

TRANSFORMING ABSTRACT INTERPRETATIONS

BY

ABSTRACT INTERPRETATIONS

MODELLING SYSTEMS AS AI TRANSFORMERS

Roberto Giacobazzi

(and A. Banerjee, **I. Mastroeni**, E. Quintarelli, F. Ranzato, F. Scozzari)

SAS'08, Valencia July 2008

ABSTRACT INTERPRETATION

[Cousot & Cousot '79]



A program P



A domain of computation for P : C typically a complete lattice



Semantic specification (interpreter): $\llbracket P \rrbracket : C \longrightarrow C$



(Approximate) observable properties: $\rho \in uco(C)$



DERIVE A SOUND APPROXIMATE SPECIFICATION $\llbracket P \rrbracket^\#$

$$\rho(\llbracket P \rrbracket(x)) \leq \llbracket P \rrbracket^\#(x)$$



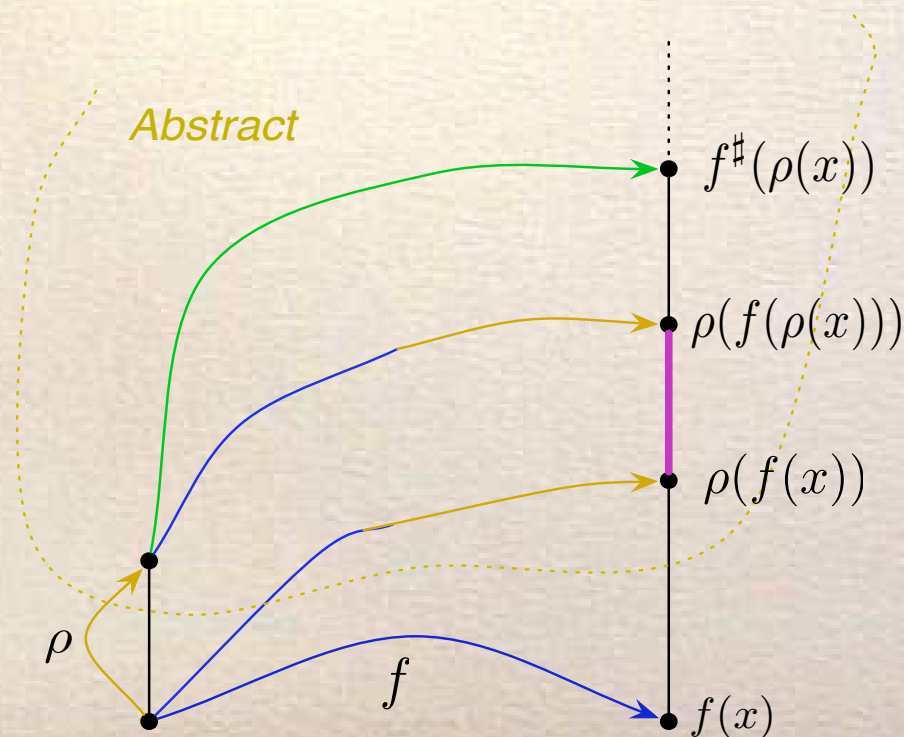
THE LIMIT CASE: COMPLETENESS

$$\rho(\llbracket P \rrbracket(x)) = \llbracket P \rrbracket^\#(x) \text{ iff } \rho(\llbracket P \rrbracket(x)) = \rho(\llbracket P \rrbracket(\rho(x)))$$

COMPLETENESS IN ABSTRACT INTERPRETATION

⇨ BACKWARD SOUNDNESS: NO INFORMATION IS LOST BY APPROXIMATING THE INPUT/OUTPUT

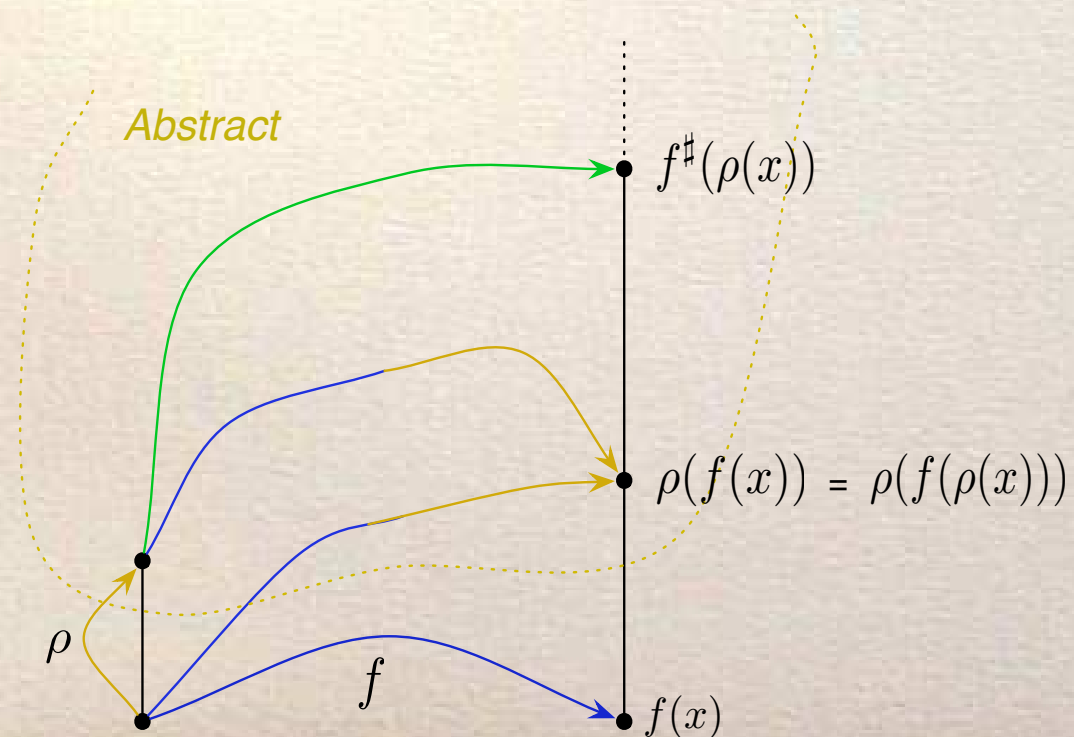
⇨ $\rho \circ f \leq \rho \circ f \circ \rho$



COMPLETENESS IN ABSTRACT INTERPRETATION

⇨ BACKWARD COMPLETENESS: NO LOSS OF PRECISION IS ACCUMULATED BY APPROXIMATING THE INPUT

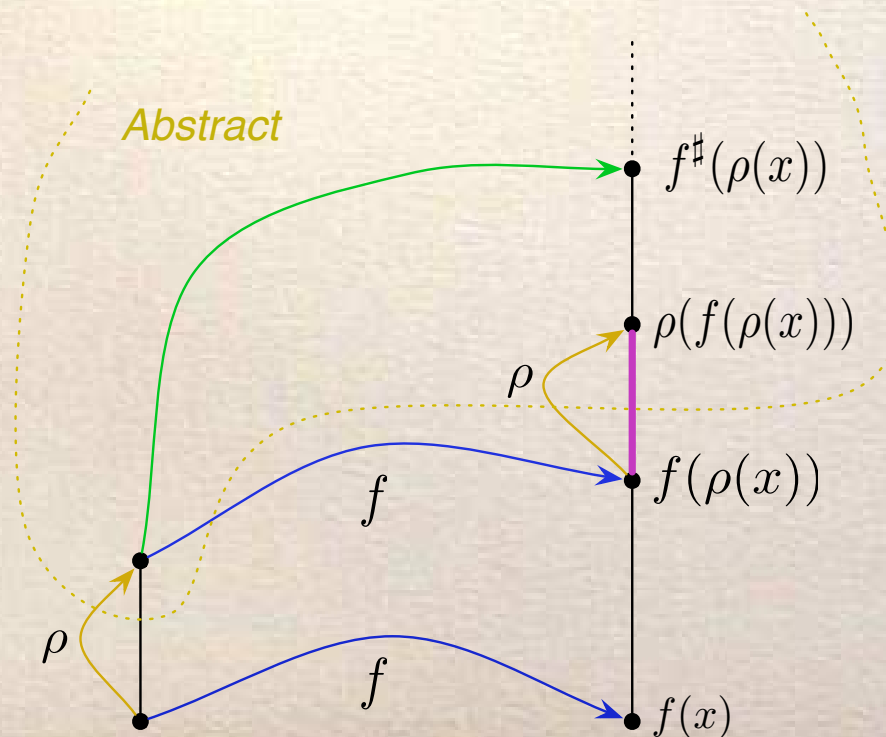
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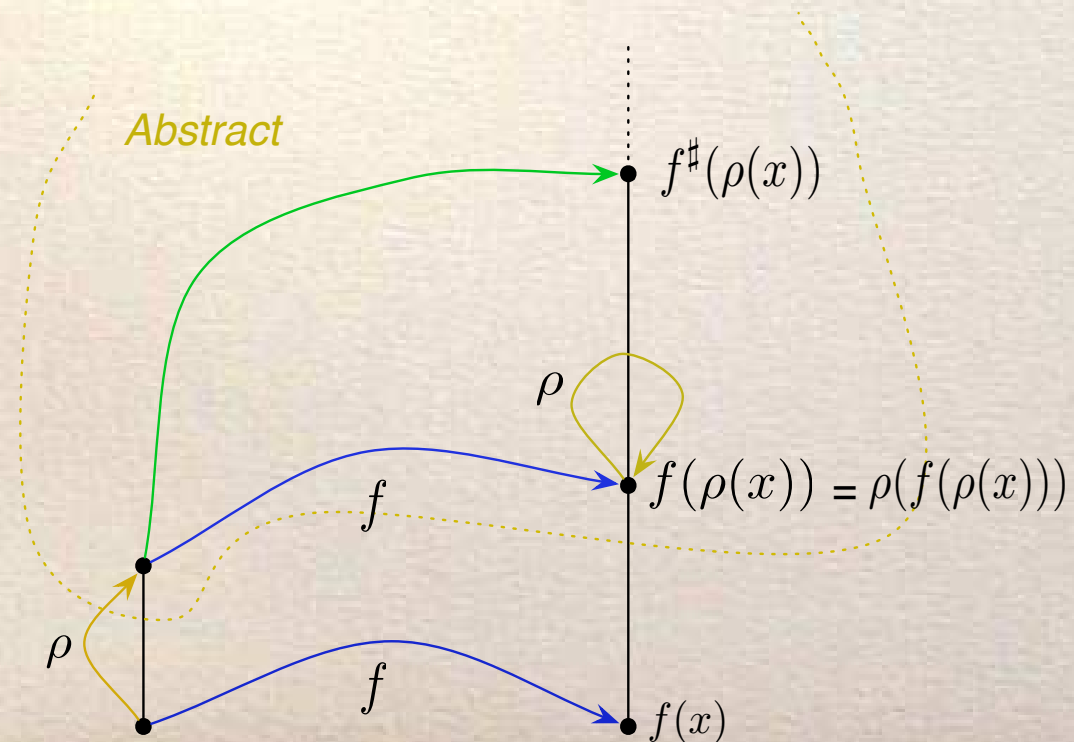
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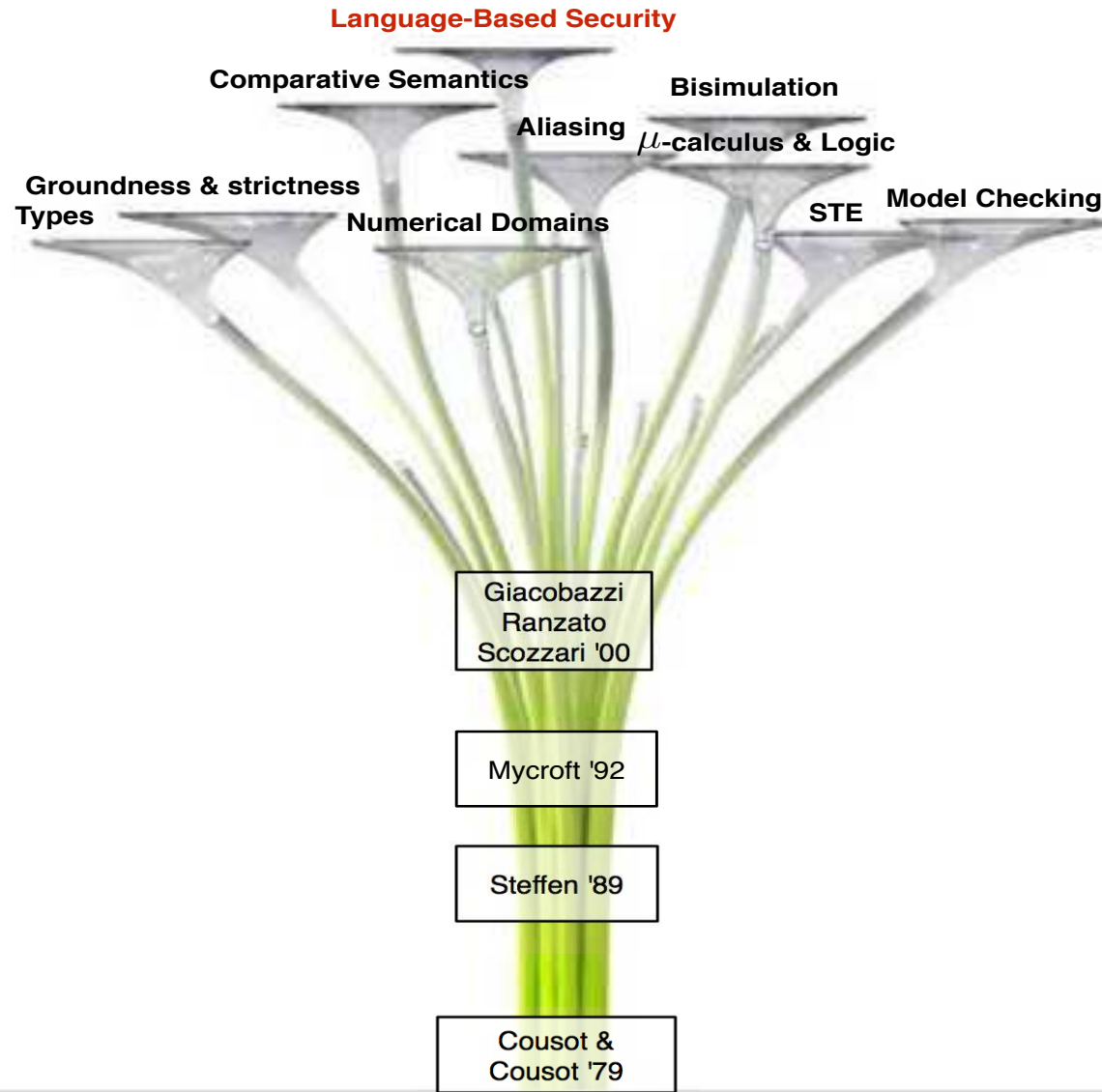
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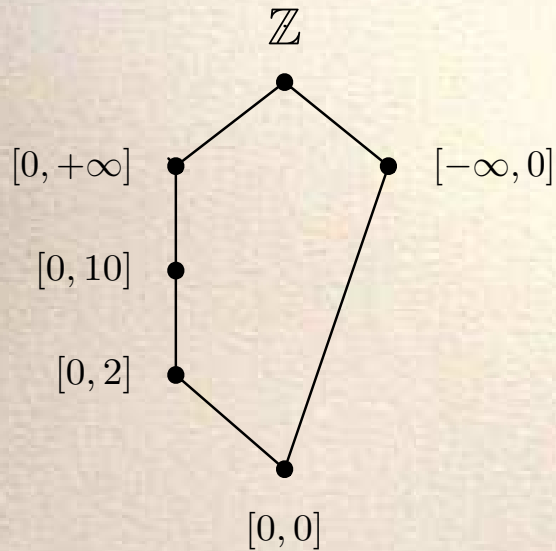


COMPLETENESS IN ABSTRACT INTERPRETATION



IN NUMERICAL DOMAINS

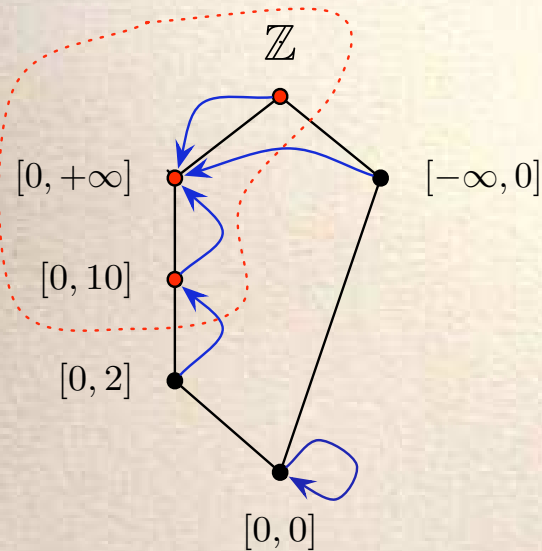
A SIMPLE EXAMPLE IN INTERVAL ANALYSIS



A simple domain of intervals

IN NUMERICAL DOMAINS

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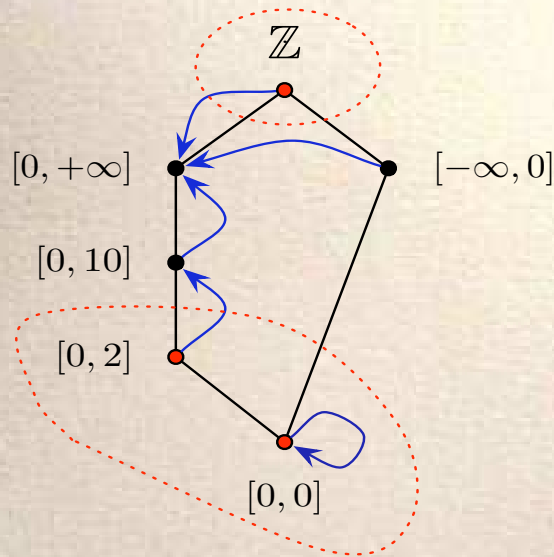
$$sq(X) = \left\{ x^2 \mid x \in X \right\}$$



$\{\mathbb{Z}, [0, +\infty], [0, 10]\}$ is Forward but not Backward complete

IN NUMERICAL DOMAINS

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$\{\mathbb{Z}, [0, +\infty], [0, 10]\}$ is Forward but not Backward complete



$\{\mathbb{Z}, [0, 2], [0, 0]\}$ is Backward but not Forward complete

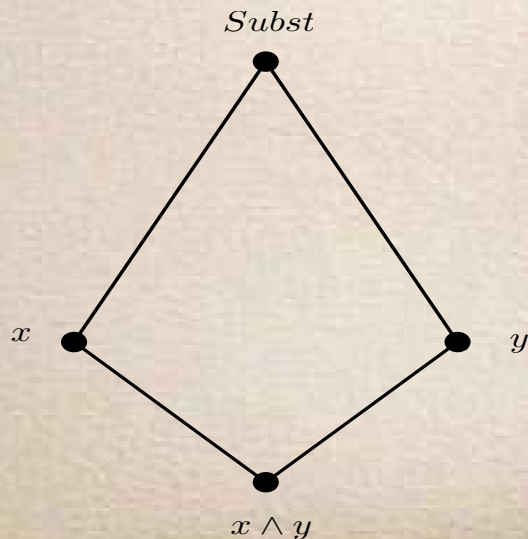
IN GROUNDNESS: HEYTING COMPLETION

GROUNDNESS ANALYSIS DETERMINES WHETHER A VARIABLE IS DEFINITELY INSTANTIATED

⇒ $(\wp(\text{Subst})^\downarrow, \cap)$ is a complete Heyting Algebra

⇒ $\Theta_1 \cap \Theta_2 \leq \Theta_3 \iff \Theta_2 \leq \Theta_1 \multimap \Theta_3 = \bigcup \left\{ \Theta \mid \Theta_1 \cap \Theta \leq \Theta_3 \right\}$

⇒ $A \multimap B = \left\{ \Theta_1 \multimap \Theta_2 \mid \Theta_1 \in A, \Theta_2 \in B \right\}$



$$X = \mathcal{G} \cap (X \multimap X)$$

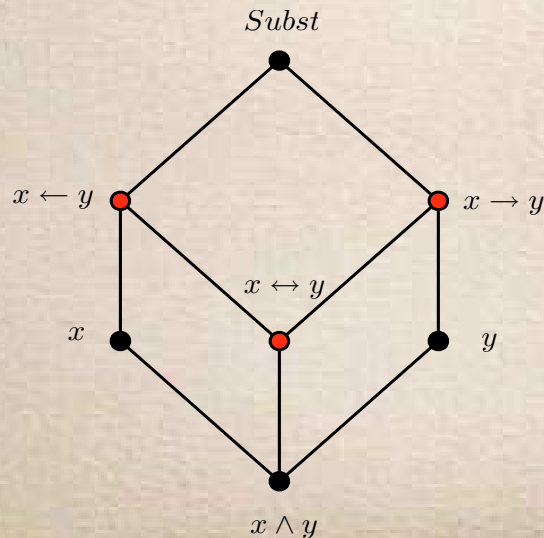
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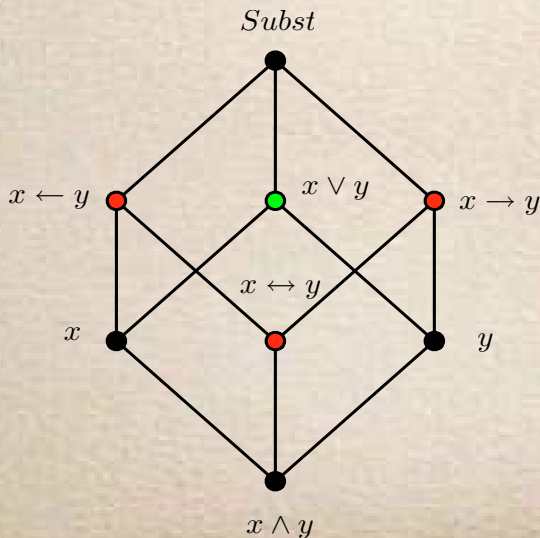
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$$X = \mathcal{G} \cap (X \multimap X)$$

⇒ A COMPLETENESS PROBLEM

[Giacobazzi & Scozzari '98]

IN COMPARATIVE SEMANTICS

CONDENSING GENERALISES THE LIFTING LEMMA FROM SLD-RESOLUTION TO ARBITRARY SEMANTICS [Giacobazzi et al. '05]

$$\llbracket a \otimes b \rrbracket = a \otimes \llbracket b \rrbracket$$

<i>Program</i>	P	$::=$	$\emptyset \mid p(\bar{x}) \leftarrow A \mid P.P$
<i>Agent</i>	A	$::=$	$\theta \mid p(\bar{x}) \mid A \otimes A \mid \bigvee_{i=1}^n A_i$



\otimes is a tensor operator (e.g. unification)



$$a \otimes b \leq c \iff b \leq a \multimap c = \bigvee \left\{ b \in C \mid a \otimes b \leq c \right\}$$



$$A \xrightarrow{\otimes} B = \left\{ a \multimap b \in C \mid a \in A, b \in B \right\}$$



X is **condensing** iff $X = X \sqcap (X \xrightarrow{\otimes} X)$ iff X is **complete** for

$$F_X = \left\{ \lambda y. x \otimes y \mid x \in X \right\}.$$

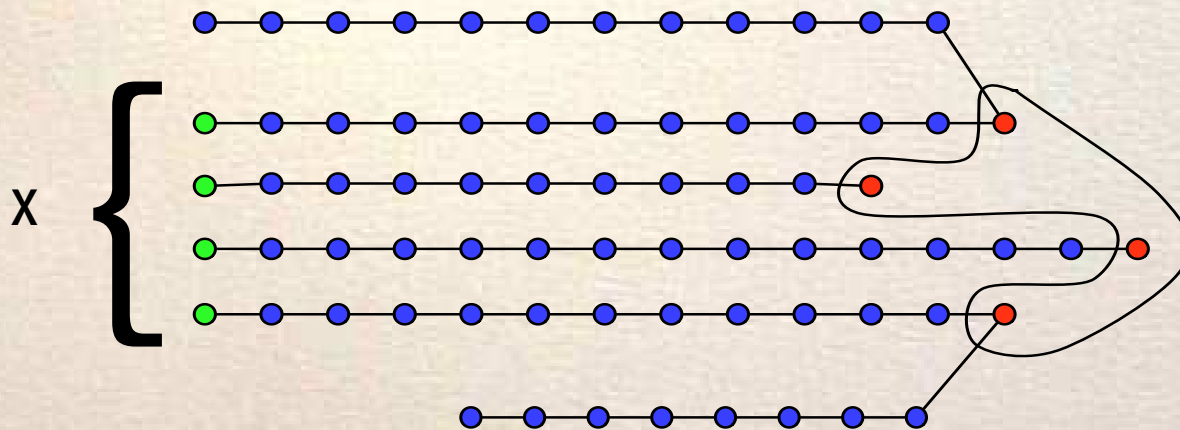
\Rightarrow A COMPLETENESS PROBLEM

IN COMPARATIVE SEMANTICS

$$\llbracket P_1; P_2 \rrbracket^A = \llbracket P_1 \rrbracket^A \diamond \llbracket P_2 \rrbracket^A$$



Forward termination: $Pot^{\rightarrow?}(X) = \left\{ \sigma \mid \delta \in X^+ \wedge \sigma_{\perp} = \delta_{\perp} \right\}$

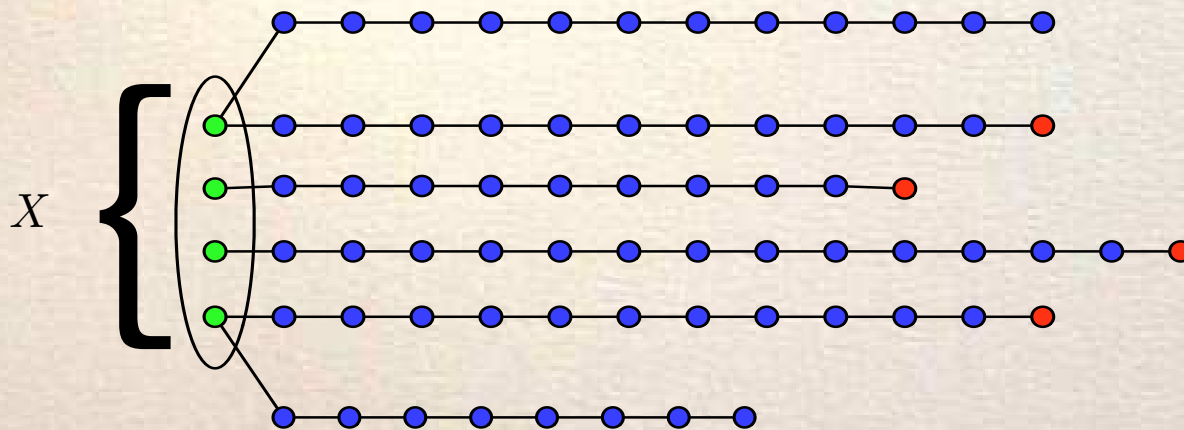


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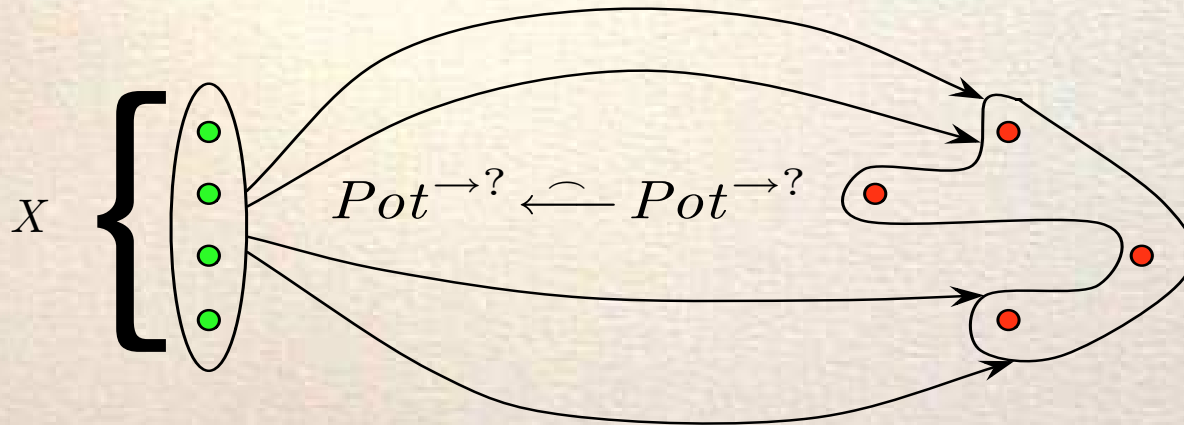


IN COMPARATIVE SEMANTICS

$$\llbracket P_1; P_2 \rrbracket^A = \llbracket P_1 \rrbracket^A \diamond \llbracket P_2 \rrbracket^A$$



$X = Pot^{\rightarrow?} \sqcap (X \multimap X)$ and the solution: $Pot^{\rightarrow?} \multimap Pot^{\rightarrow?} = \llbracket \cdot \rrbracket$.

