha(1 + 2) = +0 = \alpha(1) +^\# \alpha(2) = +0 +^\# +0$$

$$\alpha(-1 \times 0) = \Theta = \alpha(-1) \times^\# \alpha(0) = -0 \times^\# \Theta$$

$$\alpha(-1 \times 2) = -0 = \alpha(-1) \times^\# \alpha(2) = -0 \times^\# +0$$

$\times^\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	Θ	Θ	Θ
$+0$	\perp^\pm	Θ	$+0$	-0	$T\pm$
-0	\perp^\pm	Θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$

$+\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	$+0$	-0	$T\pm$
$+0$	\perp^\pm	$+0$	$+0$	$T\pm$	$T\pm$
-0	\perp^\pm	-0	$T\pm$	-0	$T\pm$
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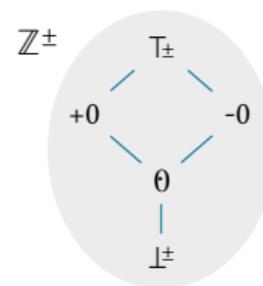
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$\times^\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	Θ	Θ	Θ
$+0$	\perp^\pm	Θ	$+0$	-0	$T\pm$
-0	\perp^\pm	Θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$

$+\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	$+0$	-0	$T\pm$
$+0$	\perp^\pm	$+0$	$+0$	$T\pm$	$T\pm$
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$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$



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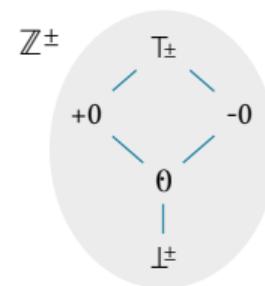
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$$\alpha(-1 + 0) = -0 = \alpha(-1) +^\# \alpha(0) = -0 +^\# \Theta$$

$$-1 + 2$$

$\times^\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	Θ	Θ	Θ
$+0$	\perp^\pm	Θ	$+0$	-0	$T\pm$
-0	\perp^\pm	Θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$

$+\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	$+0$	-0	$T\pm$
$+0$	\perp^\pm	$+0$	$+0$	$T\pm$	$T\pm$
-0	\perp^\pm	-0	$T\pm$	-0	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$



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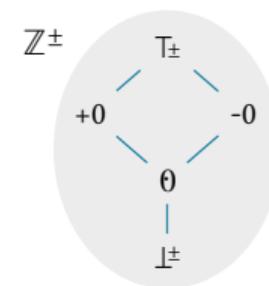
$$\alpha(1 + 2) = +0 = \alpha(1) +^\# \alpha(2) = +0 +^\# +0$$

$$\alpha(-1 + 0) = -0 = \alpha(-1) +^\# \alpha(0) = -0 +^\# \Theta$$

$$-1 + 2 \qquad \qquad \alpha(-1) +^\# \alpha(2)$$

$\times^\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	Θ	Θ	Θ
$+0$	\perp^\pm	Θ	$+0$	-0	$T\pm$
-0	\perp^\pm	Θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$

$+\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	$+0$	-0	$T\pm$
$+0$	\perp^\pm	$+0$	$+0$	$T\pm$	$T\pm$
-0	\perp^\pm	-0	$T\pm$	-0	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$



$$\alpha(1 \times 2) = +0 = \alpha(1) \times^\# \alpha(2) = +0 \times^\# +0$$

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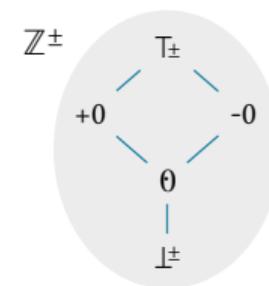
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$\times^\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	Θ	Θ	Θ
$+0$	\perp^\pm	Θ	$+0$	-0	$T\pm$
-0	\perp^\pm	Θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$

$+\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	$+0$	-0	$T\pm$
$+0$	\perp^\pm	$+0$	$+0$	$T\pm$	$T\pm$
-0	\perp^\pm	-0	$T\pm$	-0	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$



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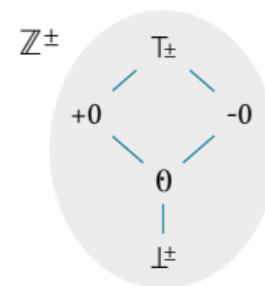
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$$-1 + 2 = T\pm = \alpha(-1) +^\# \alpha(2) = -0 +^\# +0$$

$\times^\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	Θ	Θ	Θ
$+0$	\perp^\pm	Θ	$+0$	-0	$T\pm$
-0	\perp^\pm	Θ	-0	$+0$	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$

$+\#$	\perp^\pm	Θ	$+0$	-0	$T\pm$
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
Θ	\perp^\pm	Θ	$+0$	-0	$T\pm$
$+0$	\perp^\pm	$+0$	$+0$	$T\pm$	$T\pm$
-0	\perp^\pm	-0	$T\pm$	-0	$T\pm$
$T\pm$	\perp^\pm	Θ	$T\pm$	$T\pm$	$T\pm$



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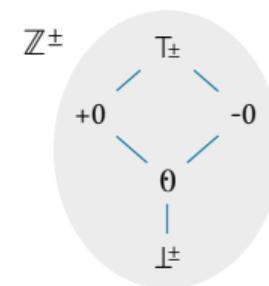
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$$\alpha(-1 + 2) \neq T\pm = \alpha(-1) +^\# \alpha(2) = -0 +^\# +0$$

$\times^\#$	\perp^\pm	θ	$+0$	-0	\top^\pm
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	θ	θ	θ
$+0$	\perp^\pm	θ	$+0$	-0	\top^\pm
-0	\perp^\pm	θ	-0	$+0$	\top^\pm
\top^\pm	\perp^\pm	θ	\top^\pm	\top^\pm	\top^\pm

$+\#$	\perp^\pm	θ	$+0$	-0	\top^\pm
\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm	\perp^\pm
θ	\perp^\pm	θ	$+0$	-0	\top^\pm
$+0$	\perp^\pm	$+0$	$+0$	\top^\pm	\top^\pm
-0	\perp^\pm	-0	\top^\pm	-0	\top^\pm
\top^\pm	\perp^\pm	θ	\top^\pm	\top^\pm	\top^\pm



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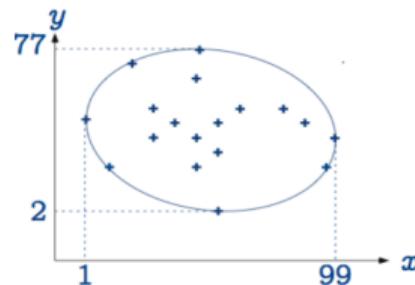
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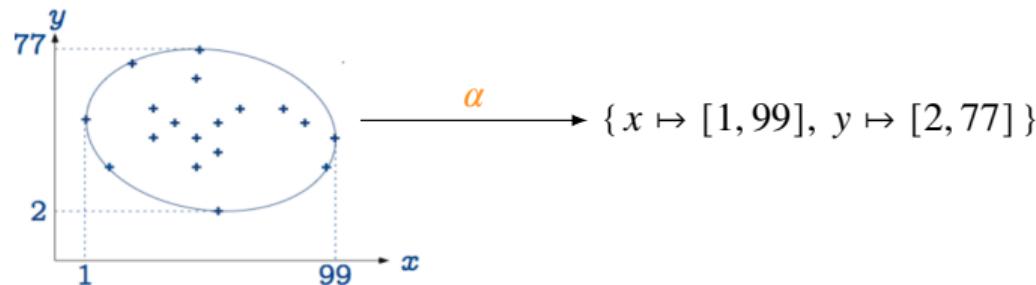
$$\alpha(-1 + 2) \neq \top^\pm = \alpha(-1) +^\# \alpha(2) = -0 +^\# +0$$

Abstract operations may lose precision during computation!

