« Mathematical foundations:

(6) Abstraction — Part I »

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Course 16.399: "Abstract interpretation"

http://web.mit.edu/afs/athena.mit.edu/course/16/16.399/www/

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Informal introduction to abstract interpretation

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MESE Université Scientifique et Médicale de Grenoble

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METHODES ITERATIVES DE CONSTRUCTION ET D'APPROXIMATION DE POINTS EIXES D'OPERATEURS MONOTONES SUR UN TREILLIS ANALYSE SEMANTIQUE DES PROGRAMMES.

of the SIXTH ANNUAL ACM SYMPOSIUM ON

A little graphical language

- objects;
- operations on objects.

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Objects

An object is a pair:

- an origin (a reference point \times);
- a finite set of black pixels (on a white background).



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Operations on objects: constants

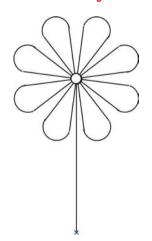
- constant objects;

for example:

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Example of an object: a flower

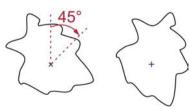


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Operations on objects: rotation

- rotation r[a](o) of objects o (of some angle a around the origin):



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Example 1 of rotation

$$petal = r[45](petal) =$$

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Operations on objects: union

- union $o_1 \cup o_2$ of objects o_1 and o_2 = superposition at the origin;

for example:

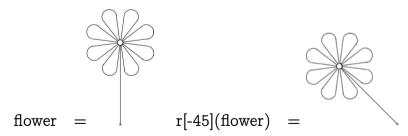
 $corolla = petal \cup r[45](petal) \cup r[90](petal) \cup$ $r[135](petal) \cup r[180](petal) \cup r[225](petal) \cup$ $r[270](petal) \cup r[315](petal)$



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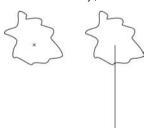
Example 2 of rotation



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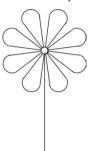
Operations on objects: add a stem

- stem(o) adds a stem to an object o (up to the origin, with new origin at the root);



Flower

flower = stem(corolla)



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Contraints

- A corolla is the \subseteq -least object X satisfying the two constraints:
 - A corolla contains a petal:

$$\mathrm{petal} \subseteq X$$

- and, a corolla contains its own rotation by 45 degres:

$$r[45](X) \subseteq X$$

- Or, equivalently 1:

$$F(X) \subseteq X$$
, where $F(X) = \text{petal} \cup r[45](X)$

1 By Tarski's fixpoint theorem, the least solution is lfp F.

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Fixpoints

-
$$corolla = lfp \subseteq F$$

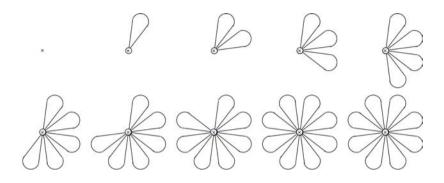
 $F(X) = petal \cup r[45](X)$

Iterates to fixpoints

– The iterates of F from the infimum \emptyset are:

$$X^0=\emptyset\;, \ X^1=F(X^0)\;, \ \dots\dots\dots, \ X^{n+1}=F(X^n)\;, \ \dots\dots\dots\;, \ ext{lfp}^\subseteq F=X^\omega=igcup_{n\geq 0}X^n\;.$$

Iterates for the corolla



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Upper-approximation

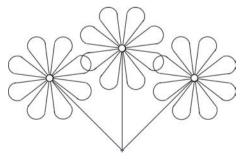
- An upper-approximation of an object is a object with:
 - same origin;
 - more pixels.

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The bouquet

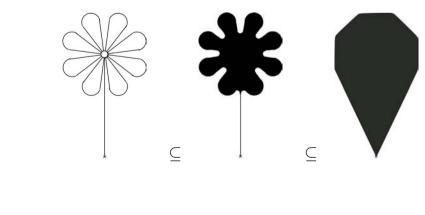
- bouquet = $r[-45](flower) \cup flower \cup r[45](flower)$
- The bouquet:



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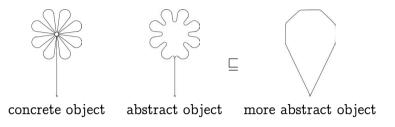
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Examples of upper-approximations of flowers



Abstract objects

- an abstract object is a mathematical/computer representation of an approximation of a concrete object;





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Abstraction

- an abstraction function α maps a concrete object o to an approximation represented by an abstract object $\alpha(o)$.



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Abstract domain

- an abstract domain is a set of abstract objects plus abstract operations (approximating the concrete ones);

Example 1 of abstraction

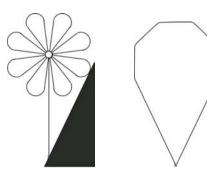








Example 2 of abstraction





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Concretization

- a concretization function γ maps an abstract object ō to the concrete object $\gamma(\overline{o})$ that is represents (that is to its concrete meaning/semantics).



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Comparing abstractions

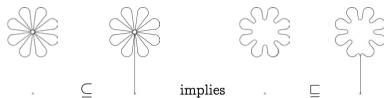
- larger pen diameters : more abstract;
- different pen shapes: may be non comparable abstractions.

Example of concretization

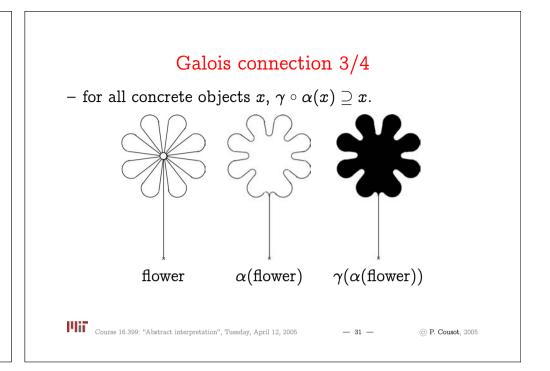




 $-\alpha$ is monotonic.



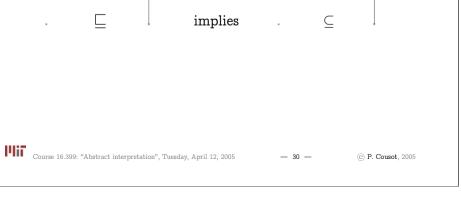




Galois connection 2/4

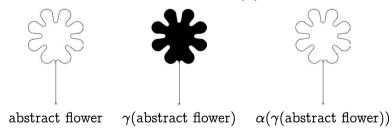
– γ is monotonic.





Galois connection 4/4

- for all abstract objects y, $\alpha \circ \gamma(y) \sqsubseteq y$.



((abbitact newer)

Galois connections

$$\langle \mathcal{D}, \subseteq \rangle \xrightarrow{\alpha} \langle \overline{\mathcal{D}}, \sqsubseteq \rangle$$

$$\text{iff} \qquad \quad \forall x,y \in \mathcal{D}: x \subseteq y \Longrightarrow \alpha(x) \sqsubseteq \alpha(y)$$

$$\wedge \ \forall \overline{x}, \overline{y} \in \overline{\mathcal{D}} : \overline{x} \sqsubseteq \overline{y} \Longrightarrow \gamma(\overline{x}) \subseteq \gamma(\overline{y})$$

$$\wedge \ orall x \in \mathcal{D} : x \subseteq \gamma(lpha(x))$$

$$\wedge \ orall \overline{y} \in \overline{\mathcal{D}} : lpha(\gamma(\overline{y})) \sqsubseteq \overline{x}$$

$$\text{iff} \qquad \forall x \in \mathcal{D}, \overline{y} \in \overline{\mathcal{D}}: \alpha(x) \sqsubseteq y \Longleftrightarrow x \subseteq \gamma(y)$$

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Specification of abstract operations

$$-\overline{\operatorname{op}/0} \stackrel{\mathrm{def}}{=} \alpha(\operatorname{op}/0)$$
 0-ary $-\overline{\operatorname{op}/1}(y) \stackrel{\mathrm{def}}{=} \alpha(\operatorname{op}/1(\gamma(y)))$ unary $-\overline{\operatorname{op}/2}(y,z) \stackrel{\mathrm{def}}{=} \alpha(\operatorname{op}/2(\gamma(y),\gamma(z)))$ binary

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Abstract ordering

 $-x \sqsubseteq y$ is defined as $\gamma(x) \subseteq \gamma(y)$.











Abstract petal

$$\alpha(\mathcal{C}) = \mathcal{C}$$

Abstract rotations

$$- \overline{\mathbf{r}}[a](y) = \alpha(\mathbf{r}[a](\gamma(y)))$$

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A commutation theorem on abstract rotations

 $-\alpha(\mathbf{r}[a](x))$ $= \alpha(\gamma(\alpha(r[a](x))))$ $= \alpha(\gamma(\mathbf{r}[a](\alpha(x))))$ $=\alpha(\mathtt{r}[a](\gamma(\alpha(x))))$ $= \overline{\mathbf{r}}[a](\alpha(x))$

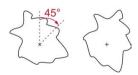
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Abstract rotations

$$- \overline{\mathbf{r}}[a](y) = \alpha(\mathbf{r}[a](\gamma(y)))$$

$$= \mathbf{r}[a](y)$$



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Abstract stems

$$-\ \overline{\operatorname{stem}}(y) = \alpha(\operatorname{stem}(\gamma(y)))$$



abstract corolla



 γ (abstract corolla)



 $stem(\gamma(abstract$ corolla))



 $\alpha(\text{stem}(\gamma(\text{abstract})))$ corolla)))

Abstract union

$$-x\sqcup y=lpha(\gamma(x)\cup\gamma(y))$$



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Abstract bouquet: (cont'd)

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Abstract bouquet:

abstract bouquet

$$= \frac{1}{2} \left[\frac{1}{2}$$

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Abstract bouquet: (end)

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A theorem on the abstract bouquet

```
abstract flower = \alpha(concrete flower)
abstract bouquet
= \overline{r}[-45](abstract flower) \sqcup abstract flower \sqcup \overline{r}[-45](abstract
flower)
= \overline{r}[-45](\alpha(\text{concrete flower})) \sqcup \alpha(\text{concrete flower}) \sqcup \overline{r}[-45](\alpha(\text{concrete flower}))
flower))
= \alpha(r[-45](concrete flower)) \sqcup \alpha(concrete flower) \sqcup \alpha(r[-45](concrete flower))
flower))
= \alpha(r[-45](concrete flower) \cup concrete flower \cup r[-45](concrete
flower))
= \alpha(concrete bouquet)
```

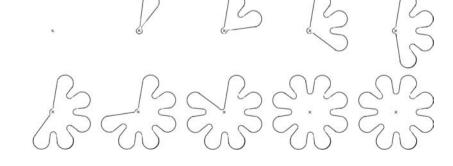
Abstract transformer \overline{F}

 $-\alpha(F(X))$ $= \alpha(\text{petal} \cup \text{r}[45](X))$ $= \alpha(\text{petal}) \sqcup \alpha(\text{r}[45](X))$ $= \alpha(\text{petal}) \sqcup \overline{r}[45](\alpha(X))$ = abstract petal $\sqcup \overline{r}[45](\alpha(X))$ $=\overline{F}(\alpha(X))$ by defining $\overline{F}(X) = \text{abstract petal} \sqcup \overline{r}[45](X)$ and so: - abstract corolla = α (concrete corolla) = α (lfp $\subseteq F$) = lfp $\subseteq \overline{F}$

Abstract fixpoint

- abstract corolla = α (concrete corolla) = α (lfp $\subseteq F$) where $F(X) = \text{petal} \cup r[45](X)$

Iterates for the abstract corolla



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Abstract interpretation of the (graphic) language

- Similar, but by syntactic induction on the structure of programs of the language;

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On abstracting properties of graphic objects

- No, because we implicitly used the following implicit initial abstraction:

$$\langle \wp(\wp(\mathcal{P})),\subseteq
angle \stackrel{\gamma_0}{ \longleftarrow_{\alpha_0}} \langle \wp(\mathcal{P}),\subseteq
angle$$

where:

 \mathcal{P} is a set of pixels (e.g. pairs of coordinates)

$$\alpha_0(X) = \bigcup X$$

$$\gamma_0(Y) = \{ G \in \mathcal{P} \mid G \subseteq Y \}$$

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On abstracting properties of graphic objects

- A graphic object is a set of (black) pixels (ignoring the origin for simplicity);
- So a property of graphic objects is a set of graphic objects that is a set of sets of (black) pixels (always ignoring the set of origins for simplicity);
- Was there something wrong?