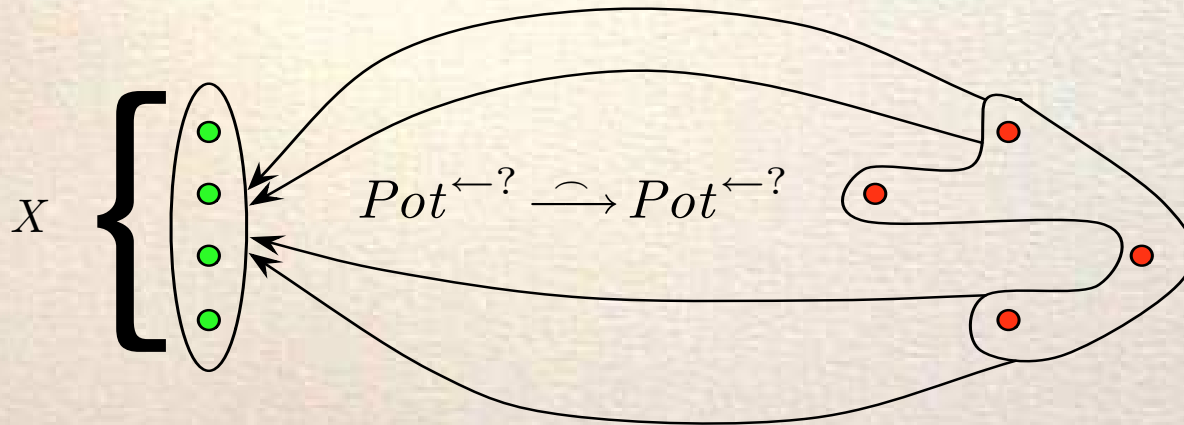


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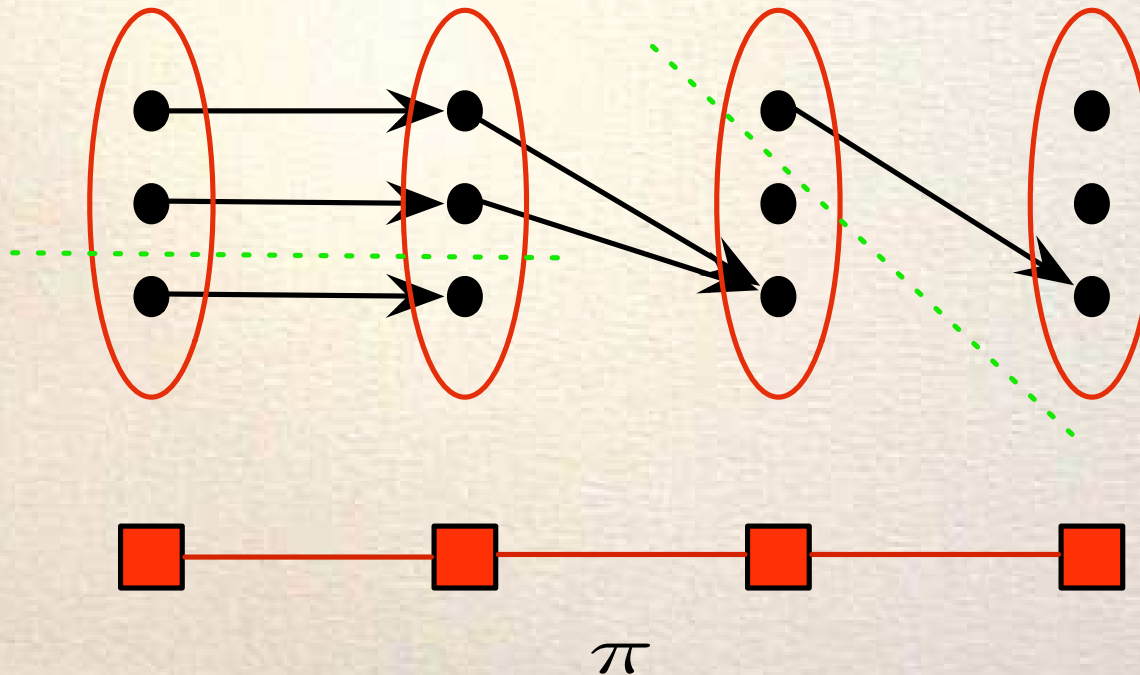


\Rightarrow A COMPLETENESS PROBLEM

[Giacobazzi & Mastroeni '05]

IN MODEL CHECKING

Complete Abstract Model Checking: $M^A \models \Phi \iff M^C \models \Phi$



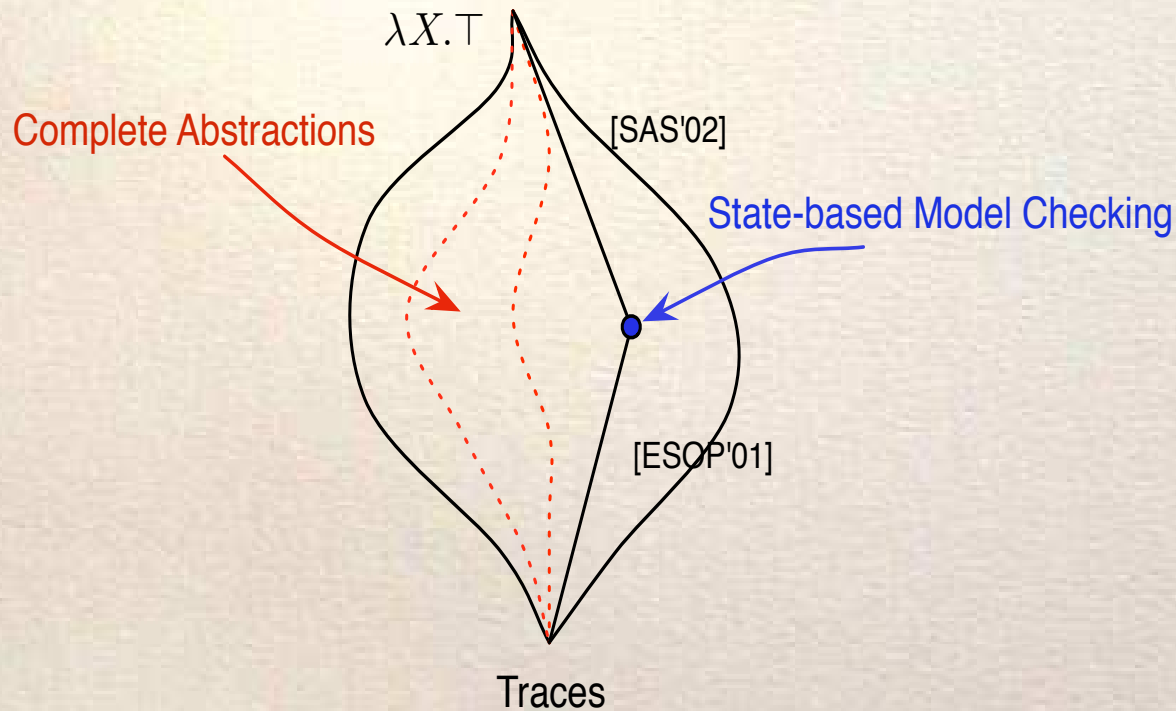
IF π IS SPURIOUS THEN THE ABSTRACTION IS INCOMPLETE FOR *post*

[Giacobazzi & Quintarelli '01, Ranzato & Tapparo '06, Cousot et al '07, Schmidt '08]

IN MODEL CHECKING

[Cousot & Cousot '00]

Let $\Phi \in \mu\text{-calculus}$: $\llbracket \Phi \rrbracket^{State} \subset \alpha^{State}(\llbracket \Phi \rrbracket^{Trace})$

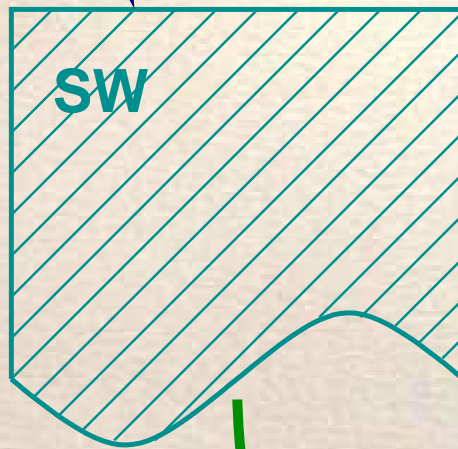


STATE-BASED MODEL CHECKING IS INTRINSICALLY INCOMPLETE FOR PROPERTIES OF TRACES!!

IN SECURITY: NON-INTERFERENCE

Secret H:
Financial investment

Public L:
Investment data

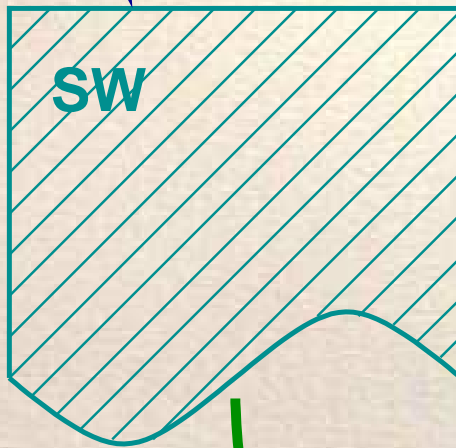


Public L: Log files

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Is it secure?

Public L: Log files

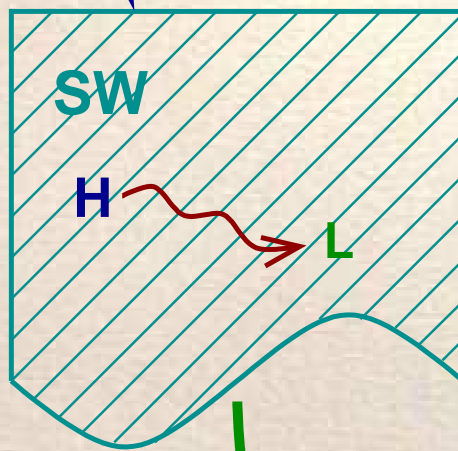


External observer

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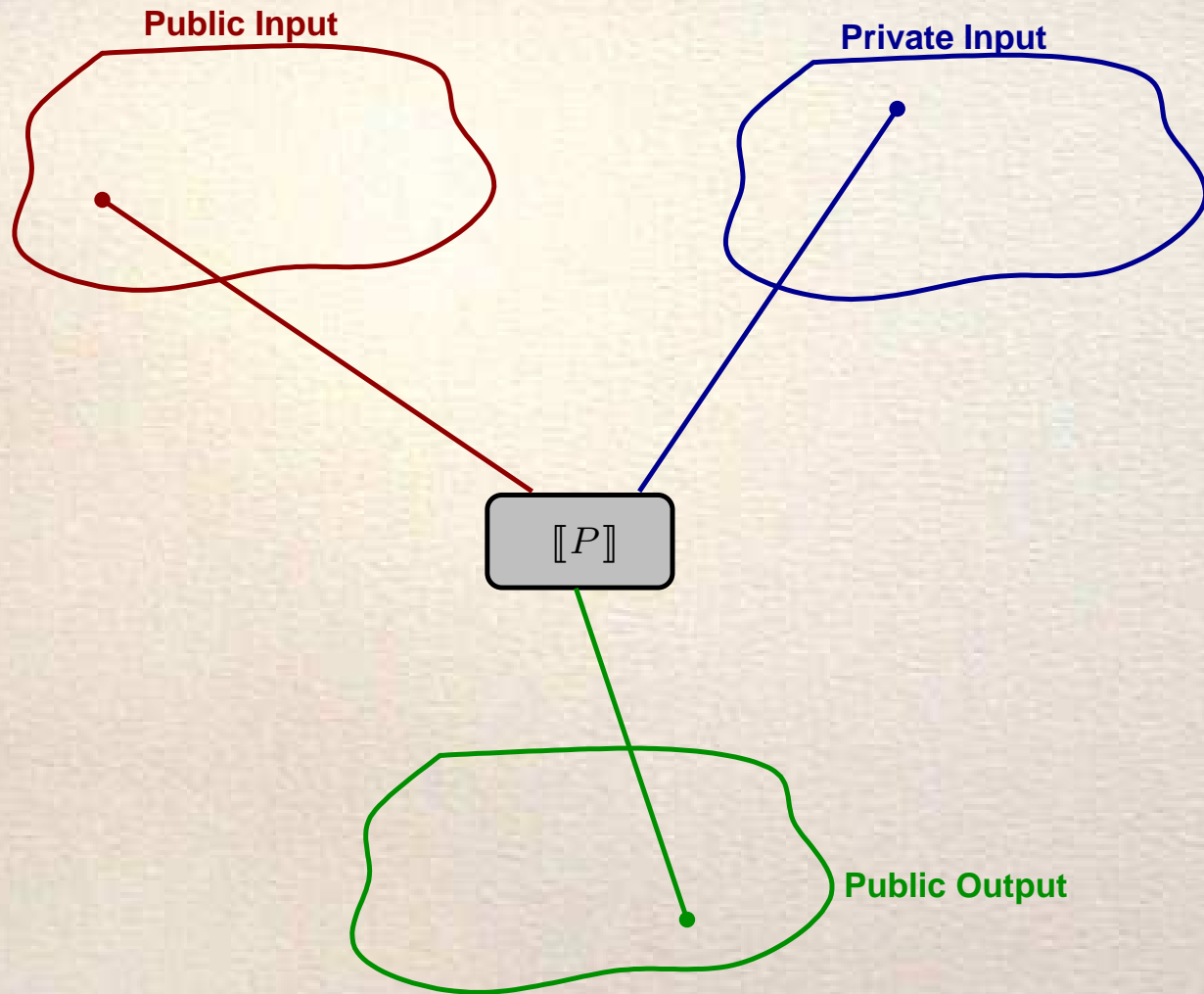
Is it secure? **NO**

Secret H
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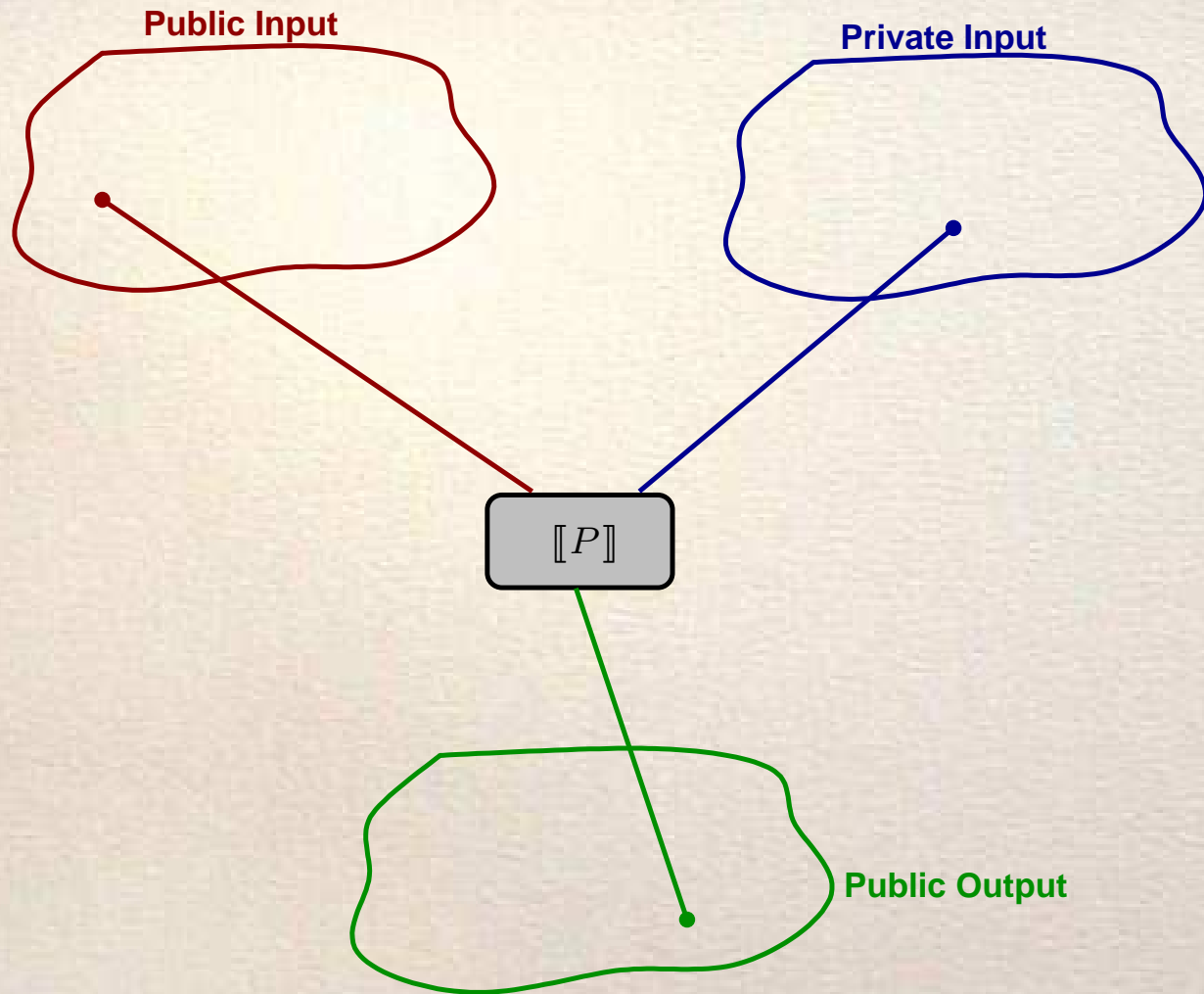
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STANDARD NON-INTERFERENCE



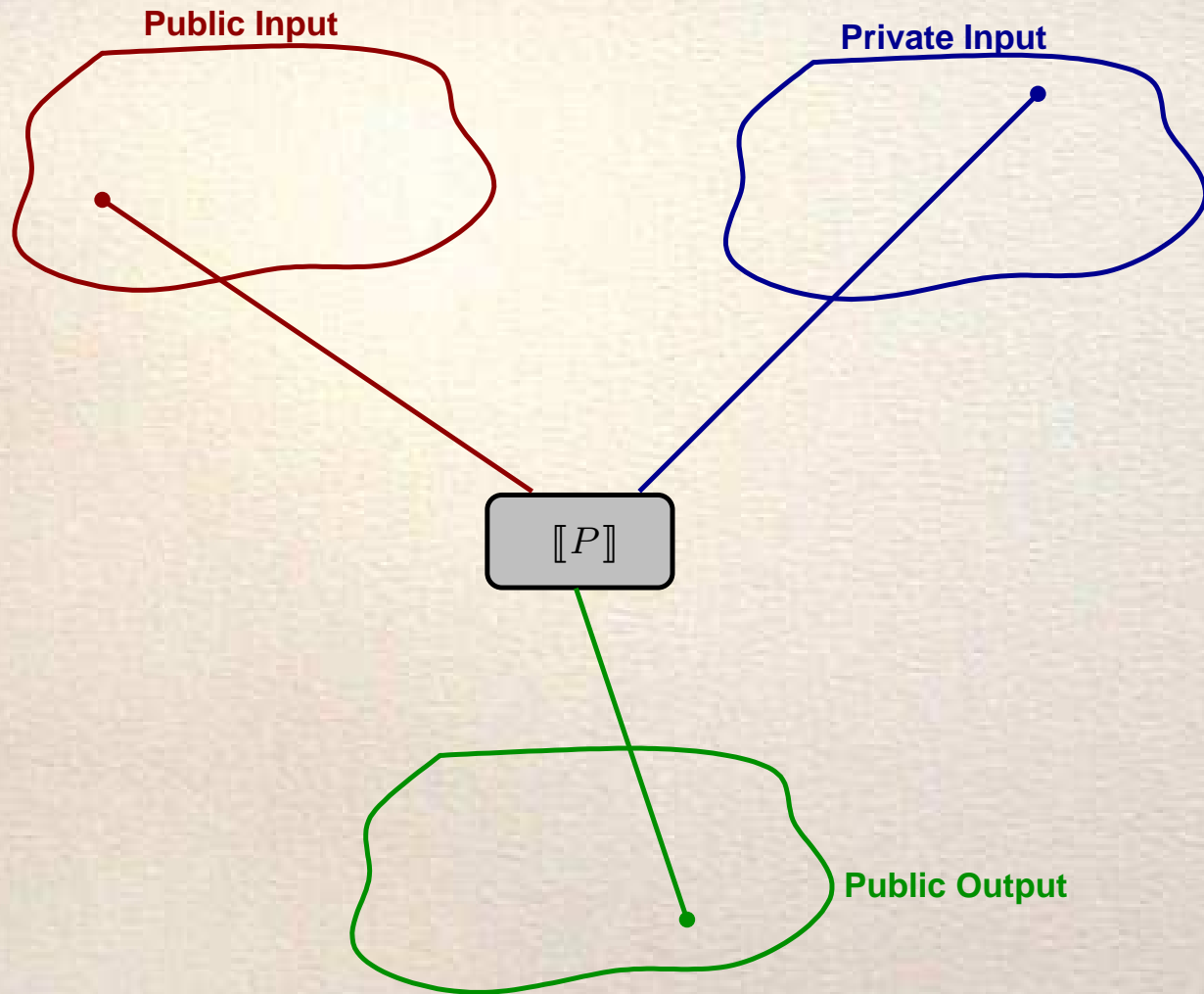
$$\forall l : L, \forall h_1, h_2 : H. [[P]](h_1, l)^{\perp} = [[P]](h_2, l)^{\perp}$$

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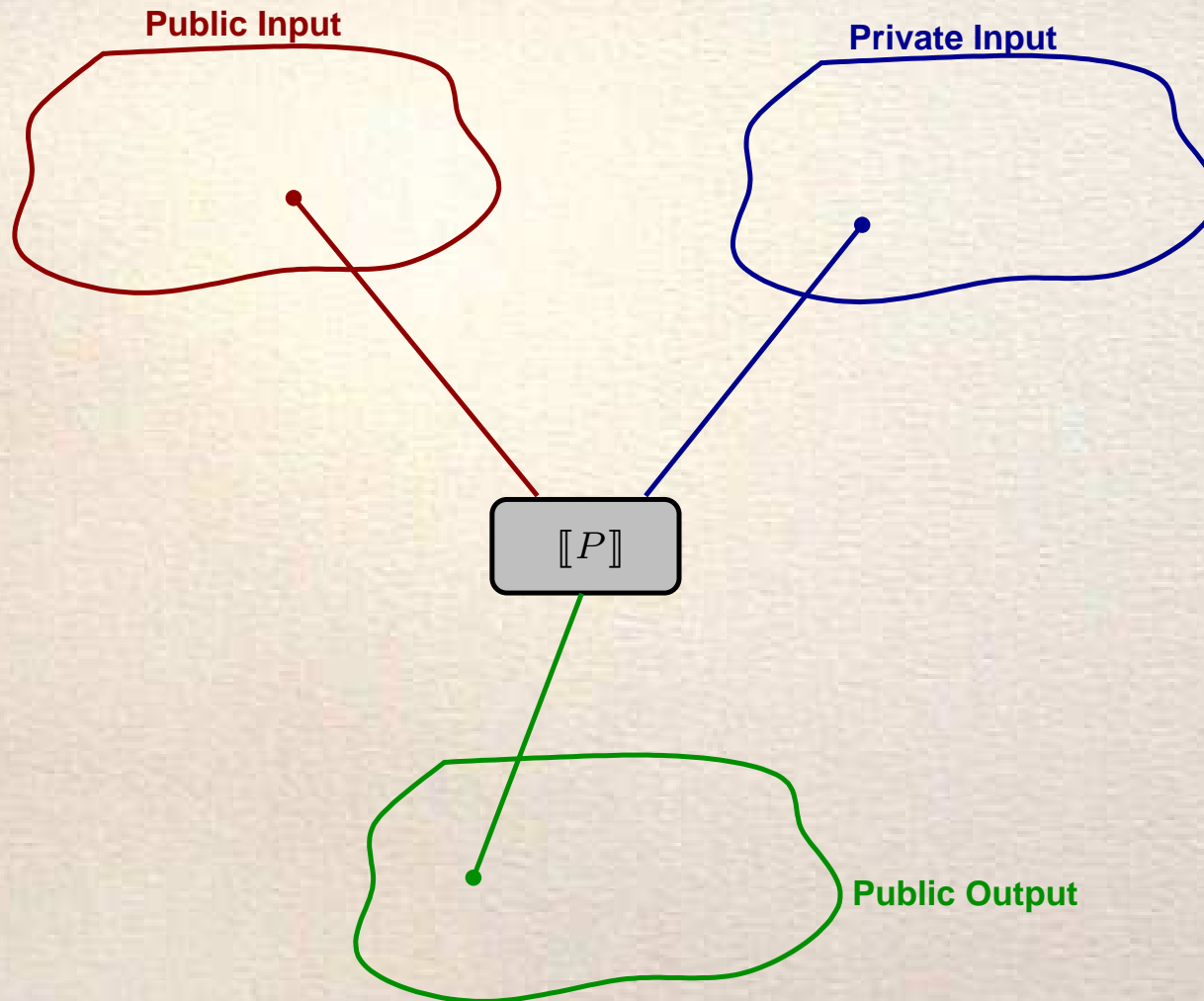
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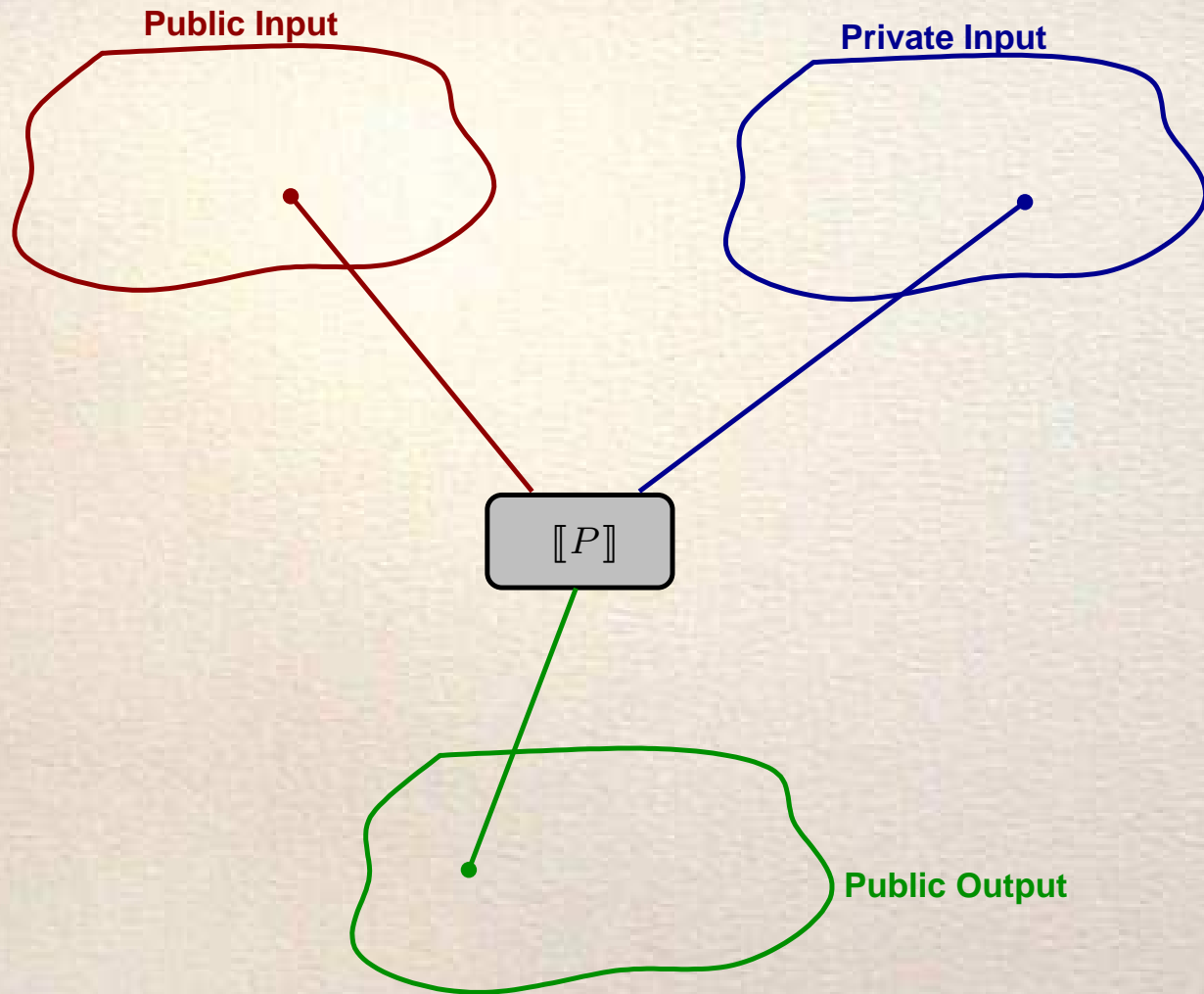
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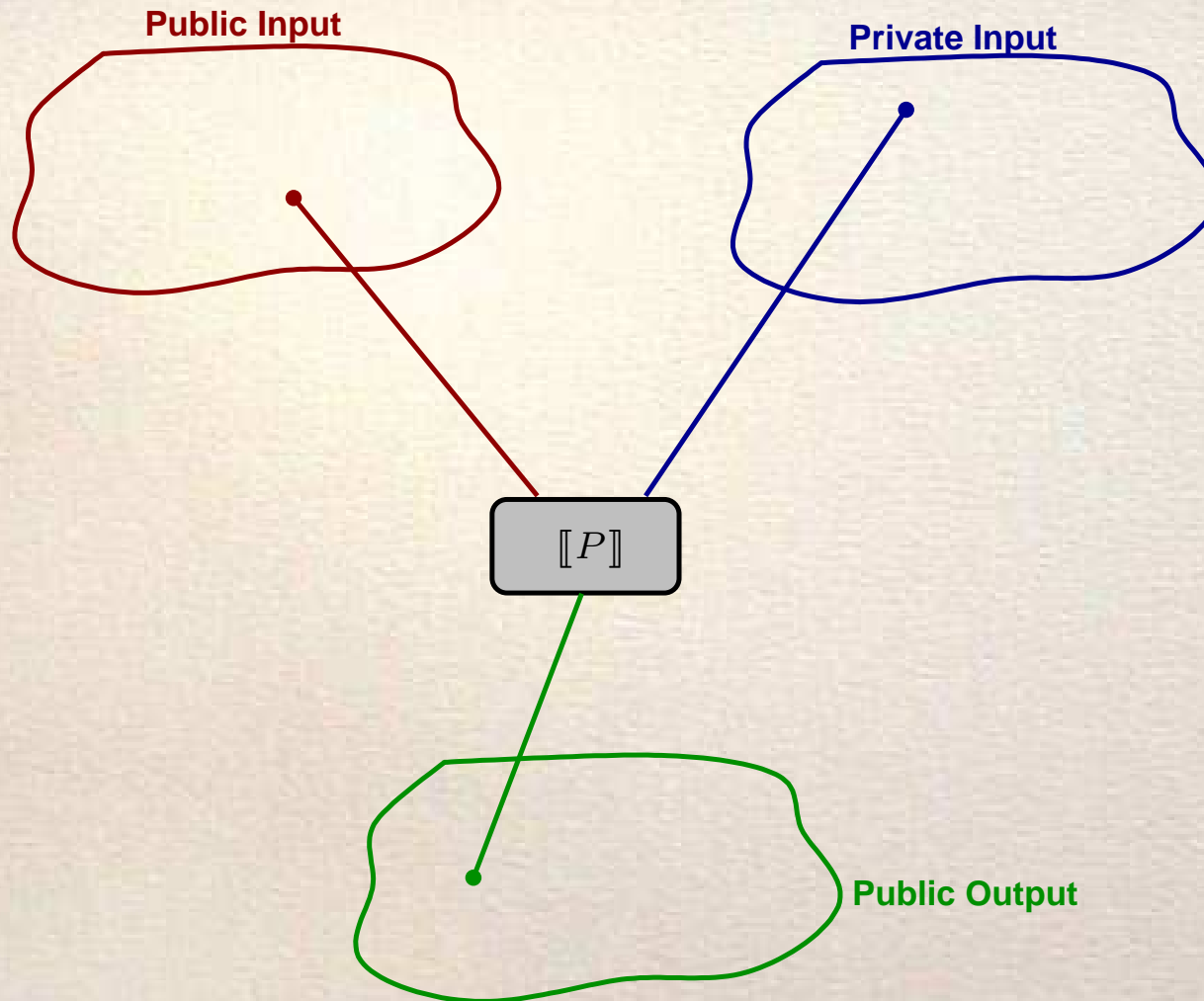
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NI: A COMPLETENESS PROBLEM

Recall that [Joshi & Leino'00]

