« Mathematical foundations: (1) Naïve set theory »

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Course 16.399: "Abstract interpretation"

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





Georg F. Cantor

_ Reference

 Cantor, G., 1932, "Gesammelte Abhandlungen mathematischen und philosohischen Inhalts", E. Zermelo, Ed. Berlin: Springer-Verlag.

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Set theory

- In naïve set theory everything is a set, including the empty set Ø; So any collection of objects can be regarded as a single entity (i.e. a set)
- A set is a collection of elements which are sets (but sets in sets in sets . . . cannot go for ever);
- In practice one consider a universe of objects (which are not sets and called atoms) out of which are built sets of objects, set of sets of objects, etc.

Sets





Membership

- $-a \in x$ means that the object a belongs to/is an element of the set x
- $-a \not\in x$ means that the object a does not belong to/is not an element of the set x:

$$(a
ot\in x) \stackrel{\mathrm{def}}{=}
eg (a \in x)$$

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Additional notations are as follows:

$$P \lor Q \stackrel{\mathrm{def}}{=} \neg ((\neg P) \land (\neg Q))$$
 "P or Q"
 $P \Longrightarrow Q \stackrel{\mathrm{def}}{=} (\neg P) \lor Q$ "P implies Q"
 $P \iff Q \stackrel{\mathrm{def}}{=} (P \Longrightarrow Q) \land (Q \Longrightarrow P)$ "P iff 1Q "
 $P \lor Q \stackrel{\mathrm{def}}{=} (P \lor Q) \land \neg (P \land Q)$ "P exclusive or Q"
 $\exists x : P \stackrel{\mathrm{def}}{=} \neg (\forall x : (\neg P))$ "there exists x such that P "
 $\exists a \in S : P \stackrel{\mathrm{def}}{=} \exists a : a \in S \land P$

$$\exists a \in S: P \stackrel{\mathrm{def}}{=} \exists a: a \in S \wedge P \ \exists a_1, a_2, \dots, a_n \in S: P \stackrel{\mathrm{def}}{=} \exists a_1 \in S: \exists a_2, \dots, a_n \in S: P \ \forall a \in S: P \stackrel{\mathrm{def}}{=} \forall a: (a \in S) \Longrightarrow P \ \forall a_1, a_2, \dots, a_n \in S: P \stackrel{\mathrm{def}}{=} \forall a_1 \in S: \forall a_2, \dots, a_n \in S: P$$

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Logical symbols

If P, Q, ... are logical statements about sets, then we use the following abbreviations:

- $-P \wedge Q$ abbreviates "P and Q"
- $-\neg P$ abbreviates "not P"
- $\forall x : P$ abbreviates "forall x, P"

Comparison of sets

$$egin{aligned} oldsymbol{x} &\subseteq oldsymbol{y} \stackrel{ ext{def}}{=} orall a: (a \in oldsymbol{x} \Longrightarrow a \in oldsymbol{y}) & ext{inclusion} \ oldsymbol{x} &\supseteq oldsymbol{y} \stackrel{ ext{def}}{=} y \subseteq oldsymbol{x} & ext{superset} \ oldsymbol{x} &= oldsymbol{y} \stackrel{ ext{def}}{=} (x \subseteq oldsymbol{y}) \wedge (oldsymbol{y} \subseteq oldsymbol{x}) & ext{equality} \ oldsymbol{x} &\subset oldsymbol{y} \stackrel{ ext{def}}{=} (x \subseteq oldsymbol{y}) \wedge (oldsymbol{x}
eq oldsymbol{y}) & ext{strict inclusion} \ oldsymbol{x} &\supset oldsymbol{y} \stackrel{ ext{def}}{=} (oldsymbol{x} \supseteq oldsymbol{y}) \wedge (oldsymbol{x}
eq oldsymbol{y}) & ext{strict superset} \end{aligned}$$

¹ if and only i

Operations on sets

$$egin{aligned} (z=x\cup y) &\stackrel{ ext{def}}{=} orall a: (a\in z) \Leftrightarrow (a\in x ee a\in y) ext{ union} \ (z=x\cap y) &\stackrel{ ext{def}}{=} orall a: (a\in z) \Leftrightarrow (a\in x \wedge a\in y) ext{ intersection} \ (z=x\setminus y) &\stackrel{ ext{def}}{=} orall a: (a\in z) \Leftrightarrow (a\in x \wedge a
ot\in y) ext{ difference} \end{aligned}$$

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Set theoretic laws

Intuition provided by *Venn diagrams* but better proved formally from the definitions.

$$egin{array}{lll} x \cup x &=& x \ x \cap x &=& x \ & x \subseteq x \cup y & ext{upper bound} \ & x \cap y \subseteq x & ext{lower bound} \ & x \cup y &=& y \cup x & ext{commutativity} \ & x \cap y &=& y \cap x \ & (x \subseteq z) \wedge (y \subseteq z) \Longrightarrow (x \cup y) \subseteq z & ext{lub}^2 \ & (z \subseteq x) \wedge (z \subseteq y) \Longrightarrow z \subseteq (x \cap y) & ext{glb}^3 \end{array}$$

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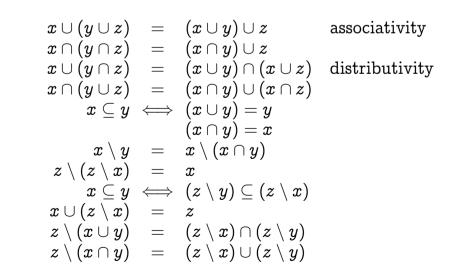
Partial order

 \subseteq is a partial order in that:

$$x\subseteq x$$
 reflexivity $(x\subseteq y \land y\subseteq x)\Longrightarrow (x=y)$ antisymetry $(x\subseteq y)\land (y\subseteq z)\Longrightarrow (x\subseteq z)$ transitivity

 \subset is a *strict partial order* in that:

$$eg(x \subset x) \qquad \text{irrreflexivity} \ (x \subset y) \land (y \subset z) \Longrightarrow (x \subset z) \quad \text{transitivity}$$



² lub: least upper bound.

³ glb: greatest lower bound

Empty set

- $\forall a : (a \notin \emptyset)$ Definition of the empty set
- The emptyset is unique 4.
- Emptyset laws:

$$egin{array}{cccc} x\setminus\emptyset=x & \emptyset\subseteq x\ x\setminus x=\emptyset & x\cup\emptyset=x\ x\cap(y\setminus x)=\emptyset & x\cap\emptyset=\emptyset \end{array}$$

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Operations on set





Empty set

Singleton



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Notations for sets

- Definitions in extension:
 - 0 $-\{a\}$
 - $\{a, b\}$ Doubleton $(a \neq b)$
 - $-\{a_1,\ldots,a_n\}$ Finite set
 - $-\{a_1,\ldots,a_n,\ldots\}$ Infinite set
- Definition in comprehension:
 - $\{a \mid P(a)\}$ Examples: $x \cup y = \{a \mid a \in x \lor a \in y\}$ $x \cap y = \{a \mid a \in x \land a \in y\}$ $x \setminus y = \{a \mid a \in x \land a \not\in y\}$