Is it for fun (only)?

- Yes, but see image processing by morphological filtering:
 - J. Serra. Morphological filtering: An overview, Signal Processing 38 (1994) 3-11.

It can be entirely formalized by abstract interpretation.

Property abstraction

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```
begin
     new X,Y;
                                         1: X 10 Y 0
     X := 10; Y := 0;
     begin
        new X;
                                         2: X 20
    X := 20:
                                      { 1 → { X → 6, Y → 0},

2 → { X → 20 3}.
      end:
  end:
- Heaps: dynamic allocation;
- Control points: procedure names, labels, ...;
- States: control & memory states;
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```

Objects

When analyzing/proving programs we have to consider "objects" that represent some part of the computation state, such as:

- Values: booleans, integers, ... \mathcal{V}
- Variable names: X
- Environments: $\mathbb{X} \mapsto \mathcal{V}$
- Stacks: assigning values to variables in the context of block-structured languages: $\bigcup_{n>0} ([1,n] \mapsto (\mathbb{X} \mapsto \mathcal{V}))$

```
- Finite prefix traces;
```

- Maximal finite or infinite traces (for deterministic programs);
- Sets of maximal finite or infinite traces (for nondeterministic programs);
- **-** . . .

Properties

Properties are "sets of objects" (which have that propertv).

Examples:

- odd naturals: $\{1, 3, 5, \dots, 2n + 1, \dots\}$
- even integers: $\{2z \mid z \in \mathbb{Z}\}$
- values of integer variables: $\{z \in \mathbb{Z} \mid \text{minint} < z < z \}$ maxint}
- values of maybe uninitialized integer variables: $\{z \in$ $\mathbb{Z} \mid \mathrm{minint} < z < \mathrm{maxint} \} \cup \{ \varOmega_m \mid m \in \mathcal{M} \} \ \mathrm{where} \ \mathcal{M}$ is a set of error messages

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The complete lattice of concrete properties

The set of properties $\wp(\Sigma)$ of objects in Σ is a complete boolean lattice:

$$\langle \wp(\Sigma), \subseteq, \emptyset, \Sigma, \cup, \cap, \neg \rangle$$

where

- A property $P \in \wp(\Sigma)$ is the set of objects which have the property P
- \subseteq is logical implication since $P \subseteq Q$ means that all objects with property P have property Q ($o \in P \Longrightarrow$ $o \in Q$)

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- equality of two variables X and Y: $\{ \rho \in \mathbb{X} \mapsto \mathcal{V} \mid X, Y \in \mathcal{X} \mid A \in \mathcal{X} \}$ $dom(\rho) \wedge \rho(X) = \rho(Y)$
- invariance property (of a program with states in Σ): $I \in \wp(\Sigma)$
- trace property: $T \in \wp(\Sigma^{\vec{\infty}})$
- trace semantics property: $P \in \wp(\wp(\Sigma^{\vec{\infty}}))$
- **–** . . .

- ∅ is false (ff)
- $-\Sigma$ is true (tt)
- $-\cup$ is disjunction (objects which have either property P and/or have property Q belong to $P \cup Q$
- $-\cap$ is *conjunction* (object which have property P and have property Q belong to $P \cap Q$)
- $-\neg$ is negation (objects not having property P are those in $\Sigma \setminus P$)

Abstraction, informal introduction

- Abstraction replace someting "concrete" by a schematic description that account for some, and in general not all properties, either known or inferred i.e. an "abstract" model or concept
- In practice, such an abstract model of a concrete object
 - can describe some of the properties of the concrete object
 - cannot describe all properties of this concrete object ³

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Intuitive example 1 of abstraction

Cars $\xrightarrow{\alpha}$ Trademarks 4

- A concrete property of cars is a set of cars
- It can be abstracted by the set of their trademarks
- A trademark is a set of cars.
- An abstract property of cars is a set of cars which, whenever it contains one car of some trademark, also contains all cars of that trademark

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- So an abstraction of properties in $\wp(\Sigma)$ of objects in Σ is essentially a subset $A \subseteq \wp(\Sigma)$ such that:
 - The properties in A are the concrete properties that can be described exactly by the abstraction, without any loss of information
 - The properties in $\wp(\Sigma) \setminus A$ are the properties that cannot be described exactly by the abstraction, and have to be referred to by being approximated in some way or another by abstract properties in

Intuitive example 2 of abstraction

Scientific papers $\stackrel{\alpha}{\longrightarrow}$ set of keywords⁵

- A concrete property of scientific papers is a set of scientific papers
- Each scientific paper is abstracted by a list of keywords
- A property of scientific papers can be abstracted by the list of keywords appearing in all papers with that property
- An abstract property of scientific papers is therefore a set of papers which have all keywords belonging to the list

² real, actual, material, corporeal, ...

³ since otherwise this property would have to be "exactly that object" i.e. {o}

⁴ Formally, if $t \in \text{Cars} \mapsto \text{Trademarks}$ yield the trademark t(c) of a car $c \in \text{Cars}$ then the abstraction of $P \in \wp(\operatorname{Cars})$ is $\alpha(P) = \{t(c) \mid c \in P\}$ and the set of cars described by an abstract property $T \subseteq \operatorname{Trademarks}$ is $\gamma(T) = \{c \in \text{Cars} \mid t(c) \in T\}.$

⁵ Formally if $w \in \text{Scientific papers} \mapsto \text{Words provides the set of words } w(p)$ appearing in a paper $p \in \text{Scientific papers and Keywords} \mapsto \text{Words is a given list of keywords, then a property } P \in$ $\wp(\text{Scientific papers})$ is abstracted by the set of keywords $\alpha(P) = \{w(p) \cap \text{Keywords} \mid p \in P\}$ and a set K of keyworks stands for the concrete property $\gamma(K) = \{p \in \text{Scientific papers} \mid K \subseteq w(p) \cap \text{Keywords}\}$.

Abstraction, definition of concrete and abstract properties

Abstraction in a reasoning/computation such that:

- Only some properties $A \subset \wp(\Sigma)$ of the objects in Σ can be used:
- The properties $P \in A$ that can be used are called abstract:
- The properties $P \in \wp(\Sigma)$ are called *concrete*;

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Direction of abstraction

- When approximating a concrete property $P \in \wp(\Sigma)$, by an abstract property $\overline{P} \in A$, with $\overline{P} \neq P$, a relation must be established between the concrete P and abstract property \overline{P} to establish that

> " $\overline{P} \in A$ is an approximation/abstraction of $P \in \wp(\Sigma)$ "

so as to ensure the soundness of the reasoning in the abstract with respect to the concrete, exact one.

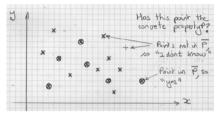
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- Abstract reasonings/computations involve sound approximations, in that:
 - The concrete properties that are also abstract can be used in the abstract reasoning/computation "as is", without any loss of information;
 - The concrete properties $P \in \wp(\Sigma) \setminus A$ which are not abstract cannot be used in the reasoning/computation and therefore must be approximated by some other abstract property $\overline{P} \in A$, which, since $P \neq \overline{P}$, involves some form of approximation.

- We consider essentially two cases:
 - Approximation from above: $P \subseteq \overline{P}$
 - Approximation from below: $P \supset \overline{P}$
- Other relations can be considered (e.g. probabilistic properties)
- The two notions are dual so formally only one need to be studied formally (approximation from above)
- In practice, useful approximation from below are much harder to discover

Abstraction from below



- \times : points which have the concrete property P
- o: points which have the abstract property \overline{P}
- To answer the question " $\langle x, y \rangle \in P$?" using only \overline{P} (such that $P \subseteq \overline{P}$):
 - If $\langle x, y \rangle \not \in \overline{P}$ then "I don't know"
 - If $\langle x, y \rangle \in \overline{P}$ then "Yes"

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Why can an abstraction from above be "simpler" than the original concrete property?

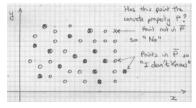
- The concrete property is a set of objects
 - \rightarrow The objects are complex
 - \rightarrow The set can be infinite
 - ightarrow In general their exists no suitable computer representation of the concrete property
- The abstract property is a larger set of objects
- → larger structures are in general even more expensive to store in the computer memory/compute with than smaller ones

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Abstraction from above

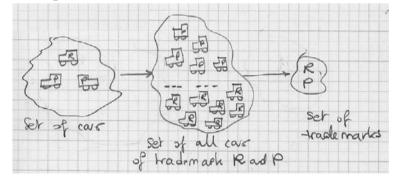


- \times : points which have the concrete property P
- o: points which have the abstract property \overline{P}
- To answer the question " $\langle x, y \rangle \in P$?" using only \overline{P} (such that $P \supseteq \overline{P}$):
 - If $\langle x, y \rangle t \in \overline{P}$ then "I don't know"
 - If $\langle x, y \rangle t \not \in \overline{P}$ then "No"

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- $ightarrow \underline{\text{but}}$, well-chosen larger structures can have $\underline{\text{simpler}}$ $\underline{\text{encodings}}$ which can ve exploited for memorization and computation
- Example:



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What to do in absence of (upper) abstraction?