P is *secure* iff $\text{HH}; P; \text{HH} \doteq P; \text{HH}$

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Let $X = \langle X^{\mathbb{H}}, X^{\mathbb{L}} \rangle \Rightarrow \mathcal{H}(X) \stackrel{\text{def}}{=} \langle \top^{\mathbb{H}}, X^{\mathbb{L}} \rangle \in \text{uco}(\wp(\mathbb{V}))$

$\mathbb{H}\mathbb{H}; P; \mathbb{H}\mathbb{H} \doteq P; \mathbb{H}\mathbb{H}$

\Downarrow

$\mathcal{H} \circ \llbracket P \rrbracket \circ \mathcal{H} = \mathcal{H} \circ \llbracket P \rrbracket$

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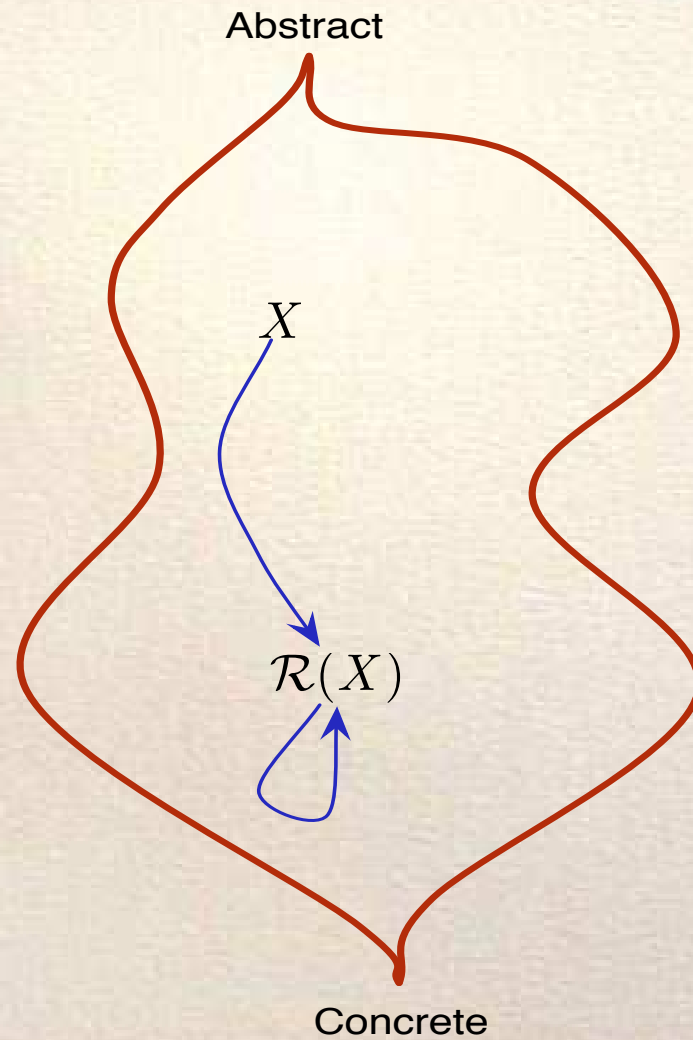
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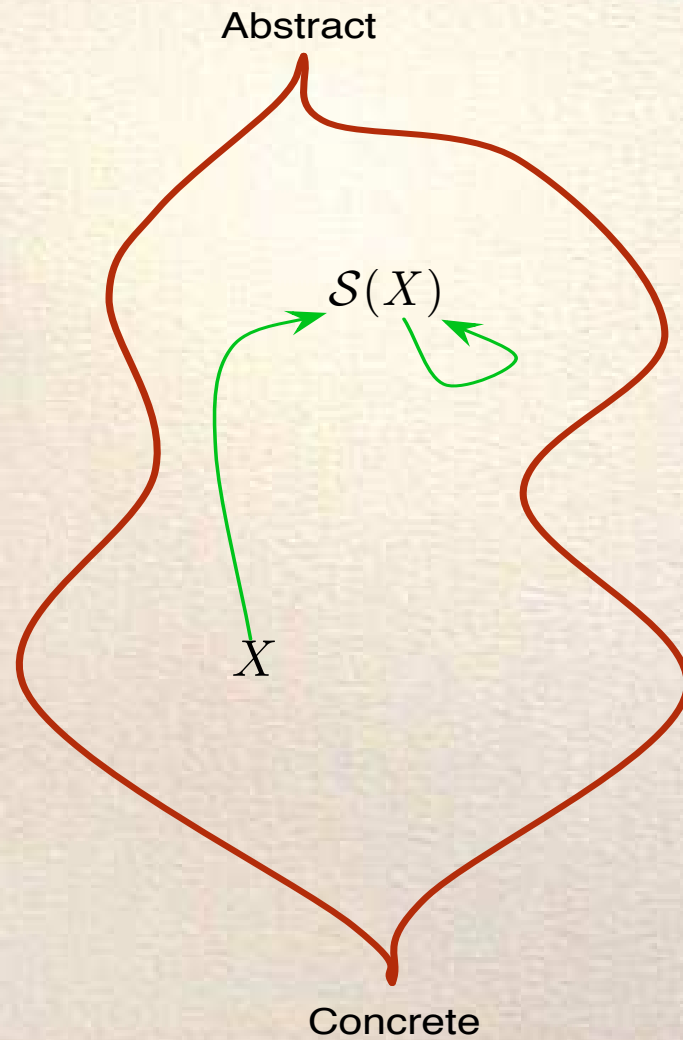
MAKING
ABSTRACT INTERPRETATIONS COMPLETE
10 YEARS AFTER

THE GEOMETRY OF AI TRANSFORMERS



lco – REFINEMENT

THE GEOMETRY OF AI TRANSFORMERS



uco – SIMPLIFICATION

THE GEOMETRY OF AI TRANSFORMERS

Can we use **abstract interpretation** for transforming **abstract interpretations**?



Refinements: $X \subseteq \mathcal{R}(X)$ (improving precision – **lower closure**)



Simplification: $\mathcal{S}(X) \subseteq X$ (reducing precision – **upper closure**)

[Janowitz '67]

$$(1) \quad \eta \in uco(C) \Leftrightarrow \eta^+ \in lco(C) \Leftrightarrow \begin{cases} \eta \circ \eta^+ = \eta^+ \\ \eta^+ \circ \eta = \eta \end{cases}$$

$$(2) \quad \eta \in uco(C) \Leftrightarrow \eta^- \in lco(C) \Leftrightarrow \begin{cases} \eta \circ \eta^- = \eta \\ \eta^- \circ \eta = \eta^- \end{cases}$$

THE GEOMETRY OF AI TRANSFORMERS

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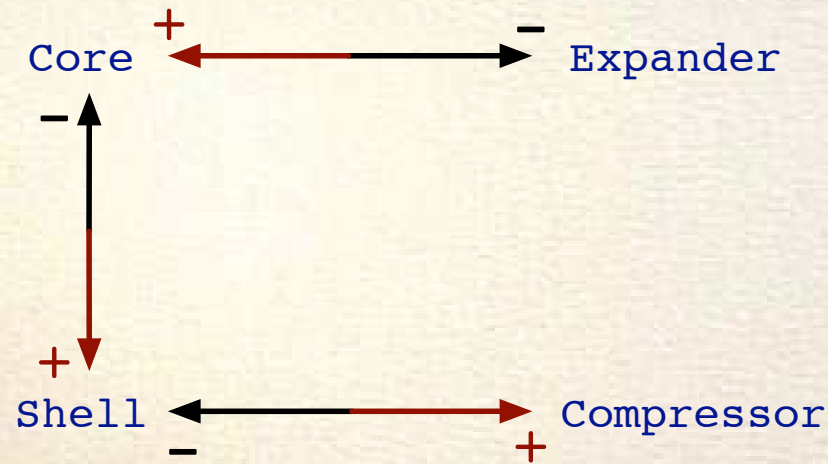
$$(1) \mathcal{S} \text{ simplification} \Leftrightarrow \mathcal{S}^+ \text{ refinement} \Leftrightarrow \begin{cases} \mathcal{S} \circ \mathcal{S}^+ = \mathcal{S}^+ \\ \mathcal{S}^+ \circ \mathcal{S} = \mathcal{S} \end{cases}$$

Shell/Core of a given property

$$(2) \mathcal{S} \text{ simplification} \Leftrightarrow \mathcal{S}^- \text{ refinement} \Leftrightarrow \begin{cases} \mathcal{S} \circ \mathcal{S}^- = \mathcal{S} \\ \mathcal{S}^- \circ \mathcal{S} = \mathcal{S}^- \end{cases}$$

Expander/Compressor for a given property

THE GEOMETRY OF DOMAIN TRANSFORMERS

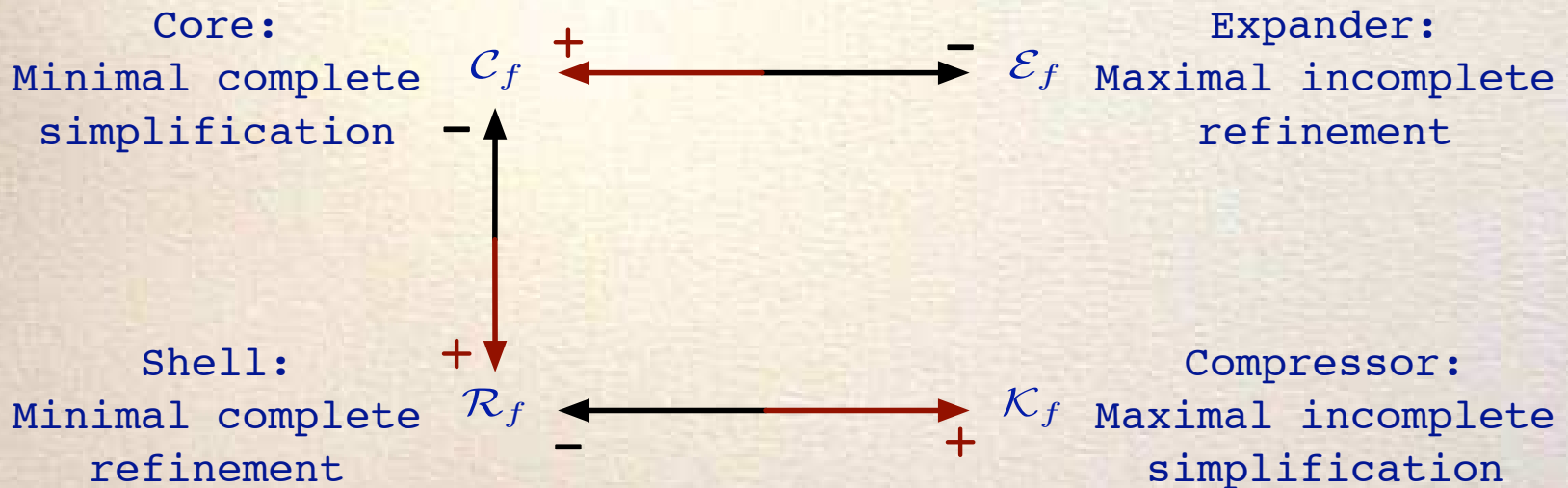


- ⇒ Shell/Core **minimally** transform domains in order to achieve a given property
- ⇒ Expander/Compressor **maximally** transform domains in order to achieve a given property

WHAT IS THE MEANING OF SHELL/CORE AND EXPANDER/COMPRESSOR FOR THE COMPLETENESS PROPERTY?

THE GEOMETRY OF DOMAIN TRANSFORMERS

Basic abstract domain transformers

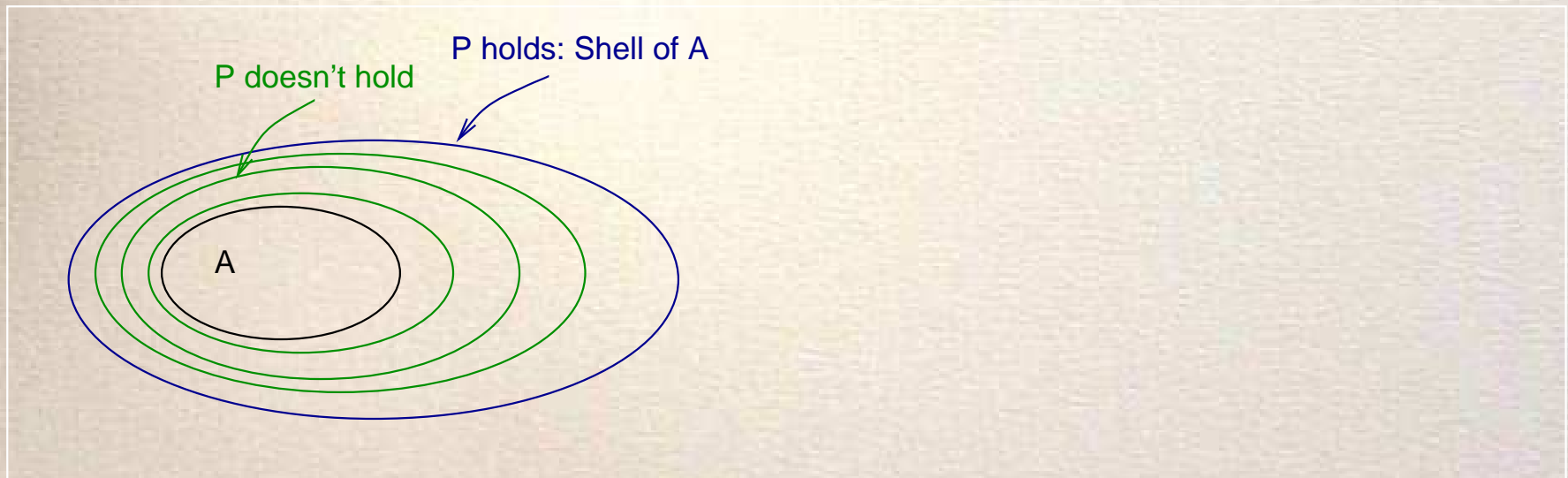


[Giacobazzi et al.'00]

[SAS'08]

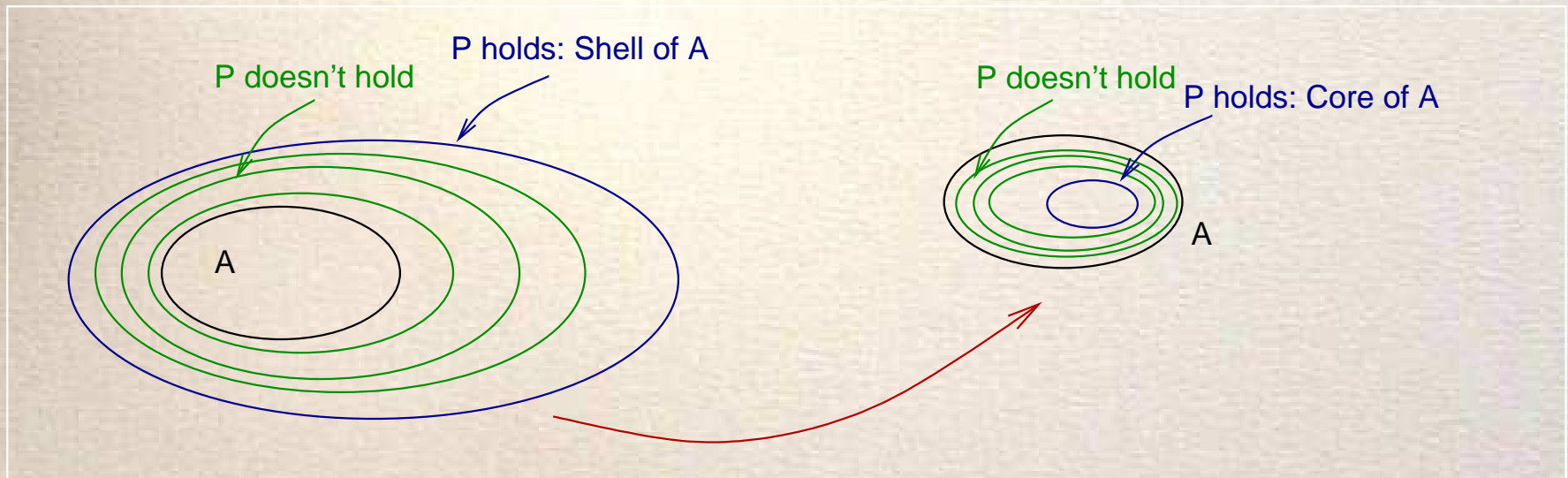
SHELL/CORE

Let P be completeness

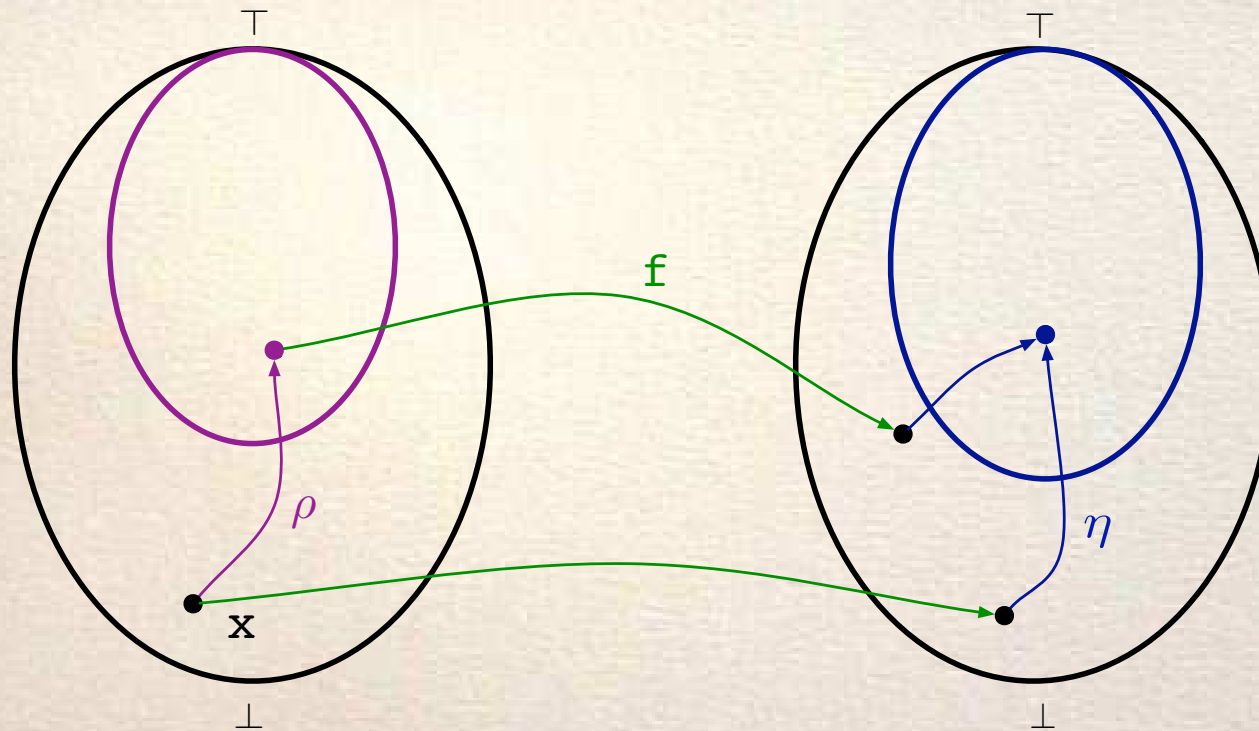


SHELL/CORE

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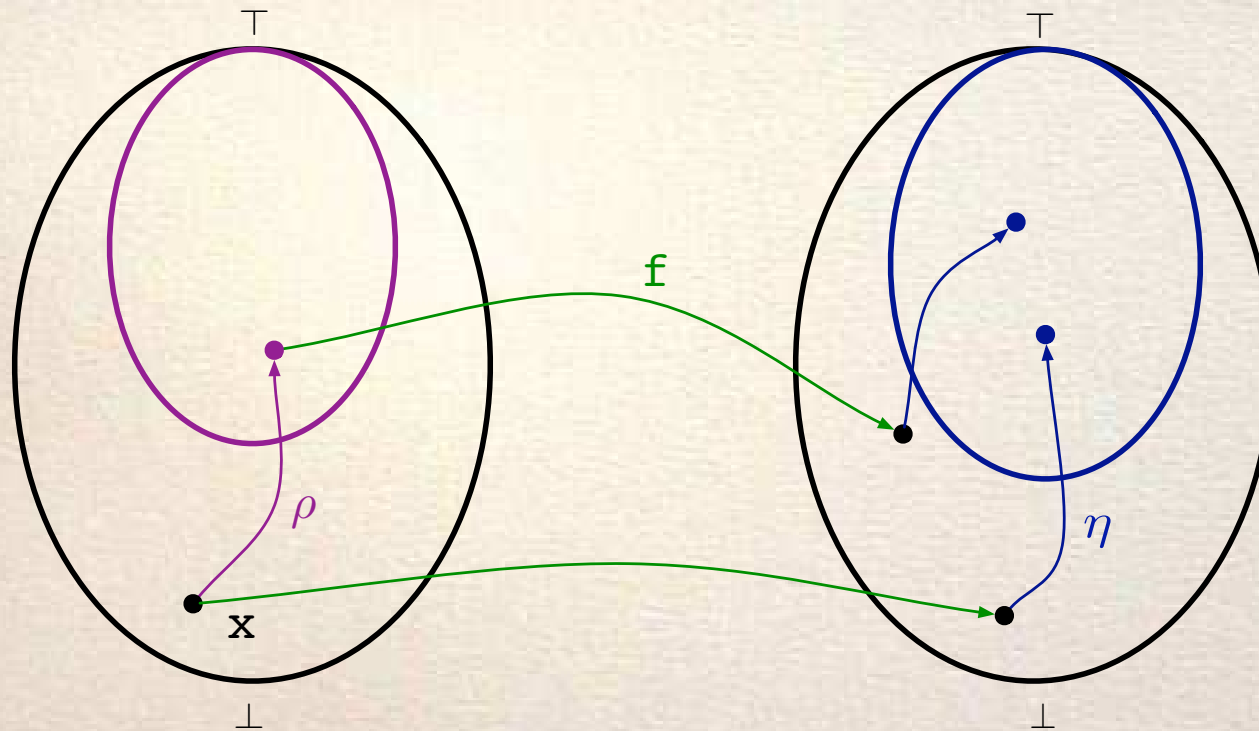


DOMAIN COMPLETENESS: SHELL/CORE



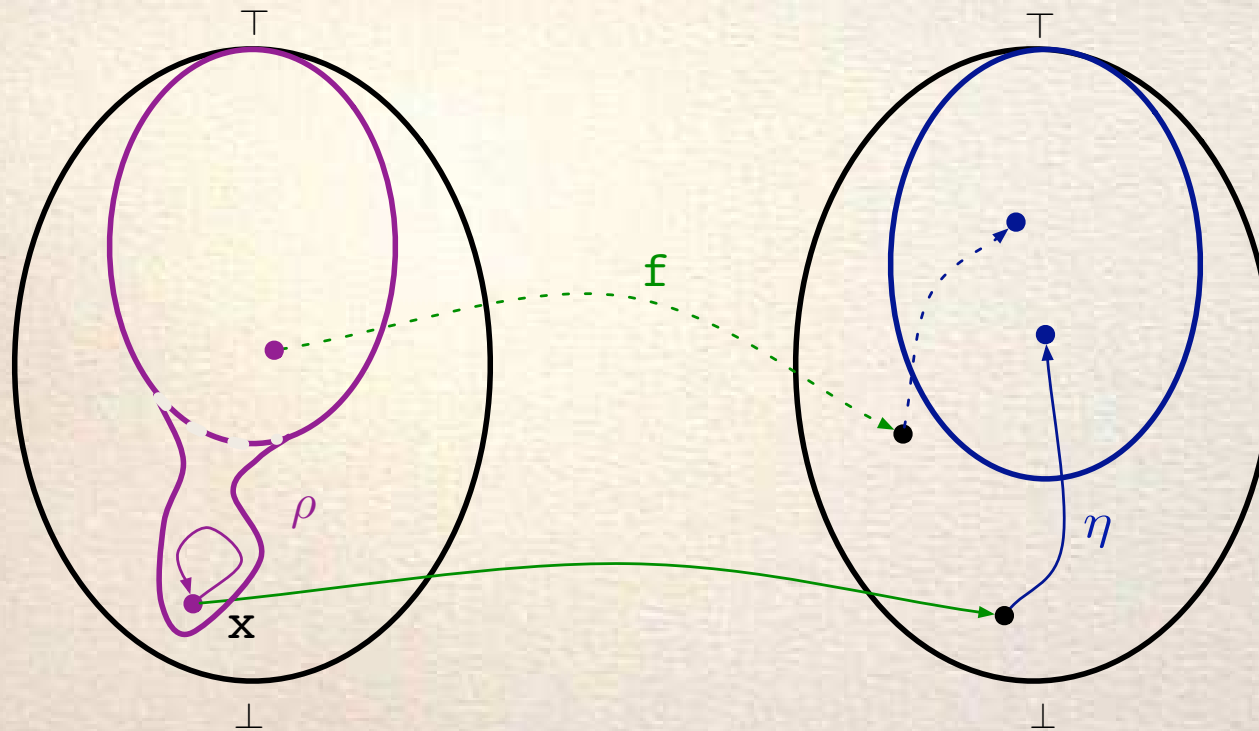
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DOMAIN COMPLETENESS: SHELL/CORE



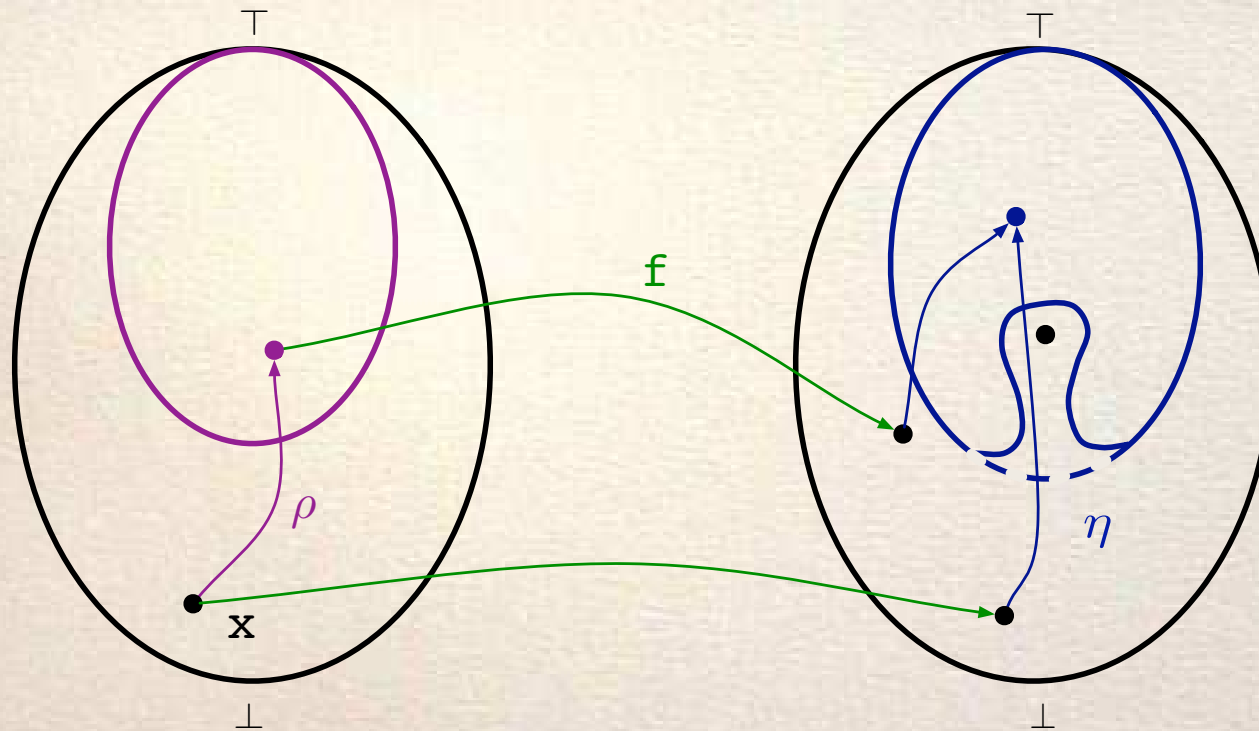
BACKWARD IN-COMPLETENESS: $\eta \circ f \circ \rho \geq \eta \circ f$

DOMAIN COMPLETENESS: SHELL/CORE



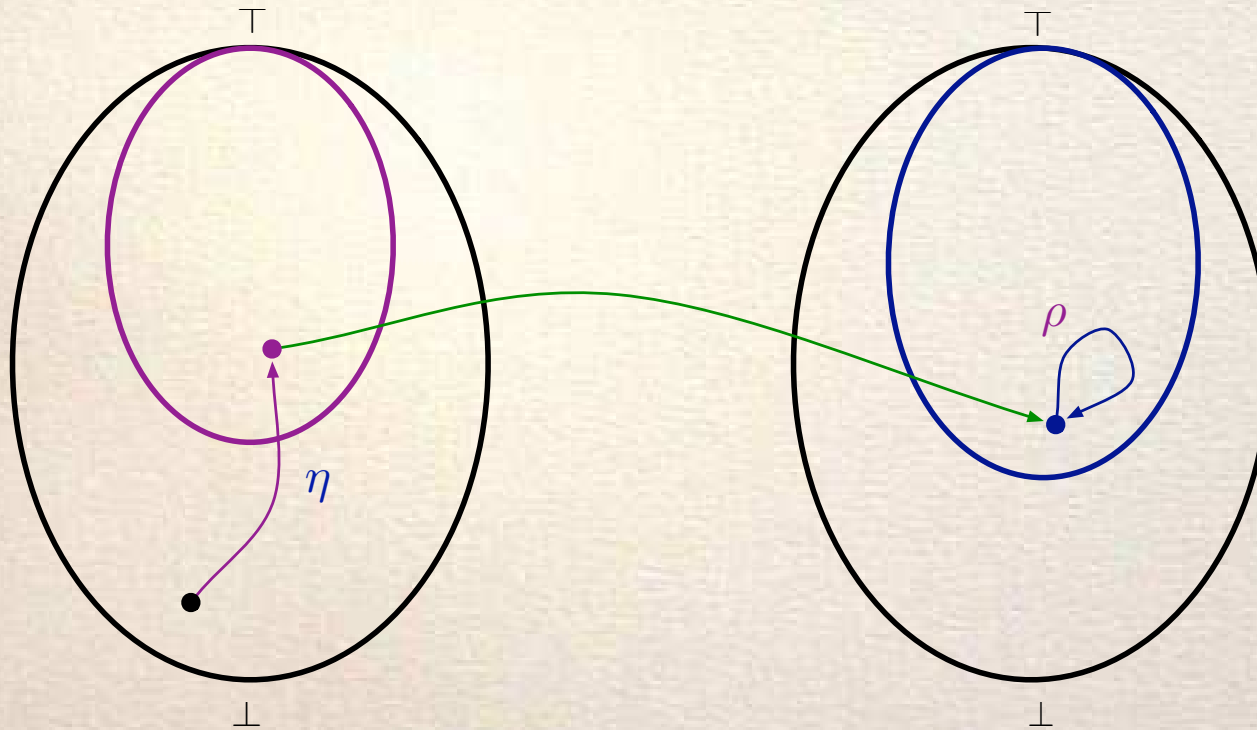
Making BACKWARD COMPLETE: Refining input domains [GRS'00]