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Pairs

- $-\langle a, b\rangle \stackrel{\text{def}}{=} \{\{a\}, \{a, b\}\}$
- $-\langle a, b\rangle_1 = a$

first projection 5

 $-\langle a, b \rangle_2 = b$

second projection 6

 $-x_0, x_1$ undefined for non-pairs

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⁶ Formally, if $\bigcup \langle a, b \rangle = \bigcap \langle a, b \rangle$ then a = b whence $\langle a, b \rangle_2 \stackrel{\text{def}}{=} \bigcup \bigcup \langle a, b \rangle = \bigcup \bigcup \{\{b\}\} = \bigcup \{b\} = b$. Otherwise $\bigcup \langle a, b \rangle \neq \bigcap \langle a, b \rangle$ that is $a \neq b$, in which case $\langle a, b \rangle_2 \stackrel{\text{def}}{=} \bigcup \bigcup \bigcup \langle a, b \rangle \setminus \bigcap \langle a, b \rangle = \bigcup \bigcup \bigcup \{a\}, \{a, b\}\}$ $\bigcap \{\{a\}, \{a, b\}\}\} = \bigcup (\bigcup \{a, b\} \setminus \{a\}) = \bigcup \{b\} = b.$

Tuples

$$egin{aligned} -\langle a_1,\, \ldots,\, a_{n+1}
angle &\stackrel{ ext{def}}{=} \langle\langle a_1,\, \ldots,\, a_n
angle,\, a_{n+1}
angle & ext{tuple} \ -\langle a_1,\, \ldots,\, a_n
angle_i &= a_i & i=1,\ldots,n ext{ projection} \ - ext{Law:} & \langle a_1,\, \ldots,\, a_n
angle &= \langle a_1',\, \ldots,\, a_n'
angle &= a_1'\wedge\ldots\wedge a_n = a_n' \end{aligned}$$

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Powerset

$$-\wp(x)\stackrel{\mathrm{def}}{=}\{y\mid y\subseteq x\}$$
 powerset $-\bigcup y\stackrel{\mathrm{def}}{=}\{a\mid \exists x\in y: a\in x\}$ Union $-\bigcap y\stackrel{\mathrm{def}}{=}\{a\mid \forall x\in y: a\in x\}$ Intersection $-$ Laws:

$$egin{aligned} x \cup y &= igcup \{x,y\} & igcap \{x\} &= x \ x \cap y &= igcap \{x,y\} & igcup \emptyset &= \emptyset \ igcup \{x\} &= x & igcap \emptyset &= \{a \mid true\} & ext{Universe} \end{aligned}$$

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Cartesian product

$$egin{aligned} -x imes y &\stackrel{ ext{def}}{=} \{\langle a,\ b
angle \mid a\in x \wedge b\in y\} \ -x_1 imes \ldots imes x_{n+1} &\stackrel{ ext{def}}{=} (x_1 imes \ldots imes x_n) imes x_{n+1} ext{ so} \ x_1 imes \ldots imes x_n &= \{\langle a_1,\ \ldots,\ a_n
angle \mid a_1\in x_1 \wedge \ldots \wedge a_n\in x_n\} \ -x^0 &\stackrel{ ext{def}}{=} \emptyset \end{aligned}$$

Families (indexed set of sets)

- $-x = \{y_i \mid i \in I\}$ I indexing set for the elements of x
- $egin{array}{l} -igcup_{i\in I}y_i\stackrel{ ext{def}}{=}igcup_x\ &=\{a\mid \exists i\in I: a\in y_i\}. \end{array}$
- $egin{array}{l} -igcap_{i\in I}y_i\stackrel{ ext{def}}{=}igcap x\ &=\{a\mid orall i\in I:a\in y_i\} \end{array}$
- Laws:

$$egin{aligned} orall i \in I: (x_i \subseteq y) &\Longrightarrow (igcup_{i \in I} x_i \subseteq y) \ orall i \in I: (y \subseteq x_i) &\Longrightarrow (y \subseteq igcap_{i \in I} x_i) \end{aligned}$$

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$$egin{aligned} igcup_{i \in I} (x_i \cup y_i) &= (igcup_i x_i) \cup (igcup_i y_i) \ igcap_{i \in I} (x_i \cap y_i) &= (igcap_i x_i) \cap (igcap_i y_i) \ igcup_{i \in I} (x_i \cap y) &= (igcup_i (x_i) \cap y \ igcap_{i \in I} (x_i \cup y) &= (igcap_i (x_i) \cup y \ z \setminus igcup_i x_i &= igcup_i (z \setminus x_i) \ z \setminus igcap_i x_i &= igcap_i (z \setminus x_i) \ z \setminus igcap_i x_i &= igcap_i (z \setminus x_i) \end{aligned}$$

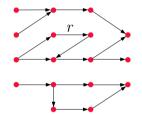
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Relations

- $-r \subset x$
- $-r \subseteq x \times y$
- $-r \subseteq x_1 \times \ldots \times x_n$

unary relation on xbinary relation n-ary relation

- Graphical representation of a relation r on a finite set x:



•	elements of the set x
$a b \longrightarrow \bullet$	$\langle a,\ b angle \in r$

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Relations

Notations for relations

- If $r \subseteq x_1 \times \ldots \times x_n$ then we use the notation:

$$r(a_1,\ldots,a_n)\stackrel{\mathrm{def}}{=}\langle a_1,\,\ldots,\,a_n
angle\in r$$

- In the specific case of binary relation, we also use:

$$egin{array}{l} oldsymbol{a} & oldsymbol{r} & oldsymbol{b} \stackrel{ ext{def}}{=} \langle a, \ b
angle \in r & ext{example: } 5 \leq 7 \ oldsymbol{a} & \stackrel{oldsymbol{r}}{\longrightarrow} & oldsymbol{b} \stackrel{ ext{def}}{=} \langle a, \ b
angle \in r & ext{example: } 5 \leq 7 \ \end{array}$$



Properties of binary relations

Let $r \subseteq x \times x$ be a binary relation on the set x

 $- \forall a \in x : (a r a)$

reflexive

 $- \forall a, b \in x : (a \ r \ b) \iff (b \ r \ a)$

symmetric

 $- \forall a, b \in x : (a \ r \ b \land a \neq b) \Longrightarrow \neg (b \ r \ a)$ antisymmetric

 $- \forall a, b \in x : (a \neq b) \Longrightarrow (a \ r \ b \lor b \ r \ a)$

connected

 $- \forall a, b, c \in x : (a \ r \ b) \land (b \ r \ c) \Longrightarrow (a \ r \ c)$

transitive

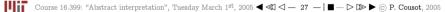
Reflexive transitive closure



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Operations on relations

- empty relation
- $-1_x\stackrel{\mathsf{def}}{=} \{\langle a,\ a
 angle \mid a\in x\}$ identity
- $-r^{-1}\stackrel{\mathrm{def}}{=} \{\langle b, a \rangle \mid \langle a, b \rangle \in r\}$ inverse
- $-r_1 \circ r_2 \stackrel{\mathrm{def}}{=} \{\langle a, c \rangle \mid \exists b : \langle a, b \rangle \in r_1 \land \langle b, c \rangle \in r_2 \}$ composition
- set operations $r_1 \cup r_2$, $r_1 \cap r_2$, $r_1 \setminus r_2$

Reflexive transitive closure of a relation

Let r be a relation on x:

Let
$$r$$
 be a relation on x .
$$-r^0 \stackrel{\text{def}}{=} 1_x$$

$$-r^{n+1}\stackrel{\mathrm{def}}{=} r^n\circ r\ (=r\circ r^n)$$

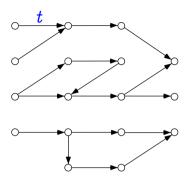
$$-\stackrel{m{r}^{\star}}{=}igcup_{n\in\mathbb{N}}r^n$$

$$- r^+ \stackrel{\mathrm{def}}{=} igcup_{n \in \mathbb{N} \setminus \{0\}} r^n$$

so
$$r^\star = r^+ \cup 1_x$$

strict transitive closure

Example of relation



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Equational definition of the reflexive transitive closure

$$-t^{\star}=1_{x}\cup t\circ t^{\star}$$

Proof.