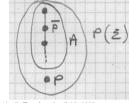
- Assume a mechanized reasoning about a computer systems with objects/states Σ , we use an abstraction $A \subset \wp(\Sigma)$
- Assume concrete properties $P \in \wp(\Sigma)$ which cannot be expressed in the abstract, must be approximated from above by $\overline{P} \in A : P \supset \overline{P}$
- How should the mechanized reasoning proceed when some property P has no abstraction $\overline{P} \in A$ from above $(\forall \overline{P} \in A : P \not\supset \overline{P})$?
 - loop?

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Minimal abstractions

- Assume concrete properties $P \in \wp(\Sigma)$ must be approximated from above by $\overline{P} \in A \subset \wp(\Sigma)$ such that $P \subset \overline{P}$
- The smaller the abstract property \overline{P} is, the most precise the approximation will be
- Obviously, there might be no minimal abstract property at all in A



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- block?
- ask for help?
- fail?
- answer something sensible!
- The only way to be always able to say something sensible for all $P \in \wp(\Sigma)$ is to assume that $\Sigma \in A$:

Any concrete property should be approximable by "I don't know" (i.e. $\Sigma \in A$, Σ meaning "true")

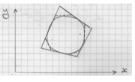
- If a concrete property $P \in \wp(\Sigma)$ has minimal upper approximations $\overline{P} \in A$:
 - $P \subset \overline{P}$
 - $\exists \overline{P}' : P \subseteq \overline{P}' \vdash \overline{P}$

then such minimal approximations are more precise than the non-minimal ones

- So minimal abstract upper approximations, if any, should be prefered
- In particular, an abstract property $\overline{P} \in A$ is best approximated by itself

In absence of minimal abstraction

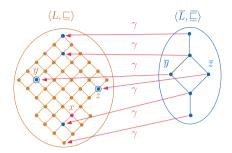
- A classical example of absence of minimal abstract upper-approximations is that of a disk with no minimal convex polyhedral approximation [1]
 - $\Sigma = \mathbb{R} \times \mathbb{R}$
 - A = convex polyhedra
 - Absence of minimal approximation is shown by Euclide's construction:



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Example of minimal abstractions in absence of a best approximation



- x can be approximated by $y = \gamma(\overline{y})$ and $z = \gamma(\overline{z})$ but y and z are not comparable.

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- In absence of minimal approximations, the approximation $P \subset P_1$ can always be approximated by a better one $P \subset P_2 \subset P_1!$
- Some arbitrary choice has to be performed. This case will be studied later (see [2]). So, in the following, we assume the existence of minimal approximations

- [1] P. Cousot and N. Halbwachs. Automatic discovery of linear restraints among variables of a program. In Conference Record of the Fifth Annual ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages, pages 84-97, Tucson, Arizona, 1978. ACM Press, New York, NY, U.S.A.
- [2] P. Cousot and R. Cousot. Abstract Interpretation Frameworks, Journal of Logic and Computation, 2(4):511-547, August 1992.

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- The other possible upper approximations would be less precise (than both y and z in that particular example)
- Notice that γ cannot be the upper adjoint of a Galois connection since it is not a complete meet morphism: $\gamma(\overline{y}) \wedge \gamma(\overline{z}) \neq \gamma(\overline{y} \sqcap \overline{z})$
- Abstraction in absence of best approximation is studied in [2]

Which minimal abstraction to choose?

- If there are several minimal possible abstract approximations $\overline{P}_1, \overline{P}_2, \dots$ of a concrete property P, the most useful choice (ultimately providing the most precise unformation) may depend upon the circumstances and on later reasonings/computations
- Example: rule of signs.
 - In "1+0", it is better to chose '+', because of the rule '+' + '+' = '+', while '+' + '-' yields no information (I don't know)
 - In "(-1)+0", it is better to chose '-' because of the rules (-'+')='-'and '-' + '-' = '-', while '-' + '+' yields no information (I don't know)
 - Both cases have to be tried (backtracking)

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Best abstraction

- A very handy choice of the abstract properties $A \subseteq$ $\wp(\Sigma)$ is when every concrete property P has a best approximation $\overline{P} \in P$:
 - $P \subset \overline{P}$
 - $-\ \forall \overline{P}' \in A: (P \subseteq \overline{P}') \Longrightarrow (\overline{P} \subseteq \overline{P}')$
- It follows that \overline{P} is the glb of the over-approximations of P in A:

$$\overline{P} = \bigcap \{ \overline{P}' \in A \mid P \subseteq \overline{P}' \} \in A$$

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- In absence of unicity of the minimal approximation, it may be necessary to try all of them (at the cost of an exponential blow up of the mechanical reasoning). This case will be studied later (see [2]).
- To start with, we will assume the existence of a best approximation (i.e. a unique minimal upper approximation).

PROOF. – We have $\forall \overline{P} \in \{\overline{P}' \in A \mid P \subseteq \overline{P}'\} : P \subseteq \overline{P} \text{ so } P \subseteq \bigcap \{\overline{P}' \in A \mid P \subseteq \overline{P}'\}$ \overline{P}' } by def. glb \sqcap

- Moreover $\forall \overline{P}' \in A : (P \subset \overline{P}') \Longrightarrow (\bigcap \{\overline{P}'' \in A \mid P \subset \overline{P}''\} \subset \overline{P}')$
- It follows that $\overline{P} = \bigcap \{\overline{P}' \in A \mid P \subseteq \overline{P}'\}$
- $-\text{ So }[\exists \overline{P}: (P\subseteq \overline{P}) \land (\forall \overline{P}' \in A: (p\subseteq \overline{P}') \Longrightarrow (\overline{P}\subseteq \overline{P}')] \iff [\overline{P}=\bigcap \{\overline{P}' \in \overline{P}'\})$ $A \mid P \subseteq \overline{P}' \} \in A$

⁶ There can even be infinitely many ones.

The abstract domain is a Moore family

THEOREM. The hypothesis that any concrete property $P \in \wp(\Sigma)$ has a best abstraction $\overline{P} \in A$, implies that The abstract domain A is a Moore family.

PROOF. - Let $X \subseteq A$ be a set of apstract properties. Its intersection $\bigcap X$ has a best approximation $\overline{P} \in A$. We have therefore

$$\overline{P} = \bigcap \{ \overline{P}' \in A \mid \bigcap X \subseteq \overline{P}' \}$$

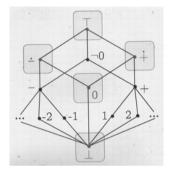
But $\forall \overline{P}' \in X : \bigcap X \subseteq \overline{P}'$ and $X \subseteq A$ so $X \subseteq \{\overline{P}' \in A \mid \bigcap X \subseteq \overline{P}'\}$ and therefore $\bigcap \{\overline{P}' \in A \mid \bigcap X \subseteq \overline{P}'\} \subseteq \bigcap X$ by def. of glb. By antisymmetry, $\bigcap X = \bigcap \{\overline{P}' \in A \mid \bigcap X \subseteq \overline{P}'\} = \overline{P} \in A$, proving A to be a Moore family.

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Example and counter-example of Moore family based abstraction

- Example: rule of signs with best approximation of 0

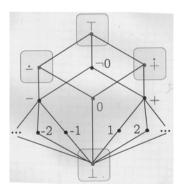


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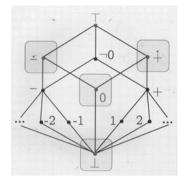
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In particular $\bigcap \emptyset = \Sigma \in A$, which is consistent with our hypothesis that A should contain Σ to have the ability to express "I don't know".

- Counter-example: rule of signs without best approximation of 0



- Counter example: rule of sign without upper approximation of "different from zero"





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Closure operator based abstraction

Assume that the abstract domain A is a Moore family of the concrete domain $\langle \wp(\Sigma), \subseteq, \emptyset, \Sigma, \cup, \cap, \neg \rangle$. Then the abstraction map is

$$ho \ \in \ \wp(\Sigma) \mapsto A \
ho(P) \stackrel{\mathrm{def}}{=} igcap \{ \overline{P} \in A \ | \ P \subseteq \overline{P} \}$$

Then ρ is an upper closure operator on $\wp(\Sigma)$.

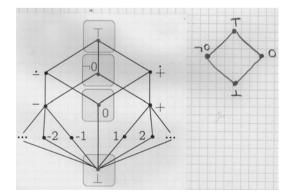
PROOF. ρ is the closure operator induced by the Moore family, a result simply depending on the fact that $\langle \rho(\Sigma), \subseteq, \emptyset, \Sigma, \cup, \cap \rangle$ is a complete lattice. \square

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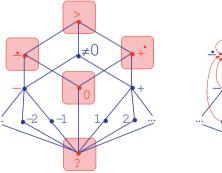
- Example: abstraction to 0 or different from 0



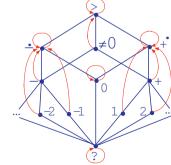
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Example of abstraction map



Moore family



Abstraction map (closure operator)

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Equivalent specification of an abstraction by a Moore family and a closure operator

In case of existence of a best abstraction, it is equivalent to specify the abstraction domain A

- 1. as a Moore family \mathcal{M}
- 2. as a closure operator ρ

PROOF. – Given \mathcal{M} defined $\rho(P) = \bigcap \{\overline{P} \in \mathcal{M} \mid P \subseteq \overline{P}\} \in \mathcal{M}\}$ so that $A = \mathcal{M} = \rho(\wp(\Sigma))$

- Conversely, given a closure operator ρ , define $A = \rho(\wp(\Sigma)) = \{\rho(P) \mid P \in$ $\wp(\Sigma)$ which is therefore the set of fixpoints of ρ whence a Moore family since ρ operates on a complete lattice

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Generalizing to complete lattices

- The reasoning on abstractions of concrete properties $\langle \wp(\Sigma), \subset, \emptyset, \Sigma, \cup, \cap, \neg \rangle$ to an abstract domain which, in case of best abstraction is a Moore family, whence a complete lattice, can be generalized to an arbitrary concrete complete lattice $\langle L, \, \sqsubseteq, \, \bot, \, \top, \, \sqcup, \, \sqcap \rangle$
- This allow a compositional approach where $\langle L, \, \sqsubseteq, \, \bot, \,$ \top , \sqcup , \sqcap) is abstracted to $\langle A_1, \, \Box_1, \, \bot_1, \, \top_1, \, \Box_1, \, \Box_1 \rangle$ $\top_2, \sqcup_2, \sqcap_2\rangle, \ldots$

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Examples of specifications of an abstractionby a Moore family and a closure operator

- The most imprecise abstraction is "I don't know"
 - $\mathcal{M} = \{\Sigma\}$
 - $\rho = \lambda P \cdot \Sigma$
- The most precise abstraction is "identity"
 - $\mathcal{M}=\wp(\Sigma)$
 - $\rho = \lambda P \cdot P$

Correspondance between concrete and abstract properties

Given a closure operator ρ on a poset $\langle L, \, \Box \rangle$ (typically L is $\wp(\Sigma)$), Morgado's theorem states that for all $P, P' \in L$

$$\rho(P) \sqsubseteq \rho(P') \iff P \sqsubseteq \rho(P')$$

that is, by definition of Galois connections $(1_L \stackrel{\text{def}}{=} \lambda x \in L \cdot x)$:

$$\langle L, \sqsubseteq \rangle \stackrel{1_L}{\longleftarrow_{
ho}} \langle
ho(L), \sqsubseteq \rangle$$

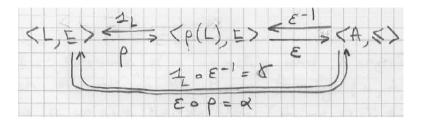
PROOF. We must prove $\forall x \in L : \forall y \in \rho(L) : (\rho(x) \sqsubseteq y) \iff (x \sqsubseteq 1_L(y)).$ We have $y \in \rho(L)$ iff $\exists z \in L : \rho(z) = y$ so that this condition is equivalent to $\forall x,z \in L: (\rho(x) \sqsubseteq \rho(z)) \iff (x \sqsubseteq \rho(z))$ which directly follows from Morgado's theorem. Moreover, ρ is surjective on $\rho(L)$.