DOMAIN COMPLETENESS: SHELL/CORE



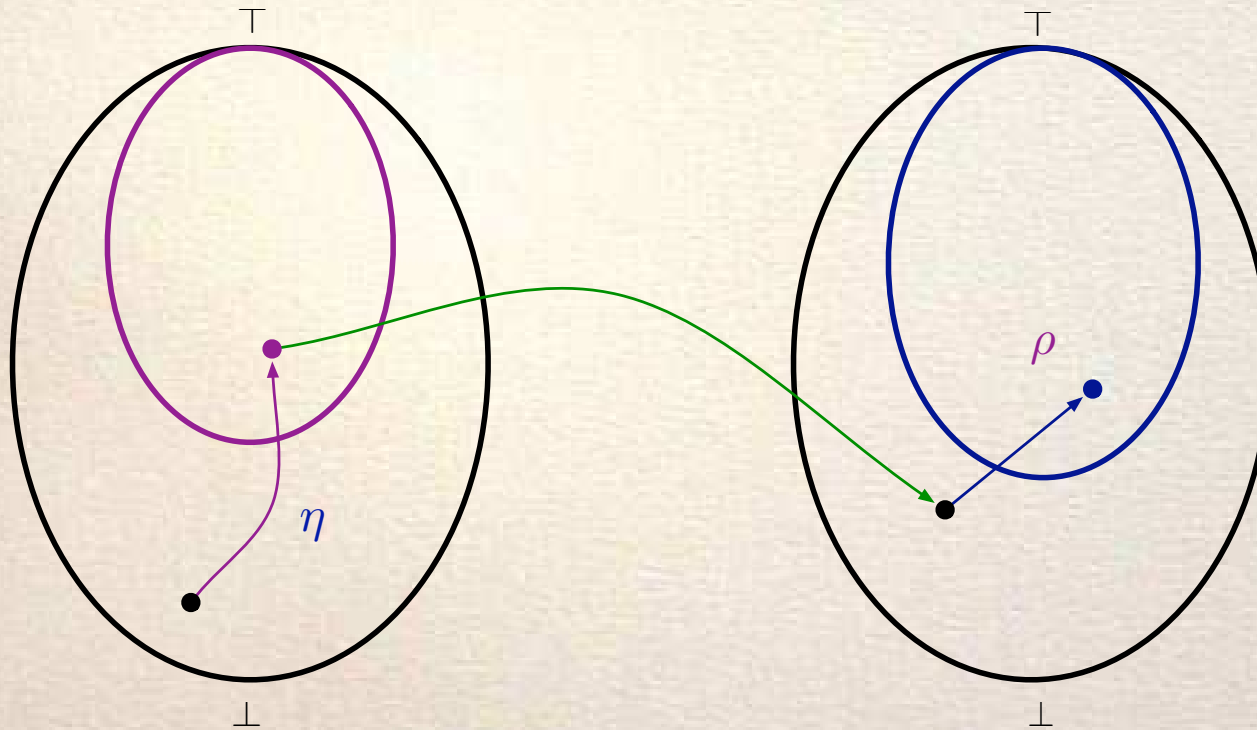
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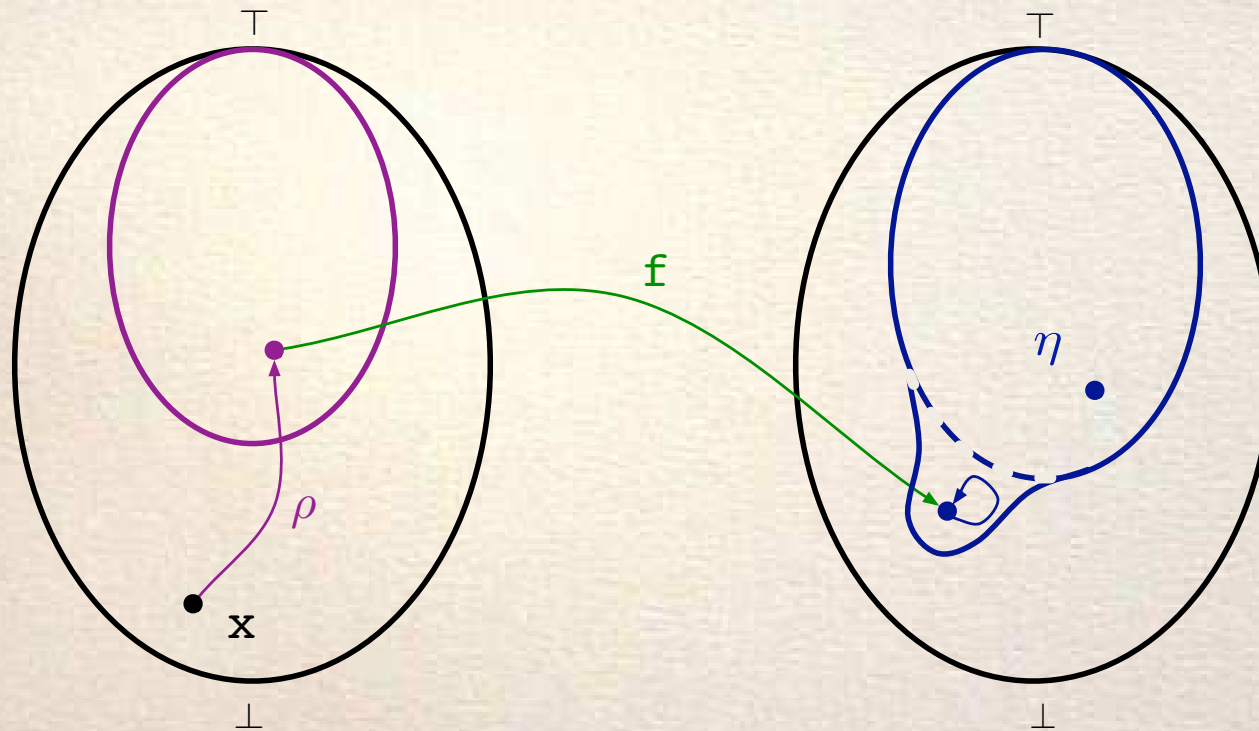
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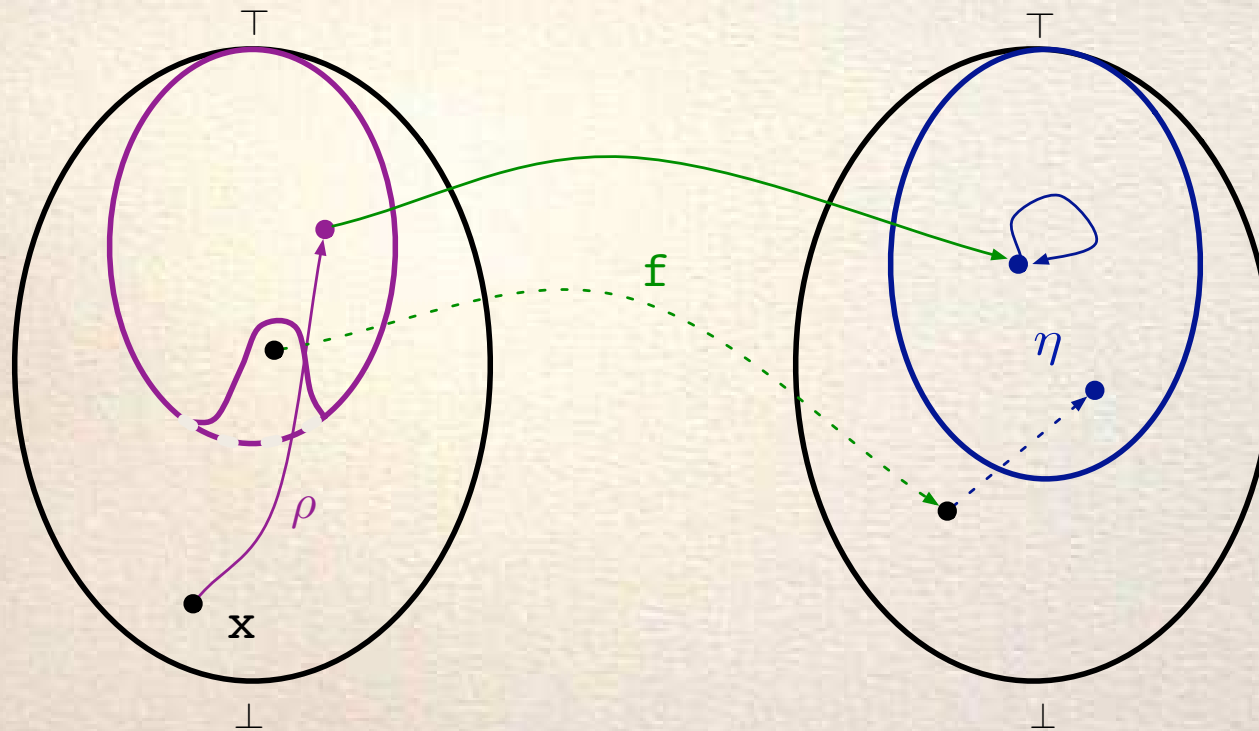
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Making FORWARD COMPLETE: Refining output domains [GQ'01]

DOMAIN COMPLETENESS: SHELL/CORE



Making FORWARD COMPLETE: Simplifying input domains [GQ'01]

BACKWARD VS FORWARD



A domain is *backward complete* wrt f iff it is *forward complete* wrt

$$f^+ = \lambda X. \bigcup \left\{ Y \mid f(Y) \subseteq X \right\};$$



A (not trivial) partition is *backward stable* wrt f iff it is *forward stable* wrt

$$f^{-1} = \lambda X. \left\{ y \mid f(y) \in X \right\};$$



If f is *injective*, a (not trivial) partition is *forward stable* wrt f iff it is *backward stable* wrt f^{-1} ;

BACKWARD VS FORWARD



A domain is *backward complete* wrt f iff it is *forward complete* wrt $f^+ = \lambda X. \cup \{ Y \mid f(Y) \subseteq X \}$;



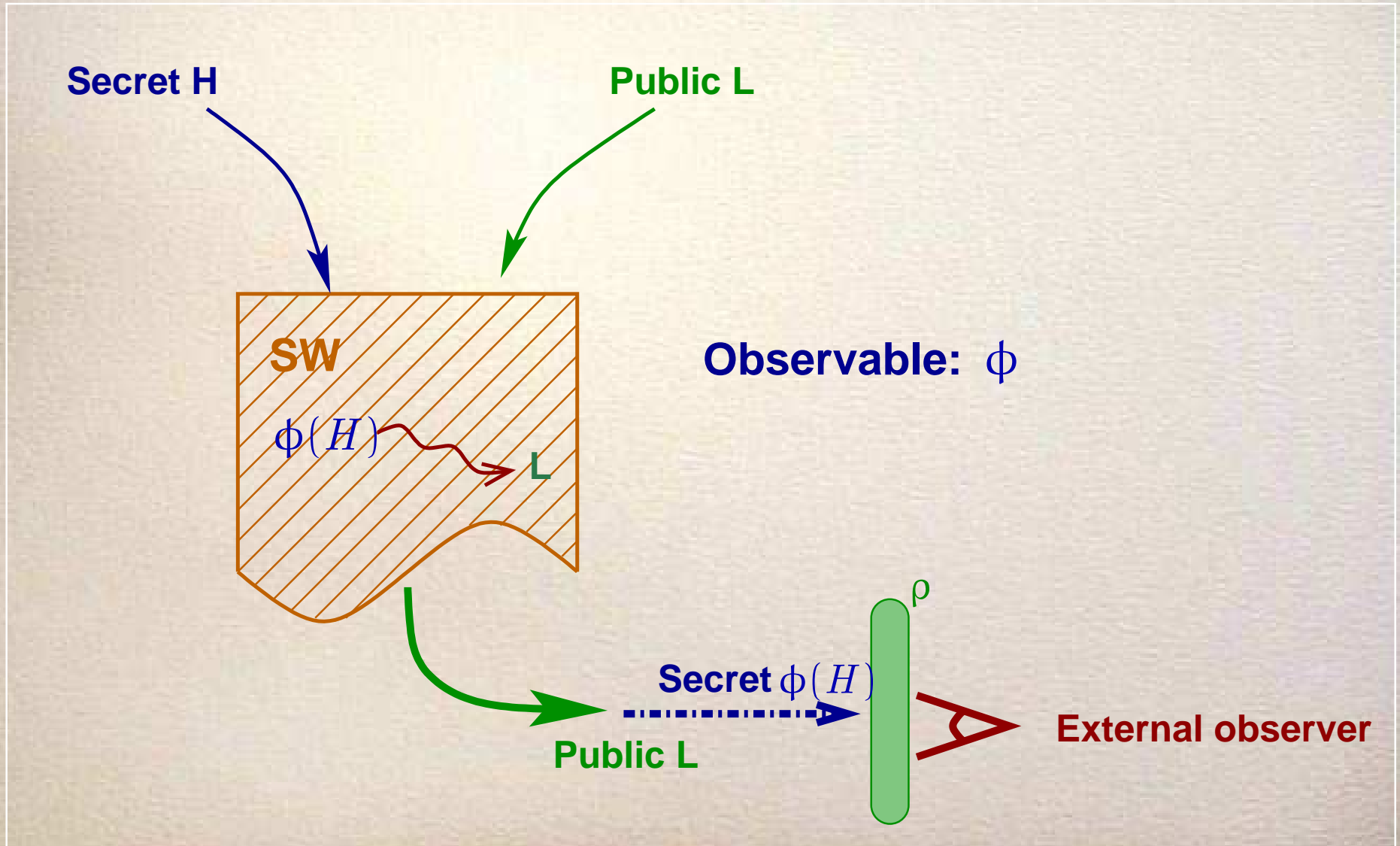
A (not trivial) partition is *backward stable* wrt f iff it is *forward stable* wrt $f^{-1} = \lambda X. \{ y \mid f(y) \in X \}$;



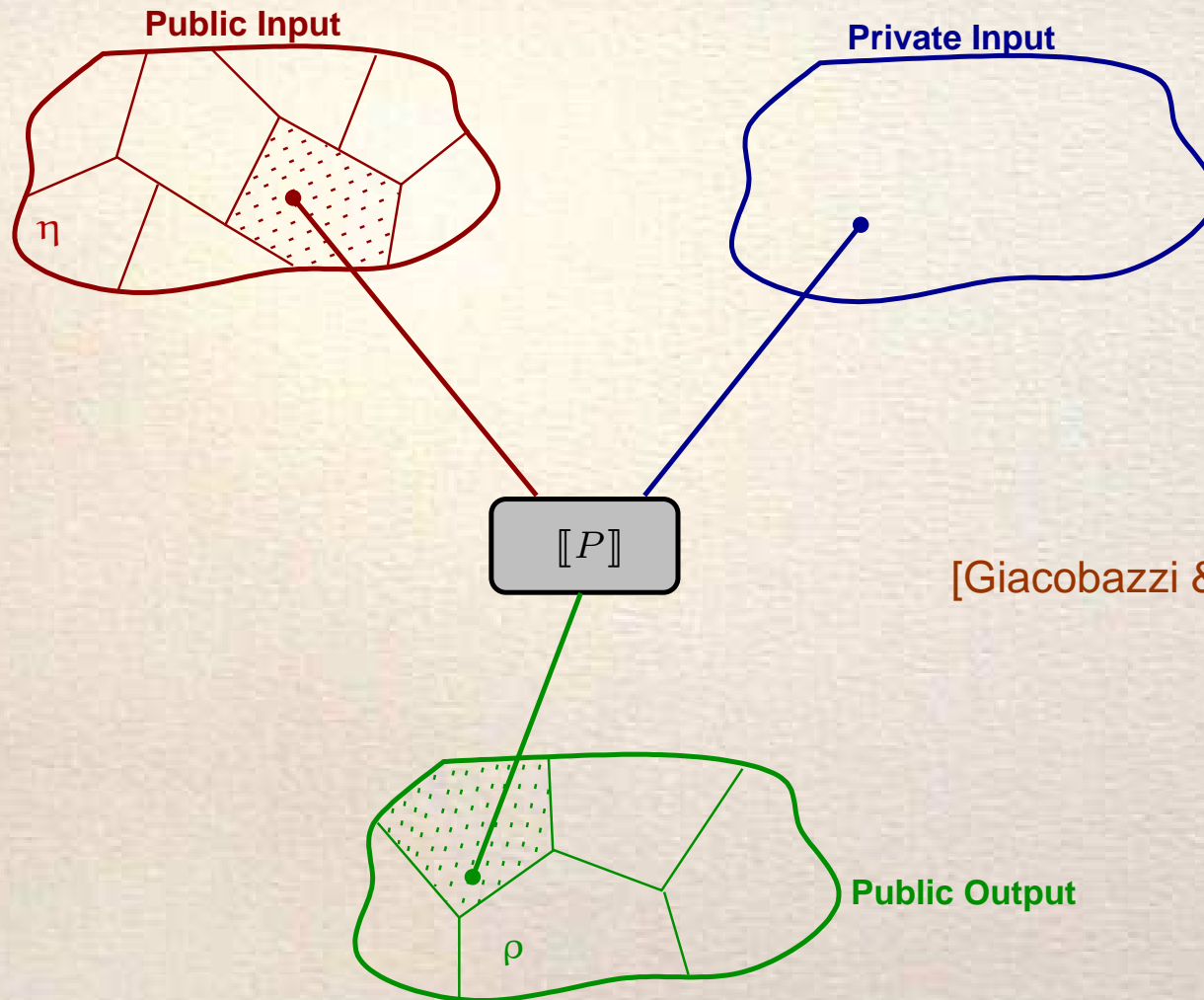
If f is *injective*, a (not trivial) partition is *forward stable* wrt f iff it is *backward stable* wrt f^{-1} ;

A **backward** problem can always be transformed in a **forward** one,
but the viceversa is not always possible!

NEW PERSPECTIVES IN LANGUAGE-BASED SECURITY



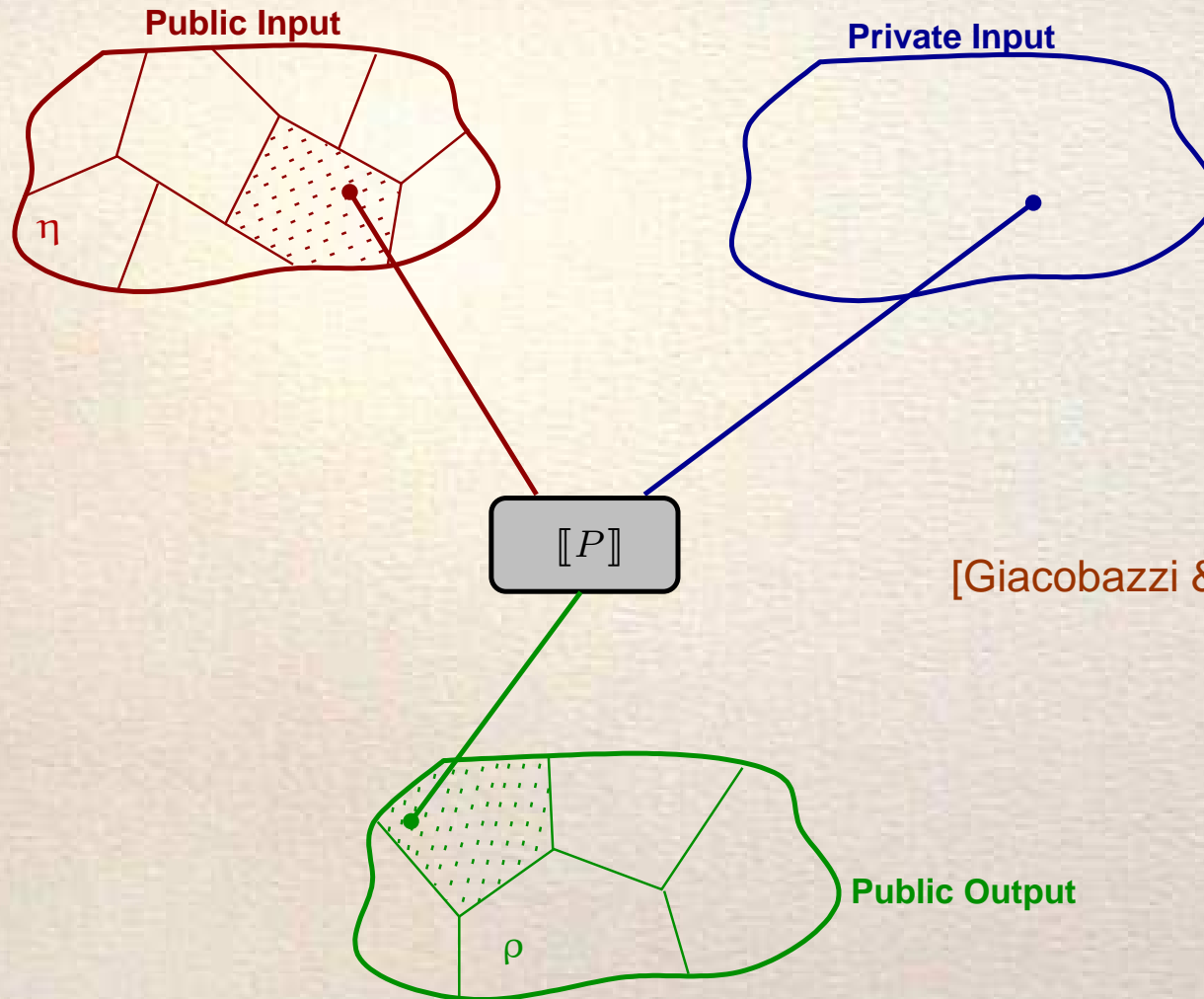
ABSTRACT NON-INTERFERENCE (NARROW)



[Giacobazzi & Mastroeni '04]

$$\rho, \eta \in uco(\wp(\mathbb{V}^L)): [\eta]P(\rho): \eta(l_1) = \eta(l_2) \Rightarrow \rho([[P]](h_1, l_1)^L) = \rho([[P]](h_2, l_2)^L)$$