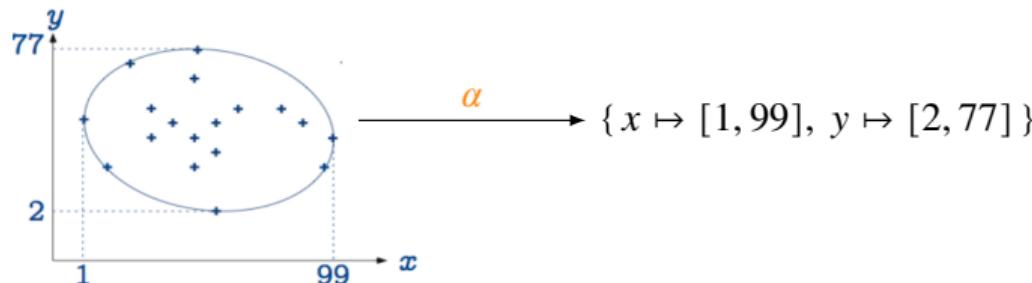
Encode a set of points in \mathbb{R}^2 into an (integer) interval



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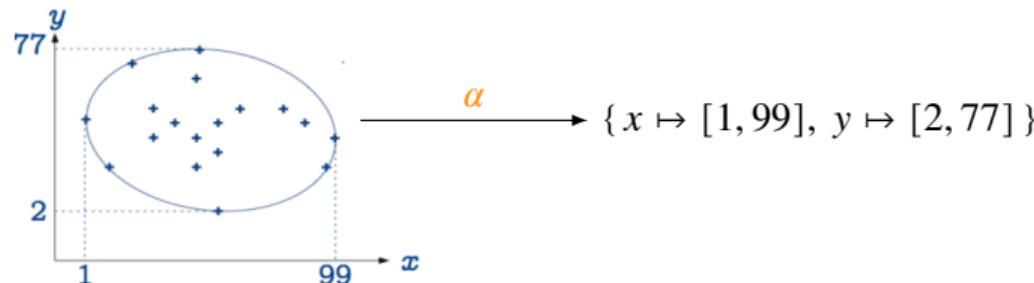
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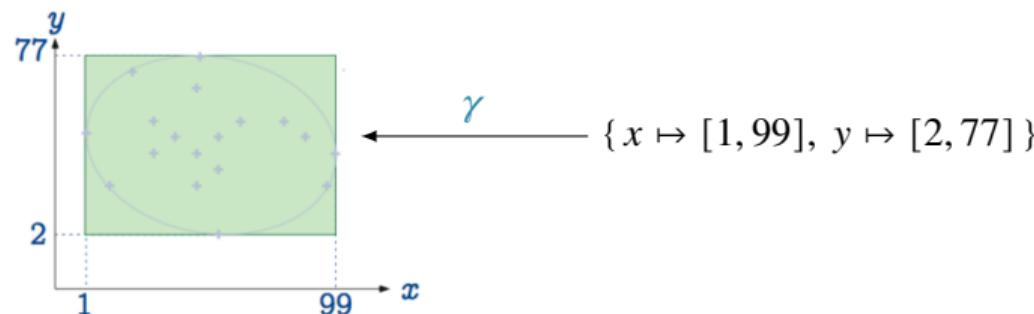
Decode an (integer) interval into a set of points in \mathbb{R}^2

$$\{x \mapsto [1, 99], y \mapsto [2, 77]\}$$

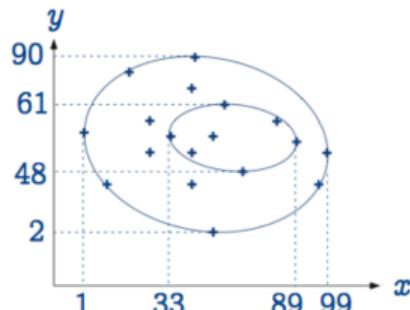
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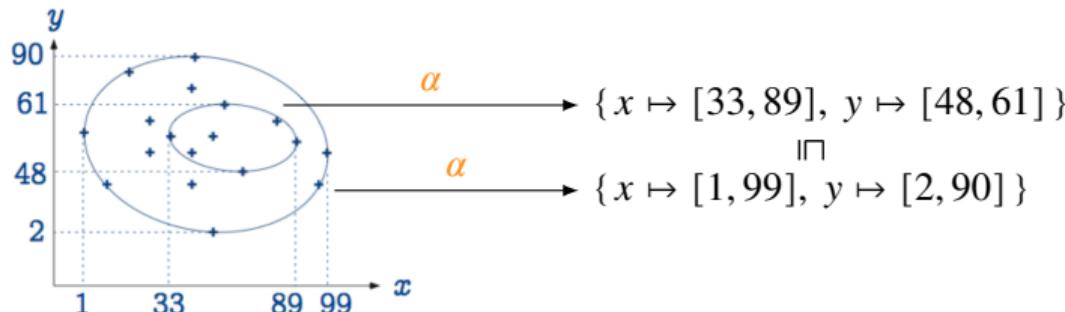
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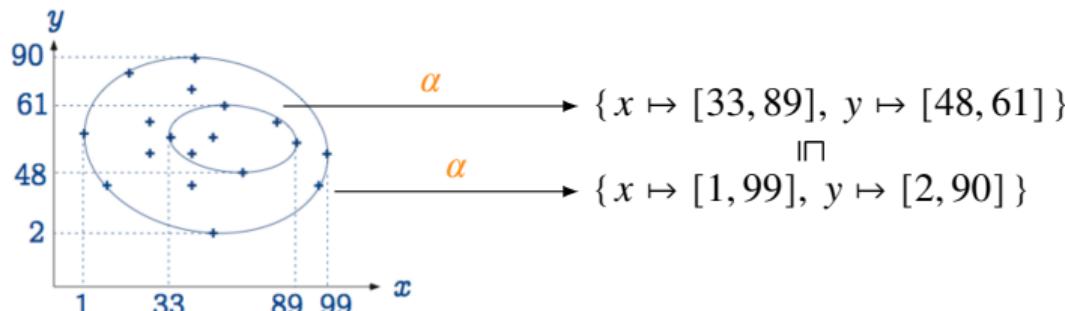
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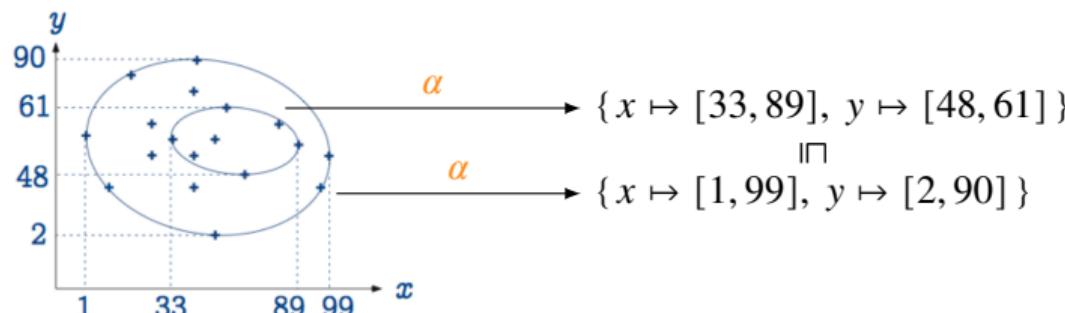
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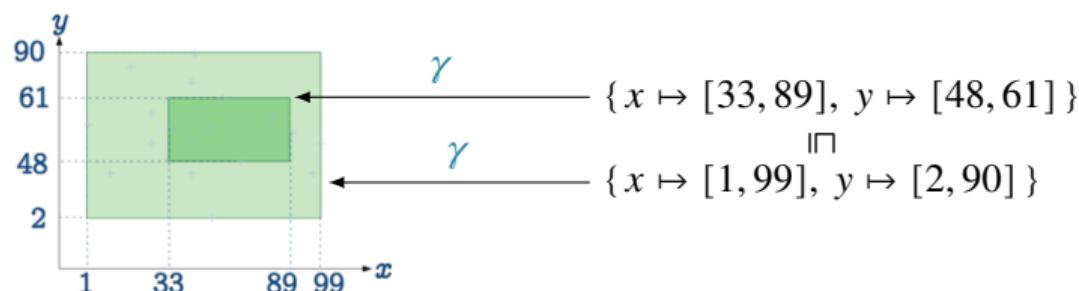
The concretization γ is **monotone**: $I_1 \sqsubseteq I_2 \Rightarrow \gamma(I_1) \subseteq \gamma(I_2)$

$$\begin{aligned} & \{x \mapsto [33, 89], y \mapsto [48, 61]\} \\ & \sqcap \\ & \{x \mapsto [1, 99], y \mapsto [2, 90]\} \end{aligned}$$

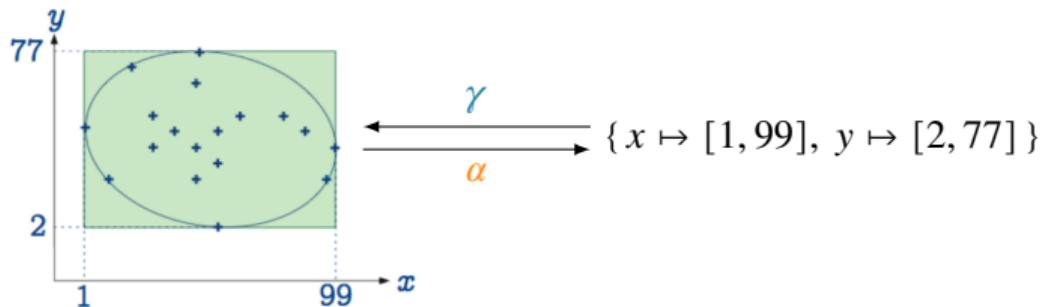
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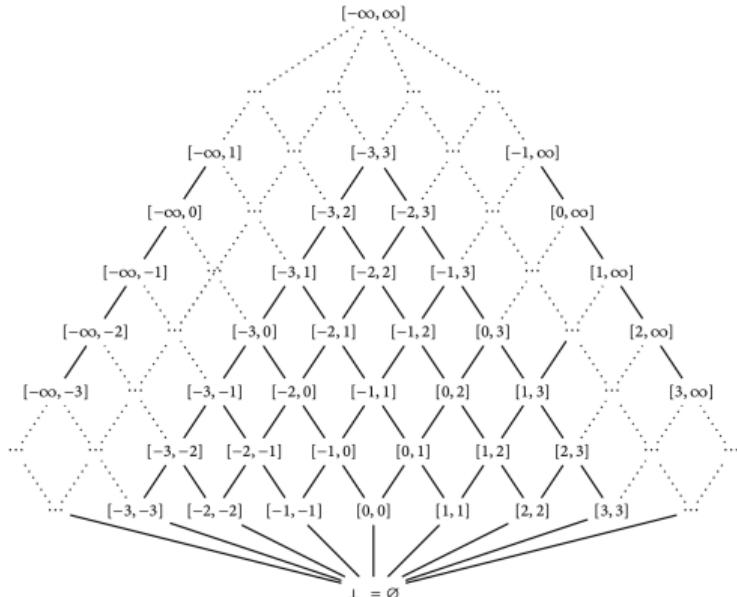