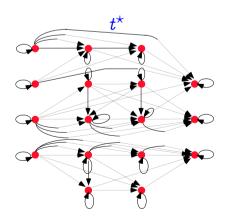
$$t^{\star}$$

$$= \bigcup_{n \in \mathbb{N}} t^{n} \qquad \qquad \text{(def. } t^{\star}\text{)}$$

$$= t^{0} \cup \bigcup_{n \in \mathbb{N} \setminus \{0\}} t^{n} \qquad \qquad \text{(isolating } t^{0}\text{)}$$

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The reflexive transitive closure of the example relation



$$= 1_x \cup \bigcup_{k \in \mathbb{N}} t^{k+1} \qquad \text{(def. } t^0 \text{ and } k+1 = n\text{)}$$

$$= 1_x \cup \bigcup_{k \in \mathbb{N}} t \circ t^k \qquad \text{(def. power)}$$

$$= 1_x \cup t \circ (\bigcup_{k \in \mathbb{N}} t^k) \qquad \text{(def. } \circ\text{)}$$

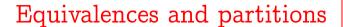
$$= 1_x \cup t \circ t^* \qquad \text{(def. } t^*\text{)}$$

- If $r = 1_r \cup t \circ r$ then $t^* \subseteq r$

PROOF. - $t^0 = 1_r \subseteq 1_r \cup t \circ r = r$ so $t^0 \subseteq r$

- if $t^n \subseteq r$ then $t^{n+1} = t \circ t^n \neq \subseteq t \circ r \subseteq 1_r \cup t \circ r = r$ so $t^{n+1} \subset r$
- By recurrence, $\forall n \in \mathbb{N} : (t^n \subseteq r)$
- $-t^{\star}=\bigcup_{n\in\mathbb{N}}t^{n}\subseteq r$

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪1 < ── 33 ── | ■ ── ▷ ▶ ▶ ⑥ P. Cousot, 2005









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- If follows that r^* is the \subseteq -least solution of the equation: $X = 1_{r} \cup t \circ X^{7}$
- This least solution is unique.

PROOF. - let r_1 and r_2 be two solutions to $X = 1_x \cup t \circ$

- $r_1 \subseteq r_2$ since r_1 is the least solution
- $r_2 \subseteq r_1$ since r_2 is the least solution
- $r_1 = r_2$ by antisymmetry.

7 So called \subseteq -least fixpoint of $F(X) = 1_x \cup t \circ X$, written If F.

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Equivalence relation

- A binary relation r on a set x is an equivalence relation iff it is reflexive, symmetric and transitive
- Examples: = equality, $\equiv [n]$ equivalence modulo n > 0
- $[a]_r \stackrel{\mathrm{def}}{=} \{b \in x \mid a \ r \ b\}$ equivalence class
- Examples: $[a]_{=}=\{a\},\ [a]_{\equiv [n]}=\{a+k imes n\mid k\in\mathbb{N}\}$
- $-x/_r \stackrel{\mathrm{def}}{=} \{[a]_r \mid a \in x\}$ quotient of x by r
- Examples: $x/_{=} = \{\{a\} \mid a \in x\}^{8},$ $x/_{\equiv [n]}=\{[0]_{\equiv [n]},\ldots,[n-1]_{\equiv [n]}\}$ 9

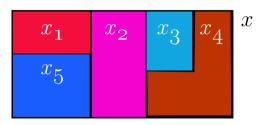
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⁸ which is isomorphic to x through $a \mapsto \{a\}$

⁹ which is isomorphic to $\{0,\ldots,n-1\}$ through $a\mapsto [a]_{=[n]}$

Partition

- -P is a partition of x iff P is a family of disjoint sets covering x:
 - $\forall y \in P : (y \neq \emptyset)$
 - $\text{- }\forall y,z\in P:(y\neq z)\Longrightarrow (y\cap z=\emptyset)$
 - $-x=\bigcup P$











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Correspondence between partitions and equivalences

- If P is a partition of x then $\{\langle a, b \rangle \mid \exists y \in P : a \in y \land b \in y\}$ is an equivalence relation
- Inversely, if r is an equivalence relation on x, then $\{[a]_r \mid a \in x\}$ is a partition of x.

Partial order relation

- A relation r on a set x is a partial order if and only if it is reflexive, antisymmetric and transitive.

Examples of partial order relations

 $- < on \mathbb{N}$

- < on \mathbb{Z}

 $- \subseteq \text{on } \wp(x)$

 $-\langle a, b\rangle \leq_2 \langle c, d\rangle \stackrel{\text{def}}{=} (a \leq c) \wedge (b \leq d)$ componentwise/cartesian ordering

 $-\langle a, b \rangle \leq_{\ell} \langle c, d \rangle \stackrel{\text{def}}{=} (a \leq c \wedge a \neq c) \vee (a = c \wedge b \leq d)$ lexicographic ordering

 $-a_1 \dots a_n \leq_a b_1 \dots b_m \stackrel{\text{def}}{=} \exists k : (0 < k < n) \land (k < n)$ $(a_1 = b_1 \wedge \ldots a_{k-1} = b_{k-1}) \wedge (a_k \leq b_k)$ alphabetic ordering

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Posets

- A partially ordered set (poset for short) is a pair $\langle x, \leq \rangle$ where:
 - x is a set
 - < ia a partial order relation on x
- if $\langle x, < \rangle$ is a poset and $y \subset x$ then $\langle y, < \rangle$ is also a poset.

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Notations for partial order relations

- Partial order relations are often denoted in infix form by symbols such as <, \square , \subset , \prec , ..., meaning:

$$\leq = \{\langle a, b \rangle \mid a \leq b\}$$

- The inverse is written >, \supset , >, ..., meaning: $> = <^{-1} = \{ \langle b, a \rangle \mid a < b \}$

- The negation is written $\not <$, $\not \subset$, $\not <$, ..., meaning:

- The strict ordering is denoted <, \subseteq , \subset , \prec , ..., meaning:

$$<=\{\langle a,\ b
angle\mid a\leq b\wedge a
eq b\}$$

Hasse diagram

- The Hasse diagram of a poset $\langle x, < \rangle$ is a graph with
 - vertices x
 - arcs $\langle a, b \rangle$ whenever a < b and $\neg (\exists c \in x : a < c < b)$
 - the arc $\langle a, b \rangle$ is oriented bottom up, that is drawn with vertex a below vertex b whenever a < b

– Example: $\forall i \in \mathbb{Z}: \bot \Box \bot \Box i \sqsubseteq i \sqsubseteq \top \sqsubseteq \top$ is represented as:

4 -3 -2 -1 0 1 2 3 4

Encoding N with sets

In set theory, natural numbers are encoded as follows:

$$-\{\emptyset\}$$
 1 = \{0\}

$$-\{\emptyset,\{\emptyset\}\}$$
 2 = \{0,1\}

- . . .

$$-Sn = n \cup \{n\}$$
 $n+1 = \{0,1,\ldots,n\}$

$$-w = \{0, 1, \dots, n, \dots\} = \mathbb{N}$$
 first infinite ordinal

The ordering is:

$$n < m \stackrel{\mathrm{def}}{=} n \in m$$
 so that $0 < 1 < 2 < 3 < \ldots < n < \ldots < \omega$

$$- \ n \leq m \stackrel{ ext{def}}{=} (n < m) \lor (n = m)$$

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Functions







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Domain and range of a relation