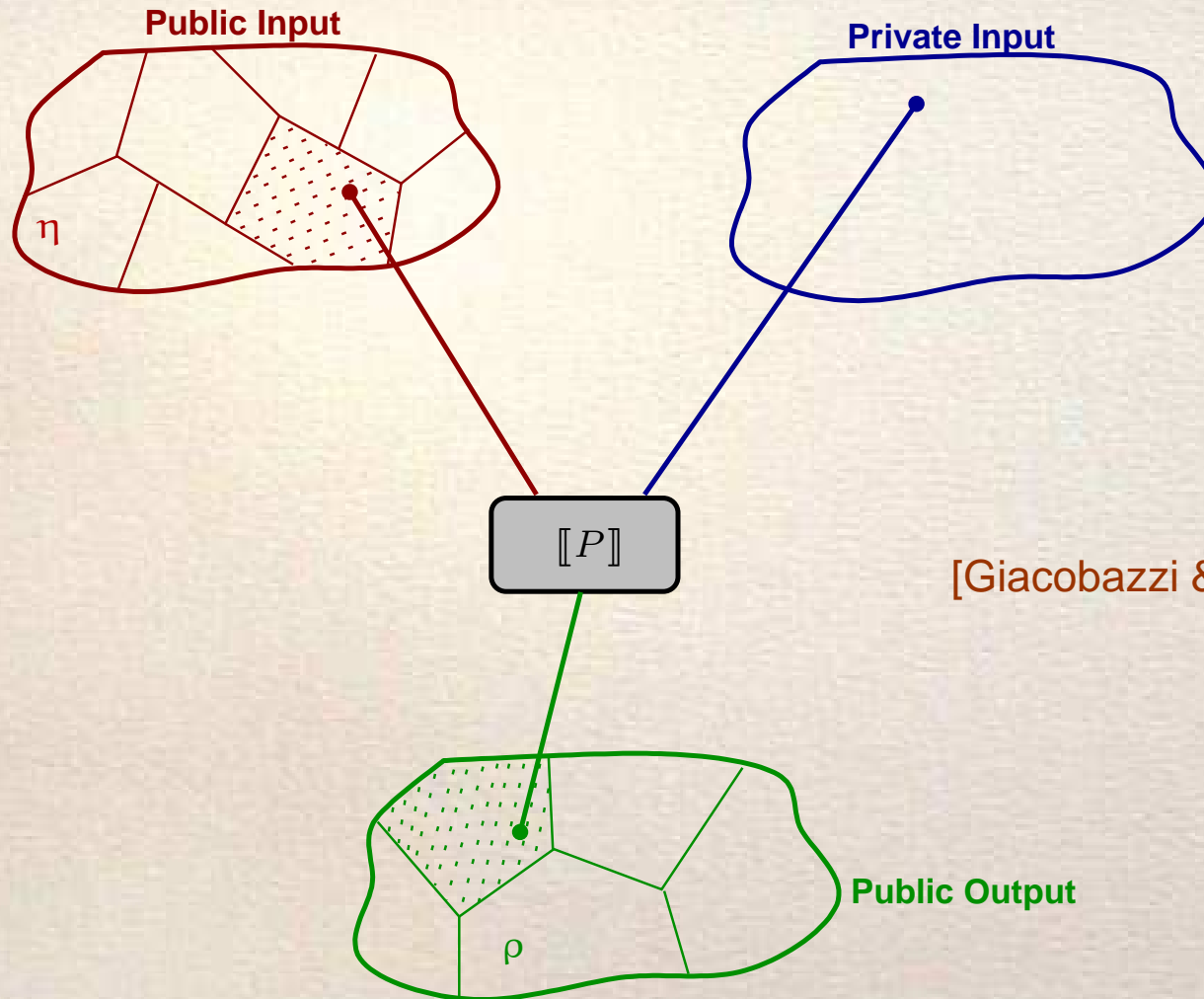
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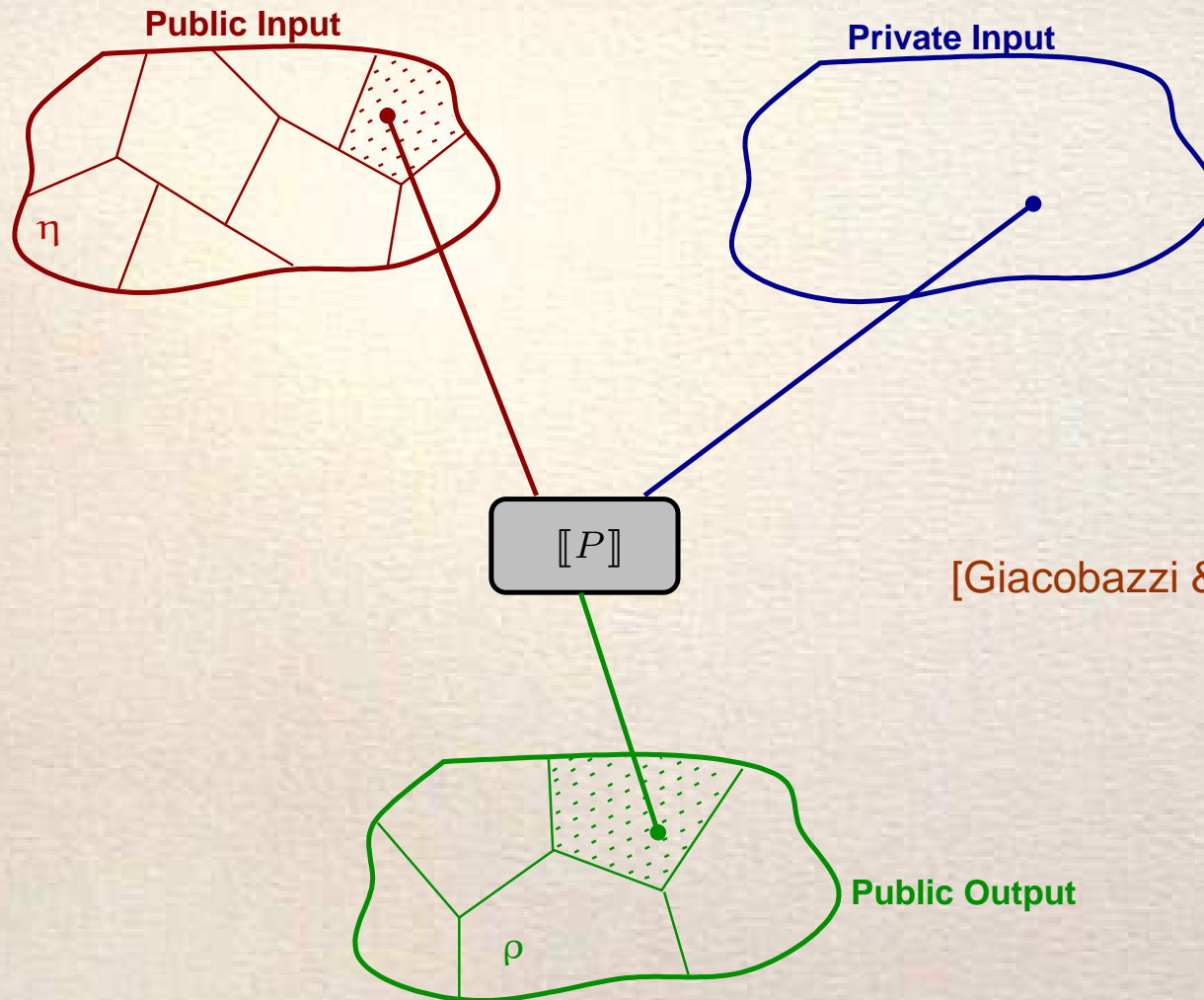
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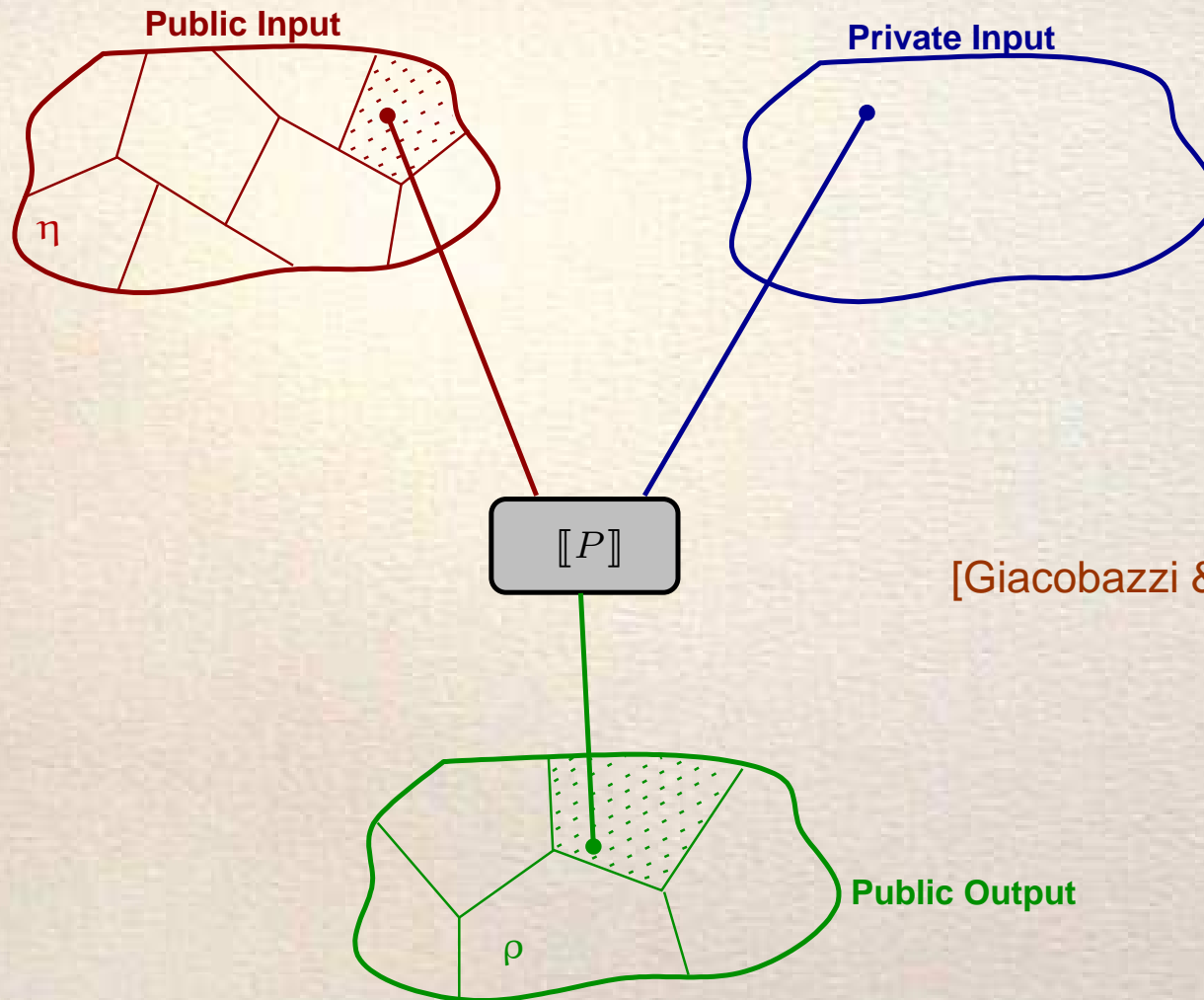
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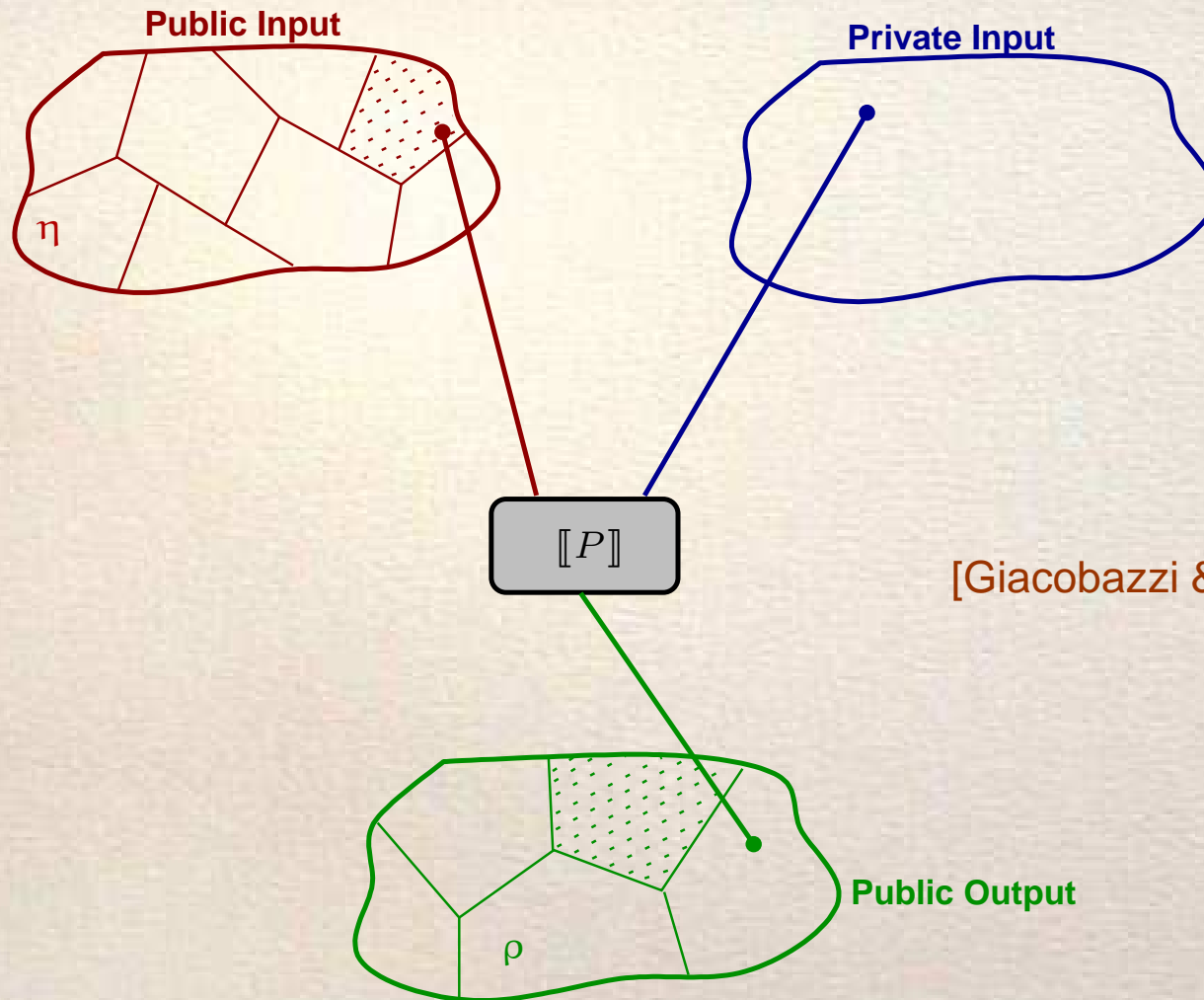
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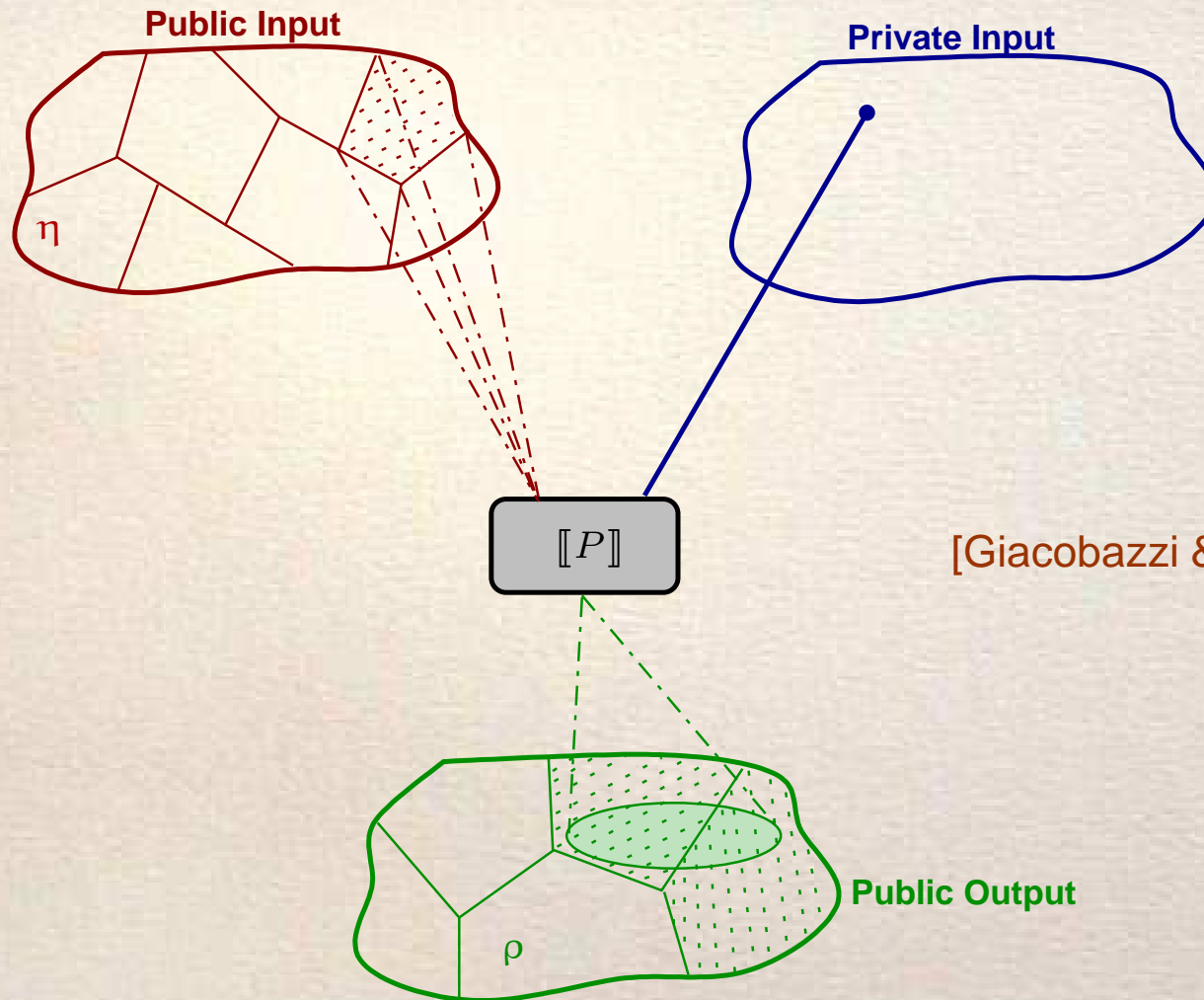
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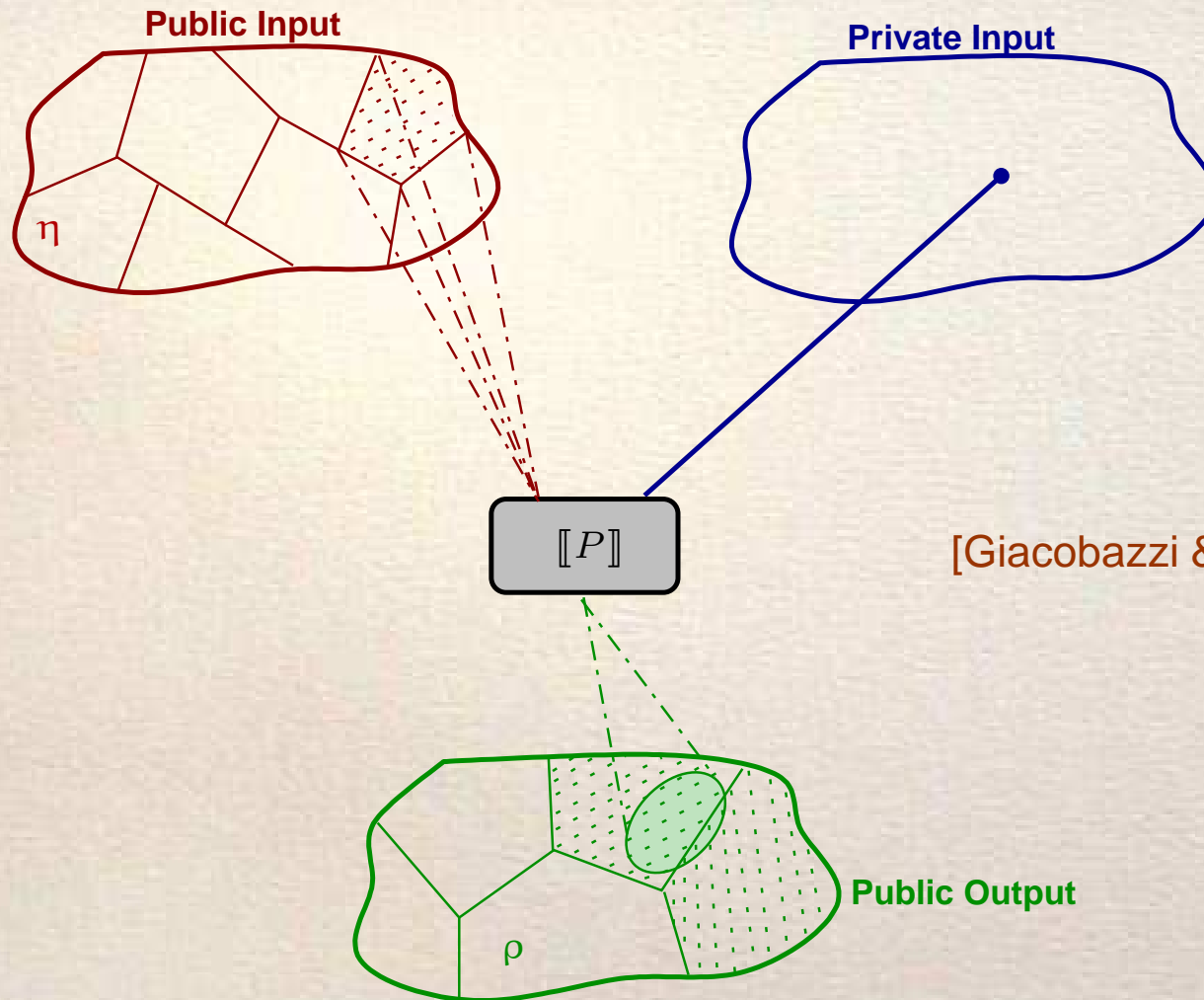


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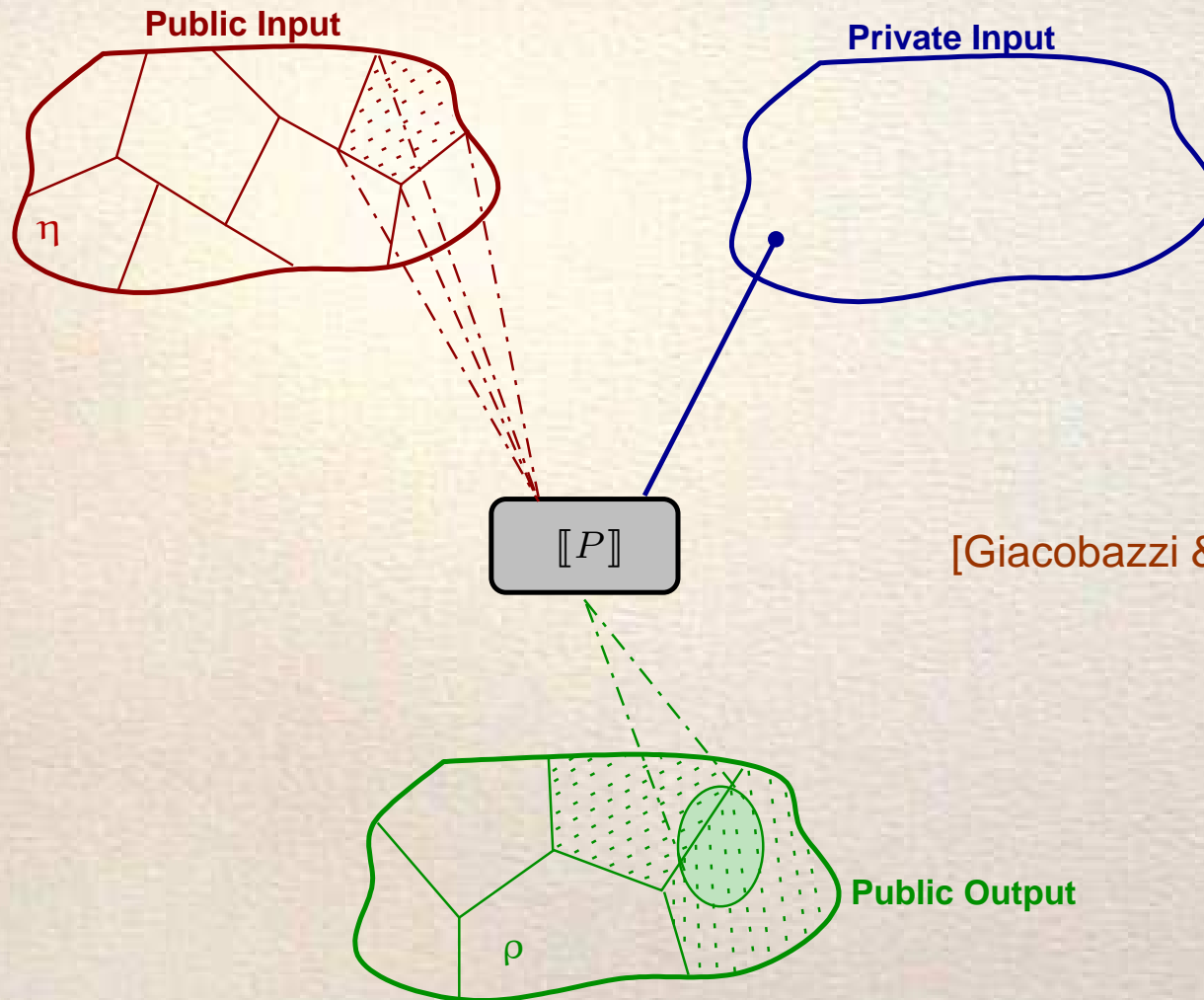


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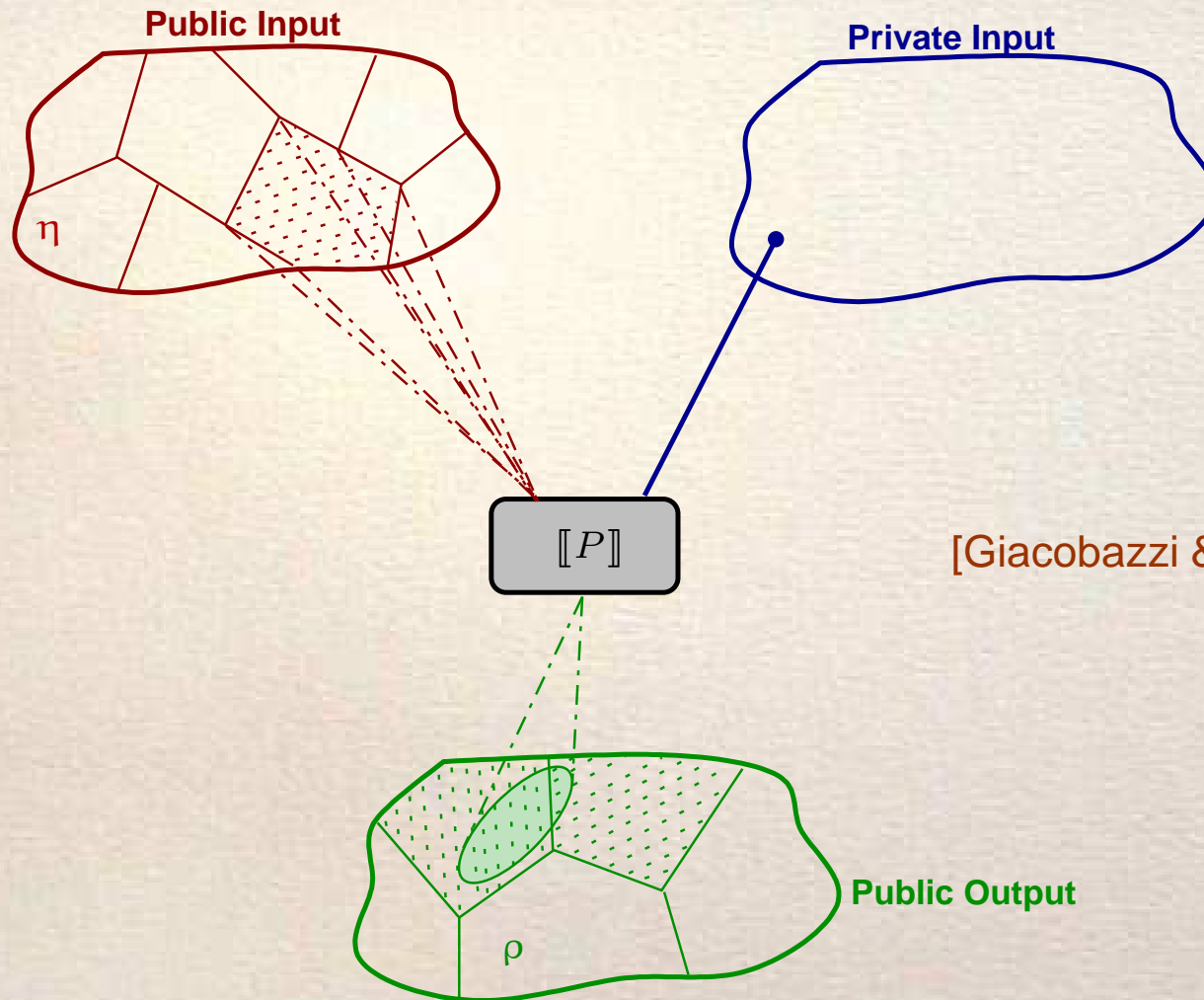


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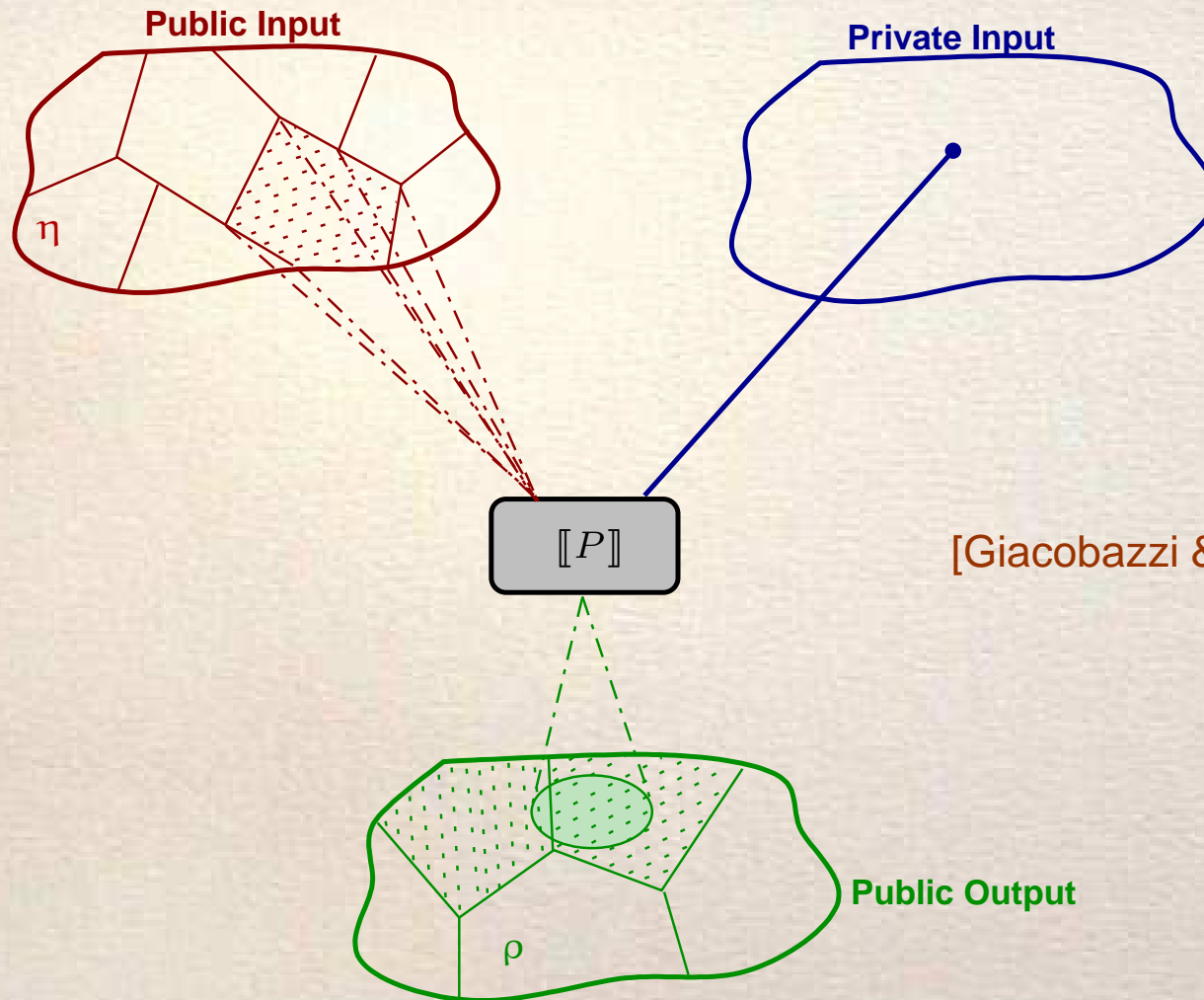


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EXAMPLES

EXAMPLE I:

while h **do** $(l := l + 2; h := h - 1)$.

Standard Non-Interference $\equiv [id]P(id)$

$$h = 0, l = 1 \rightsquigarrow l = 1$$

$$h = 1, l = 1 \rightsquigarrow l = 3$$

$$h = n, l = 1 \rightsquigarrow l = 1 + 2n$$

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$[id]P(Par)$

$$h = 0, l = 1 \rightsquigarrow Par(l) = \text{odd}$$

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EXAMPLES

EXAMPLE II:

$$P = l := 2 * l * h^2.$$

$[Par]P(Sign)$

$$h = 1, l = 4 \text{ (} Par(4) = \text{even) } \rightsquigarrow Sign(l) = +$$
$$h = 1, l = -4 \text{ (} Par(-4) = \text{even) } \rightsquigarrow Sign(l) = -$$

DECEPTIVE FLOW

EXAMPLES

EXAMPLE II:

$$P = l := 2 * l * h^2.$$

$[Par]P(Sign)$

$$\begin{aligned} h = 1, l = 4 \quad (Par(4) = \text{even}) &\rightsquigarrow Sign(l) = + \\ h = 1, l = -4 \quad (Par(-4) = \text{even}) &\rightsquigarrow Sign(l) = - \end{aligned}$$

DECEPTIVE FLOW



$(Par)P(Sign)$

$$\begin{aligned} h = -3, Par(l) = \text{even} &\rightsquigarrow Sign(l) = \text{I don't know} \\ h = 1, Par(l) = \text{even} &\rightsquigarrow Sign(l) = \text{I don't know} \end{aligned}$$

EXAMPLE III:

$$P = l := l * h^2.$$

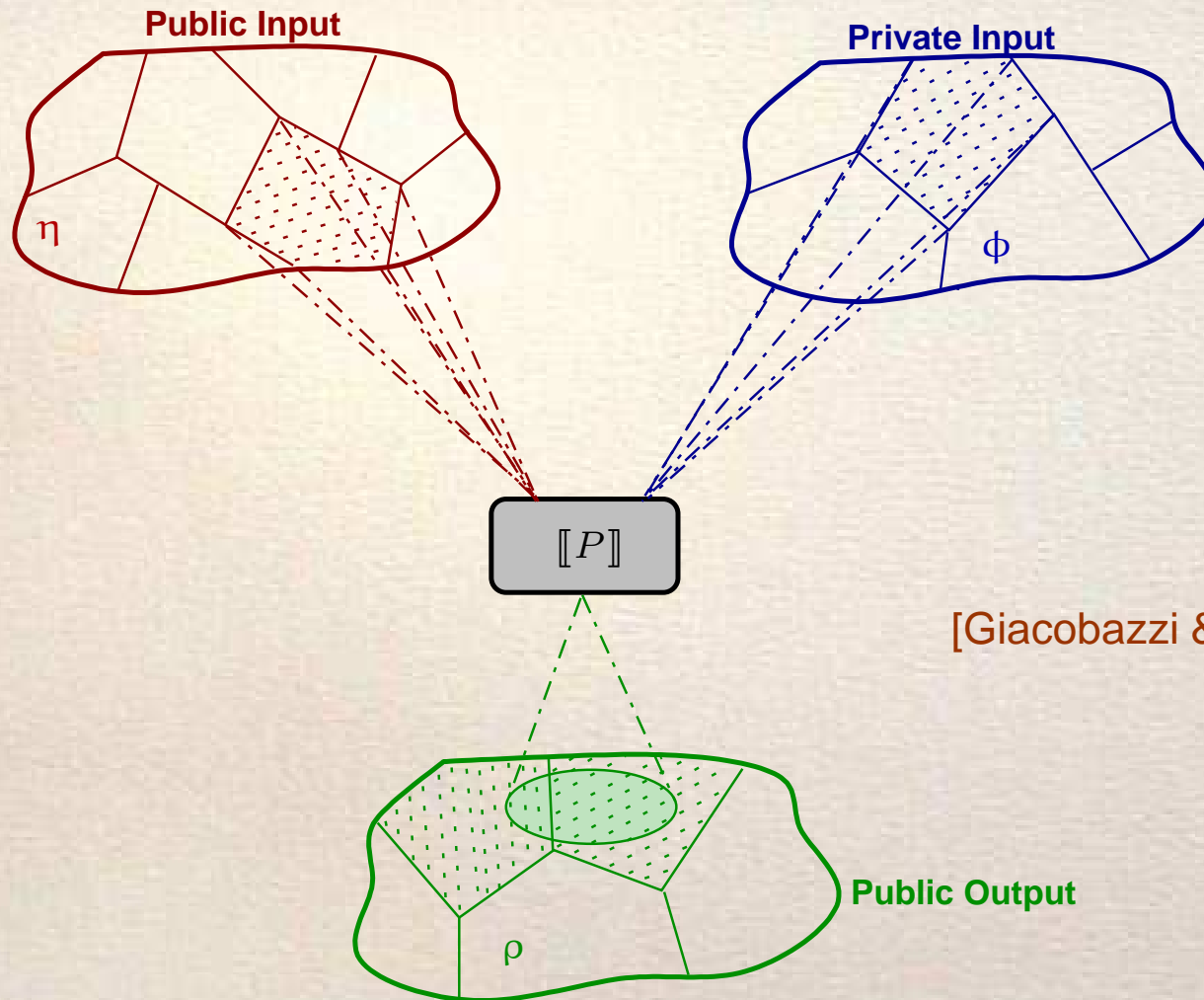
$$\boxed{(id)P(Par)}$$

$$h = 2, l = 1 \rightsquigarrow Par(l) = \text{even}$$

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DECLASSIFIED ANI VIA BLOCKING