The composition $\gamma \circ \alpha$ is **extensive**: $S \subseteq \gamma\alpha(S)$



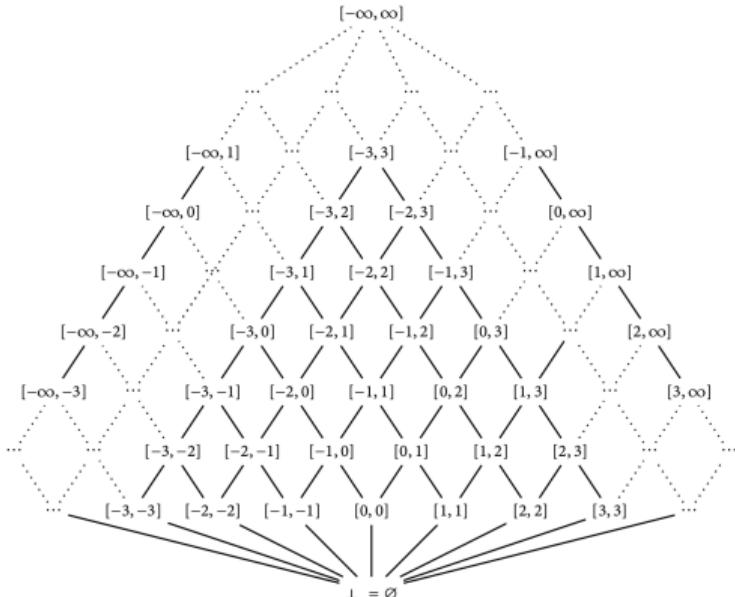
The bounded integer intervals abstraction

Bounded integer intervals $((\mathbb{Z} \cup \{-\infty\}) \times (\mathbb{Z} \cup \{\infty\}), \sqsubseteq, \sqcup, \sqcap, \perp, \top)$



Bounded integer intervals $\langle (\mathbb{Z} \cup \{-\infty\}) \times (\mathbb{Z} \cup \{\infty\}), \sqsubseteq, \sqcup, \sqcap, \perp, \top \rangle$

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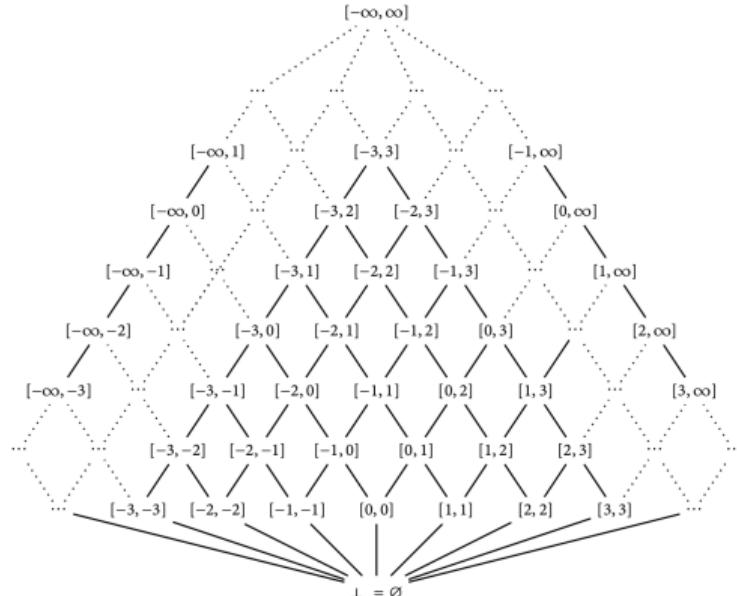


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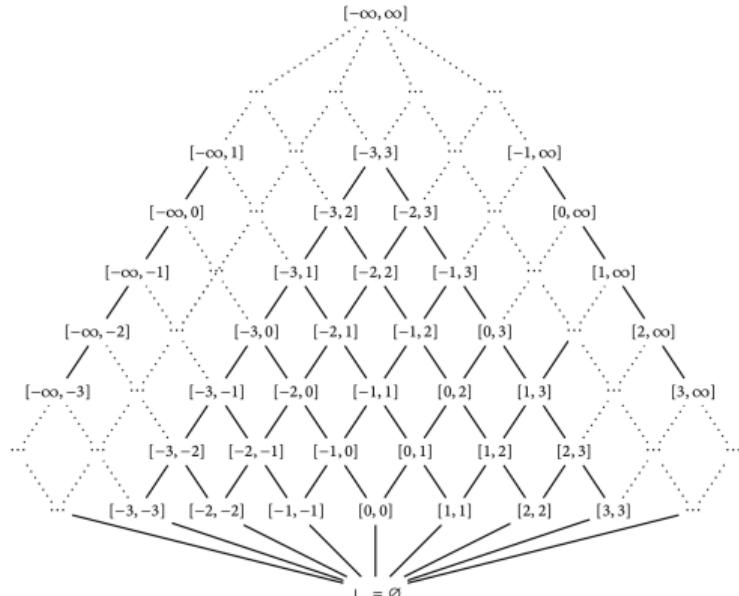
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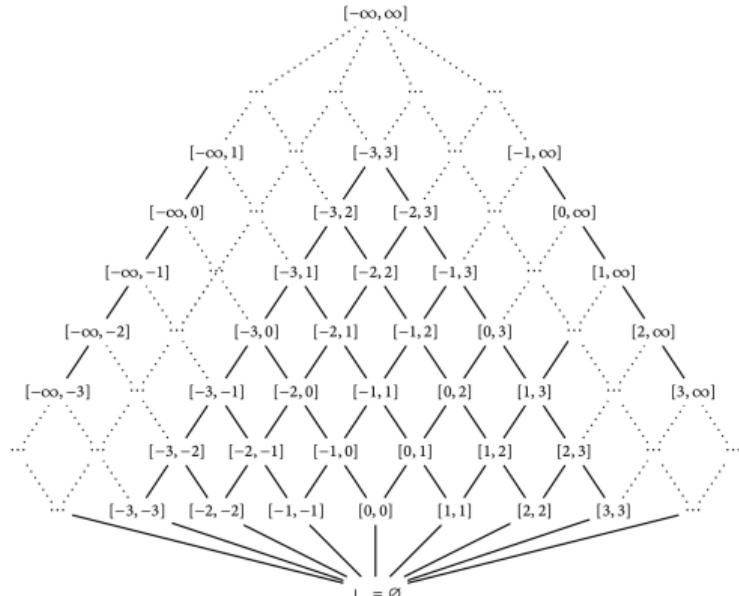
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Galois Connection