Let r be a n + 1-ary relation on a set x.

$$-\operatorname{dom}(r)\stackrel{\mathrm{def}}{=} \{a\mid \exists b: \langle a,\ b
angle \in r\}$$
 domain

$$-\operatorname{rng}(r)\stackrel{\mathrm{def}}{=}\{b\mid \exists b: \langle a,\,b
angle\in r\}$$
 range/codomain

Functions

- An n-ary function on a set x is an (n+1)-ary relation r on x such that for every $a \in dom(r)$ there is at most one $b \in \operatorname{rng}(r)$ such that $\langle a, b \rangle \in r$:

$$(\langle a,\,b
angle \in r \wedge \langle a,\,c
angle \in r) \Longrightarrow (b=c)$$

- Fonctional notation:
 - One writes $r(a_1, \ldots, a_n) = b$ for $\langle a_1, \ldots, a_n, b \rangle \in r$

Partial and total functions

- $-x \mapsto y$ is the set of (total) functions f such that dom(f) = x and $rng(f) \subseteq y$
- $-x \mapsto y$ is the set of (partial) functions f such that $dom(f) \subseteq x$ and $rng(f) \subseteq y$. So f(z) is undefined whenever $z \in x \setminus dom(f)$.

Operations on functions

 $-f = \lambda a \cdot k \stackrel{\mathrm{def}}{=} \{\langle a, k \rangle \mid a \in \mathrm{dom}(f)\}^{11} \mathrm{constant} \ \mathrm{function}$ $-\mathbf{1}_x \stackrel{\mathrm{def}}{=} \{\langle a, a \rangle \mid a \in x\}$ identity function $-f \circ g \stackrel{\mathrm{def}}{=} \lambda a \cdot f(g(a))$ function composition $-f \upharpoonright u \stackrel{\mathrm{def}}{=} f \cap (u \times \mathrm{rng}(f))$ function restriction $-f^{-1} \stackrel{\mathrm{def}}{=} \{\langle f(a), a \rangle \mid a \in \mathrm{dom}(f)\}$ function inverse 12

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪ ◯ ← 51 — | ■ — ▷ ▷ ⓒ P. Cousot, 2005

Notations for functions

The function f such that:

- $-\operatorname{dom}(f)=x,\operatorname{rng}(f)\subseteq y$ i.e. $f\in x\mapsto y$
- $\ orall a \in x : \langle a, \ e(a)
 angle \in f^{10}$

is denoted as:

- -f(a) = e or f(a:x) = e functional notation
- $-f = \lambda a \cdot e$ or $f = \lambda a : x \cdot e$ Church's lambda notation
- $f : a \in x \mapsto e$
- $\{a \to b, c \to d, e \to f\}$ denotes the function $g = \{\langle a, b \rangle, \langle c, d \rangle, \langle e, f \rangle\}$ such that g(a) = b, g(c) = d, g(e) = f, $dom(g) = \{a, c, e\}$ and $rng(g) = \{b, d, f\}$.

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪ 1 ← 50 ← 1 ■ ← ▷ ▷ ▶ ⊚ P. Cousot, 2005

Properties of functions





¹¹ where $k \in \operatorname{rng}(f)$.

¹² a relation but in general not a function.

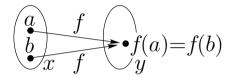
¹⁰ e(a) is an expression depending upon variable $a \in x$ which result is in y.

Injective/one-to-one function

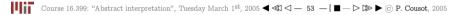
- A function $f \in x \mapsto y$ is injective/one-to-one if different elements have different images:

$$orall a,b \in x: a
eq b \Longrightarrow f(a)
eq f(b) \ \Longleftrightarrow \ orall a,b \in x: f(a) = f(b) \Longrightarrow a = b$$

- The following situation is excluded:



- Notation: $f \in x \rightarrow y$, $f \in x \rightarrow y$



Bijective function

- A function is bijective iff it is both injective and surjective
- Notation: $f \in x \rightarrow y$
- A bijective function is a bijection, also called an isomorphism
- Two sets x and y are isomorphic iff there exists an isomorphism $i \in x \rightarrowtail y$

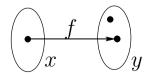
Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ◀ ◁ ─ 55 ─ | ■ ─ ▷ Þ ⓒ P. Cousot, 2005

Surjective/onto function

- A function $f \in x \mapsto y$ is surjective/onto function if all elements of its range are images of some element of their domain:

$$\forall b \in y: \exists a \in x: f(a) = b$$

- The following situation is excluded:



- Notation: $f \in x \mapsto y$, $f \in x \mapsto y$

Inverse of bijective functions

- If $f \in x \rightarrow y$ is bijective then its inverse is the function f^{-1} defined by:

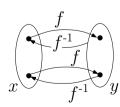
$$f^{-1} = \{\langle b,\ a
angle \mid \langle a,\ b
angle \in f\}$$

thus:

-
$$f^{-1} \in y
ightarrow x$$

$$-f^{-1}\circ f=1_x$$

-
$$f \circ {}^{-1} = 1_y$$



Cartesian product (revisited)

- Given a family $\{x_i \mid i \in I\}$ of sets, the cartesian product of the family $\{x_i \mid i \in I\}$ is defined as:

$$\prod_{i \in I} x_i \stackrel{ ext{def}}{=} \{ f \mid f \in I \mapsto igcup_{i \in I} x_i \land orall i \in I : f(i) \in x_i \}$$

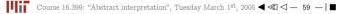
– If $orall i \in I: x_i = x$ then we write: $oldsymbol{x}^I$ or $I \mapsto x$ instead of $\prod_{i \in I} x_i$

- For example $x^n = \underbrace{x \times \ldots \times x}_{n \text{ times}}$

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪ □ ← 57 ← □ ■ ← ▷ ▶ ⊚ P. Cousot, 2005

Sequences







Characteristic functions of subsets

- The powerset $\wp(x)$ of a set x is isomorphic to $x \mapsto \mathbb{B}$ where the set of booleans is $\mathbb{B} = \{\text{true}, \text{false}\}\ \text{or } \{\text{ff}, \text{tt}\}\ \text{or } \{\text{0,1}\}\ \text{or } \{\text{NO,YES}\}.$
- The isomorphism is called the characteristic function: $c \in \wp(x)
 ightharpoonup (x \mapsto \mathbb{B})$

$$c(y) \stackrel{ ext{def}}{=} \lambda a \in x \cdot a \in y \qquad \qquad ext{where } y \subseteq x \ c^{-1}(y) = \lambda f \in x \mapsto \mathbb{B} \cdot \{a \in x \mid f(a) = \operatorname{tt} \}$$

Useful to implement subsets of a finite set by bit vectors

Finite sequences

Given a set x:

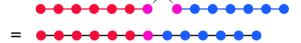
- $-x^{\vec{0}} \stackrel{\text{def}}{=} \{\vec{\epsilon}\}$ where $\vec{\epsilon} \in \emptyset \mapsto x$ is the empty sequence of length 0
- $-x^{ec{n}} \stackrel{ ext{def}}{=} \{0,\ldots,n-1\} \mapsto x, ext{ finite sequences } \sigma ext{ of length} \ |\sigma| = n. ext{ The } i ext{-th element of } \sigma \in x^{ec{n}} ext{ is } \sigma(i) ext{ abbreviated} \ \sigma_i ext{ so } \sigma = \sigma_0\sigma_1\ldots\sigma_{n-1}$
- $-x^{ec{ec{ec{ec{ec{ec{ec{ec{ec{v}}}}}}}}\mathop=\limits_{oldsymbol{n}\in\mathbb{N}} x^{ec{n}}$ finite sequences
- $-\stackrel{oldsymbol{x}^{ec{+}}}{=} igcup_{n \in \mathbb{N} \setminus \{0\}} x^{ec{n}}$ finite nonempty sequences