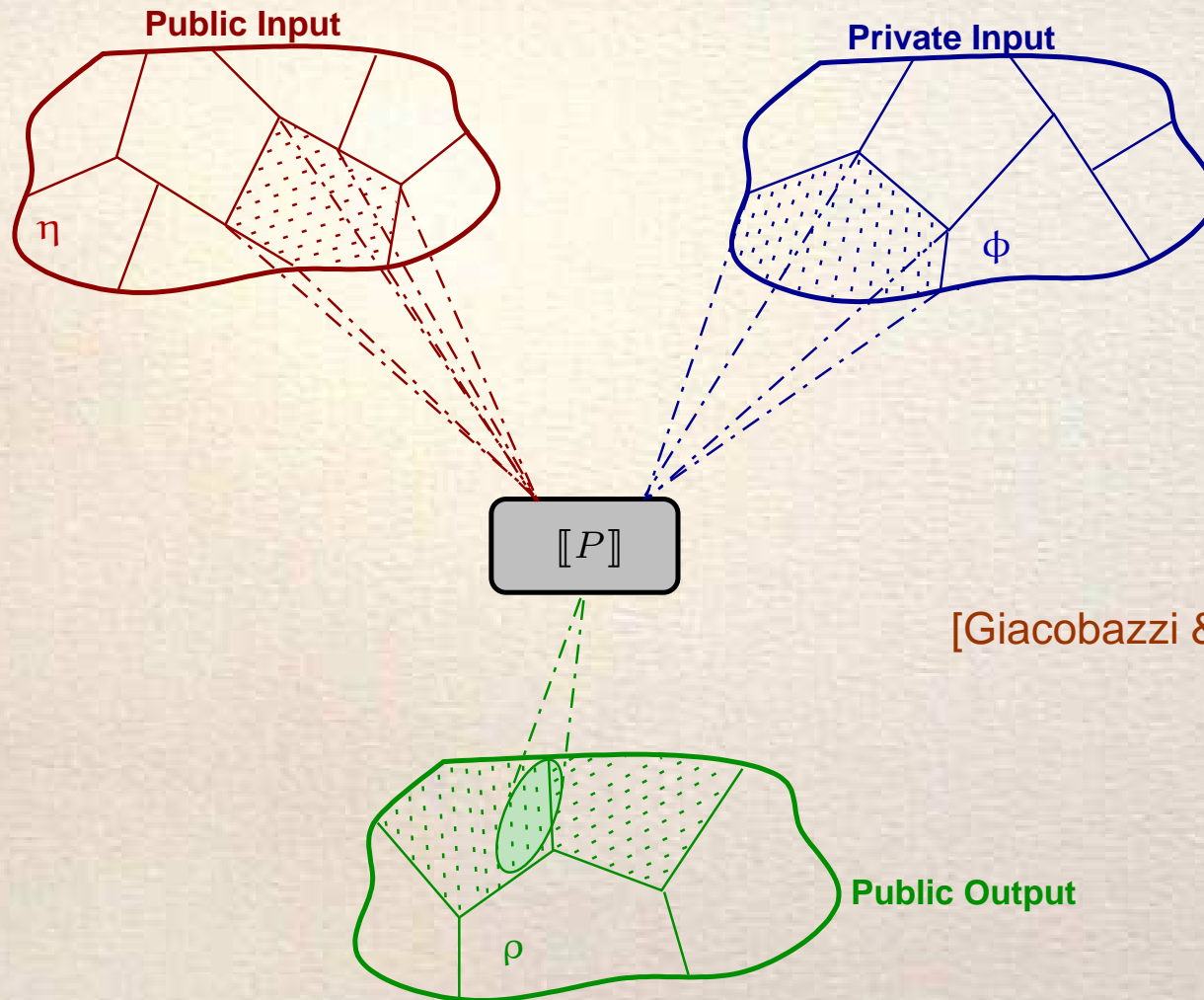


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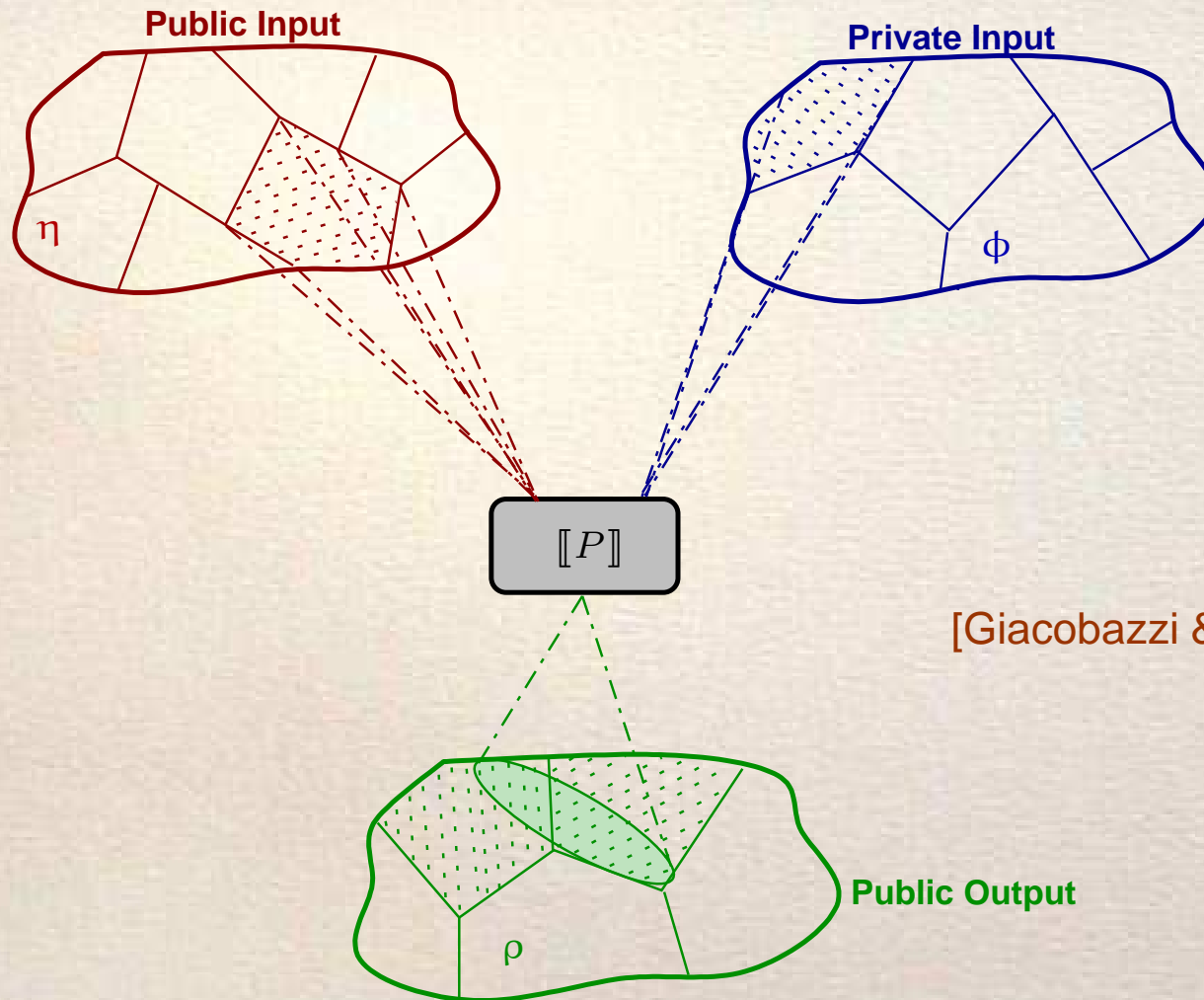


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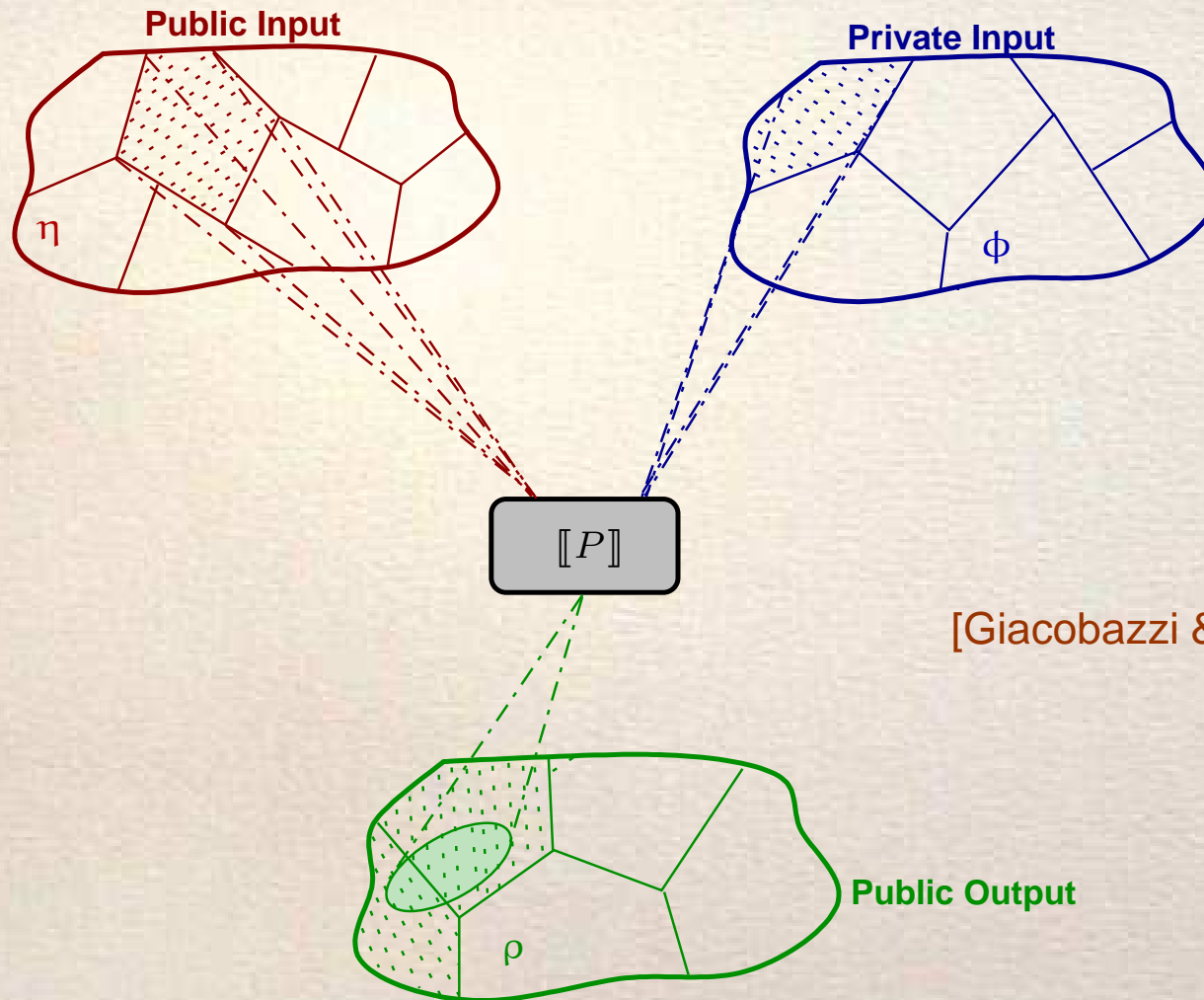


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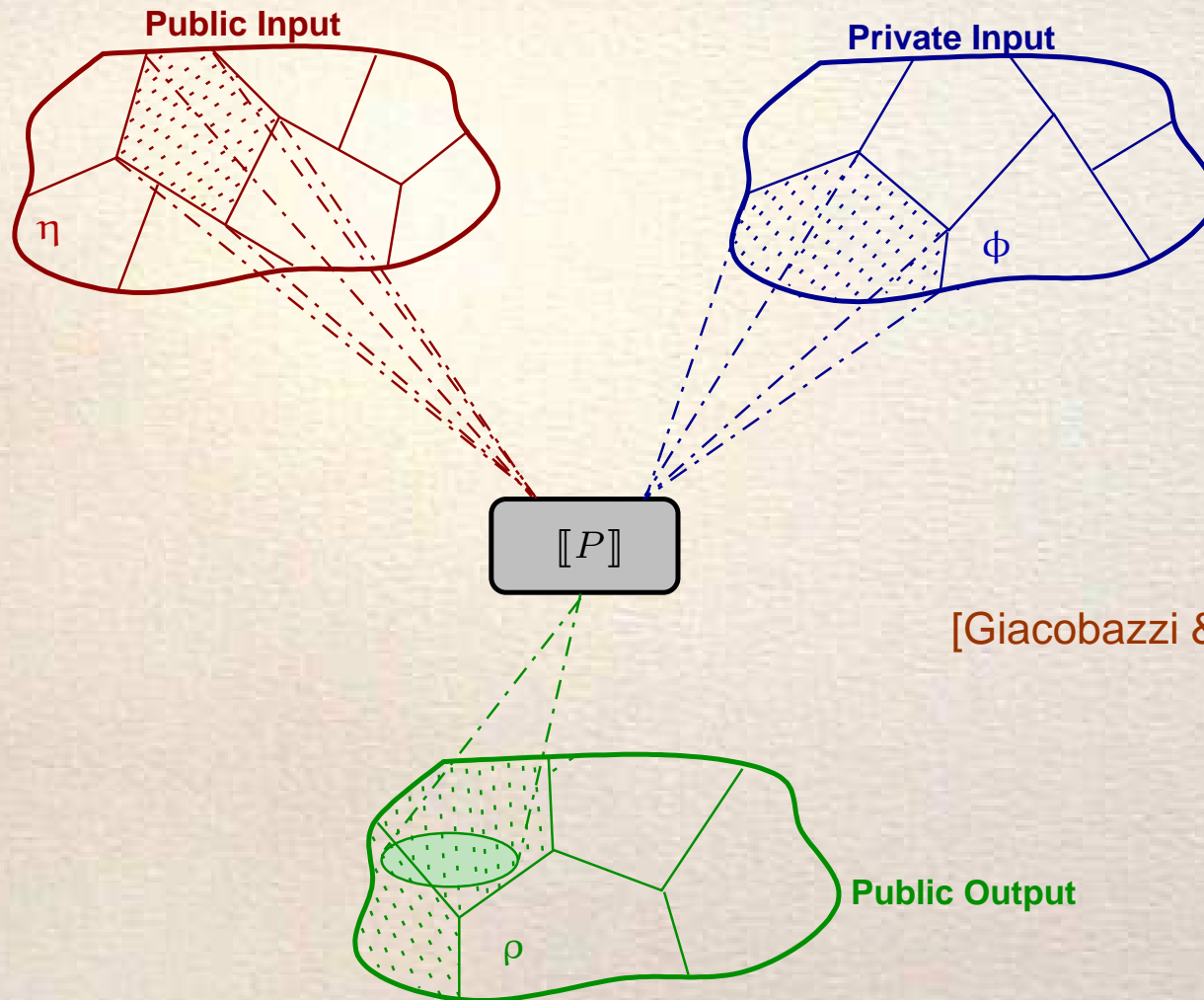


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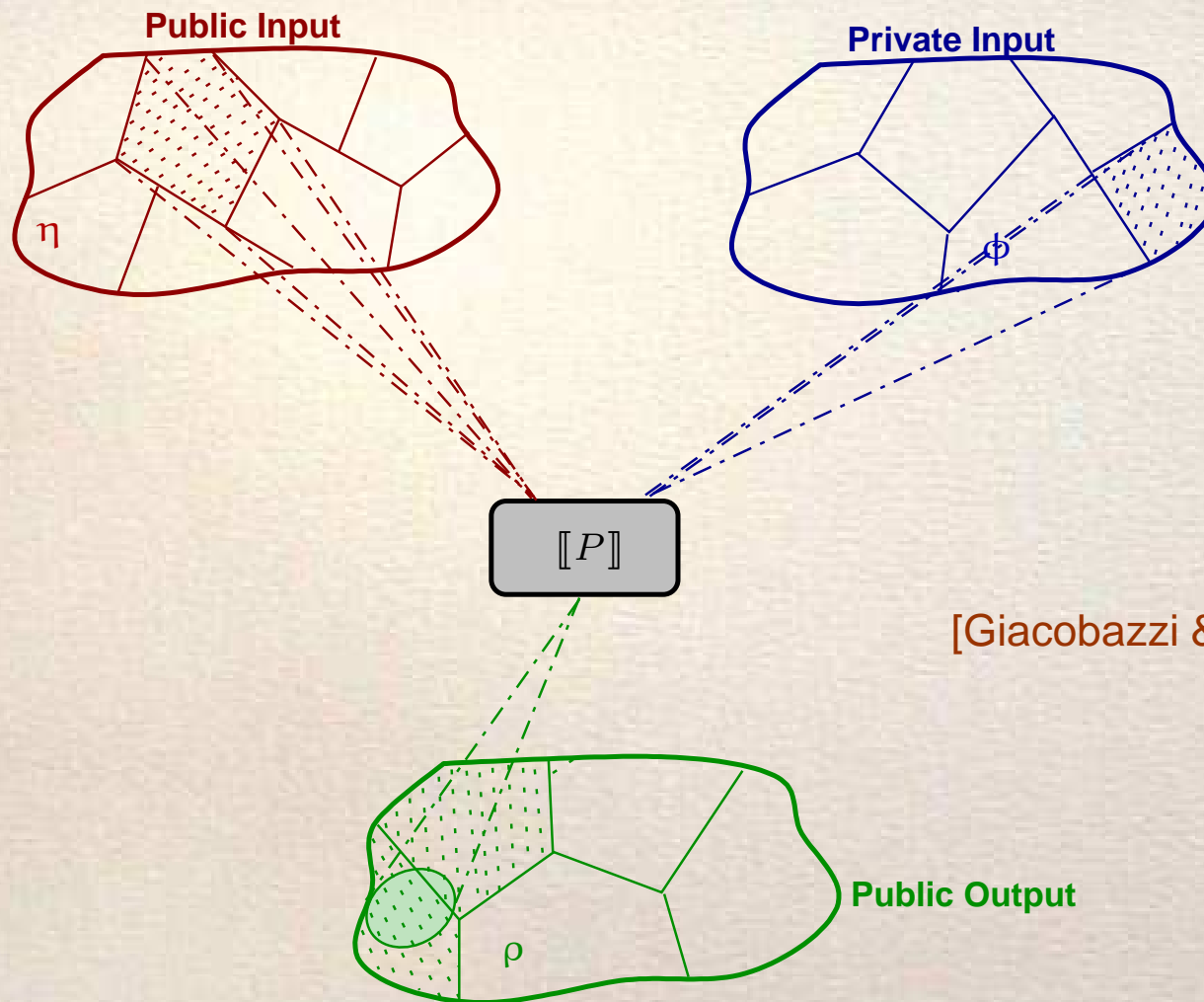


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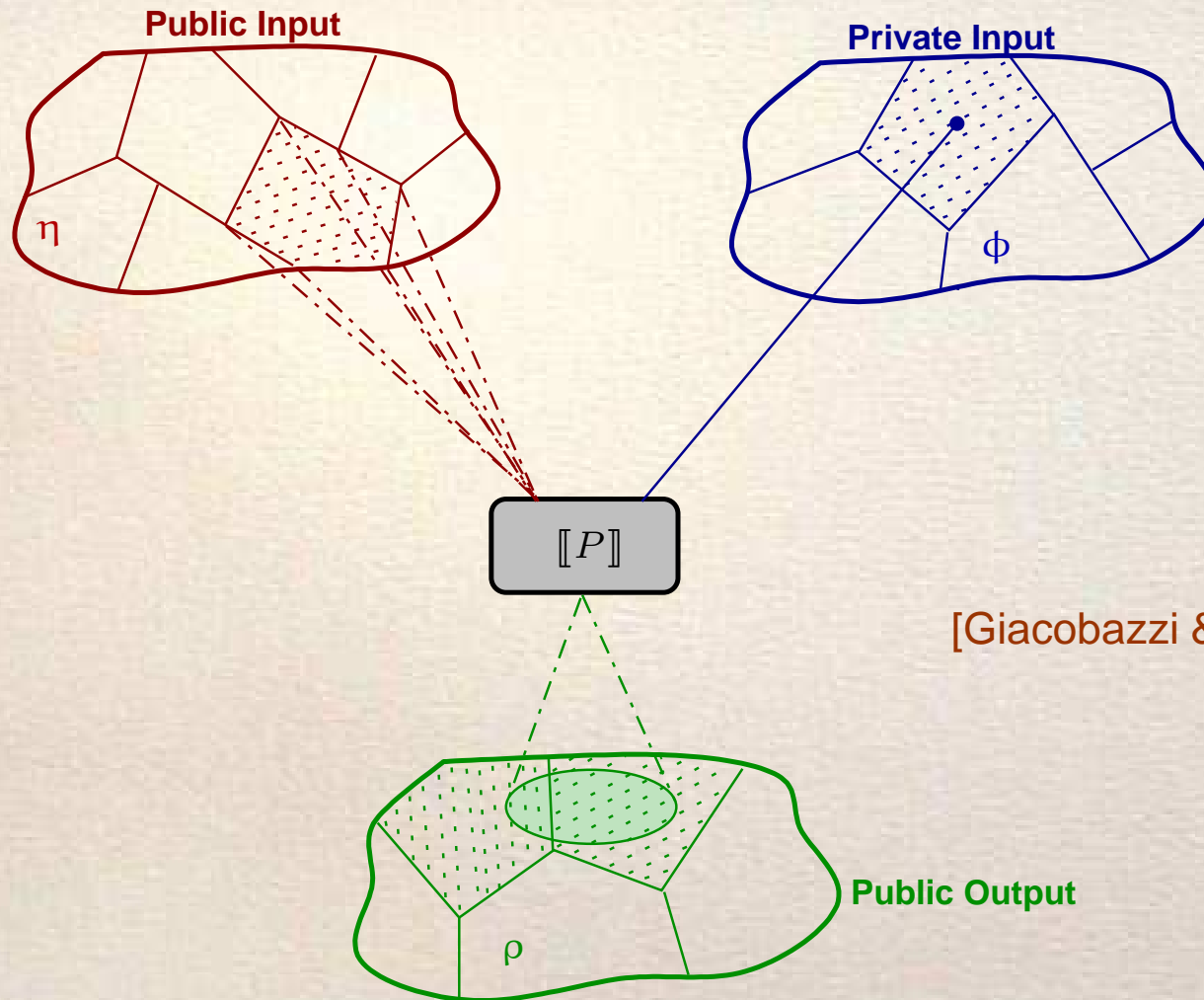


$$\boxed{(id)P(Sign \rightsquigarrow Par)}$$

$$Sign(h) = +, l = 1 \rightsquigarrow Par(l) = \text{I don't know}$$

$$Sign(h) = -, l = 1 \rightsquigarrow Par(l) = \text{I don't know}$$

DECLASSIFIED ANI (VIA ALLOWING)

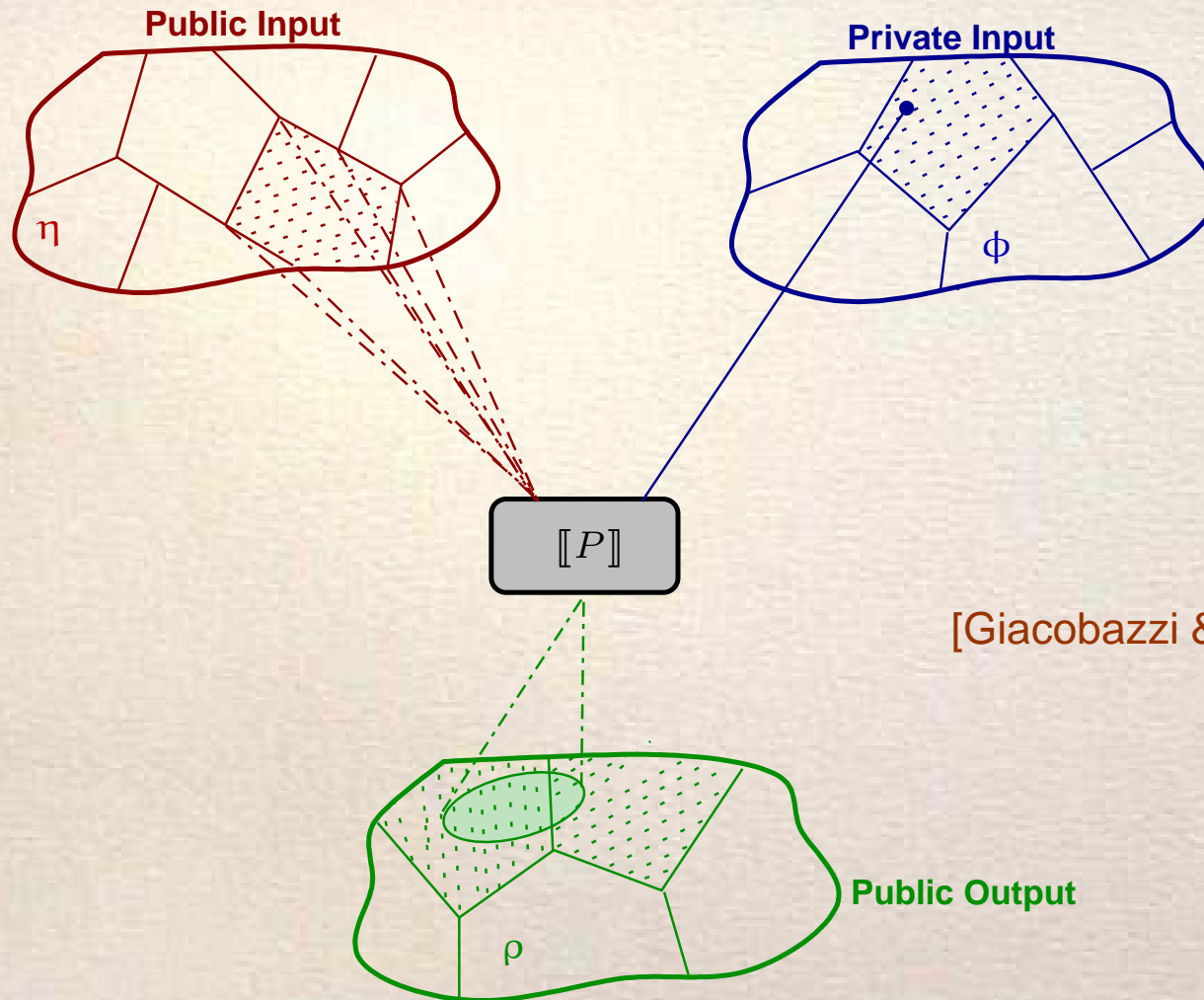


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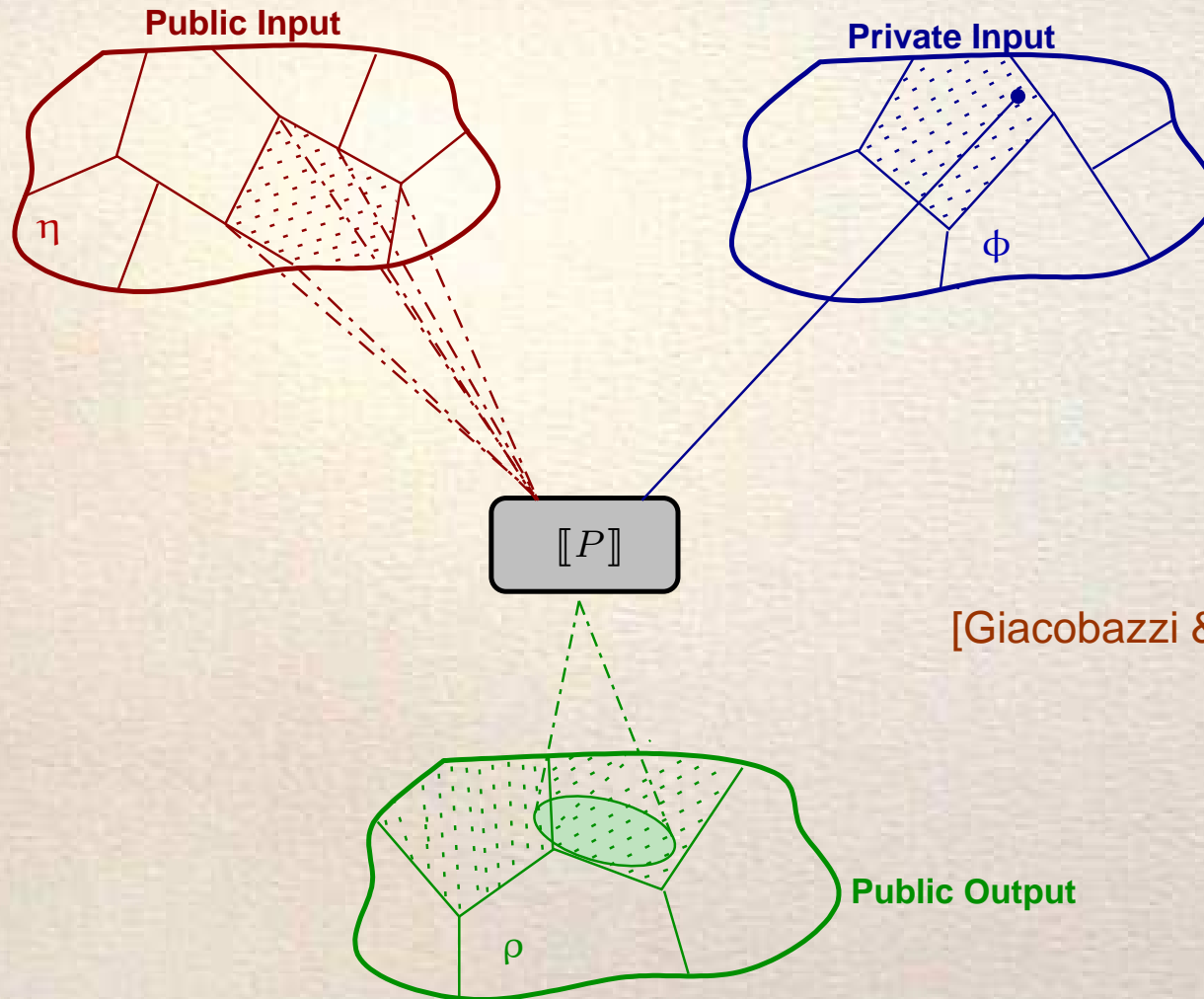


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OBSERVER VS OBSERVABLE

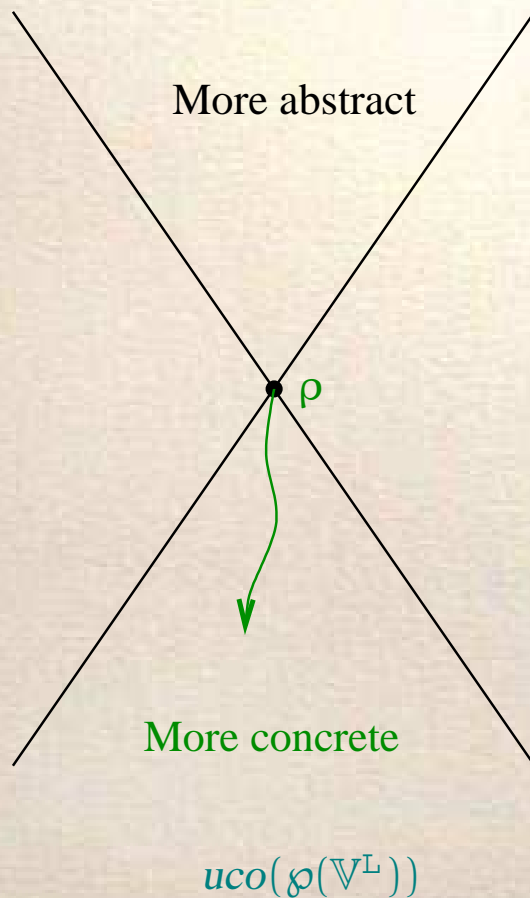
MODELLING ATTACKERS AS DOMAIN TRANSFORMERS

Consider $\models (\eta)P(\phi \rightsquigarrow \rho)$: *In order to preserve non-interference...*