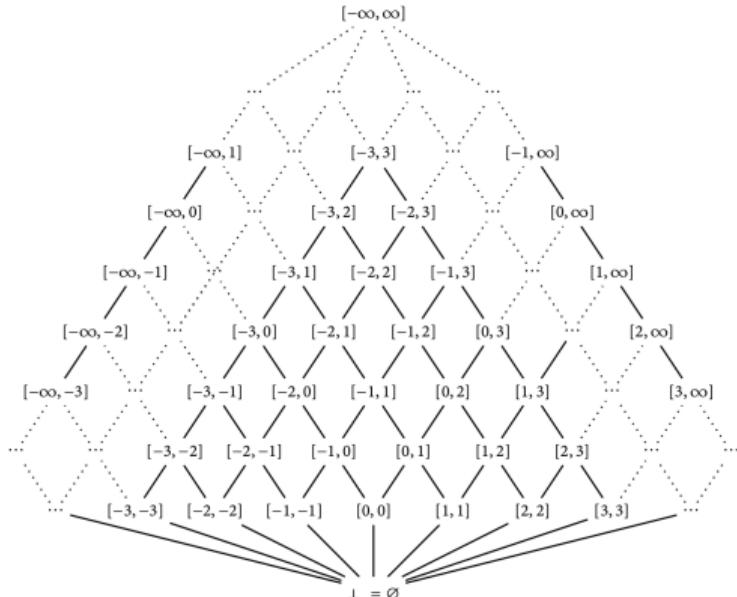
α is not surjective

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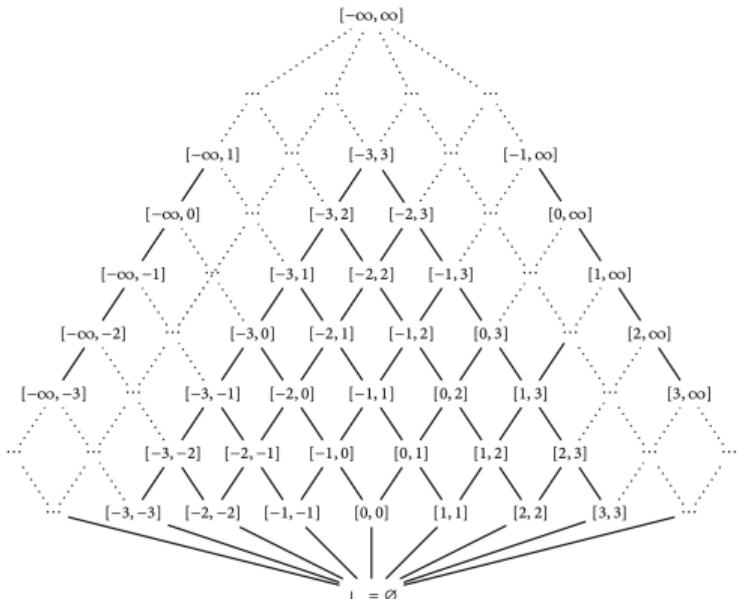
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$[3, 1] \in (\mathbb{Z} \cup \{-\infty\}) \times (\mathbb{Z} \cup \{\infty\})$ but $[3, 1] \notin \text{image}(\alpha)$

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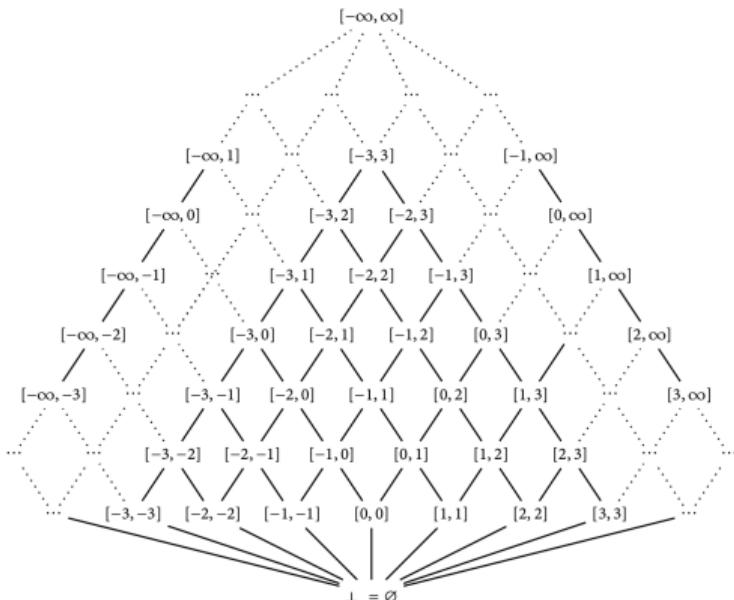
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Galois Connection



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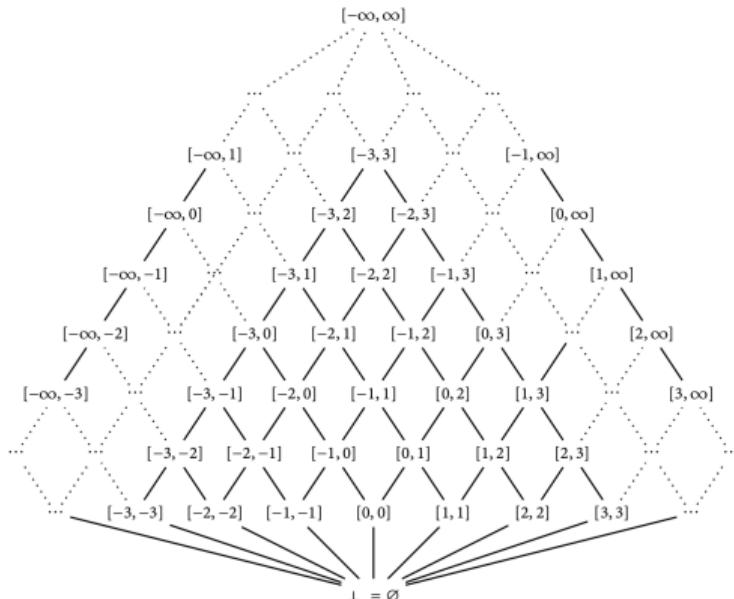
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$$\gamma([3, 1]) = \emptyset = \gamma([3, 2]) \text{ but } [3, 1] \neq [3, 2]$$

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Galois Connection



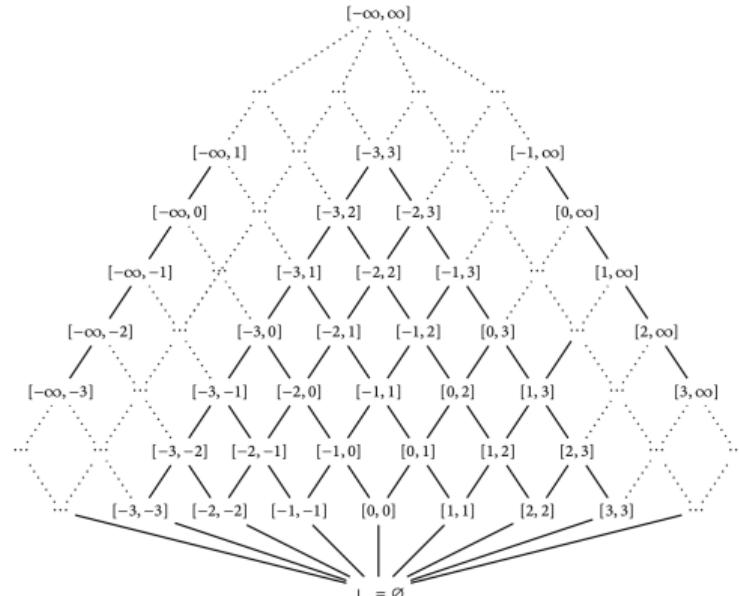
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Galois Insertion



A Galois Connection can always be made into a Galois Injection

- Given $\langle C, \leq_C \rangle \xrightleftharpoons[\alpha]{\gamma} \langle A, \leq_A \rangle$ we can reduce A forcing the surjectivity of α

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$$a \equiv a' \triangleq \gamma(a) = \gamma(a')$$

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The set of equivalence classes $A/\equiv \triangleq \{[a]_\equiv \mid a \in A\}$ forms a Galois Injection with C

$$\alpha_\equiv \triangleq \lambda c . [\alpha(c)]_\equiv$$

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$$\alpha_\equiv \triangleq \lambda c . [\alpha(c)]_\equiv \quad \gamma_\equiv \triangleq \lambda [a]_\equiv . \gamma(a)$$

We have $\langle C, \leq_C \rangle \xrightleftharpoons[\alpha_\equiv]{\gamma_\equiv} \langle A/\equiv, \leq_\equiv \rangle$ where $[a]_\equiv \leq_\equiv [a']_\equiv \triangleq a \leq_A a'$

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Given two abstractions $\langle C, \sqsubseteq^c \rangle \xleftarrow[\gamma_a]{\alpha_a} \langle A, \sqsubseteq^a \rangle$ and $\langle C, \sqsubseteq^c \rangle \xleftarrow[\gamma_b]{\alpha_b} \langle B, \sqsubseteq^b \rangle$ of C

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We say that A is **more precise** than B when

$$\forall b \in B \exists a \in A . \gamma_b(b) = \gamma_a(a)$$

In other words, A is more precise than B when $\{\gamma_b(b) \mid b \in B\} \subseteq \{\gamma_a(a) \mid a \in A\}$

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In other words, A is more precise than B when $\{\gamma_b(b) \mid b \in B\} \subseteq \{\gamma_a(a) \mid a \in A\}$

Prove that $\langle \{T_C\}, = \rangle$ is the less precise abstraction of C

Abstract Computation

$$\langle C, \sqsubseteq^c \rangle \xrightleftharpoons[\alpha]{\gamma} \langle A, \sqsubseteq^a \rangle$$

What we **ideally want** compute: a concrete function $f : C \rightarrow C$ on $\langle C, \sqsubseteq^c \rangle$

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Note: we usually aim at computing the fixpoints of f (and $f^\#$)