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By composition, we get:

$$\langle L, \sqsubseteq
angle \stackrel{1_L \circ \epsilon^{-1}}{\longleftarrow} \langle A, \leq
angle$$



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Correspondance between concrete and representations of abstract properties

- Let $\langle A, \leq \rangle$ be an order-isomorphic representation of the abstract domain $\langle \rho(L), \, \Box \rangle$. We have

$$\langle
ho(L), \sqsubseteq
angle \stackrel{\epsilon}{\sqsubseteq_{\epsilon^{-1}}} \langle A, \leq
angle$$

where ϵ^{-1} is the inverse of the bijection $\epsilon \in \rho(L) \rightarrow A$ and $\epsilon \in \rho(L) \stackrel{\mathrm{m}}{\longmapsto} A$.

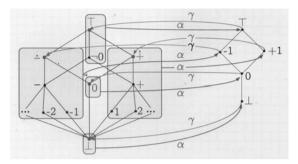
Specification of an abstract domain by a Galois surjection

- Inversely, we can consider a Galois surjection

$$\langle L, \sqsubseteq \rangle \stackrel{\gamma}{\longleftarrow} \langle A, \leq \rangle$$

- Then $\rho = \gamma \circ \alpha$ is a closure operator and $\langle A, < \rangle$ is order-isomorphic to $\langle \rho(L), \, \Box \rangle$
- We have an order-isomorphic representation of the abstract domain $\langle \rho(L), \, \Box \rangle$, which is a Moore family.

Specification of an abstract domain by a Galois surjection, example



Because α is surjective, γ is injective and order is preserved, each element in the Moore family $\{\bot,0,\dot{-},\dot{+},\top\}$ has a unique isomorphic representation $\{\bot,0,-1,+1,\top\}$. This would not be the case when α is not surjective.

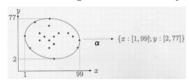
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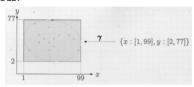
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A graphical illustration of the specification of an abstraction by a Galois surjection

- Abstraction of a set of point in \mathbb{R}^2 by an interval:

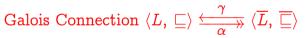


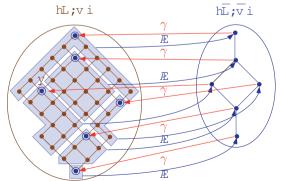
- Concretization:



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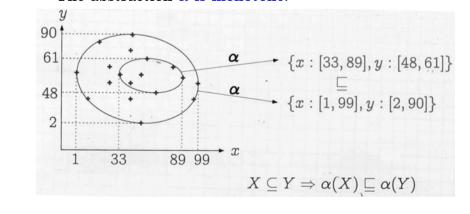


- ●: Moore family of best approximations;
- concrete values with the same abstraction.

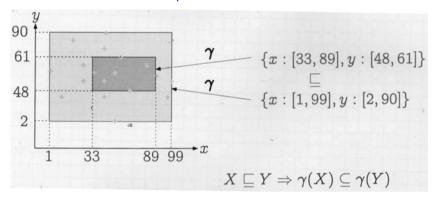
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- The abstraction α is monotone:



- The concretization γ is monotone:

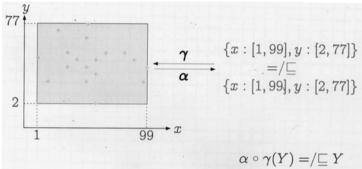


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- The composition $\alpha \circ \gamma$ is:
 - The identity for Galois surjections
 - Reductive (ideed a lower-closure operator) for Galois connections



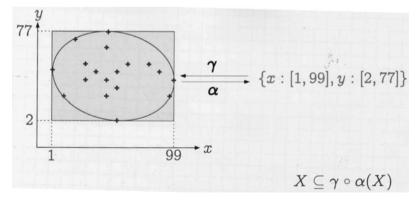
 $\frac{}{7}$ providing the least abstract properties with similar expressive power that is same concretization

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 $-\gamma \circ \alpha$ is extensive (indeed an upper-closure operator):



- The intuition of \sqsubseteq is that $\overline{P} \sqsubseteq \overline{P}'$ implies $\gamma(\overline{P}) \subseteq \gamma(\overline{P}')$ so that \overline{P} is more precise than \overline{P}' when expressed in the concrete
- So $\alpha \circ \gamma(\overline{P}) \sqsubseteq \overline{P}$ means that concretization can loose no information, since if the concrete property P is overapproximated by \overline{P} then

$$P \subseteq \gamma(\overline{P}) \iff P \subseteq \gamma(\alpha \circ \gamma(\overline{P}))$$

so that using \overline{P} or $\alpha \circ \gamma(\overline{P})$ is exactly the same in the concrete, as far as precision is concerned.

Why are abstract domains complete lattices in the presence of best abstractions?

- The abstractions start from the complete lattice of concrete properties $\langle \rho(\Sigma), \subset, \emptyset, \Sigma, \cup, \cap, \neg \rangle$ where objects in Σ represent program computations and the elements of $\wp(\Sigma)$ represent properties of these program computations
- We have defined abstract domains with best approximations in three equivalent different ways (more are considered in [3])
 - As a Moore family;
 - As a closure operator (which fixpoints form the abstract
 - As the image of the concrete domain by a Galois surjec-

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Relaxing the condition on the uniqueness of the representation of abstract properties: Galois connections

- Assume the correspondence between concrete and abstract properties is a non-surjective Galois connection:

$$\langle L, \sqsubseteq \rangle \stackrel{\gamma}{ \stackrel{}{ \hookleftarrow} \alpha} \langle A, \leq \rangle$$

 $-\gamma$ is not surjective, which means that at least two different abstract properties \overline{P}_1 and \overline{P}_2 have exactly the same concretization:

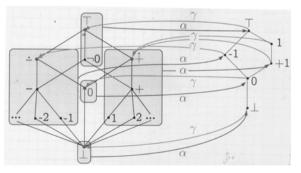
$$\overline{P}_1
eq \overline{P}_2 \wedge \gamma(\overline{P}_1) = \gamma(\overline{P}_2)$$

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- In all cases, it follows that the abstract domain is a complete lattice, since we have seen that:
 - A Moore family of a complete lattice is a complete lattice;
 - The image of a complete lattice by an upper closure operator is a complete lattice (Ward);
 - The image of a complete lattice by the surjective abstraction of a Galois connection is a complete lattice.
- In general this property does not hold in absence of best abstraction or if arbitrary points are added to the abstract domain as shown next.

Example of non-surjective Galois connection based abstraction



Here "1" and "+1" are two different encodings of the same concrete property $\dot{+}$ (i.e; positive or zero).

^[3] P. Cousot and R. Cousot. Systematic design of program analysis frameworks. In Conference Record of the Sixth Annual ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages, pages 269-282, San Antonio, Texas, 1979. ACM Press, New York, NY, U.S.A.

Reduction

- With non-surjective Galois connections $\langle L, \sqsubseteq \rangle \stackrel{\gamma}{\longleftrightarrow} \langle A, \leq \rangle$, there are at least two different representations in the abstract of at least one concrete property
- This may happen when abstract computer representations of the same concrete property are not unique (e.g. sets represented by ordered trees)
- Reduction is always mathematically possible, by considering $\langle L, \sqsubseteq \rangle \stackrel{\gamma_{\equiv}}{\longleftrightarrow} \langle A_{\equiv}, \leq_{\equiv} \rangle \text{ where } \overline{P} \equiv \overline{P}' \iff \gamma(\overline{P}) = \gamma(\overline{P}'),$ $lpha_{\equiv}(P) = [\stackrel{-}{lpha}(P)]_{\equiv}, \ \gamma([\overline{P}]_{\equiv}) = \gamma(\overline{P}) \ \ ext{and} \ \ [\overline{P}]_{\equiv} \leq_{\equiv} [\overline{P}']_{\equiv} \ \ \Longleftrightarrow \ \ P < \overline{P}'$

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Standard examples of abstractions formalized by Galois connections

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- Example:

- Abstract properties are intervals [a, b] meaning $\gamma([a, b]) \stackrel{\text{def}}{=}$ $\{x \mid minint < a < x < b < maxint\}$
- The empty set is represented by any [a, b] with b < a. This can be left as is or normalized as e.g. [maxint, minint]
- The supremum is represented by any [a, b] with a < minintand maxint $\leq b$. This can be left as is or better normalized as e.g. [minint, maxint]
- Sometimes it is better to have a "normal form", but this reduction may also be sometimes algorithmically very expensive

Subset restriction abstraction

- -C is a set, $A \subset C$ is a strict subset
- $-\alpha_{\Lambda}(X) \stackrel{\text{def}}{=} X \cap A$
- $-\gamma_A(Y)\stackrel{\mathrm{def}}{=} (Y\cup \neg A)$ where $\neg A\stackrel{\mathrm{def}}{=} C\setminus A$ then

$$\langle \wp(C), \subseteq
angle \stackrel{\gamma_A}{ \longleftarrow_{lpha_A}} \langle \wp(A), \subseteq
angle$$

Proof. $\alpha_A(X) \subseteq Y \iff (X \cap A) \subseteq Y \iff X \subseteq (Y \cup \neg A) \iff X \subseteq \gamma_A(Y).$ If $Y \in \wp(A)$ then $\alpha(A) = A$ proving α to be onto.