Infinite sequences

- $egin{array}{ll} \emph{ extbf{x}} \stackrel{ ext{def}}{=} \mathbb{N} \mapsto \emph{ extbf{x}} ext{ infinite sequences } \sigma ext{ of length } |\sigma| = \omega \ ext{where } orall i \in \mathbb{N}: i < \omega \end{array}$
- $-x^{\vec{\bowtie}} \stackrel{\mathrm{def}}{=} x^{\vec{\star}} \cup x^{\vec{\omega}}$ infinitary sequences
- $x^{\vec{\infty}} \stackrel{\text{def}}{=} x^{\vec{+}} \cup x^{\vec{\omega}}$ nonempty infinitary sequences
- The *i*-th element of $\sigma \in x^{\vec{\infty}}$ is $\sigma(i)$ abbreviated σ_i so $\sigma = \sigma_0 \sigma_1 \dots \sigma_n, \dots$

Junction \sim :

- $-\vec{\epsilon} \frown \sigma$ and $\sigma \frown \vec{\epsilon}$ are undefined
- $-\sigma \frown \sigma' \stackrel{\mathrm{def}}{=} \sigma ext{ whenever } \sigma \in x^{ec{\omega}}$
- $-\sigma_0 \dots \sigma_{n-1} \frown \sigma' = \sigma_0 \dots \sigma_{n-2} \sigma'$ is defined only if $\sigma_{n-1} = \sigma'_0$
- $x \frown y \stackrel{\mathrm{def}}{=} \{ \sigma \frown \sigma' \mid \sigma \in x \land \sigma' \in y \land \sigma \frown \sigma' \text{ is well-defined} \}$



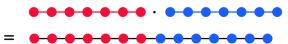
Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪1 <1 - 1 ■ - ▷ ▷ ▶ ⓒ P. Cousot, 2005

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪1 < 1 − 63 − | ■ − ▷ ▷ ▶ ⊚ P. Cousot, 2005

Operations on sequences

Concatenation ·:

- $-\vec{\epsilon}\cdot\sigma\stackrel{\mathrm{def}}{=}\sigma\cdot\vec{\epsilon}\stackrel{\mathrm{def}}{=}\sigma$
- $-\ \sigma \cdot \sigma' \stackrel{\mathrm{def}}{=} \sigma \ ext{whenever} \ \sigma \in x^{ec{\omega}}$
- $-\sigma_0\ldots\sigma_{n-1}\cdot\sigma'=\sigma_0\ldots\sigma_{n-1}\sigma'$
- $-\sigma \cdot \sigma'$ is often denoted $\sigma \sigma'$
- $extbf{x} \cdot extbf{y} \stackrel{ ext{def}}{=} \{ \sigma \sigma' \mid \sigma \in x \wedge \sigma' \in y \}$



Set transformers





Image (postimage) of a set by a function/relation

- Let $r \subseteq x \times y$ and $z \subseteq x$.
 - The image (or postimage) of z by r is:

$$r[z] \stackrel{\mathrm{def}}{=} \{b \mid \exists a \in z : \langle a, b \rangle \in r\}$$

(which is also written post[r]z or even r(z))

- For $f \in x \mapsto y$ and $z \subseteq x$, we have:

$$f[z] = f(z) = \operatorname{post}[f]z \stackrel{\text{def}}{=} \{f(a) \mid a \in z\}$$



Dual image of a set by a function/relation

- Let $r \subseteq x \times y$ and $z \subseteq x$.

$$\widetilde{\operatorname{post}}[r]z = \neg \operatorname{post}[r](\neg z) \qquad \text{(informally)}$$

$$= y \setminus \operatorname{post}[r](x \setminus z) \qquad \text{(formally)}$$

$$= \neg \{b \mid \exists a \in (\neg z) : \langle a, b \rangle \in r\}$$

$$= \neg \{b \mid \exists a : a \notin z \land \langle a, b \rangle \in r\}$$

$$= \{b \mid \forall a : a \in z \lor \langle a, b \rangle \notin r\}$$

$$= \{b \mid \forall a : (\langle a, b \rangle \in r) \Longrightarrow (a \in z)\}$$

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ◀ ◀ ◁ ─ 67 ─ | ■ ─ ▷ ሙ ▶ ⊚ P. Cousot, 2005

Preimage of a set by a function/relation

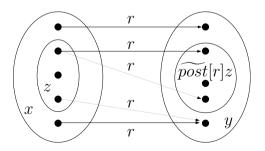
- Let $r \subseteq x \times y$ and $z \subseteq y$. The inverse image (or preimage) of z by r is:

$$egin{aligned} r^{-1}[z] &\stackrel{ ext{def}}{=} \{a \mid \exists b \in z : \langle a, \ b
angle \in r \} \ &= \{a \mid \exists b \in z : \langle b, \ a
angle \in r^{-1} \} = \operatorname{post}[r^{-1}]z \end{aligned}$$
 (which is also written $\operatorname{pre}[r]z$ or even $r^{-1}(z)$)

- For $f \in x \mapsto y$ and $z \subseteq u$, we have:

$$f^{-1}[z] = f^{-1}(z) = \operatorname{pre}[f]z \stackrel{\operatorname{def}}{=} \{a \mid f(a) \in z\}$$

It is impossible to reach post(r)z from x by following r without starting from z



Dual preimage of a set by a function/relation

- Let
$$r \subseteq x \times y$$
 and $z \subseteq y$.

$$\widetilde{\operatorname{pre}}[r]z = \neg \operatorname{pre}[r](\neg z) \qquad \text{(informally)}$$

$$= x \setminus \operatorname{pre}[r](y \setminus z) \qquad \text{(formally)}$$

$$= \neg \{a \mid \exists b \in (\neg z) : \langle a, b \rangle \in r\}$$

$$= \neg \{a \mid \exists b : b \not\in z \land \langle a, b \rangle \in r\}$$

$$= \{a \mid \forall b : b \in z \lor \langle a, b \rangle \not\in r\}$$

$$= \{a \mid \forall b : (\langle a, b \rangle \in r) \Longrightarrow (b \in z)\}$$

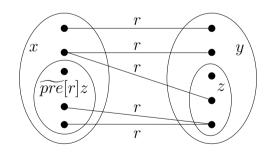
Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪1 < 1 - 69 - 1 ■ - ▷ ▷ ▶ ⓒ P. Cousot, 2005

Properties of [dual [inverse]] images

$$egin{aligned} -\operatorname{post}[r](igcup_{i\in I}x_i) &= igcup_{\operatorname{post}[r]}(x_i) \ \operatorname{pre}[r](igcup_{i\in I}x_i) &= igcup_{\operatorname{pre}[r]}(x_i) \ \widetilde{\operatorname{pre}}[r](igcap_{i\in I}x_i) &= igcap_{\widetilde{\operatorname{pre}}[r]}(x_i) \ \widetilde{\operatorname{post}}[r](igcap_{i\in I}x_i) &= igcap_{\widetilde{\operatorname{post}}[r]}(x_i) \ -\operatorname{post}[r](x) \subseteq y \iff x \subseteq \widetilde{\operatorname{pre}}[r](y) \ \operatorname{pre}[r](x) \subseteq y \iff x \subseteq \widetilde{\operatorname{post}}[r](y) \end{aligned}$$

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ◀ ◀ ◁ ─ 71 ─ | ■ ─ ▷ Þ ♠ ⓒ P. Cousot, 2005

Starting from $\widetilde{\text{pre}}(r)z$ from x and following r, it is impossible to arrive outside z (or one must reach z)



- $egin{aligned} -\operatorname{pre}[r](x)&=\operatorname{post}[r^{-1}](x)\ \operatorname{post}[r](x)&=\operatorname{pre}[r^{-1}](x)\ \widetilde{\operatorname{pre}}[r](x)&=\widetilde{\operatorname{post}}[r^{-1}](x)\ \widetilde{\operatorname{post}}[r](x)&=\widetilde{\operatorname{pre}}[r^{-1}](x) \end{aligned}$
- Notice that if $f \in x \rightarrow y$ is bijective with inverse f^{-1} then the two possible interpretations of $f^{-1}[z]$ as $f^{-1}[z] = \operatorname{pre}[f](z)$ and $f^{-1}[z] = \operatorname{post}[f^{-1}]z$ do coincide since $\operatorname{pre}[f](z) = \operatorname{post}[f^{-1}]z$.