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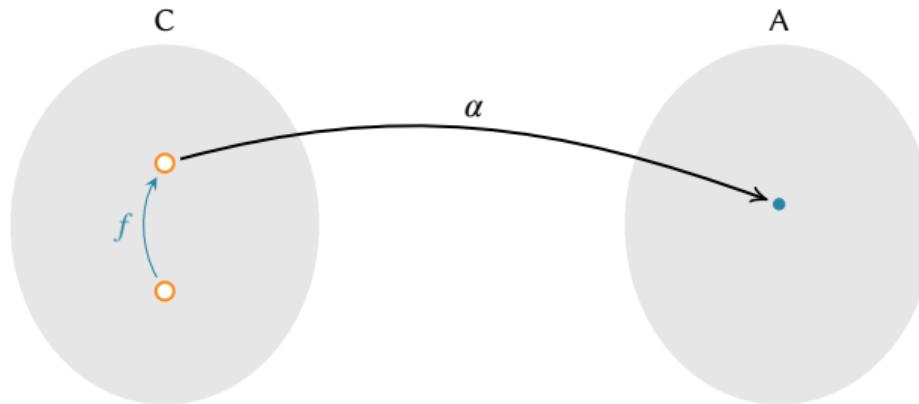
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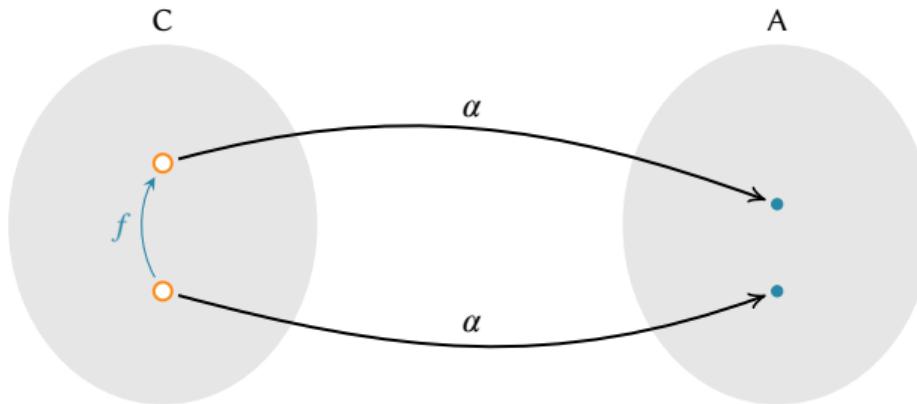
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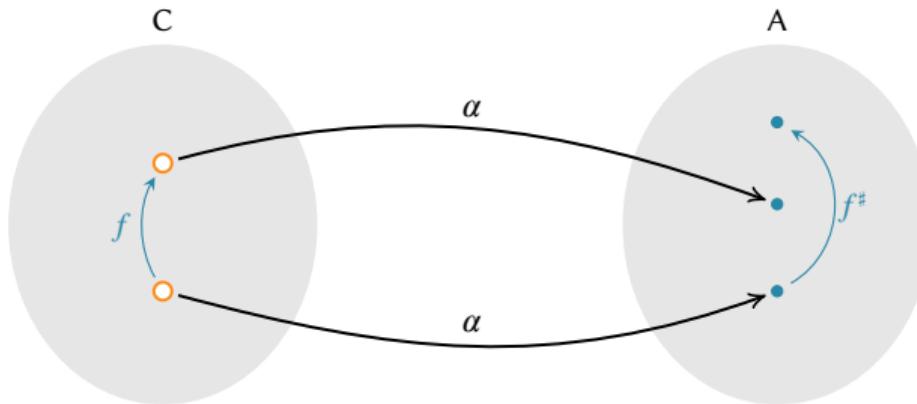
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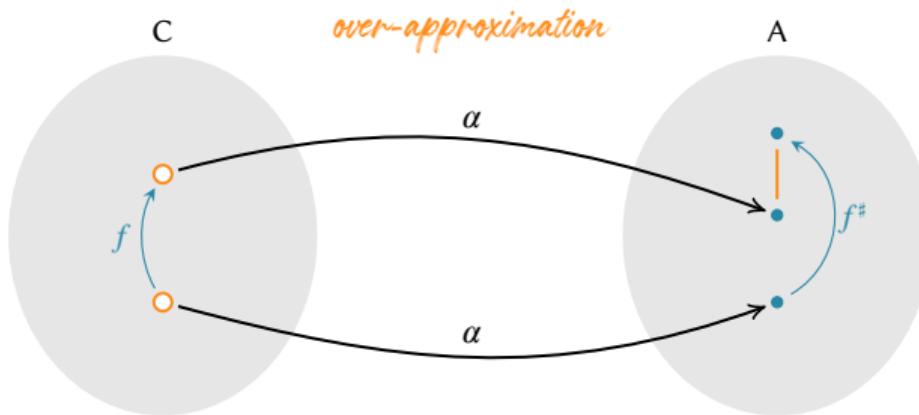
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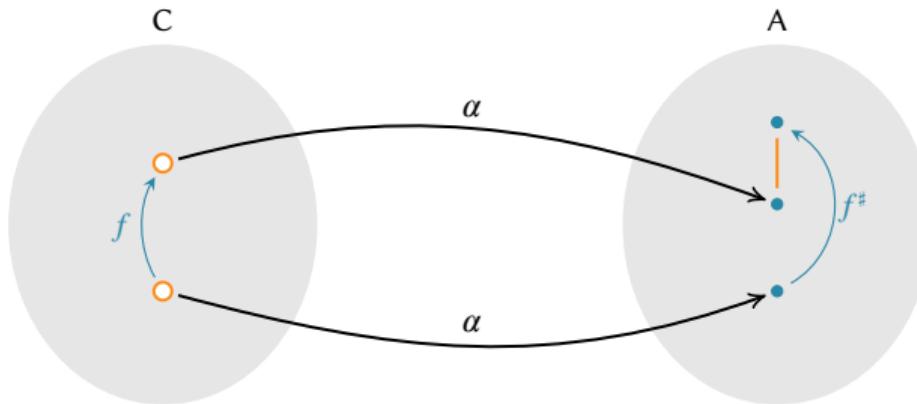
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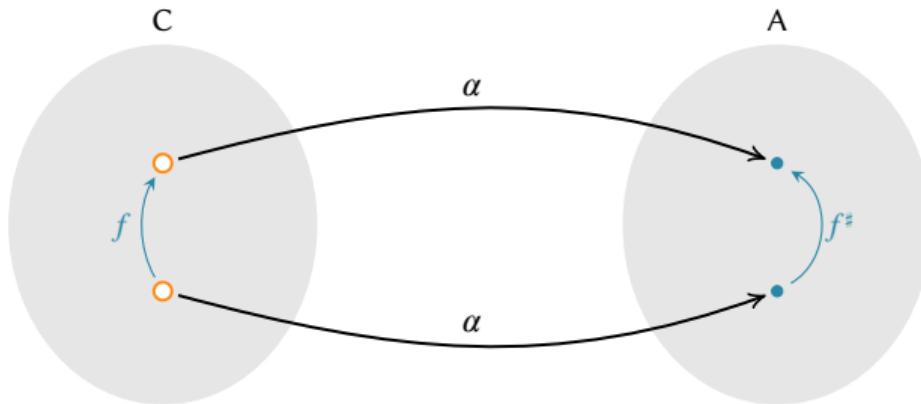
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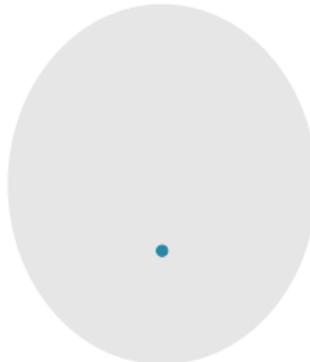
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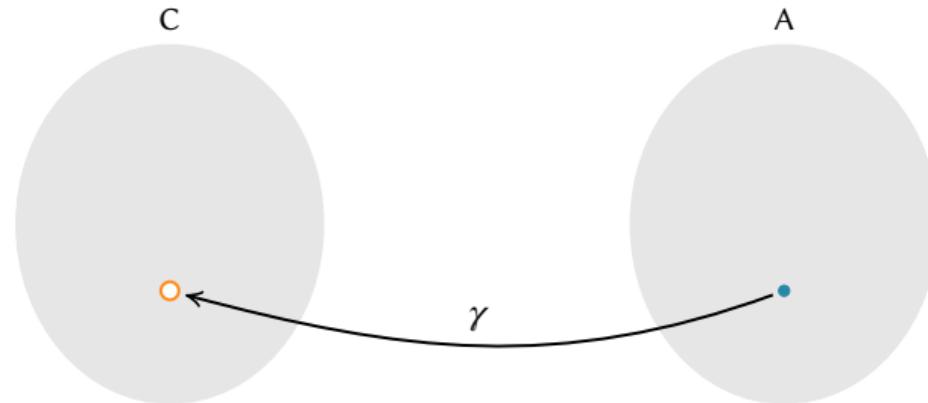
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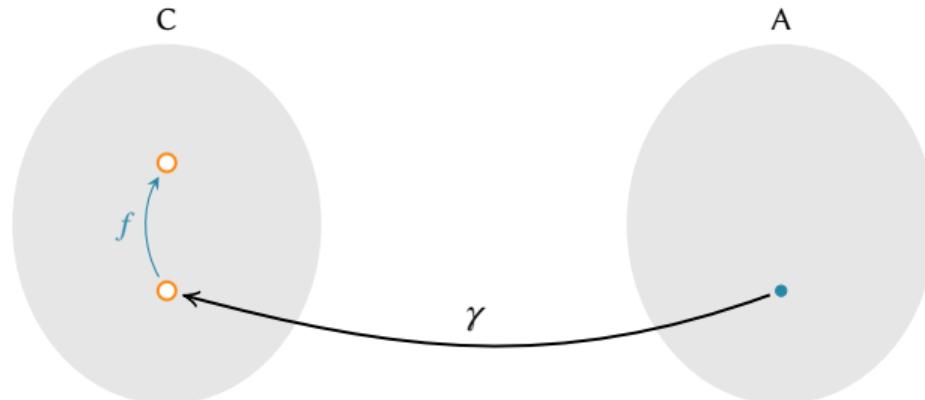
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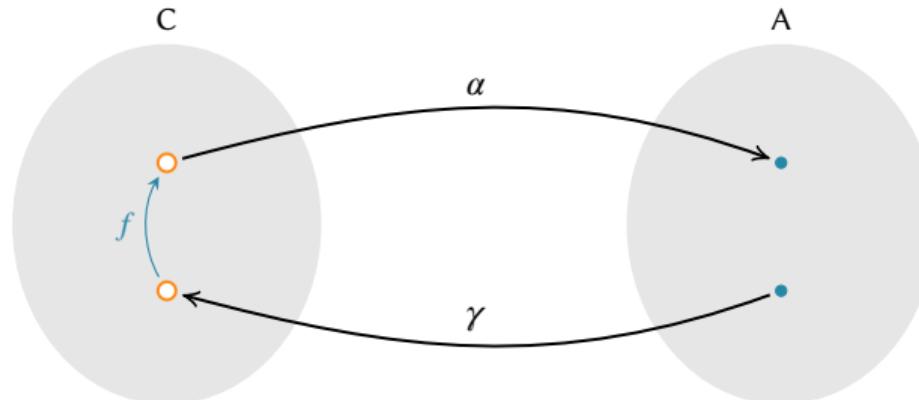
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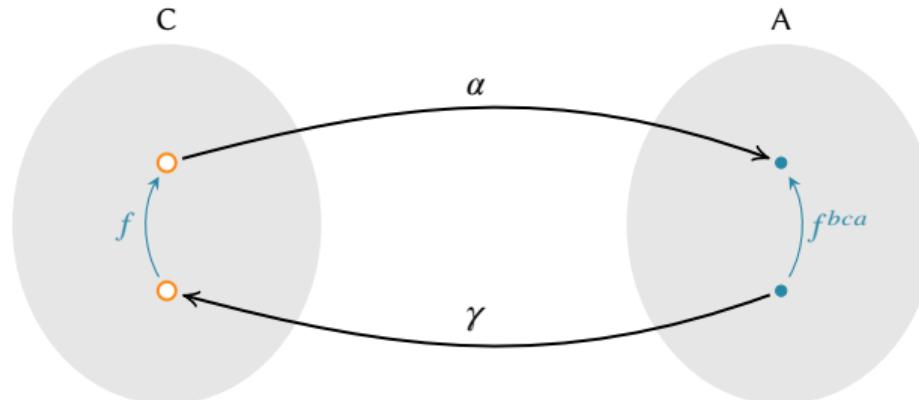
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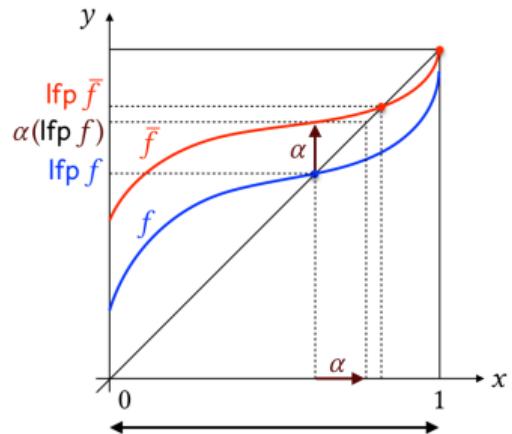
Sometimes the abstraction is **exact** (or complete): $\alpha(\text{lfp } f) = \text{lfp } f^\#$