- The intuition is that we approximate a set by remembering a few members
- Example: tests
 - C is the set of all program execution traces
 - A is the subset of traces explored by tests
 - $\gamma(P) = P \cup \neg A$ i.e. nothing is known about execution traces which have not been tested!
- Example: keywords of a scientific paper

- The intuition is to record whether a given property holds (tt) or whether it is not known whether it holds or not (ff).
- Example 1: this is called "predicate abstraction" (to be further developped later)
- Example 2: $\Sigma = \langle c, m \rangle$, c is a control point, m is a memory state, $S = \{\langle c, m \rangle \mid m(X) = 0\}$ records whether variable X is null.
- Example 3: green mark on tags of vegetarian participants in CS conferences

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Subset inclusion abstraction

Τf

- C is a set, $S \subset C$ is a strict subset
- $-\alpha_S(X) \stackrel{\mathrm{def}}{=} (X \subseteq S)$
- $-\gamma_{S}(b) \stackrel{\text{def}}{=} (b ? S : C)$

then

$$\langle \wp(C), \subseteq \rangle \stackrel{\gamma_S}{\longleftarrow_{\alpha_S}} \langle \mathbb{B}, \Leftrightarrow \rangle$$

PROOF. $\alpha_S(X) \Leftrightarrow b \iff b \Rightarrow (X \subseteq S) \iff (b ? (X \subseteq S) : \mathsf{tt}) \iff$ $(b ? (X \subseteq S) : (X \subseteq C)) \iff X \subseteq (b ? S : C) \iff X \subseteq \gamma_S(b). \ \alpha_S \text{ is onto}$ since $\alpha_S(S)$ = tt and $\alpha_S(C)$ = $(C \subseteq S)$ = ff since $S \subset C$.

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Elementwise/homomorphic abstraction

Τf

$$- \mathbb{Q} : C \mapsto A$$

elementwise abstraction

$$-lpha_{@}(P)\stackrel{\mathrm{def}}{=}\{@(p)\mid p\in P\}$$

set abstraction

$$-\gamma_{@}(Q)\stackrel{\mathrm{def}}{=}\{p\mid @(p)\in Q\}$$

concretization

then

$$\langle \wp(C), \subseteq
angle \stackrel{\gamma_{@}}{ \displaystyle \stackrel{}{ \displaystyle \leftarrow} \displaystyle \stackrel{}{ \displaystyle \sim} \displaystyle$$

PROOF. Given $X \subseteq C$ and $Y \subseteq A$, we have

$$\alpha_{\mathbb{Q}}(X) \subseteq Y$$

$$\iff \{@(x) \mid x \in X\} \subseteq Y$$

 $\partial def. \alpha_{\Theta}$

$$\iff \forall x \in X: @(x) \in Y$$

$$\iff X \subseteq \{x \in C \mid @(x) \in Y\} \\ \iff X \subseteq \gamma_{@}(Q)\}$$
 (def./ \subseteq)

- The intuition is to remember only one characteristics $\mathbb{Q}(x)$ of the objects x which satisfy the concrete property.
- Example 1: trademark of cars
 - C: set of all cars
 - A: set of all car trademarks
 - $\mathbb{Q}(c)$: trademark of car c
 - $\alpha_{\mathbb{Q}}(X)$: trademarks of cars in set X
 - $\gamma_{\odot}(T)$: all cars which trademark is in T

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- $-\langle \wp(C), \subseteq \rangle \xrightarrow{\gamma_{@}} \langle \wp(A), \subseteq \rangle \text{ when } @: C \mapsto A \text{ is onto}$
- Often rediscovered (e.g. abstract model-checking)
- Often misunderstood (e.g.: $\langle \mathbb{Q}, \gamma \rangle$ instead of $\langle \alpha, \gamma \rangle$)

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- Example 2: signs

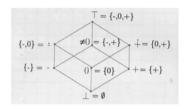
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$$@: \mathbb{Z} \mapsto \{-, 0, +\}$$

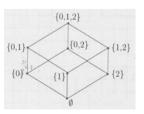
$$egin{array}{ll} - & \mathbb{Q}(z) \stackrel{ ext{def}}{=} - & ext{if } x < 0 \ \stackrel{ ext{def}}{=} 0 & ext{if } x = 0 \ \stackrel{ ext{def}}{=} + & ext{if } x > 0 \end{array}$$

- Example 3: congruence

-
$$\mathbb{Q} \in \mathbb{Z} \mapsto \mathbb{Z}/n, \ n=3$$

-
$$\mathbb{Q}(x)\stackrel{\mathrm{def}}{=}|x| mod n$$





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Functional abstraction

Tf

- $-D^{\dagger}$ and D^{\sharp} are sets
- $-\langle L, \sqsubseteq, \perp, \top, \sqcup, \sqcap \rangle$ is a complete lattice

$$- \alpha \in (D^{
atural} \mapsto L) \mapsto (D^{\sharp} \mapsto L)$$

$$lpha(f) \stackrel{\mathrm{def}}{=} \lambda y \cdot | |\{f(x) \mid @(x) = y\}|$$

$$-\gamma \in (D^\sharp \mapsto L) \mapsto (D^{\natural} \mapsto L)$$

$$\gamma(q)\stackrel{\mathrm{def}}{=} q\circ @$$

then

$$\langle D^{
atural} \mapsto L, \stackrel{.}{\sqsubseteq} \rangle \stackrel{\gamma}{\longleftrightarrow} \langle D^{
atural} \mapsto L, \stackrel{.}{\sqsubseteq} \rangle$$

Proof. $\alpha(f) \sqsubseteq g \iff \forall y : \alpha(f)(y) \sqsubseteq g(y) \iff \forall y : \bigsqcup \{f(x) \mid @(x) = y\} \sqsubseteq g(y) \iff \forall y : \forall x : (@(x) = y) \implies (f(x) \sqsubseteq g(y)) \iff \forall x : f(x) \sqsubseteq g(@(x))$ $\iff f \stackrel{.}{\sqsubset} q \circ @ \iff f \stackrel{.}{\sqsubset} \gamma(q)$

- Example: this is a generalization of the previous homomorphic abstraction with $L = \{ff, tt\}$ ordered with ff \Box tt using the representation of sets by their characteristic function.

Proof. $\alpha(X) \subseteq Y \iff \{y \mid \exists x \in X : \langle x, y \rangle \in \mathbb{Q}\} \subseteq Y \iff \forall y : (\exists x \in X : x \in X) \in \mathbb{Q}$ $\langle x, y \rangle \in \mathbb{Q} \Longrightarrow (y \in Y) \iff \forall y : \forall x \in X : (\langle x, y \rangle \in \mathbb{Q}) \Longrightarrow (y \in Y) \iff$ $\forall x \in X : \forall y : (\langle x, y \rangle \in \mathbb{Q}) \Longrightarrow (y \in Y) \iff X \subseteq \{x \mid \forall y : (\langle x, y \rangle \in \mathbb{Q}) \Longrightarrow$ $(y \in Y)$ \iff $X \subseteq \gamma(Y)$.

- A generalization of the homomorphic/elementwise abtraction using a relation instead of a function Q.

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Relational Abstraction

$$- @ \in D^{\natural} \times D^{\sharp}$$

$$-lpha\in\wp(D^
atural})\mapsto\wp(D^
atural})$$

$$lpha(X)\stackrel{ ext{def}}{=} \{y\mid \exists x\in X: \langle x,\ y
angle\in \mathbb{Q}\}= ext{post}[\mathbb{Q}]X$$

$$-\gamma\in\wp(D^{\sharp})\mapsto\wp(D^{\natural})$$

$$\gamma(Y)\stackrel{\mathrm{def}}{=} \{x\mid orall y: (\langle x,\ y
angle\in \mathbb{Q}) \Longrightarrow (y\in Y)\} = \widetilde{\mathsf{pre}}[\mathbb{Q}]Y$$

then

$$\langle \wp(D^{\natural}), \subseteq \rangle \stackrel{\gamma}{ \underset{\alpha}{\longleftarrow}} \langle \wp(D^{\sharp}), \subseteq \rangle$$

Relational lattice abstraction

$$-\langle A, \sqsubseteq, \perp, \top, \sqcup, \sqcap \rangle$$
 Abstract domain (complete lattice)

$$-\;
ho\in\wp(C imes A)$$

Abstraction relation

$$-lpha_
ho(P)\stackrel{\mathrm{def}}{=}igsqcup \{a\in A\mid \exists p\in P: \langle p,\ a
angle\in
ho\}$$

Set abstraction

$$egin{aligned} &-\gamma_{
ho}(a) \stackrel{ ext{def}}{=} \{p \mid orall a' \in A : (\langle p,\ a'
angle \in
ho) \Longrightarrow (a' \sqsubseteq a)\} \end{aligned}$$

Concretization

then

$$\langle \wp(C), \subseteq
angle \stackrel{\gamma_{
ho}}{ \stackrel{}{\longleftarrow} } \langle A, \sqsubseteq
angle$$

Proof. $\forall P \subseteq C, \forall Y \in A$:

$$\begin{array}{c} \alpha_{\rho}(P) \sqsubseteq Y \\ \Longleftrightarrow \bigsqcup \{a \in A \mid \exists p \in P : \langle p, \ a \rangle \in \rho\} \sqsubseteq Y \\ \Longleftrightarrow \forall a \in A : (\exists p \in P : \langle p, \ a \rangle \in \rho\}) \Longrightarrow (a \sqsubseteq Y) \\ \Longleftrightarrow \forall a \in A : \forall p \in P : (\langle p, \ a \rangle \in \rho\}) \Longrightarrow (a \sqsubseteq Y) \\ \Longleftrightarrow \forall p \in P : \forall a \in A : (\langle p, \ a \rangle \in \rho\}) \Longrightarrow (a \sqsubseteq Y) \\ \Longleftrightarrow P \subseteq \{p \mid \forall a \in A : (\langle p, \ a \rangle \in \rho\}) \Longrightarrow (a \sqsubseteq Y) \\ \Longleftrightarrow P \subseteq \gamma_{\rho}(a) \end{array} \qquad \begin{array}{c} (\text{def.} \ \subseteq S) \\ \text{(def.} \ \subseteq S) \\ \text{(def.} \ \gamma_{\rho}S \\ \end{array}$$

- Intuition: the weakest abstract property in relation with the concrete elements

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- Example 2 (semi-dual of example 1):

-
$$@\in D^
atural \mapsto \wp(D^\sharp)$$

-
$$\alpha \in \wp(D^{
atural}) \mapsto \wp(D^{
atural})$$

$$lpha(X)\stackrel{\mathrm{def}}{=}igcap \{ @(x)\mid x\in X\}$$

-
$$\gamma \in \wp(D^{\sharp}) \mapsto \wp(D^{\natural})$$

$$\gamma(Y) \stackrel{\mathrm{def}}{=} \{ y \mid @(y) \supseteq Y \}$$

then

$$\langle \wp(D^{
atural}), \subseteq
angle \stackrel{\gamma}{ \Longleftrightarrow} \langle \wp(D^{\sharp}), \supseteq
angle$$

Proof. $\alpha(X) \supseteq Y \iff \bigcap \{ @(x) \mid x \in X \} \supseteq Y \iff \forall x \in X : @(x) \supseteq Y$ $\iff X \subset \{x \mid \mathbb{Q}(x) \in \supset Y\} \iff X \subset \gamma(Y).$

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- Example 1:

-
$$@\in D^
atural \mapsto \wp(D^\sharp)$$

-
$$lpha \in \wp(D^{
atural}) \mapsto \wp(D^{
atural})$$

$$lpha(X) \stackrel{
m def}{=} igcup \{ @(x) \mid x \in X \}$$

-
$$\gamma \in \wp(D^{\sharp}) \mapsto \wp(D^{\natural})$$

$$\gamma(Y)\stackrel{\mathrm{def}}{=} \{y\mid @(y)\subseteq Y\}$$

then

$$\langle \wp(D^{
atural}), \subseteq \rangle \stackrel{\gamma}{\longleftrightarrow} \langle \wp(D^{\sharp}), \subseteq \rangle$$

$$\begin{array}{ll} \text{Proof.} \ \ \alpha(X) \subseteq Y \iff \bigcup \{ @(x) \mid x \in X \} \subseteq Y \iff \forall x \in X : @(x) \subseteq Y \\ \iff X \subseteq \{x \mid @(x) \in \subseteq Y \} \iff X \subseteq \gamma(Y). \end{array} \qquad \Box$$

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Minimal Abstraction

Τf

$$-\langle L, \leq, 0, 1, \wedge, \vee \rangle$$
 complete lattice

$$-\;\alpha_m\in\wp(L)\mapsto L$$

$$lpha_m(S) \stackrel{\mathrm{def}}{=} igwedge S$$

$$-\gamma_m\in L\mapsto \wp(L)$$

$$\gamma_m(\ell) \stackrel{\mathrm{def}}{=} \{x \in L \mid \ell \leq x\}$$

then

$$\langle \wp(L), \subseteq
angle \stackrel{\gamma_m}{ \stackrel{}{\longleftarrow} \alpha_m} \langle L, \ge
angle$$

Proof.

$$\alpha_m(S) \ge \ell$$

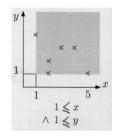
$$\iff \bigwedge S \qquad \qquad (\operatorname{def.} \ \alpha)$$

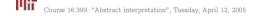
$$\iff \forall x \in S : x \geq \ell \qquad \qquad (\operatorname{def.} \ \bigwedge)$$

$$\iff S \subseteq \{x \in L \mid x \geq \ell\} \qquad \qquad (\operatorname{def.} \subseteq S)$$

$$\iff S \subseteq \gamma_m(\ell) \qquad \qquad (\operatorname{def.} \ \gamma_m)$$
Given $S \in L$, $\alpha(\{S\}) = \bigwedge \{S\} = S$ proving α onto.

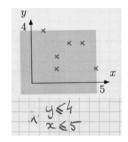
- Approximate a set by its glb
- Example: $\langle \mathbb{Z} \cup \{-\inf, +\inf\}, \leq, -\infty, +\infty, \min, \max \rangle$





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- Approximate a set by its lub
- Example 1: $\langle \mathbb{Z} \cup \{-\inf, +\inf\}, \leq, -\infty, +\infty, \min, \max \rangle$



- Example 2: Σ : objects, $\wp(\Sigma)$: semantics, $\wp(\wp(\Sigma))$: semantic properties, $\langle \wp(\Sigma), \subseteq, \emptyset, \Sigma, \cup, \cap \rangle$ complete lattice and $\langle \wp(\wp(\Sigma)), \subseteq \rangle \xrightarrow{\lambda S \cdot \wp(S)} \langle \wp(\Sigma), \subseteq \rangle$, as already seen with the flowers example on page 51.

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Maximal abstraction

If

- $-\langle L, \leq, 0, 1, \wedge, \vee \rangle$ complete lattice
- $-lpha_M\in\wp(L)\mapsto L$
- $lpha_M(S) \stackrel{ ext{def}}{=} igee S$
- $-\gamma_M\in L\mapsto \wp(L)$

$$\gamma_M(\ell) \stackrel{\mathrm{def}}{=} \{x \in L \mid \ell \geq x\}$$

then

$$\langle \wp(L), \subseteq \rangle \xrightarrow{\alpha_M} \langle L, \leq \rangle$$

PROOF. Duality on L.

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П

Interval abstraction

Ιf

- $-\langle L, \leq, 0, 1, \wedge, \vee \rangle$ complete lattice
- $-lpha_i\in\wp(L)\mapsto L imes L$

$$lpha_i(S) \stackrel{\mathrm{def}}{=} [igwedge S,igee S]$$

 $-\gamma_i\in L imes L\mapsto \wp(L)$

$$\gamma_i([a,b]) \stackrel{\mathrm{def}}{=} \{x \in L \mid a \leq x \leq b\}$$

then

$$\langle \wp(L), \subseteq
angle \stackrel{oldsymbol{\gamma_i}}{ \overset{}{\smile} \alpha_i} \langle L imes L, \sqsubseteq
angle$$

where $[a,b] \sqsubseteq [a',b'] \stackrel{\mathrm{def}}{=} (a' \leq a \land b \leq b')$

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PROOF

$$egin{aligned} &lpha_m(S)\geq [a,b] \ &\iff [\bigwedge S,\bigvee S]\sqsubseteq [a,b] \ &\iff a\leq \bigwedge S\wedge\bigvee S\leq b \ &\&\iff \forall x\in S: a\leq x\wedge \forall y\in S: y\leq b \ &\iff \forall x\in S: a\leq x\leq b \ &\&\iff S\subseteq \{x\in L\mid a\leq x\leq b\} \ &\iff S\subseteq \gamma_i([a,b]) \end{aligned}$$

This is also the reduced product of the minimal and maximal abstractions (see later).

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Abstraction of a function at a point

Τf

- -S is a set with element $s \in S$
- $-\langle L, \, \Box, \, \bot, \, \top, \, \Box, \, \Box \rangle$ is a complete lattice
- $-\alpha_s(f) \stackrel{\text{def}}{=} f(s)$
- $-\gamma_s(v)\stackrel{\mathrm{def}}{=}\lambda x\cdot (\!(x=s\
 ceil v\
 ceil\ op)$

then

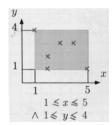
$$\langle S \mapsto L, \ \dot{\sqsubseteq}
angle \ rac{\gamma_s}{lpha_s} \ \langle L, \ \sqsubseteq
angle$$

PROOF. $\alpha_s(f) \sqsubseteq v \iff f(s) \sqsubseteq v \iff \forall x \in S : f(x) \sqsubseteq (x = s ? v : \top) \iff \forall x \in S : f(x) \sqsubseteq \gamma_s(v)(x) \iff f \sqsubseteq \gamma_s(v)$

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- Approximate a set by the pair of its glb and lub
- Example: $\langle \mathbb{Z} \cup \{-\inf, +\inf\}, <, -\infty,$ $+\infty$, min, max
- $-\alpha_i(\emptyset) = [+\infty, -\infty]$ is the infimum
- $-\alpha_i(L) = [-\infty, +\infty]$ is the supremum



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Abstraction of a function at a set of points

- S is a set with subset $T \in S$
- $-\langle L, \, \Box, \, \bot, \, \top, \, \Box, \, \Box \rangle$ is a complete lattice
- $-\alpha_T(f) \stackrel{\text{def}}{=} \lambda y \in Y \cdot f(y)$
- $-\gamma_T(arphi)\stackrel{ ext{def}}{=}\lambda x\in S$. ($x\in T$? arphi(x) : o)

then

$$\langle S \mapsto L, \ \dot{\sqsubseteq}
angle \ rac{\gamma_s}{lpha_s} \ \langle L, \ \sqsubseteq
angle$$

 $\begin{array}{lll} \text{PROOF.} & \alpha_T(f) \stackrel{.}{\sqsubseteq} \varphi & \Longleftrightarrow & \forall y \in T : \alpha_T(f)(y) \sqsubseteq \varphi(y) & \Longleftrightarrow & \forall y \in T : f(y) \sqsubseteq \\ \varphi(y) & \Longleftrightarrow & \forall x \in S : f(x) \sqsubseteq (x \in T \ ? \ \varphi(x) \ \rlap{!}{ \boxtimes} \ \top) & \Longleftrightarrow & f \stackrel{.}{\sqsubseteq} \lambda x \in S \cdot (x \in T \ ? \ \end{matrix}$ $\varphi(x) : \top) \iff f \stackrel{\cdot}{\sqsubset} \gamma_s(\varphi).$

Example: approximate an invariance specification attaching an invariant assertion to each program point of a program/procedure by a precondition at the program/procedure entry and a postcondition at the program/procedure exit:

- S: set of program points
- $-T = \{\text{entry point, exit point}\}$
- $-L=\wp(\mathbb{X}\mapsto\mathcal{V}),$ assertions
- $-I \in S \mapsto L$, invariants attached to each program point
- The top is $\mathbb{X} \mapsto \mathcal{V}$ ("I don't know")

$$\iff \forall y \in T : \alpha_f(\varphi)(y) \sqsubseteq \psi(y) \qquad \qquad \text{(def. } \dot{\sqsubseteq}\text{)}$$

$$\iff \forall y \in T : \varphi \circ f(y) \sqsubseteq \psi(y) \qquad \qquad \text{(def. } \alpha_f\text{)}$$

$$\iff \forall x \in S : \forall y \in T : (f(y) = x) \Longrightarrow (\varphi(x) \sqsubseteq \psi(y)) \qquad \qquad \text{(def. } \circ \text{ and } = \text{)}$$

$$\iff \forall x \in S : \varphi(x) \sqsubseteq \bigcap \{\psi(y) \mid y \in T \land f(y) = x\} \qquad \qquad \text{(def. } \bigcap \text{)}$$

$$\iff \varphi \dot{\sqsubseteq} \lambda x \in S \cdot \bigcap \{\psi(y) \mid y \in T \land f(y) = x\} \qquad \qquad \text{(def. } \dot{\sqsubseteq}\text{)}$$

$$\iff \varphi \dot{\sqsubseteq} \gamma_f(\psi) \qquad \qquad \text{(def. } \gamma_f\text{)}$$

- We get the previous example (on page 140) with $L = \{tt, ff\}$ and f is an injection.