Induction

Characteristic property of wosets

 $-\langle x,\leq
angle$ is a woset iff there is no infinite strictly decreasing sequence $a\in \mathbb{N}\mapsto x$ (that is such that $a_0>a_1>a_2>\ldots$).







Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ◀ 1 ◀ 75 — | ■ — ▷ ▷ ▶ ⓒ P. Cousot, 2005

Well-founded relation, woset

- Let $\langle x, \leq \rangle$ be a poset, and let $y \subseteq x$. An element a of y is a minimal element of y iff $\neg (\exists b \in y : b < a)$ 13
- A poset $\langle x, \leq \rangle$ is well-founded iff every nonempty subset of x has a minimal element
- A woset $\langle x, \leq \rangle$ is a poset $\langle x, \leq \rangle$ such that the partial ordering relation \leq is well-founded
- Example: $\langle \mathbb{N}, \leq \rangle$, counter-example: $\langle \mathbb{Z}, \leq \rangle^{14}$

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪ ☐ < 74 — ▮ ■ — ▷ ▷ ▶ ⊚ P. Cousot, 2005

PROOF.

1) If $\langle x, \leq \rangle$ is not well-founded, their exists $y \subseteq x$ which is nonempty and has no minimal element. So let $a_0 \in y$. Since a_0 is not minimal, we can find $a_1 \in y$ such that $a_1 < a_0$. If we have built $a_0 > \ldots > a_n$ in y then a_n is not minimal, so we can find $a_{n+1} \in y$ such that $a_{n+1} < a_n$. So proceeding inductively, we can build an infinite strictly decreasing sequence $a_0 > \ldots > a_n > \ldots$ in y.

By contraposition ¹⁵, if $\langle x, \leq \rangle$ has no infinite strictly decreasing sequence $a_0 > \ldots > a_n > \ldots$ then $\langle x, \leq \rangle$ is a woset

2) Reciprocally, if x has an infinite strictly decreasing sequence $a_0 > a_1 > a_2 > \ldots > a_n > \ldots$ then $y = \{a_0, a_1, a_2, \ldots, a_n, \ldots\}$ has no minimal element.

By contraposition, if $x \langle x, \leq \rangle$ is a woset then $\langle x, \leq \rangle$ has no infinite strictly decreasing sequence $a_0 > \ldots > a_n > \ldots$

 $^{^{15} \}neg P \Longrightarrow \neg Q \text{ iff } P \Longrightarrow Q$



¹³ where as usual $a < b \stackrel{\text{def}}{=} a < b \land a \neq b$.

 $[\]mathbb{Z} \subseteq \mathbb{Z}$ has no minimal element since $\forall a \in \mathbb{Z} : \exists b \in \mathbb{Z} : b < a$.

Proof by induction on a woset

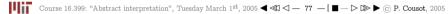
If $\langle x, \leq \rangle$ is a woset, and $P \subseteq x$. One wants to prove $x \subset P$ (that is property P holds for all elements of x).

If one can prove property P for any element a of x by assuming that P holds for strictly smaller elements (which requires a direct proof for minimal elements) then P holds for all elements of x.

Formally:

$$egin{aligned} orall a \in x: (orall b: (b < a) \Longrightarrow (b \in P)) \Longrightarrow a \in P \ orall a \in x: a \in P \end{aligned}$$

¹⁶ The rule $\frac{P_1,\ldots,P_n}{c}$ with premiss P_1,\ldots,P_n and conclusion c is a common notation for $(\bigwedge_{i=1}^n P_i)\Longrightarrow c$.



PROOF. By reductio ad absurdum, assume the premiss holds but not the conclusion. So $\exists a_0 \in x : a_0 \notin P$. By the premiss, $a_0 \notin P$ implies $\neg(\forall b : (b < a_0) \Longrightarrow (b \in P))$ = $\exists a_1 < a_0 : a_1 \notin P$. Assume we have built $a_n < \ldots < a_1 < a_0$ with all a_i in x but not in P. Again by the premiss, $a_n \notin P$ implies $\exists a_{n+1} < a_n : a_{n+1} \notin P$. So we can built a strictly decreasing infinite chain $a_0 > \ldots > a_n > \ldots$ of elements of x, in contradiction with $\langle x, \leq \rangle$ is a woset.

Proof by recurrence

For $\langle \mathbb{N}, \leq \rangle$, the structural induction principle becomes (writing P(n) for $n \in P$ that is "n has property P"):

$$egin{aligned} orall n \in \mathbb{N} : (orall k : (k < n) \Longrightarrow P(k)) \Longrightarrow P(n) \ \hline &orall n \in \mathbb{N} : P(n) \end{aligned}$$

We can distinguish the case of 0 17:

$$egin{aligned} P(0), \ orall n \in \mathbb{N} \setminus \{0\}: (orall k < n: P(k)) \Longrightarrow P(n) \ \hline \ orall n \in \mathbb{N}: P(n) \end{aligned}$$

17 and abbreviate $\forall k : (k < n) \Longrightarrow Q$ by $\forall k < n : Q$.

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪ 1 < - 79 - | ■ - ▷ ▷ ▶ ⓒ P. Cousot, 2005

This is equivalent to the more classical:

$$\frac{P(0), \ \forall n \in \mathbb{N} : P(n) \Longrightarrow P(n+1)}{\forall n \in \mathbb{N} : P(n)}$$
(3)

PROOF. A proof done with (3) can also be done with (2) since $\forall n \in \mathbb{N} \setminus \{0\} : (\forall k < n : P(k)) \Longrightarrow P(n)$ implies $\forall n \in \mathbb{N} : P(n) \Longrightarrow P(n+1)$). Reciprocally, if a proof has been done by (2), then by redefining $P'(n) = (\forall k < n : P(k))$ we can prove by (3) that $\forall n \in \mathbb{N} : P'(n)$ which implies the conclusion of (2), namely $\forall n \in \mathbb{N} : P(n)$.

Example of recursive/structural definitions

h(n,k) = n * k can be recursively defined on $\mathbb N$ as:

$$h(0,k)=0 \ h(n,k)=k+h(n-1,k) \qquad ext{when } n>0$$

This can be written as

$$h(n,k) = f(n,k,h \mid \{\langle n', \ k
angle \mid n' < n\})$$

where

$$f(0,k,g)=0 \ f(n,k,g)=k+g(n-1,k) \qquad ext{when } n>0$$

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ◀ ☐ ← 81 — ☐ ■ ─ ▷ ▷ ▶ ⑥ P. Cousot, 200

Proof.