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Given two monotonic functions $f, \bar{f} : \mathcal{S} \rightarrow \mathcal{S}$ on a complete lattice $\langle \mathcal{S}, \sqsubseteq, \sqcup, \sqcap, \perp, \top \rangle$, if $f \dot{\leq} \bar{f}$ then $\text{lfp } f \sqsubseteq \text{lfp } \bar{f}$.

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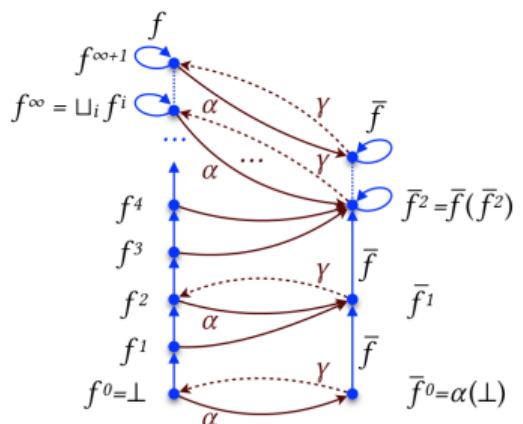


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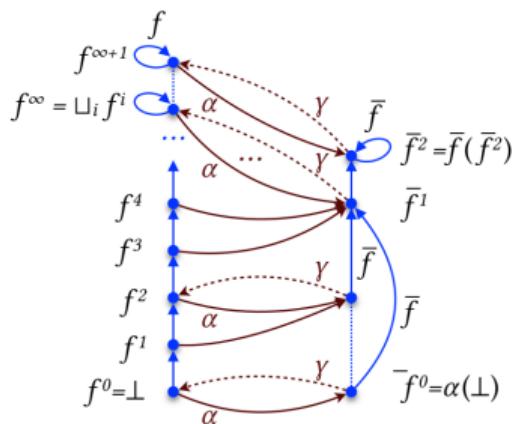
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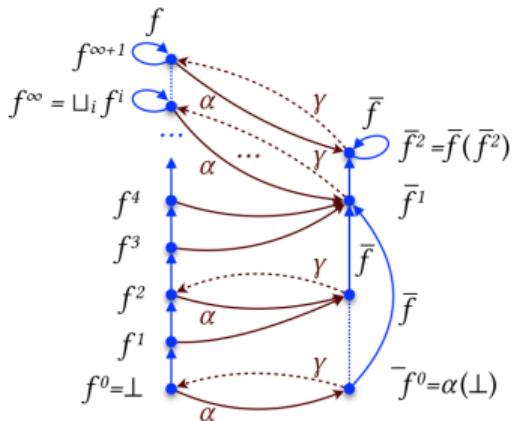
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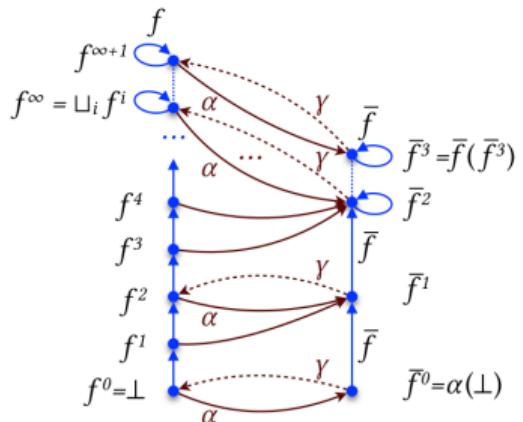


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Fixpoint Acceleration

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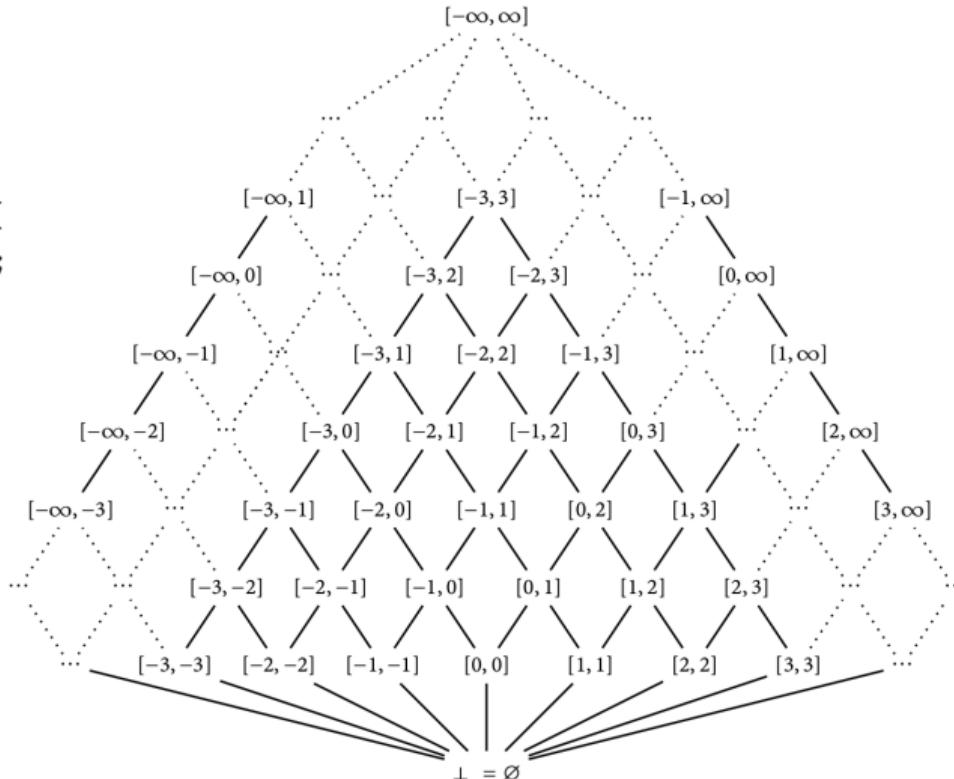
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- To force iteration termination
- To speed-up iteration computation