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Lattice abstraction of a function at a set of points

If

- -S and T are sets
- $-f \in T \mapsto S$
- $-\langle L, \sqsubseteq, \perp, \top, \sqcup, \sqcap \rangle$ is a complete lattice
- $-\alpha_f \stackrel{\mathrm{def}}{=} \lambda \varphi \cdot \varphi \circ f$
- $-\gamma_f\stackrel{\mathrm{def}}{=}\lambda\psi\cdot\lambda x\cdotigcap \{\psi(y)\mid y\in T\wedge f(y)=x\}$

then

$$\langle S \mapsto L, \; \dot{\sqsubseteq}
angle \stackrel{\gamma_f}{ rac{lpha_f}{ lpha_f}} \langle T \mapsto L, \; \dot{\sqsubseteq}
angle$$

Proof.

$$lpha_f(arphi)\mathrel{\dot\sqsubseteq} \psi$$

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Abstraction of a set of functions by a function

Ιf

- $-\Phi\subseteq D\mapsto C$ is a set of functions
- $-lpha_f(arPhi)\stackrel{\mathrm{def}}{=}\lambda x\,.\,\{arphi(x)\midarphi\inarPhi\}$
- $-\gamma_f(\varPsi)\stackrel{\mathrm{def}}{=} \{arphi \mid orall x \in D: arphi(x) \in \varPsi(x)\}$
- $-lpha_p(arPhi)\stackrel{\mathrm{def}}{=}\lambda X\cdot igcup_{x\in X}arPhi(x)$
- $-\gamma_p(\Psi)\stackrel{\mathrm{def}}{=}\lambda x\cdot \varPhi(\{x\})$

then

$$\langle \wp(D\mapsto C),\ \subseteq
angle \stackrel{oldsymbol{\gamma_f}}{\longleftarrow} \langle D\mapsto \wp(C),\ \dot\subseteq
angle \stackrel{oldsymbol{\gamma_p}}{\longleftarrow} \langle \wp(D)\stackrel{\sqcup}{\longmapsto} \wp(C),\ \dot\subseteq
angle$$

PROOF. Given $\Phi \in \wp(D \mapsto C)$, $\Psi \in D \mapsto \wp(C)$

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$$egin{aligned} lpha_f(arPhi) & \subseteq arPsi \ & & \lambda x \cdot \{arphi(x) \mid arphi \in arPhi\} & \subseteq arPsi \end{aligned}$$

 $\{\mathrm{def.}\ lpha_f\}$

$$\iff orall x \in D: \{arphi(x) \mid arphi \in arPhi\} \subseteq \varPsi(x)$$

?def. Ċ∫

$$\iff orall x \in D: orall arphi \in arPhi: arphi(x) \in arPsi(x)$$

7def. ⊂\

$$\iff orall arphi \in arPhi: orall x \in D: arphi(x) \in arPsi(x)$$

7def. ∀\

$$\iff arPhi \subseteq \{arphi \mid orall x \in D : arphi(x) \in arPsi(x)\}$$

7def. ⊂ \

$$\iff \Phi \subseteq \gamma_f(\Psi)$$

∂def. ⊂∫

Given $\psi \in D \mapsto \wp(C)$ and $X_i \subset D$, $i \in \Delta$, we have:

$$- \alpha_p(\Psi)(\bigcup_{i \in \Delta} X_i)$$

$$= \bigcup_{x \in I : I = A} \Phi(x)$$

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```
= \lambda X \cdot \Psi(\bigcup_{x \in X} \{x\})
= \lambda X \cdot \Psi(X)
= \Psi
- \gamma_p \circ \alpha_P(\phi) (assuming \phi \in D \mapsto \wp(C))
= \lambda x \cdot \alpha_p(\phi)(\{x\})
= \lambda x \cdot \bigcup_{y \in \{x\}} \Phi(y)
= \lambda x \cdot \Phi(y)
= \Phi
```

proving that α_p is a bijection with inverse γ_p .

$$\begin{array}{ll} - & \alpha_p(\varPhi) \subseteq \varPsi \\ \Longrightarrow \gamma_p \circ \alpha_p(\varPhi) \subseteq \gamma_p(\varPsi) & (\gamma_p \text{ monotone}) \\ \Longrightarrow \varPhi \subseteq \gamma_p(\varPsi) & (\text{bijection}) \end{array}$$

$$\begin{split} &= \bigcup_{i \in \Delta} \varPhi(X_i) \\ &= \bigcup_{i \in \Delta} \bigcup \{\varPhi(x) \mid x \in X_i\} \\ &= \bigcup_{i \in \Delta} \bigcup_{x \in X_i} \varPhi(x) \\ &= \bigcup_{i \in \Delta} \alpha_p(\varPhi)(X_i) \end{split}$$

proving that $\alpha_p(\Phi) \in \wp(D) \stackrel{\sqcup}{\longmapsto} \wp(C)$ is a complete join morphism.

$$\begin{array}{ll} - & \alpha_p \circ \gamma_p(\varPsi) & \text{(assuming } \varPsi \in \wp(D) \overset{\sqcup}{\longmapsto} \wp(C)\text{)} \\ = & \lambda X \cdot \bigcup_{x \in X} \gamma_p(\varPsi)(x) \\ = & \lambda X \cdot \bigcup_{x \in X} \varPsi(\{x\}) \end{array}$$

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$$\Longrightarrow lpha_p(arPhi) \subseteq lpha_p \circ \gamma_p(arPsi)$$
 ($lpha_p$ monotone) $\Longrightarrow lpha_p(arPhi) \subseteq arPsi$ (bijection)

- Example 1: often used as a set-transformer collecting semantics $\wp(D) \mapsto \wp(C)$) for functions (possible values of the result as a function of the possible values of the argument, not general enough as a collecting semantics (use $\wp(D \mapsto C)$, see [4])
- Example 2 (Cartesian abstraction):
 - Given a set \mathbb{X} of variables and \mathcal{V} of values, properties P of environments $\rho \in \mathbb{X} \mapsto \mathcal{V}$ belong to $\wp(\mathbb{X} \mapsto \mathcal{V})$ that is are sets of functions

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- The abstraction $\alpha_f(P)$ consists in considering an abstract environmenty $R \in \mathbb{X} \mapsto \wp(V)$ which records the possible values of the variables $XX \in \mathbb{X}$ in anyone of the concrete environments $\rho \in P$:

$$\alpha_f(P) = \lambda \mathbf{x} \in \mathbb{X} \cdot \{ \rho(\mathbf{x}) \mid \rho \in P \}$$

- All relations between values of variables are therefore lost. For example:

$$lpha_f(\{\{\mathtt{X}\mapsto\mathtt{0},\mathtt{Y}\mapsto\mathtt{1}\},\{\mathtt{X}\mapsto\mathtt{1},\mathtt{Y}\mapsto\mathtt{0}\}\})\ = \{\mathtt{X}\mapsto\{\mathtt{0},\mathtt{1}\},\mathtt{Y}\mapsto\{\mathtt{0},\mathtt{1}\}\}$$

so the fact that X + Y = 1 is lost.

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Abstraction of lattice functionals

If

- -S, T are sets
- $-\langle L, \sqsubseteq, \perp, \top, \sqcup, \sqcap \rangle$ is a complete lattice
- $\ F \stackrel{.}{\sqsubseteq} G \stackrel{\mathrm{def}}{=} orall f \in S \mapsto T : F(f) \sqsubseteq G(f)$
- $-arphi\stackrel{..}{\sqsubseteq}\psi\stackrel{ ext{def}}{=}orall s\in S: orall y\in T: arphi(x)(y)\sqsubseteq\psi(x)(y)$
- $egin{aligned} -lpha(F) \stackrel{ ext{def}}{=} \lambda x \in S \cdot \lambda y \in T \cdot igsqcup \{F(f) \mid f(x)=y\} \end{aligned}$
- $-\gamma(arphi)\stackrel{\mathrm{def}}{=}\lambda f\in S\mapsto T\cdot igcap \{arphi(x)(f(x))\mid x\in X\}$

then

$$\langle (S \mapsto T) \mapsto L, \ \dot{\sqsubseteq}
angle \stackrel{\gamma}{ \longleftrightarrow} \langle S \mapsto (T \mapsto L), \ \ddot{\sqsubseteq}
angle$$

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An important particular case is that of a pair $\langle x, y \rangle$ understood as $\{0 \mapsto x, 1 \mapsto y\}$ i.e. a map from selectors to fields.

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Proof.

$$\begin{array}{c} \alpha(F) \stackrel{\square}{\sqsubseteq} \varphi \\ \iff \lambda x \cdot \lambda y \cdot \bigsqcup \{F(f) \mid f(x) = y\} \stackrel{\square}{\sqsubseteq} \varphi \\ \iff \forall x \in S : \forall y \in T : \bigsqcup \{F(f) \mid f(x) = y\} \sqsubseteq \varphi(x)(y) \\ \iff \forall x \in S : \forall y \in T : \forall f \in S \mapsto T : (f(x) = y) \Longrightarrow (F(f) \sqsubseteq \varphi(x)(y)) \\ \iff \forall x \in S : \forall f \in S \mapsto T : F(f) \sqsubseteq \varphi(x)(f(x)) \\ \iff \forall f \in S \mapsto T : \forall x \in S : F(f) \sqsubseteq \varphi(x)(f(x)) \\ \iff \forall f \in S \mapsto T : F(f) \sqsubseteq \prod \{\varphi(x)(f(x)) \mid x \in S\} \\ \iff F \stackrel{\square}{\sqsubseteq} \lambda f \in S \mapsto T \cdot \prod \{\varphi(x)(f(x)) \mid x \in S\} \\ \iff F \stackrel{\square}{\sqsubseteq} \gamma(\varphi) \end{array}$$

- The particular case of the previous example on page 144 is obtained with $L = \{tt, ff\}$ with $ff \sqsubseteq tt$

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^[4] P. Cousot and R. Cousot. Higher-order abstract interpretation (and application to comportment analysis generalizing strictness, termination, projection and PER analysis of functional languages), invited paper. In Proceedings of the 1994 International Conference on Computer Languages, Toulouse, France, pages 95-112. IEEE Computer Society Press, Los Alamitos, California, USA, 16-19 May 1994.

Componentwise/Cartesian abstraction of a set of pairs

$$egin{aligned} &-lpha_p(S) \stackrel{ ext{def}}{=} \langle \{x \mid \exists y : \langle x, \ y
angle \in S\}, \ \{y \mid \exists x : \langle x, \ y
angle \in S\}
angle \ &-\gamma_p(\langle X, \ Y
angle) \stackrel{ ext{def}}{=} \{\langle x, \ y
angle \mid x \in X \land y \in Y\} \end{aligned}$$

$$=\gamma_p(\langle A, I \rangle) \equiv \{\langle x, y \rangle \mid x \in A \land y \in I\}$$

$$-\langle x,\ y
angle\subseteq_2\langle x',\ y'
angle\stackrel{\mathrm{def}}{=}x\subseteq x'\wedge y\subseteq y'$$

then

$$\langle \wp(D_1 \times D_2), \subseteq \rangle \iff \langle \wp(D_1) \times \wp(D_2), \subseteq_2 \rangle$$

PROOF.

$$egin{aligned} &lpha_p(S)\subseteq_2\langle X,\,Y
angle\ &\Longleftrightarrow\ \langle\{x\mid\exists y:\langle x,\,y
angle\in S\},\ \{y\mid\exists x:\langle x,\,y
angle\in S\}
angle\subseteq_2\langle X,\,Y
angle \end{aligned}$$

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Pointwise abstraction composition

$$-\langle P, \leq
angle \stackrel{\gamma}{ \Longleftrightarrow} \langle Q, \sqsubseteq
angle$$

$$-\dot{lpha}(f)\stackrel{\mathrm{def}}{=}\lambda s\in S$$
 , $lpha(f(s))$ pointwis

pointwise abstraction

$$-\dot{\gamma}(g)\stackrel{\mathrm{def}}{=}\lambda s\in S$$
 , $\gamma(g(s))$

$$-f\mathrel{\dot\sqsubseteq} g\stackrel{\mathrm{def}}{=} orall x\in S: f(x)\mathrel{\sqsubseteq} g(x)$$
 pointwise ordering

then

$$\langle S \mapsto P, \stackrel{.}{\leq}
angle \stackrel{\dot{\gamma}}{ \stackrel{.}{\hookrightarrow}} \langle S \mapsto Q, \stackrel{.}{\sqsubseteq}
angle$$

PROOF

$$\dot{lpha}(f)\mathrel{\dot\sqsubseteq} g$$

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$$\iff \{x \mid \exists y : \langle x, \ y \rangle \in S\} \subseteq X \land \{y \mid \exists x : \langle x, \ y \rangle \in S\} \subseteq Y \\ \iff S \subseteq \{\langle x, \ y \rangle \mid x \in X \land y \in Y\} \\ \iff S \subseteq \gamma_n(\langle X, \ Y \rangle)$$

- Intuition: abstraction of relational to independent properties, same as on page 144, up to the encoding

- Example:

-
$$\alpha_p(\{\langle 1, 2 \rangle, \langle 3, 4 \rangle\}) = \langle \{1, 3\}, \{2, 4\} \rangle$$

$$-\gamma_p(\langle\{1,3\},\{2,4\}\rangle) \stackrel{\text{def}}{=} \{\langle 1,2\rangle,\langle 1,4\rangle,\langle 3,2\rangle,\langle 3,4\rangle\}$$

$$egin{aligned} &orall x \in S: \dot{lpha}(f)(x) \sqsubseteq g(x) & ext{ (def. } \dot{\sqsubseteq} \) \ &orall x \in S: lpha(f(x)) \sqsubseteq g(x) & ext{ (def. } \dot{lpha} \) \ &orall x \in S: f(x) \leq \gamma(g(x)) & ext{ (Galois connection } \ &orall x \in S: f(x) \leq \dot{\gamma}(g)(x) & ext{ (def. } \dot{\dot{\gamma}} \) \ & ext{ (def. } \dot{\dot{\zeta}} \) \end{aligned}$$

- Used to lift abstractions to vectors (e.g. from one to many variables, from one to many program points, etc.)

Example 1: attribute independant environment abstraction

 $-x \in X$: set of variables

 $- \mathcal{V}$: set of values

 $-\wp(\mathcal{V})$: properties of values

 $-\rho \in \mathbb{X} \mapsto \mathcal{V}$: environments

 $-\wp(\mathbb{X}\mapsto\mathcal{V})$: properties of environments

 $-\langle \wp(\mathbb{X}\mapsto \mathcal{V}), \subseteq
angle \stackrel{\gamma_f}{ \underset{lpha_f}{\longleftarrow}} \langle \mathbb{X}\mapsto \wp(\mathcal{V}), \stackrel{\dot{\sqsubseteq}}{\sqsubseteq}
angle$ $\alpha_f(P) \stackrel{\text{def}}{=} \lambda X \in \mathbb{X} \cdot \{ \rho(X) \mid \rho \in P \}$

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Example 2: local invariants

- Same idea to abstract $\wp(\mathbb{C} \mapsto (\mathbb{X} \mapsto \mathcal{V}))$ where \mathbb{C} is the set of control points

$$-\langle \wp(\mathbb{C}\mapsto (\mathbb{X}\mapsto \mathcal{V})),\ \ddot{\subseteq} \rangle \ \Longleftrightarrow \ \langle \mathbb{C}\mapsto (\mathbb{X}\mapsto L),\ \ddot{\sqsubseteq}
angle$$

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- $-\langle \wp(\mathcal{V}), \subseteq \rangle \stackrel{\gamma}{\longleftrightarrow} \langle L, \sqsubseteq \rangle$ abstraction of value proper-
- $-\langle \mathbb{X} \mapsto \wp(\mathcal{V}), \stackrel{\dot{\subseteq}}{\subseteq} \rangle \xrightarrow{\dot{\gamma}} \langle \mathbb{X} \mapsto L, \stackrel{\dot{\sqsubseteq}}{\subseteq} \rangle$ pointwise exten-

$$\dot{lpha}(R)\stackrel{\mathrm{def}}{=}=\lambda \mathtt{X}\in \mathbb{X}$$
 , $lpha(R(\mathtt{X}))$

 $-\langle \wp(\mathbb{X}\mapsto \mathcal{V}), \subseteq \rangle \xrightarrow{\overset{\gamma_f\circ\gamma}{\dot{lpha}\circlpha_f}} \langle \mathtt{x}\mapsto L, \sqsubseteq \rangle$ by composition of Galois connection

Componentwise abstraction composition

A particular case of pointwise abstraction applied to pairs (more generally to vectors) is the following. If

$$-\langle P, \leq \rangle \xrightarrow{\gamma_1} \langle P^{\sharp}, \leq^{\sharp} \rangle$$

$$-\langle P, \preceq \rangle \stackrel{\gamma_2}{\longleftarrow} \langle P^{\sharp}, \preceq^{\sharp} \rangle$$

$$-lpha^{ imes}\stackrel{ ext{def}}{=}\lambda\langle x,\ y
angle\cdot\langlelpha_1(x),\ lpha_2(y)
angle$$
 Componentwise abstraction

$$\stackrel{}{-} \gamma^{ imes} \stackrel{ ext{def}}{=} \lambda \langle x, \ y
angle \cdot \langle \gamma_1(x), \ \gamma_2(y)
angle$$

then

$$\langle P imes Q, \leq imes \preceq
angle \stackrel{\gamma}{ \overset{}{ \overset{}{ \overset{}{ \overset{}{ \overset{}{ \overset{}}{ \overset{}}{ \overset{}}{ \overset{}}{ \overset{}} }}}} \langle P^{\sharp} imes Q^{\sharp}, \leq^{\sharp} imes \preceq^{\sharp}
angle$$

PROOF.

$$\begin{split} \alpha^{\times}(\langle P_1,\ P_2\rangle) &\leq^{\sharp} \times \preceq^{\sharp} \langle P_1^{\sharp},\ P_2^{\sharp}\rangle \\ \iff \langle \alpha_1(P_1),\ \alpha_2(P_2)\rangle &\leq^{\sharp} \times \preceq^{\sharp} \langle P_1^{\sharp},\ P_2^{\sharp}\rangle \\ \iff \alpha_1(P_1) &\leq^{\sharp} P_1^{\sharp} \wedge \alpha_2(P_2) \preceq^{\sharp} P_2^{\sharp} \\ \iff P_1 &\leq \gamma_1(P_1^{\sharp}) \wedge P_2 \preceq \gamma_2(P_2^{\sharp}) \\ \iff \langle P_1,\ P_2\rangle &\leq \times \preceq \langle \gamma_1(P_1^{\sharp}),\ \gamma_2(P_2^{\sharp})\rangle \\ \iff \langle P_1,\ P_2\rangle &\leq \times \preceq \gamma^{\times}(\langle P_1^{\sharp},\ P_2^{\sharp}\rangle) \end{split}$$

- Used to lift abstractions componentwise to pairs/vectors.

П

$$\iff \forall x \in P^{\sharp} : \vec{\alpha}(f)(x) \preceq^{\sharp} g(x) \qquad \qquad (\text{def.} \ \preceq^{\sharp})$$

$$\iff \forall x \in P^{\sharp} : \alpha_{c} \circ f \circ \gamma_{d}(x) \preceq^{\sharp} g(x) \qquad \qquad (\text{def.} \ \vec{\alpha})$$

$$\iff \forall x \in P^{\sharp} : f \circ \gamma_{d}(x) \preceq \gamma_{c}(g(x)) \qquad \qquad (\text{Galois connection})$$

$$\iff \forall y \in P : f \circ \gamma_{d} \circ \alpha_{d}(y) \preceq \gamma_{c} \circ g \circ \alpha_{d}(y) \qquad \text{(for } x = \alpha_{d}(y) \text{ and def. } \circ)$$

$$\iff \forall y \in P : f(y) \preceq \gamma_{c} \circ g \circ \alpha_{d}(y) \qquad \text{(for } x = \alpha_{d}(y) \text{ and def. } \circ)$$

$$\iff f \preceq \gamma_{c} \circ g \circ \alpha_{d} \qquad \qquad (\text{def.} \ \vec{\preceq})$$

$$\iff f \preceq \vec{\gamma}(g) \qquad \qquad (\text{def.} \ \vec{\gamma})$$

$$\iff \forall y \in P : f(y) \preceq \gamma_{c} \circ g \circ \alpha_{d}(y) \qquad \qquad (\text{def.} \ \vec{\gamma} \text{ and } \ \vec{\preceq})$$

$$\iff \forall x \in P^{\sharp} : f(\gamma_{d}(x)) \preceq \gamma_{c} \circ g(x) \qquad (\alpha_{d} \circ \gamma_{d} \text{ reductive, } \gamma_{c} \text{ and } g \text{ monotone})$$

$$\iff \forall x \in P^{\sharp} : \alpha_{c} \circ f \circ \gamma_{d}(x) \prec^{\sharp} g(x) \qquad \text{(Galois connection and def. } \circ)$$

 $\iff \vec{\alpha}(f) \stackrel{:}{\prec}^{\sharp} a$

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7 def. $\vec{\alpha}$ and $\vec{\prec}^{\sharp}$

Higher-order abstraction composition

If
$$\begin{array}{l}
-\langle P, \leq \rangle & \xrightarrow{\gamma_d} \langle P^{\sharp}, \leq^{\sharp} \rangle \\
-\langle Q, \leq \rangle & \xrightarrow{\gamma_c} \langle Q^{\sharp}, \leq^{\sharp} \rangle \\
-\vec{\alpha} & \stackrel{\text{def}}{=} \lambda \varphi \cdot \alpha_c \circ \varphi \circ \gamma_d \\
-\vec{\gamma} & \stackrel{\text{def}}{=} \lambda \psi \cdot \gamma_c \circ \psi \circ \alpha_d
\end{array}$$

then

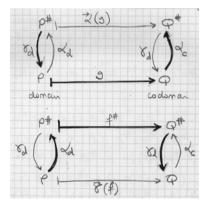
$$\langle P \stackrel{\mathrm{m}}{\longmapsto} Q, \stackrel{\cdot}{\preceq} \rangle \stackrel{\overrightarrow{7}}{\overset{\overrightarrow{0}}{\longmapsto}} \langle P^{\sharp} \stackrel{\mathrm{m}}{\longmapsto} Q^{\sharp}, \stackrel{\dot{\preceq}^{\sharp}}{\preceq} \rangle$$

PROOF. Given monotonic $f \in P \stackrel{\text{m}}{\longmapsto} Q$ and $g \in P^{\sharp} \stackrel{\text{m}}{\longmapsto} Q^{\sharp}$, we have:

$$\vec{lpha}(f)\stackrel{.}{\preceq}^{\sharp} g$$

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- Intuition:



- Used to lift abstractions at higher-order (in conjunction with fixpoint approximation/transfer), see later.

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