(1) Define $\leq^2 \stackrel{\text{def}}{=} \{ \langle \langle a', b \rangle, \langle a, b \rangle \rangle \mid a' \leq a \}$. Then $\langle x \times y, \leq^2 \rangle$ is a woset since otherwise the existence of $\langle a_0, b_0 \rangle >^2$ $\langle a_1, b_1 \rangle >^2 \ldots$ would imply $b_0 = b_1 = \ldots$ so $\langle a_0, b \rangle \geq^2$ $\langle a_1, b \rangle$ and $\langle a_0, b \rangle \neq \langle a_1, b \rangle, \ldots$ implies $a_0 > a_1 > \ldots$ in contradiction with the hyposthesis that $\langle x, \leq \rangle$ is a woset.

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪1 < - 83 - | ■ - ▷ ▷ ► ⓒ P. Cousot, 2005

Recursive/Structural Definitions

Let $\langle x, \leq \rangle$ be a woset, y be a set, and $f \in (x \times y \times ((x \times y) \mapsto y)) \mapsto y$. Define

$$g(a,b) \stackrel{\mathrm{def}}{=} f(a,b,g \upharpoonright \{\langle a',\ b
angle \mid a' < a \})$$

then $q \in (x \times y) \mapsto y$ is well-defined and unique.

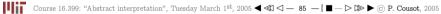
- (2) Assuming that g(a',b') is well-defined for all $\langle a',b'\rangle <^2 \langle a,b\rangle$ that is, by definition of \leq^2 , iff b=b' and a' < a then $g \upharpoonright \{\langle a',b\rangle \mid a' < a\}$ is well defined. It follows that $g(a,b) = f(a,b,g \upharpoonright \{\langle a',b\rangle \mid a' < a\})$ is well-defined by hypothesis that f is a total function. By structural induction, we have proved $g \in (x \times y) \mapsto y$ is well-defined for all $\langle a,b\rangle \in x \times y$.
- (3) If g' also satisfies the definition and g'(a',b')=g(a,b) for all $\langle a',b'\rangle<^2\langle a,b\rangle$ by induction hypothesis, then obviously $g\upharpoonright \{\langle a',b\rangle\mid a'< a\}=g'\upharpoonright \{\langle a',b\rangle\mid a'< a\}$ so g(a,b)=g'(a,b) proving g'=g by structural induction.

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪ 1 < − 84 − | ■ − ▷ ▷ ▶ ⊚ P. Cousot, 2005

Cardinals







Equipotence

- Two sets x and y are equipotent of and only if there exists a bijection $b \in x \rightarrow y^{20}$
- Examples:
 - The set of even integers is equipotent to the set \mathbb{Z} of integers (by b(n) =
 - The set of odd integers is equipotent to the set $\mathbb Z$ of integers (by b(n)=2n + 1
 - The set of integers \mathbb{Z} is equipotent to the set \mathbb{N} of natural numbers, by

$$b(n) \stackrel{ ext{def}}{=} 2n-1 \qquad ext{if } n>0 \ b(n) \stackrel{ ext{def}}{=} -2n \qquad ext{if } n<0 \ b(0) \stackrel{ ext{def}}{=} 0$$

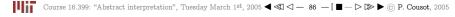
The intuition is that "x and y have the same number of elements".

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ≪1 < - 87 - 1 ■ - ▷ ▷ ▶ ⓒ P. Cousot, 2005

Intuition on ordinals and cardinals

- The ordinals 1st, 2nd, 1rd, ... and cardinals 1, 2, 3, ... elements do coincide for natural numbers
- This is not otherwise the case.
- For example if we consider the sets $\{0, 1, 2, \ldots\}$ and $\{0, 1, 2, \dots, +\infty\}$ ordered by $0 < 1 < 2 < \dots < +\infty$, they are equipotent (by $b(+\infty) = 0$ and b(n) = n + 1otherwise) hence have same cardinality 18 but the ∞^{th} element does not exists in $\{0, 1, 2, ...\}$ so the two sets are different as ordinals 19.

¹⁹ hence are different when used as positions for ranking elements of a set



Properties of Equipotence

- Equipotence is an equivalence relation denoted \equiv_c
- A set x is denumerable (also said countable) iff $x \equiv_c \mathbb{N}$ (otherwise uncountable)
- A set x is *finite* iff $\exists n \in \mathbb{N} : x \equiv_c \{i \mid i < n\}$ (otherwise infinite)
- Example: \mathbb{Z} is denumerable and infinite

hence are equivalent when used as quantities for mesuring the "size"/number of elements of sets.

Cardinality

- The cardinality |x| (also written Card(x)) of a set x is

$$|x| \stackrel{\mathrm{def}}{=} [x]_{\equiv_c}$$

i.e., intuitively, a representative of the class of all sets with "the same number of elements"

 $- |\mathbb{N}| \stackrel{\mathrm{def}}{=} \aleph_0^{21}$

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ◀ ◀ ◀ − 89 − | ■ − ▷ ▶ ⓒ P. Cousot, 200

The set of all sets of naturals is uncountable

$$|\wp(\mathbb{N})| > |\mathbb{N}|$$

PROOF. The function $f \in \mathbb{N} \mapsto \wp(\mathbb{N})$ defined by $f(n) = \{n\}$ is injective, so $|\mathbb{N}| \leq |\wp(\mathbb{N})|$.

Let $s \in \mathbb{N} \mapsto \mathbb{N}$ be a sequence $s_n, n \in \mathbb{N}$ of naturals.We show that some $S \in \wp(\mathbb{N})$ is missing in that enumeration. Define the set $S = \{n \in \mathbb{N} \mid n \notin s_n\}$. If $n \in s_n$ then $n \notin S$ and if $n \notin s_n$ then $n \in S$. So $\forall n : S \neq s_n$. This shows that there is no surjective mapping of \mathbb{N} onto $\wp(\mathbb{N})$, whence $|\wp(\mathbb{N})| > |\mathbb{N}|$.

Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ◀ 【 ◁ ─ 91 ─ | ■ ─ ▷ D▶ ▶ ⑥ P. Cousot, 2005

The set of all real numbers is uncountable

PROOF. (Cantor) Assume that \mathbb{R} is countable, i.e., is the range of some infinite sequence r(n), $n \in \mathbb{N}$. We show that some $r \in \mathbb{R}$ is missing in that enumeration.

Let $a_0^{(n)}.a_1^{(n)}a_2^{(n)}a_3^{(n)}...$ be the decimal expansion of r(n). Let $b_n=1$ if $a_n^{(n)}=0$ and otherwise $b_n=0$. Let r be the real number whose decimal expansion is $0.b_1b_2b_3...$ We have $b_n\neq a_n^{(n)}$, hence $\forall n\in\mathbb{N}:r\neq r(n)$, for all $n=1,2,3,\ldots$, a contradiction.

Operations on cardinals

- Cardinal addition $\mathfrak{m} + \mathfrak{n} = |A \cup B|$ where $\mathfrak{m} = |A|$, $\mathfrak{n} = |B|$ and $A \cap B = \emptyset$ 22
- Cardinal multiplication $\mathfrak{m} \times \mathfrak{n} = |A \times B|$ where $\mathfrak{m} = |A|$ and $\mathfrak{n} = |B|$
- Cardinal exponentiation $\mathfrak{m}^{\mathfrak{n}} = |B \mapsto A|$ where $\mathfrak{m} = |A|$ and $\mathfrak{n} = |B|$
- For example, $2^{\mathfrak{n}} = |\wp(A)|$ where $2 = |\mathbb{B}|$ and $\mathfrak{m} = |A|^{23}$

²¹ ℵ is the hebrew aleph letter.