Infinite iterations: example

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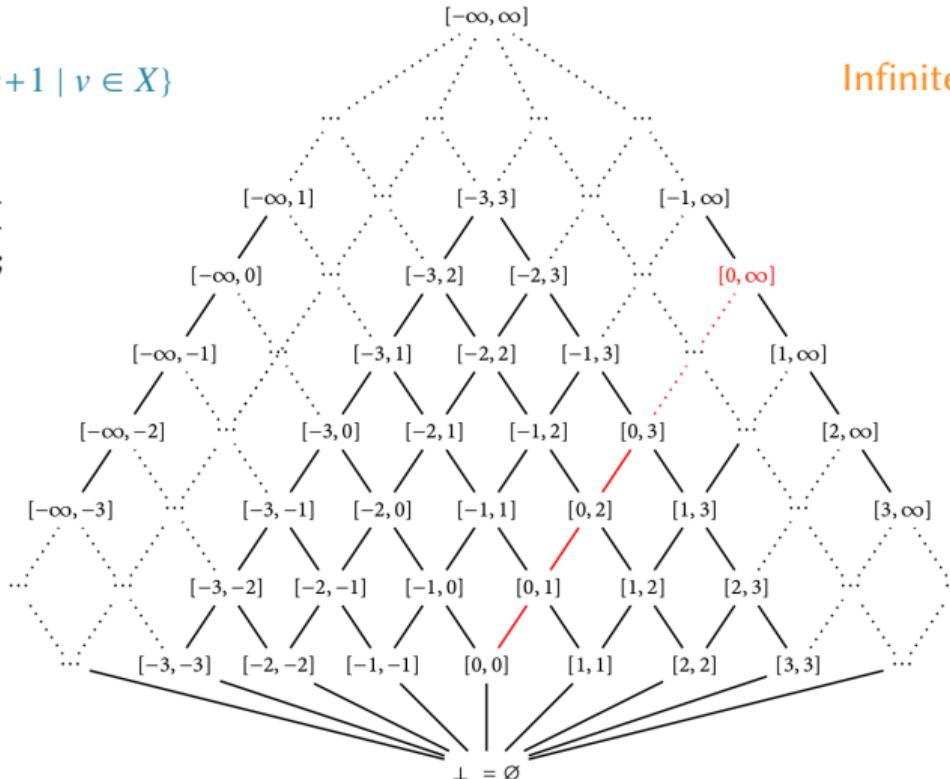
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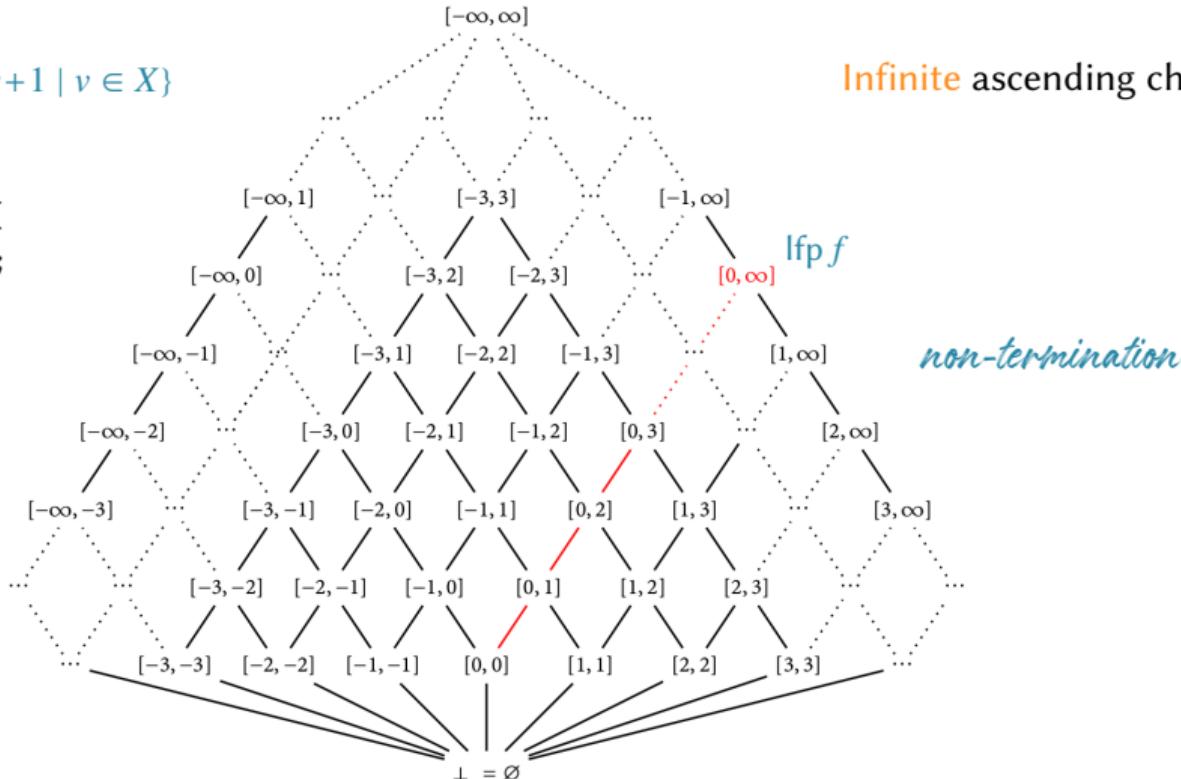
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Rationale: a sound although imprecise answer is better than no answer at all

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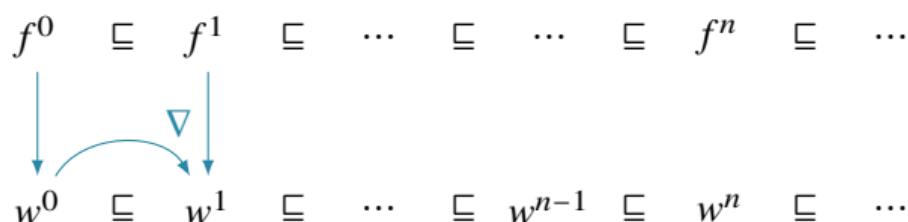
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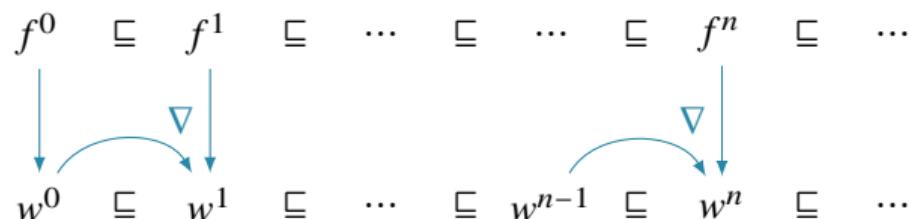
In other words, ∇ computes upper bounds and $\exists k \in \mathbb{N}$ such that $b_k = b_{k-1}$



Given a poset $\langle \mathcal{L}, \sqsubseteq \rangle$, a **widening** operator $\nabla : \mathcal{L} \times \mathcal{L} \rightarrow \mathcal{L}$ must satisfy:

- For any $a, b \in \mathcal{L}$, it must be that $a \sqsubseteq a \nabla b$ and $b \sqsubseteq a \nabla b$
- For all infinite ascending chains $a_1 \sqsubseteq a_2 \sqsubseteq \dots \sqsubseteq a_n \sqsubseteq \dots$ in \mathcal{L} , the ascending chain $b_0 \triangleq a_0 \sqsubseteq b_1 = b_0 \nabla a_1 \sqsubseteq \dots \sqsubseteq b_n \triangleq b_{n-1} \nabla a_n \sqsubseteq \dots$ stabilizes in a finite number of steps