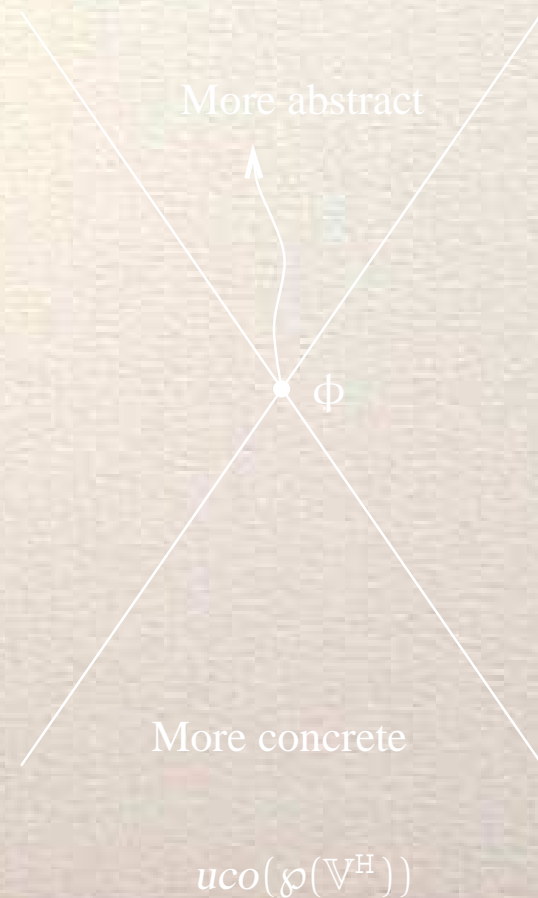
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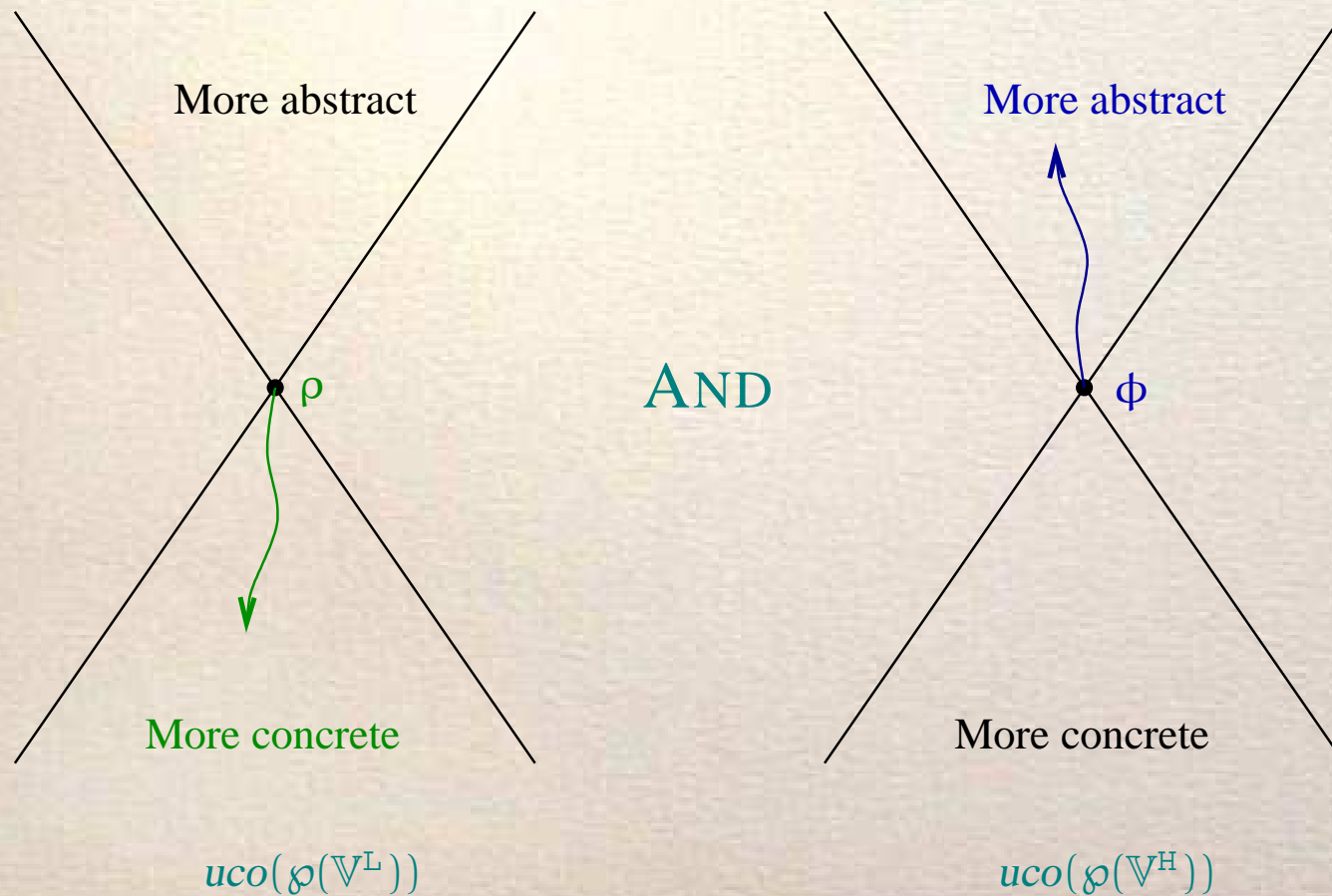
AND



OBSERVER VS OBSERVABLE

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ANI AS COMPLETENESS

Let $\rho \in uco(\wp(\mathbb{V}^L)) \Rightarrow \mathcal{H}_\rho(X) \stackrel{\text{def}}{=} \langle \top^H, \rho(X^L) \rangle \in uco(\wp(\mathbb{V}))$



Narrow abstract non-interference: $\mathcal{H}_\rho \circ \llbracket P \rrbracket \circ \mathcal{H}_\eta = \mathcal{H}_\rho \circ \llbracket P \rrbracket$;



Abstract non-interference: $\mathcal{H}_\rho \circ \llbracket P \rrbracket^{\eta, \phi} \circ \mathcal{H}_\eta = \mathcal{H}_\rho \circ \llbracket P \rrbracket^{\eta, \phi}$

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PUBLIC OBSERVER AS COMPLETENESS CORE:

$(\eta)P(\phi \rightsquigarrow \llbracket \mathcal{C}_{\llbracket P \rrbracket^{\eta, \phi}}^{\mathcal{H}_\eta}(\mathcal{H}) \rrbracket)$

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PUBLIC OBSERVER AS FORWARD COMPLETENESS CORE:

$$(\eta)P(\phi \rightsquigarrow \llbracket \mathcal{C}_{\llbracket P \rrbracket^{\eta, \phi}}^{\mathcal{H}_\eta}(\mathcal{H}) \rrbracket)$$

Strongest harmless attacker



PRIVATE OBSERVABLE AS FORWARD COMPLETENESS SHELL:

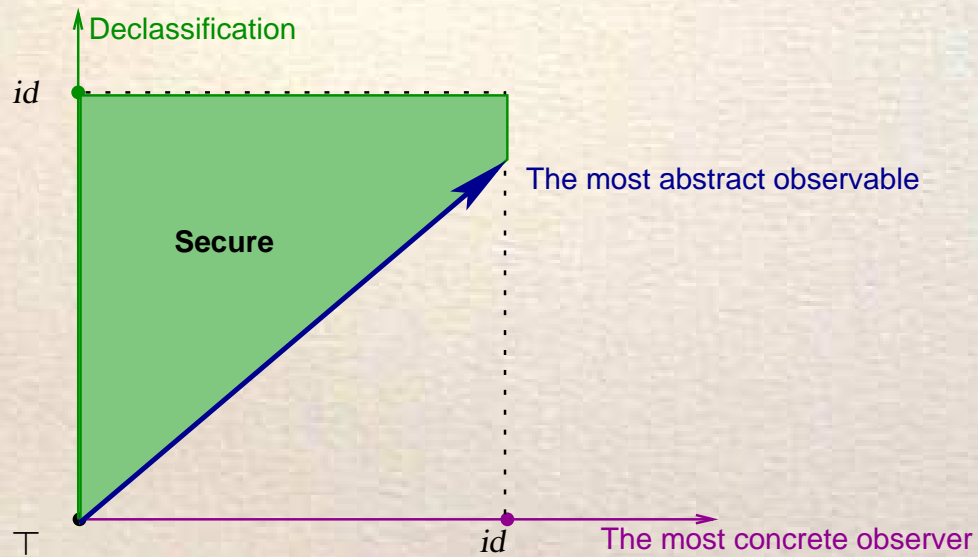
$$(\eta)P(\mathcal{R}_{\llbracket P \rrbracket^{\eta, \phi}}^{\mathcal{H}_\rho, id}(\mathcal{H}_\eta) \Rightarrow \rho)$$

Maximal information released

ANI AS COMPLETENESS



ADJOINING ATTACKERS AND DECLASSIFICATION BY COMPLETENESS



DECLASSIFICATION

[Banerjee, Giacobazzi and Mastroeni '07]



By exploiting the strong relation between completeness and non-interference we can obtain the following results:

- ✓ Model declassification as a forward completeness problem for the weakest precondition semantics;
- ✓ Derive counterexamples to a given declassification policy;
- ✓ **Refine** a given declassification policy (**Shell**);

DNI: A COMPLETENESS PROBLEM

Let \mathcal{H}^ϕ the abstract domain declassifying the property ϕ of the *private input*:

$$\mathcal{H} \circ \llbracket P \rrbracket \circ \mathcal{H}^\phi = \mathcal{H} \circ \llbracket P \rrbracket \Leftrightarrow \mathcal{H}^\phi \circ \text{Wlp}_P \circ \mathcal{H} = \text{Wlp}_P \circ \mathcal{H}$$

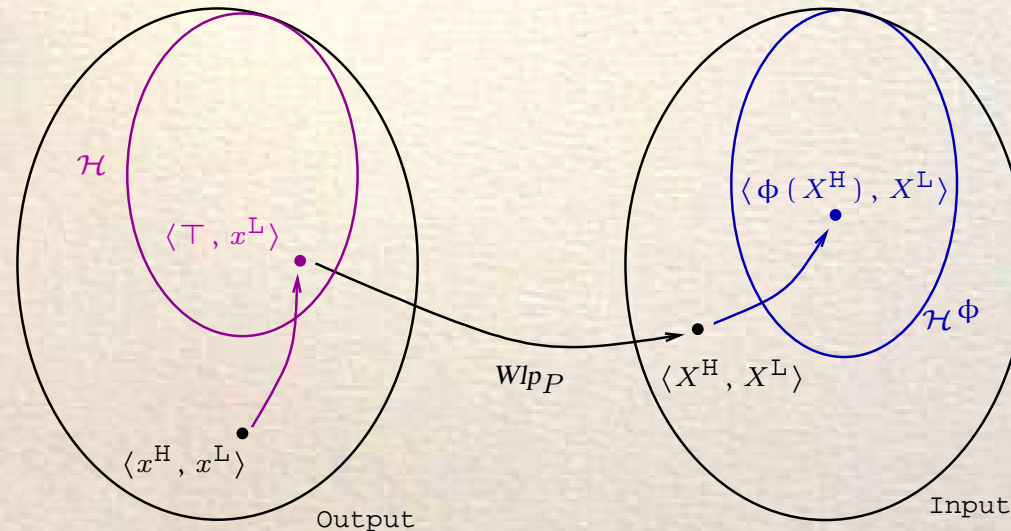


To release ϕ *means* to distinguish between elements in ϕ !

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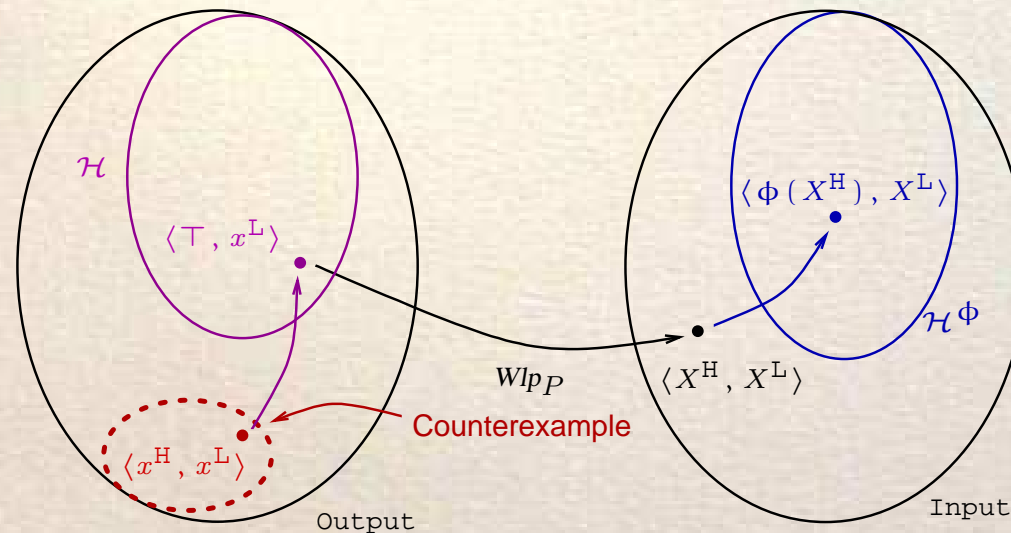
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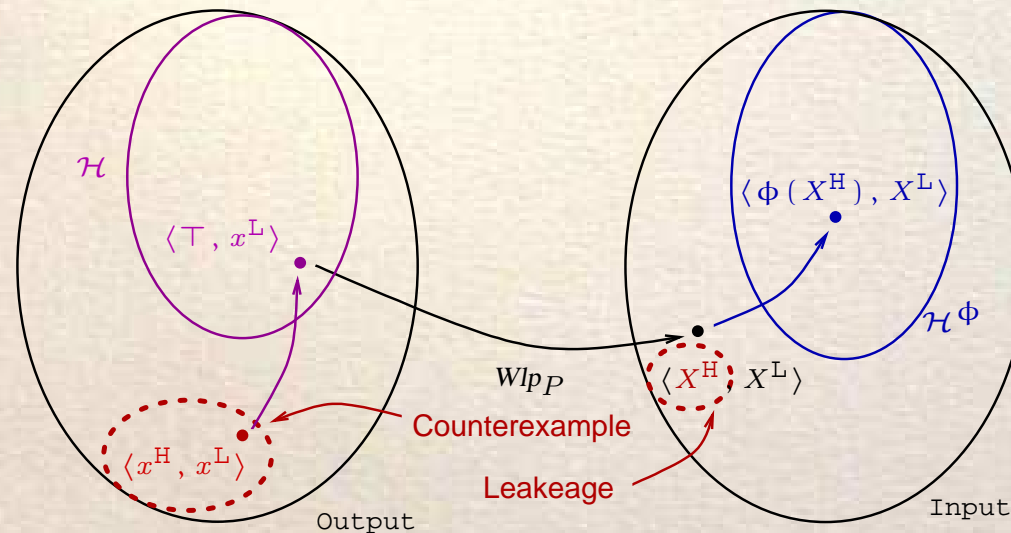
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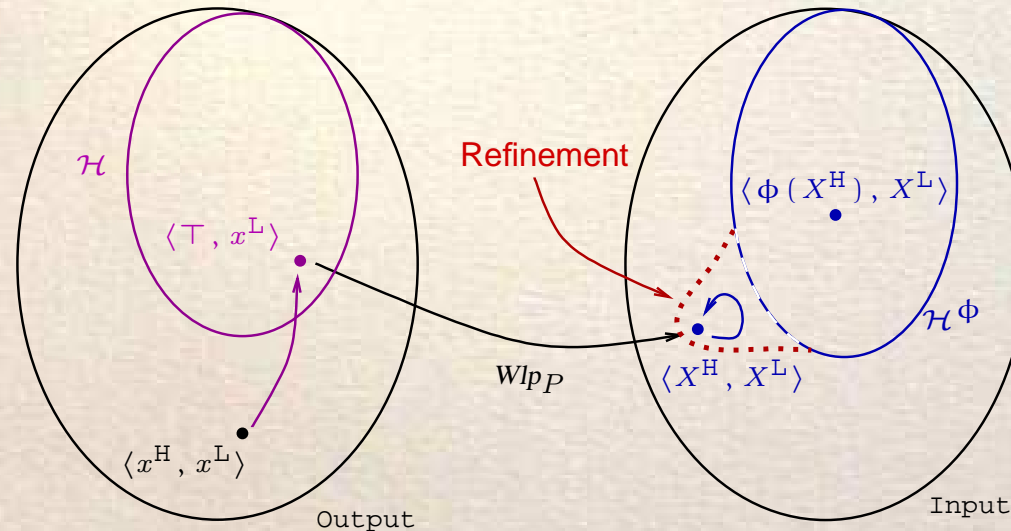
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SHELL: THE MAXIMAL RELEASED INFORMATION

Consider $\rho = \text{Parity} \stackrel{\text{def}}{=} \{\top, \text{Even}, \text{Odd}, \emptyset\}$, as the information observed by the attacker.

$$P = \left[\quad l := l * h^2; \right]$$

SHELL: THE MAXIMAL RELEASED INFORMATION

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$$\begin{array}{l} (l \in \text{Even} \vee (l \in \text{Odd}, h \in \text{Even})) \\ l := l * h^2; \\ (l \in \text{Even}) \end{array} \quad \text{OR} \quad \begin{array}{l} (l \in \text{Odd} \wedge h \in \text{Odd}) \\ l := l * h^2; \\ (l \in \text{Odd}) \end{array}$$

Let $l = 3, h = 2 \in \text{Even}$:

$$\mathcal{H}_{\text{Par}}[[P]](\langle 2, 3 \rangle) = \langle \top, \text{Even} \rangle \neq \langle \top, \top \rangle = \mathcal{H}_{\text{Par}}[[P]](\langle \top, 3 \rangle) = \mathcal{H}_{\text{Par}}[[P]](\mathcal{H}(\langle 2, 3 \rangle))$$

SHELL: THE MAXIMAL RELEASED INFORMATION

Consider $\rho = \text{Parity} \stackrel{\text{def}}{=} \{\top, \text{Even}, \text{Odd}, \emptyset\}$, as the information observed by the attacker.

$$\begin{array}{l} (l \in \text{Even} \vee (l \in \text{Odd}, h \in \text{Even})) \\ l := l * h^2; \\ (l \in \text{Even}) \end{array} \quad \text{OR} \quad \begin{array}{l} (l \in \text{Odd} \wedge h \in \text{Odd}) \\ l := l * h^2; \\ (l \in \text{Odd}) \end{array}$$

Let $l = 3, h = 2 \in \text{Even}$:

$$\mathcal{H}_{\text{Par}}[[P]](\langle 2, 3 \rangle) = \langle \top, \text{Even} \rangle \neq \langle \top, \top \rangle = \mathcal{H}_{\text{Par}}[[P]](\langle \top, 3 \rangle) = \mathcal{H}_{\text{Par}}[[P]](\mathcal{H}(\langle 2, 3 \rangle))$$

WE RELEASE SOMETHING ABOUT THE PRIVATE INPUT!

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Let us compute the shell of the input domain \mathcal{H} :

$$\mathcal{H}' \stackrel{\text{def}}{=} \mathcal{R}_{\llbracket P \rrbracket}^{\mathcal{H} \text{Par}}(\mathcal{H}) = \mathcal{H} \sqcap (\langle \top, \text{Even} \rangle \cup \langle \text{Even}, \text{Odd} \rangle, \langle \text{Odd}, \text{Odd} \rangle, \langle \text{Odd}, \text{Even} \rangle)$$

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 l := l * h^2; & \text{OR} & l := l * h^2; \\
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Hence (NB: By reduced product in \mathcal{H}' we have the elements $\langle \text{Even}, l \rangle$)

Let $l = 3, h = 2 \in \text{Even}$:

$$\mathcal{H}_{\text{Par}} \llbracket P \rrbracket (\langle 2, 3 \rangle) = \langle \top, \text{Even} \rangle = \mathcal{H}_{\text{Par}} \llbracket P \rrbracket (\langle \text{Even}, 3 \rangle) = \mathcal{H}_{\text{Par}} \llbracket P \rrbracket (\mathcal{H}'(\langle 2, 3 \rangle))$$

CORE: THE MOST POWERFUL ATTACKER

$P = \left[\text{while } (h \neq 0) \text{ do } (h := 0; l := 2l) \text{ endw} \right]$

CORE: THE MOST POWERFUL ATTACKER

$((l \in \text{Even}, h = 0) \vee (h \neq 0))$ $(h = 0)$
while $(h \neq 0)$ **do** $(h := 0; l := 2l)$ **endw;** **OR** **while** $(h \neq 0)$ **do** $(h := 0; l := 2l)$ **endw**
 $(l \in \text{Even})$ $(l \in \text{Odd})$

Let $l = 5$, $h = 3$:

$$\mathcal{H}[[P]](\langle 3, 5 \rangle) = \langle \top, 10 \rangle \neq \langle \top, \top \rangle = \mathcal{H}[[P]](\langle \top, 5 \rangle) = \mathcal{H}[[P]](\mathcal{H}(\langle 3, 5 \rangle))$$

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WE RELEASE SOMETHING ABOUT THE PRIVATE INPUT!

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 $(l \in \text{Even})$ $(l \in \text{Odd})$

Let us compute the core of the output domain \mathcal{H} :

$$\mathcal{H}' \stackrel{\text{def}}{=} C_{[[P]]}^{\mathcal{H}}(\mathcal{H}) = \left\{ \langle \top, L \rangle \mid \forall l \in \top. l \in L \Leftrightarrow 2l \in L \right\} = \bigvee \left(\left\{ n\{2\}^{\mathbb{N}} \mid n \in \text{Odd} \right\} \right)$$

CORE: THE MOST POWERFUL ATTACKER

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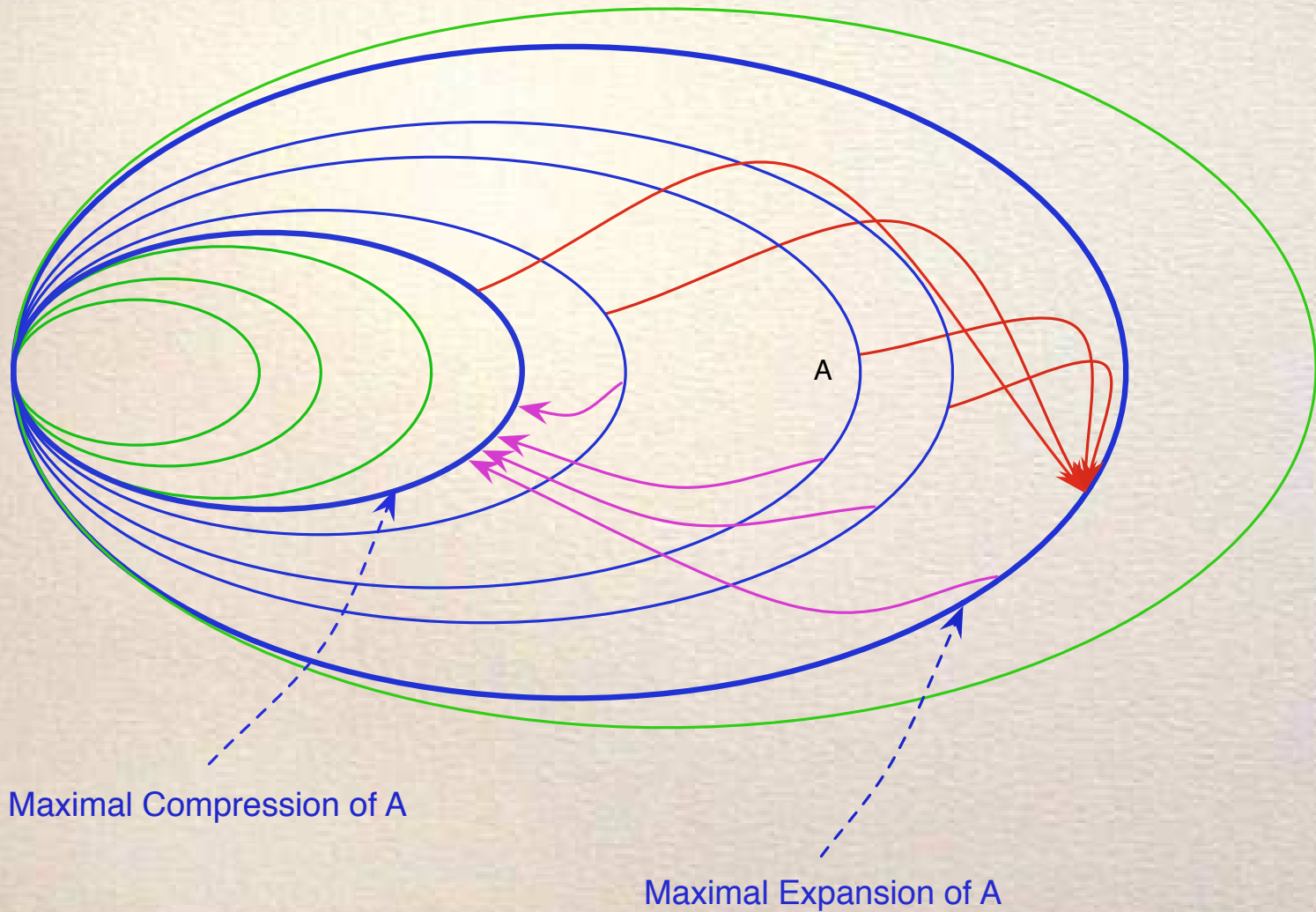
Hence

Let $l = 5, h = 3 \in \text{Even}$:

$$\mathcal{H}' \llbracket P \rrbracket (\langle 3, 5 \rangle) = \mathcal{H}' (\langle \top, 10 \rangle) = \langle \top, 5\{2\}^{\mathbb{N}} \rangle = \mathcal{H}' (\{5, 10\}) = \mathcal{H}' \llbracket P \rrbracket (\langle \top, 5 \rangle) = \mathcal{H}' \llbracket P \rrbracket (\mathcal{H}(\langle 3, 5 \rangle))$$

CAN WE EXPAND AND COMPRESS DOMAINS?