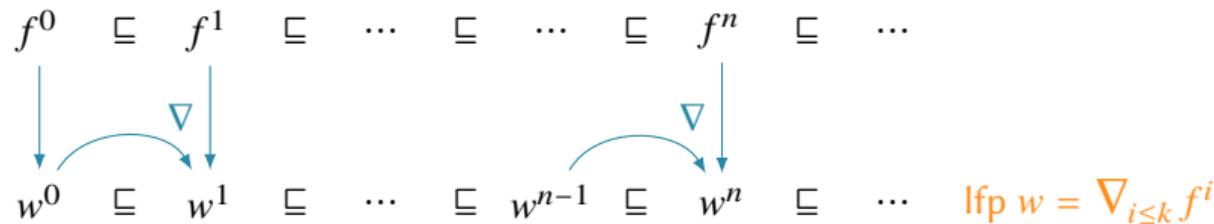
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Extrapolate unstable bounds to infinity:

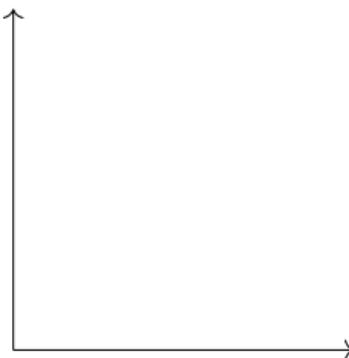
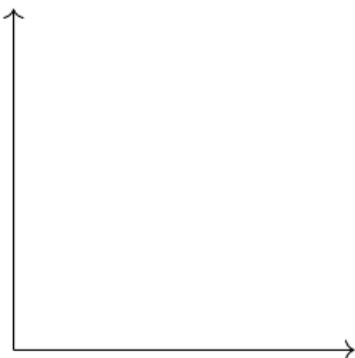
$$\perp \nabla [l, h] \triangleq [l, h] \nabla \perp \triangleq [l, h]$$

$$[l_1, h_1] \nabla [l_2, h_2] \triangleq [\textcolor{red}{(l_2 < l_1 \text{ ? } -\infty : l_1)}, \textcolor{red}{(h_2 > h_1 \text{ ? } \infty : h_1)}]$$

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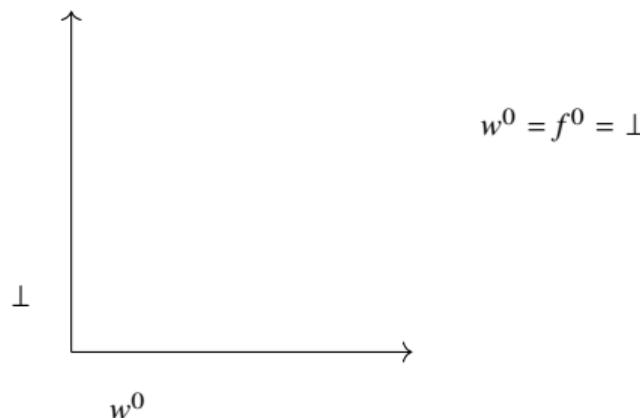
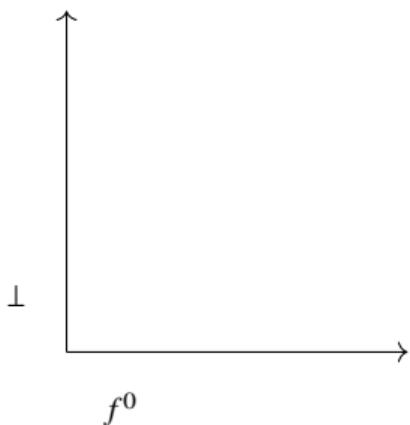
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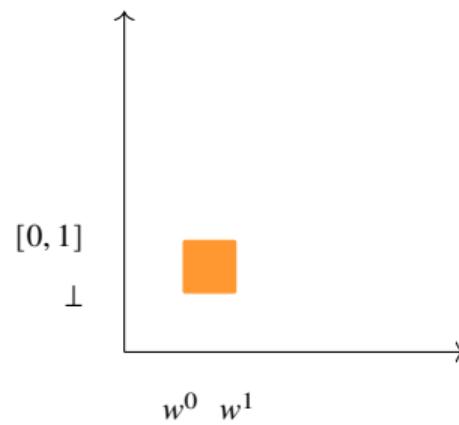
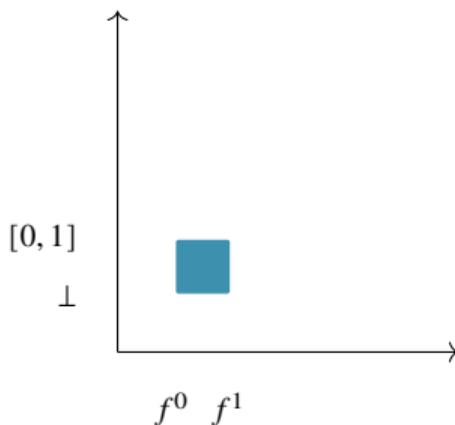
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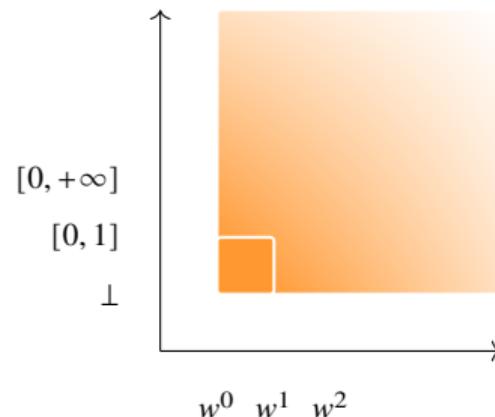
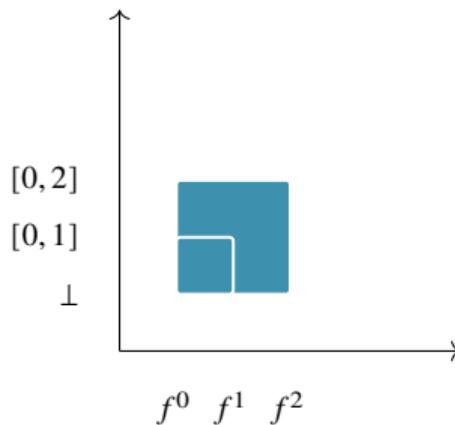


$$\begin{aligned} w^1 &= w^0 \nabla f^1 = \\ &= \perp \nabla [0, 1] = [0, 1] \end{aligned}$$

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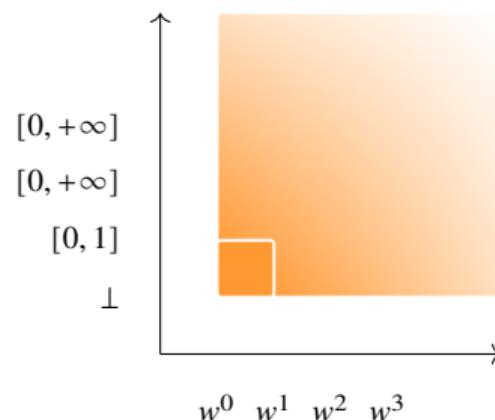
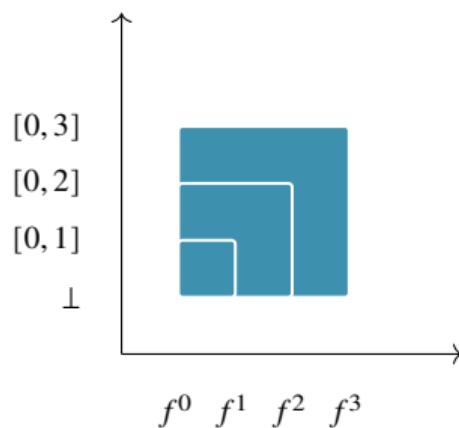


$$\begin{aligned} w^2 &= w^1 \nabla f^2 = \\ &= [0, 1] \nabla [0, 2] = [0, +\infty] \end{aligned}$$

Extrapolate unstable bounds to infinity:

$$\perp \nabla [l, h] \triangleq [l, h] \nabla \perp \triangleq [l, h]$$

$$[l_1, h_1] \nabla [l_2, h_2] \triangleq [\textcolor{red}{(l_2 < l_1 \Rightarrow -\infty : l_1)}, \textcolor{red}{(h_2 > h_1 \Rightarrow \infty : h_1)}]$$



$$\begin{aligned} w^3 &= w^2 \nabla f^3 = \\ &= [0, +\infty] \nabla [0, 3] = [0, +\infty] \end{aligned}$$

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- The limit of the iteration sequence with widening $\nabla_{i \leq k} f^i$ is a **post-fixpoint** of f

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Hence, $\nabla_{i \leq k} f^i$ is an **over-approximation** of the least fixpoint of f :

$$\text{lfp } f \sqsubseteq \nabla_{i \leq k} f^i$$

computable in **finite** time

Thanks for the attention!



LATEX is the way

Additional Slides



Further reading

CC-LOGCOM-1992 “Abstract Interpretation Frameworks”, P. Cousot and R. Cousot, In: *Journal of logic and computation* (1992)