THE GEOMETRY OF DOMAIN TRANSFORMERS



THE GEOMETRY OF DOMAIN TRANSFORMERS

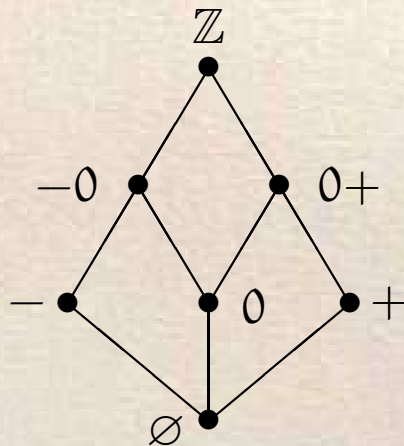
DISJUNCTIVE COMPLETION



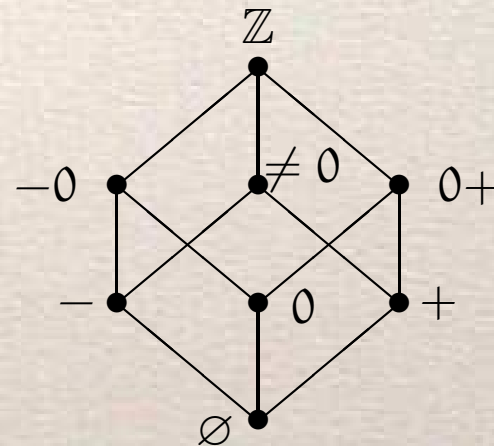
Refinement: Forward Completeness for **disjunction**

$$\mathcal{R}(X) = \left\{ \bigvee Y \mid Y \subseteq X \right\} \quad \text{one step}$$

The **least** $X = \Upsilon(A) : X = A \sqcap \mathcal{R}(X)$ Disjunctive Completion



Sign



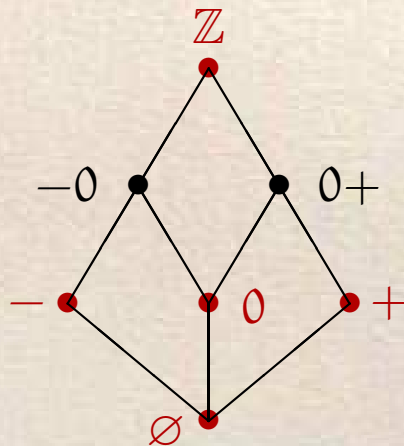
$\Upsilon(\text{Sign})$

THE GEOMETRY OF DOMAIN TRANSFORMERS

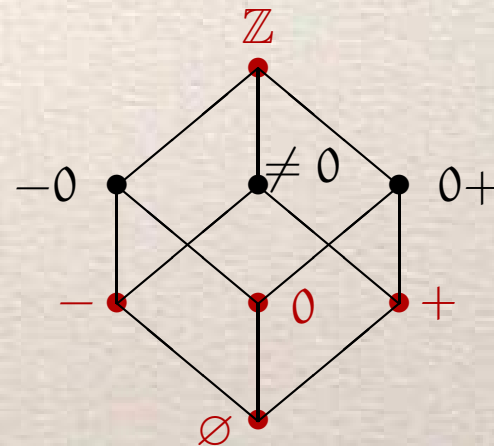
DISJUNCTIVE COMPLETION



Compressor: The domain of **Join-Irreducible** elements of X

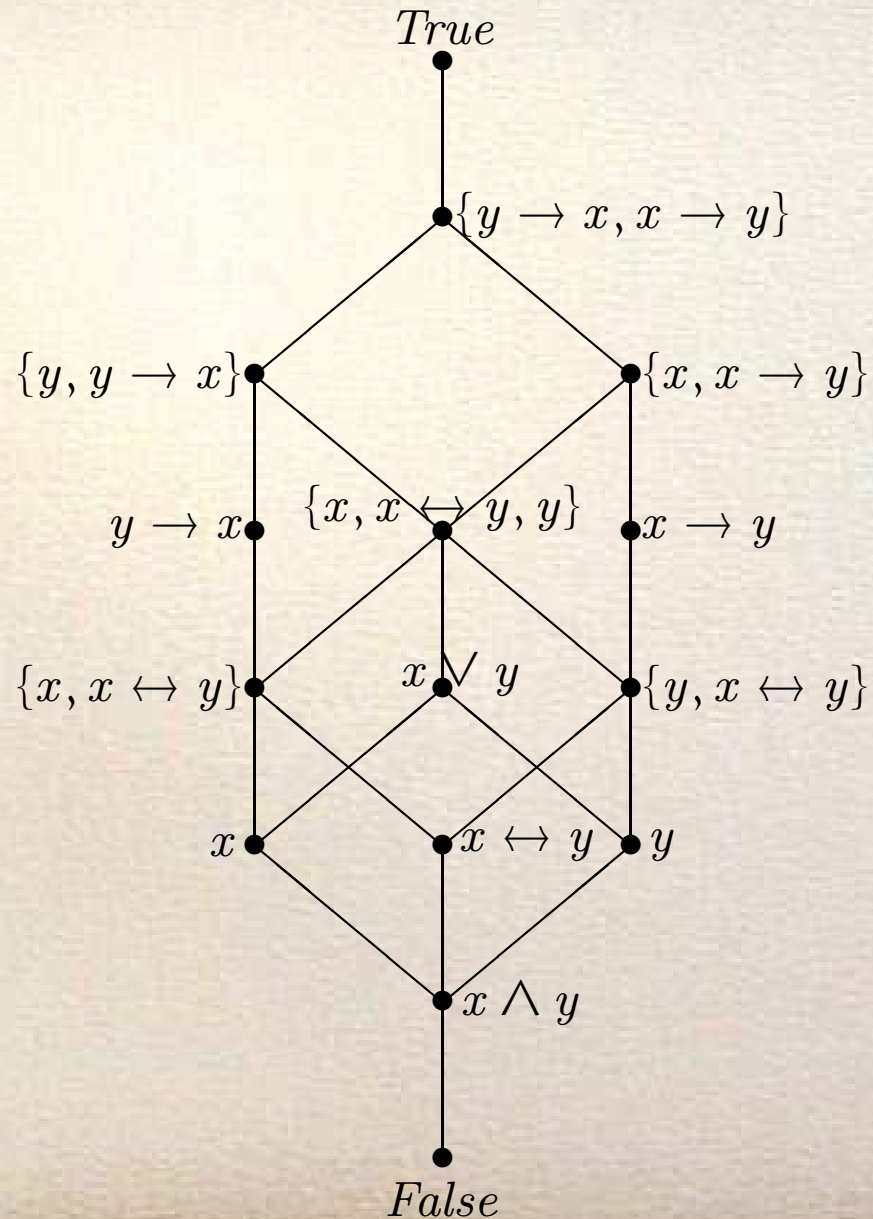


Sign

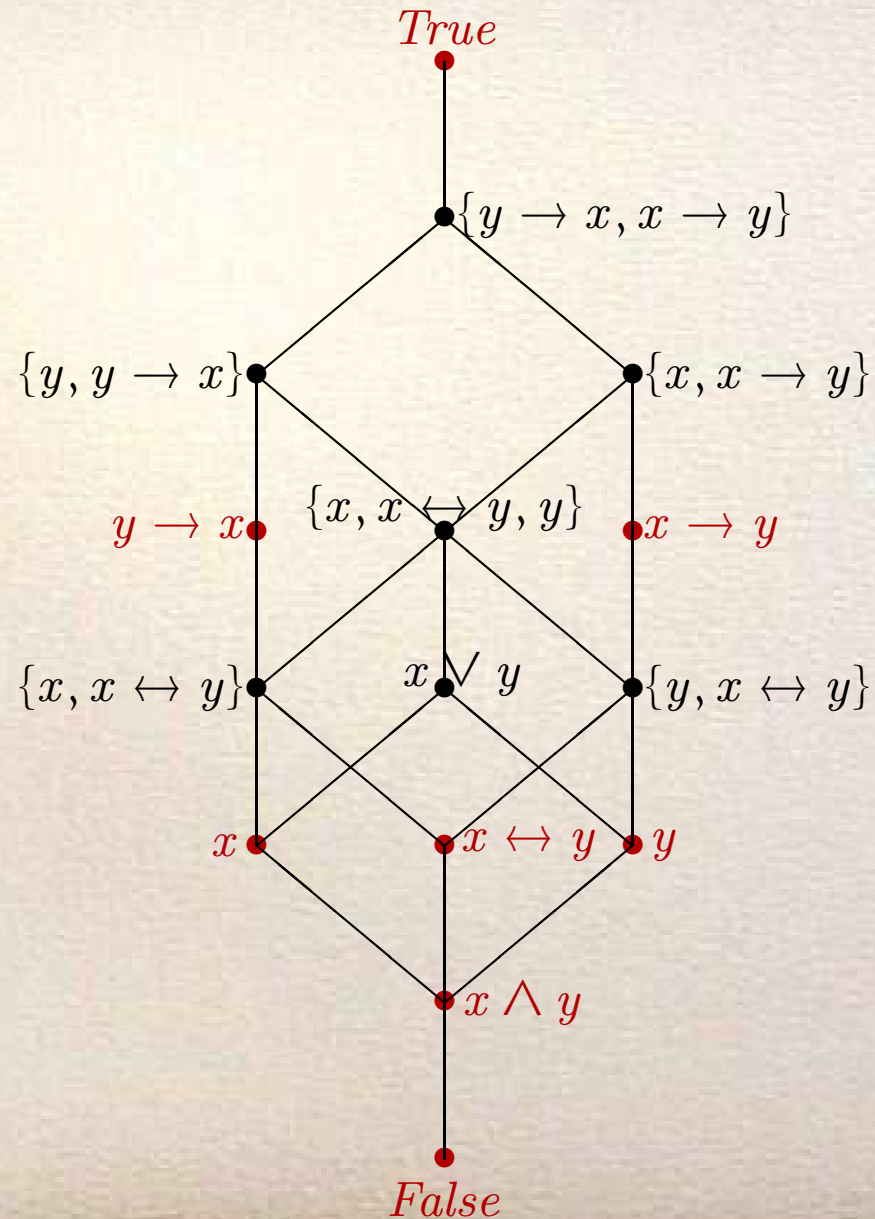


$\Upsilon(\text{Sign})$

THE GEOMETRY OF DOMAIN TRANSFORMERS



THE GEOMETRY OF DOMAIN TRANSFORMERS



THE EXPANDER IN ANI

Let $l := 2h$ and $\mathcal{E}(X) = \sqcap \{ Y \mid \mathcal{C}(X) = \mathcal{C}(Y) \}$.

→ The most powerful harmless attacker for P is: $\mathcal{H}' = \Upsilon (\{\text{Even}, \{1\}, \{3\}, \dots\})$

→ Suppose the initial observer is $\rho = \{\top, \text{Even} \setminus \{0\}, \{0\}, \text{Odd}, \emptyset\}$, then the most powerful harmless attacker more abstract than ρ is $\text{Par} = \mathcal{H}' \sqcup \rho$.

→ The expander provides **the most powerful attacker such that the harmless simplification is Par** : $\Upsilon (\{\text{Odd}, \{0\}, \{2\}, \{4\}, \dots\})$;

→ **WE OBTAIN THE MOST POWERFUL MALICIOUS ATTACKER, I.E., THE ONE THAT IS ABLE TO EXPLOIT AS MUCH AS POSSIBLE THE FAILURE OF NON-INTERFERENCE!**

→ Any more abstract (less powerful) attacker has to confuse some even inputs, for instance if it confuses $l = 0$ with $l = 2$ then it can not distinguish when $h = 0$ and $h = 1$.

THE COMPRESSOR IN ANI

Let **if** $h = 0$ **then** $l := 0$ **else** $l := |l|(h/|h|)$ and $\mathcal{E}(X) = \sqcup \{ Y \mid \mathcal{R}(X) = \mathcal{R}(Y) \}$.

- ⇒ Suppose we let to flow $\phi = \{\top, \geq 0, < 0, \emptyset\}$;
- ⇒ The maximal information released by P , is the shell of ϕ :
 $\phi' = \{\top, \geq 0, \neq 0, \leq 0, < 0, > 0, 0, \emptyset\}$
- ⇒ THE COMPRESSOR PROVIDES THE MOST ABSTRACT DECLASSIFICATION POLICY WHICH CANNOT CAPTURE WHAT IS RELEASED BY AN ATTACKER
- ⇒ The compressor is $\lambda X. \top$
- ⇒ This means that each policy between ϕ' and $\lambda X. \top$ is not able to protect the program.

THE COMPRESSOR IN ANI

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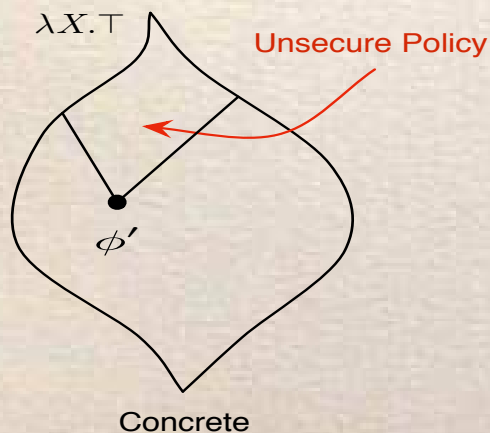


The maximal information released by P , is the shell of ϕ :

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THE COMPRESSOR PROVIDES THE MOST ABSTRACT DECLASSIFICATION POLICY WHICH CANNOT CAPTURE WHAT IS RELEASED BY AN ATTACKER



CAN WE MAKE COMPLETENESS BY
TRANSFORMING SEMANTICS?

THE GEOMETRY OF SEMANTICS TRANSFORMERS

MAKING SEMANTICS COMPLETE (FROM ABOVE AND BELOW):

$$\mathbb{F}_{\eta, \rho}^{\uparrow}(f) = \prod \{h : C \longrightarrow C \mid f \sqsubseteq h, \rho \circ h \circ \eta = h \circ \eta\}$$

$$\mathbb{F}_{\eta, \rho}^{\downarrow}(f) = \bigsqcup \{h : C \longrightarrow C \mid f \sqsupseteq h, \rho \circ h \circ \eta = h \circ \eta\}$$

$\mathbb{F}_{\eta, \rho}^{\uparrow}(f)$ and $\mathbb{F}_{\eta, \rho}^{\downarrow}(f)$ are (Forward) complete

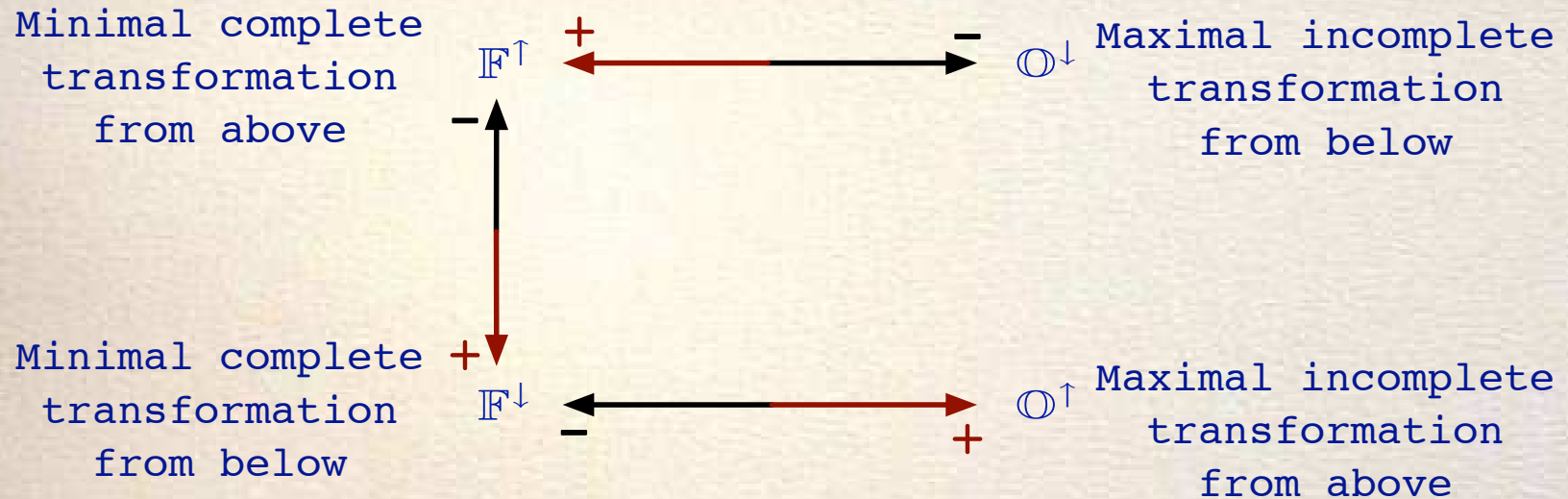
MAKING SEMANTICS MAXIMALLY IN-COMPLETE (FROM ABOVE AND BELOW):

$$\mathbb{O}_{\eta, \rho}^{\uparrow}(f) = \bigsqcup \{g : C \longrightarrow C \mid \mathbb{F}_{\eta, \rho}^{\downarrow}(g) = \mathbb{F}_{\eta, \rho}^{\downarrow}(f)\}$$

$$\mathbb{O}_{\eta, \rho}^{\downarrow}(f) = \prod \{g : C \longrightarrow C \mid \mathbb{F}_{\eta, \rho}^{\uparrow}(g) = \mathbb{F}_{\eta, \rho}^{\uparrow}(f)\}$$

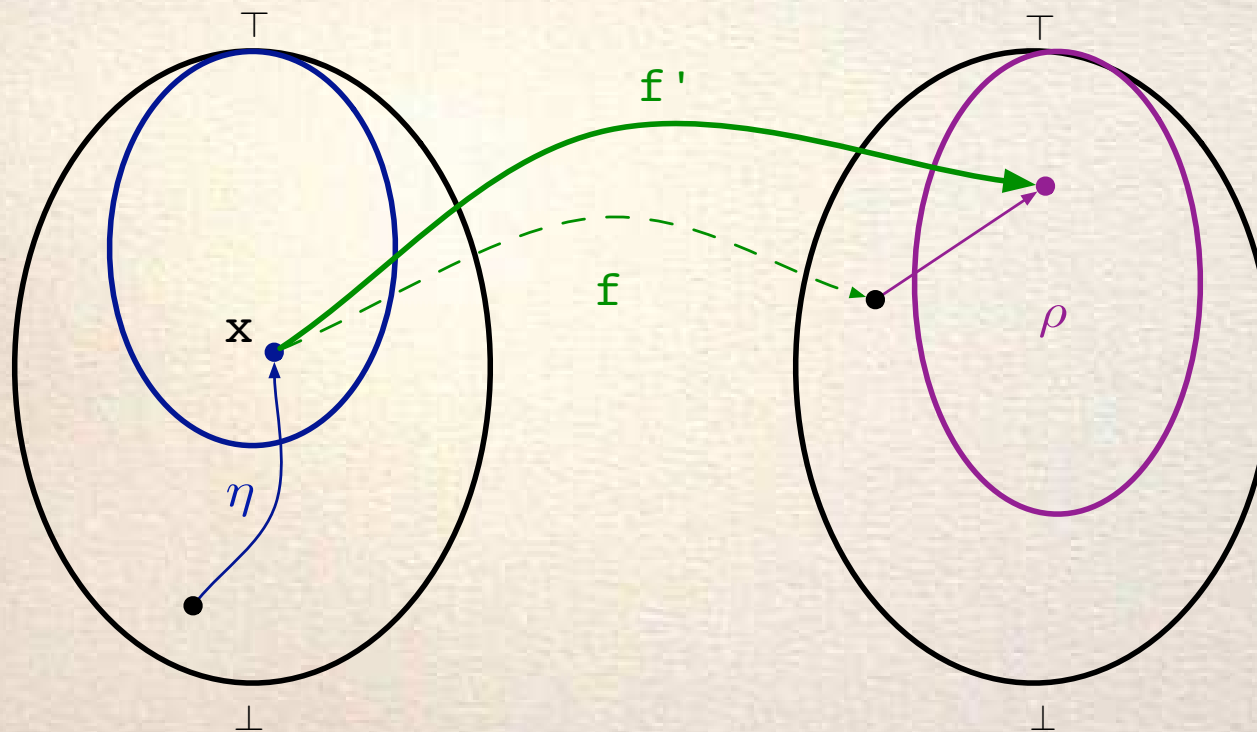
$\mathbb{O}_{\eta, \rho}^{\uparrow}(f)$ and $\mathbb{O}_{\eta, \rho}^{\downarrow}(f)$ are generally in-complete

THE GEOMETRY OF SEMANTICS TRANSFORMERS



$$(F^{\uparrow})^+ = F^{\downarrow} \quad \text{and} \quad (F^{\uparrow})^- = O^{\downarrow}$$

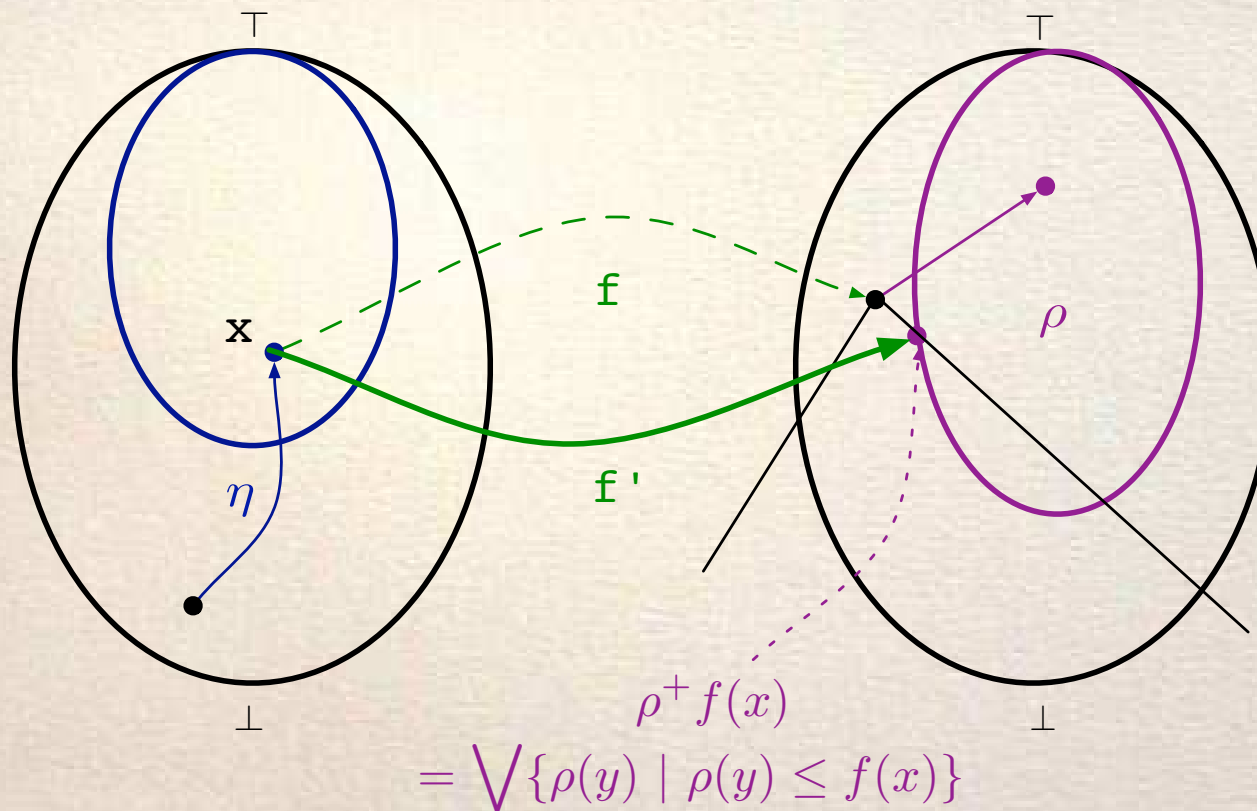
THE GEOMETRY OF SEMANTICS TRANSFORMERS



Making FORWARD COMPLETENESS: Transforming the semantics upwards

$$\mathbb{F}_{\eta, \rho}^{\uparrow} = \lambda f. \lambda x. \begin{cases} \rho \circ f(x) & \text{if } x \in \eta(C) \\ f(x) & \text{otherwise} \end{cases}$$

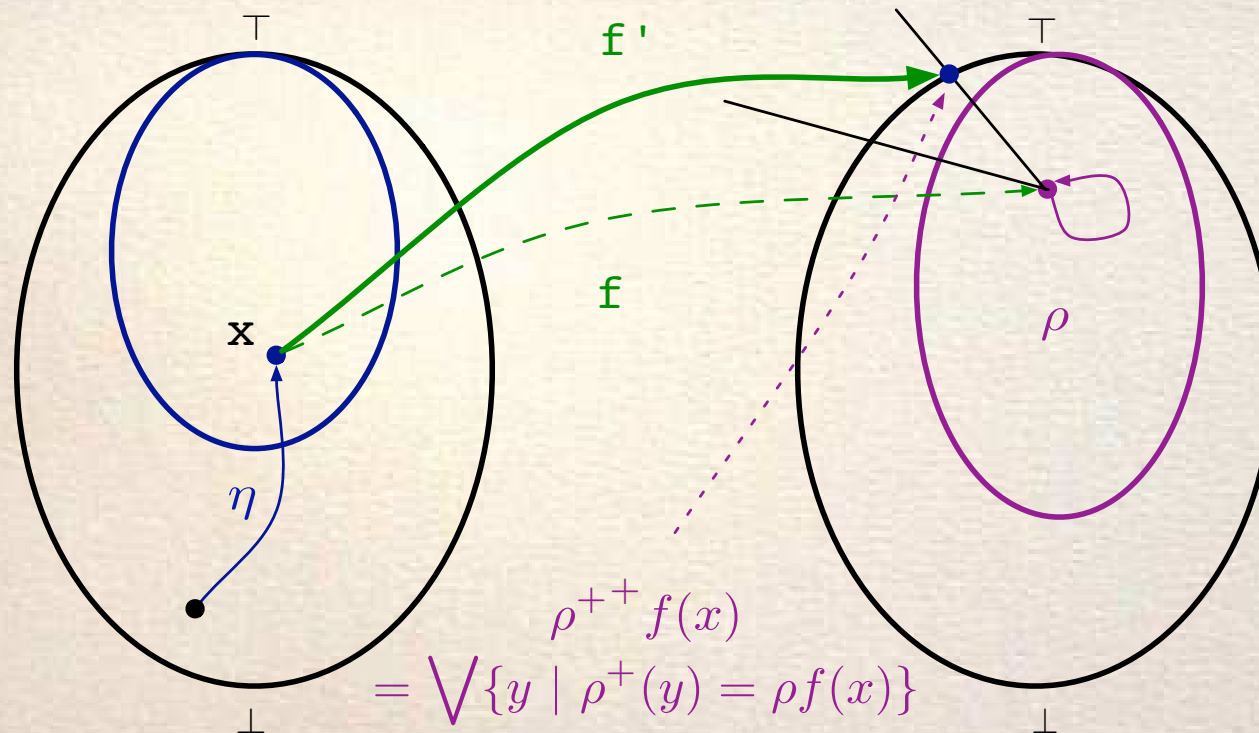
THE GEOMETRY OF SEMANTICS TRANSFORMERS



Making FORWARD COMPLETENESS: Transforming the semantics downwards

$$\mathbb{F}_{\eta, \rho}^{\downarrow} = \lambda f. \lambda x. \begin{cases} \rho^+ \circ f(x) & \text{if } x \in \eta(C) \\ f(x) & \text{otherwise} \end{cases}$$

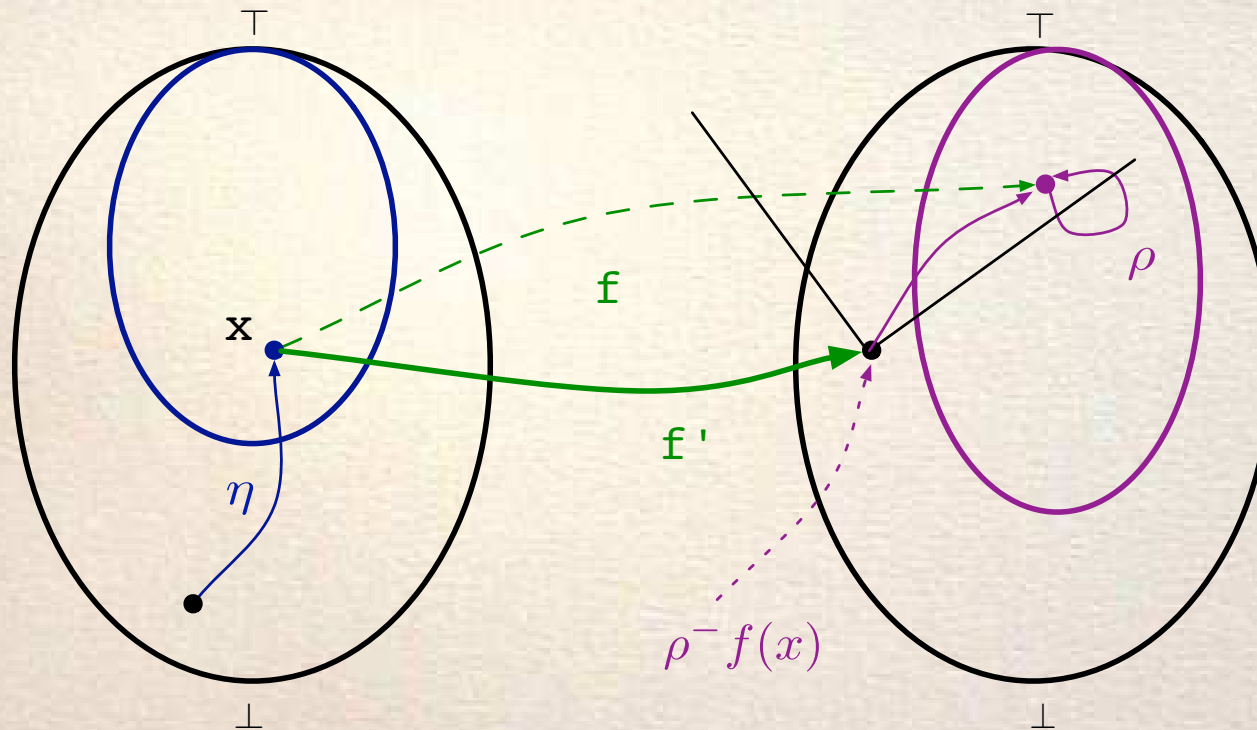
THE GEOMETRY OF SEMANTICS TRANSFORMERS



Making FORWARD IN-COMPLETENESS: Transforming the semantics upwards

$$\mathbb{O}_{\eta, \rho}^{\uparrow}(f)(x) = \begin{cases} (\rho^+)^+(f(x)) = \bigvee \left\{ y \mid \rho^+(y) = \rho^+(f(x)) \right\} & \text{if } x \in \eta \\ f(x) & \text{otherwise} \end{cases}$$

THE GEOMETRY OF SEMANTICS TRANSFORMERS



Making FORWARD IN-COMPLETENESS: Transforming the semantics downwards

$$\mathbb{O}_{\eta, \rho}^{\perp}(f)(x) = \begin{cases} \rho^{-}(f(x)) = \bigwedge \left\{ y \mid \rho(y) = \rho(f(x)) \right\} & \text{if } x \in \eta \\ f(x) & \text{otherwise} \end{cases}$$

MAKING SEMANTICS COMPLETE: AN EXAMPLE

```
while ( $h > 0$ ) do ( $h := h - 1; l := h$ ) endw
```

MAKING SEMANTICS COMPLETE: AN EXAMPLE

$(h > 0) \vee (l = 0)$
while $(h > 0)$ **do** $(h := h - 1; l := h)$ **endw**;
 $(l = 0)$

OR

$(h = 0)$
while $(h > 0)$ **do** $(h := h - 1; l := h)$ **endw**
 $(l \neq 0)$

Let $l = 5, h_1 = 3, h_2 = 0$:
 $\mathcal{H}[[P]](\langle 3, 5 \rangle) = \langle \top, 0 \rangle \neq \langle \top, 5 \rangle = \mathcal{H}[[P]](\langle 0, 5 \rangle)$

MAKING SEMANTICS COMPLETE: AN EXAMPLE

$(h \geq 0)$
while $(h > 0)$ **do** $(h := h - 1; l := h)$ **endw**;
 $(l = 0)$

OR

$(h = 0)$
while $(h > 0)$ **do** $(h := h - 1; l := h)$ **endw**
 $(l \neq 0)$

Let $l = 5, h_1 = 3, h_2 = 0$:
 $\mathcal{H}[[P]](\langle 3, 5 \rangle) = \langle \top, 0 \rangle \neq \langle \top, 5 \rangle = \mathcal{H}[[P]](\langle 0, 5 \rangle)$

WE RELEASE SOMETHING (THE EQUALITY WITH 0) ABOUT THE PRIVATE INPUT!

MAKING SEMANTICS COMPLETE: AN EXAMPLE

$(h \geq 0)$
while $(h > 0)$ **do** $(h := h - 1; l := h)$ **endw**;
 $(l = 0)$

OR

$(h = 0)$
while $(h > 0)$ **do** $(h := h - 1; l := h)$ **endw**
 $(l \neq 0)$

The upward transformation inducing completeness of Wlp_P is:

$$\mathbb{F}^\uparrow(Wlp_P) : \{l = 0 \mapsto h \in \mathbb{Z} \text{ and } l \neq 0 \mapsto h \in \mathbb{Z}\}$$

MAKING SEMANTICS COMPLETE: AN EXAMPLE

$(h \geq 0)$
while $(h > 0)$ **do** $(h := h - 1; l := h)$ **endw**;
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OR

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The upward transformation inducing completeness of Wlp_P is:

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This is, for example, the semantics of the program

$$Q : l_1 := l; P; l := l_1$$



Encoding AI problems as completeness problems:

- ✓ Systematic transformations for optimal models
- ✓ Better understanding of the limits of abstractions



Adequacy of the theory

- ✓ Abstract interpretation is perfectly adequate to reason about itself
- ✓ A calculational design of domain and code transformations can be done in abstract interpretation
- ✓ Completeness is a driving force for understanding domain and code transformers
- ✓ From semantics transformers to code transformations (and deformations) by AI [Cousot & Cousot '02]

FUTURE DIRECTIONS

- ⇒ Code obfuscation and sw watermarking
 - ✓ Completeness corresponds to maximal precision
 - ✓ Obfuscating P corresponds to make P maximally incomplete against a given attack (\mathbb{O} ?)
 - ✓ Watermarks and fingerprints can be hidden in completeness holes

- ⇒ Language-based security
 - ✓ \mathbb{F} provides code protection against information release!
 - ✓ Can we design a monitor M such that $\mathbb{F}(\llbracket P \rrbracket) = \llbracket M; P \rrbracket$?
 - ✓ Models for active attackers as code transformations (code deformations)... and the corresponding completeness problem?

- ⇒ Abstract Model Checking
 - ✓ Isolate temporal sub-logics which are complete for a given abstract system to analyse.

MANY THANKS!!