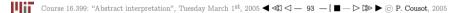
²² All these definitions are independent of the choice of A and B.

²³ Using the characteristic function of subsets of A into the booleans $\mathbb{B} = \{\mathsf{tt}, \mathsf{ff}\}$. This explains the notation 2^A for $\wp(A)$.

Ordering on cardinals

- We write $\mathfrak{m} < \mathfrak{n}$ where $\mathfrak{m} = |A|$ and $\mathfrak{n} = |B|$ iff there exists an injective function of A into B^{24}
- A cardinal m is finite iff $m < \aleph_0$, otherwise it is infinite

²⁴ Again this definition is independent of the choice of A and B



Ordinals

Order-preserving maps

- Given two posets $\langle x, \leq \rangle$ and $\langle y, \leq \rangle$, a map $f \in x \mapsto y$ which is order-preserving (also called monotone, isotone, ...) if and only if:

$$orall a,b\in x:(a\leq b)\Longrightarrow (f(a)\leq f(b))$$

- Example: $\lambda x \in \mathbb{Z} \cdot x + 1$
- Counter-example: $\lambda x \in \mathbb{Z}$. $|x|^{25}$

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Order-isomorphism

- Two posets $\langle x, \leq \rangle \langle y, \prec \rangle$ are order-isomorphic iff there exists an order-preserving bijection $b \in x \rightarrow y$
- Notation: $\langle x, \leq \rangle \equiv_o \langle y, \preceq \rangle$
- $-\equiv_{o}$ is an equivalence relation on wosets ²⁶.





Not true on posets sincee symmetry is lacking.



²⁵ Here |x| is the absolute value of x

Ordinals

- The equivalence classes $[\langle x, \leq \rangle]_{\equiv_o}$ for wosets $\langle x, \leq \rangle$ are called the ordinals. $[\langle x, \leq \rangle]_{\equiv_o}$ is called the rank (also called order-type) of the woset $\langle x, \leq \rangle$
- We let be the class 27 of all ordinals
- On \mathbb{O} which is the quotient of wosets by \equiv_o , \equiv_o and \equiv do coincide (so we use \equiv)
- the rank of $\{0,1,\ldots,n-1\}$ with ordering $0<1<2<\ldots$ is written n so $0\stackrel{\mathrm{def}}{=}[\langle\emptyset,\,\emptyset\rangle]_{\equiv_{\mathcal{O}}}$
- the rank of $\mathbb N$ is writen ω so $\omega \stackrel{\text{def}}{=} [\langle \mathbb N, \leq \rangle]_{\equiv_{\mathcal{O}}}$

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Ordering on ordinals

- We have $\delta \leq \eta$ whenever $\delta = [\langle x, \leq \rangle]_{\equiv_o}$, $\eta = [\langle y, \leq \rangle]_{\equiv_o}$ and there exists an order-preserving injection $i \in x \mapsto y^{28}$
- Example: $0 < 1 < 2 < ... < \omega$
- An ordinal δ is finite if $\delta < \omega$ and otherwise infinite

Wosets and ordinals

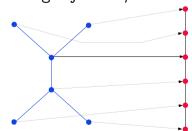
- The rank of $\langle \{\beta \mid \beta < \alpha\}, \leq \rangle$ is α so $\alpha \equiv_o \{\beta \mid \beta < \alpha\}$ that is $\alpha = \{\beta \mid \beta < \alpha\}$
- it follows that every woset is order-isomorphic to the woset of all ordinals less than some given ordinal α :

$$[\langle x, \leq
angle]_{\equiv_{o}} \equiv_{o} lpha \equiv_{o} \{eta \mid eta < lpha \}$$

- It follows that for any woset $\langle x, \preceq \rangle$ there is an ordinal α and an indexing $x_{\gamma}, \gamma \in \{\beta \mid \beta < \alpha\}$ such that $\langle x, \leq \rangle$ is order-isomorphic to $\langle \{x_{\beta} \mid \beta < \alpha\}, \leq' \rangle$ and $x_{\gamma} \leq' x_{\delta}$ iff $\gamma < \delta$
- Otherwise stated, every woset is order isomorphic to an ordinal

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 A well-founded set is ismorphic to an ordinal through an order-preserving bijection, for example:



 This is the reason why ordinals are used in Manna-Pnueli proof rule for while-loops instead of arbitrary wosets in Floyd's method.

²⁷ It is a class but not a set because sets are not large enough to contain all ordinals

This definition does not depend upon the particular choice of $\langle x, \leq \rangle$ and $\langle y, \preceq \rangle$

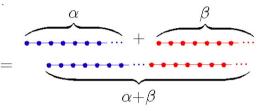
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Operations on ordinals

- The addition of $\alpha = [\langle x, \leq \rangle]_{\equiv_o}$ and $\beta = [\langle y, \leq \rangle]_{\equiv_o}$ where $x \cap y = \emptyset$ is $\alpha + \beta = [\langle x \cup y, \sqsubseteq \rangle]_{\equiv_o}$ with

$$egin{array}{lll} a\mathrel{\sqsubseteq} b & & ext{iff} & (a,b\in x\wedge a\leq b) \ ⅇ (a\in x\wedge b\in y) \ ⅇ (a,b\in y\wedge a\preceq y) \end{array}$$

- Intuition



- Addition is not commutative: $\omega = 1 + \omega \neq \omega + 1$
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Successor and limit ordinal

– A successor ordinal is $\alpha \in \mathbb{O}$ such that

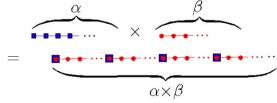
$$\exists eta: lpha = eta + 1 \ \iff \exists eta: lpha = eta \cup \{eta\}$$

Otherwise it's a limit ordinal 30.

- 0 is the first limit ordinal. ω is the first infinite limit ordinal.
- Intuition: = successor ordinal, = limit ordinal



- ³⁰ A limit ordinal λ is such that $\forall \alpha < \lambda : \exists \beta : \alpha < \beta < \lambda$ and so for a successor ordinal η , $\exists \alpha < \eta : \forall \beta : \neg(\alpha < \beta < \eta)$.
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- The *multiplication* of $\alpha = [\langle x, \leq \rangle]_{\equiv_o}$ and $\beta = [\langle y, \preceq \rangle]_{\equiv_o}$ where $x \cap y = \emptyset$ is $\alpha \times \beta = [\langle x \times y, \leq_\ell \rangle]_{\equiv_o}$ ²⁹.
- Intuition:



Induction principal for ordinals

- As a special case of structural induction, we get:

$$P(0), \ orall eta: P(eta) \Longrightarrow P(eta+1), \ (orall eta<\lambda:P(eta)) \Longrightarrow P(\lambda) ext{ for all limit ordinals } \lambda \ orall lpha:P(lpha)$$

Recall that \leq_{ℓ} is the lexicographic ordering: $\langle a, b \rangle \leq_{\ell} \langle a', b' \rangle$ iff $(a < a') \vee ((a = a') \wedge (b < b'))$.

Properties of limit ordinals

- The successor $\alpha + 1$ (also written $S\alpha$) of α satisfies

$$\alpha + 1$$

$$= \{\beta \mid \beta < \alpha + 1\}$$

$$= \{\beta \mid \beta < \alpha\} \cup \{\alpha\}$$

$$= \alpha \cup \{\alpha\}$$

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Properties of limit ordinals (Cont'd)

Assume that λ is a limit ordinal, then:

$$\lambda$$

$$= \{ \gamma \mid \gamma < \lambda \}$$

$$= \{ \gamma \mid \gamma < \beta < \lambda \} \qquad \{ \lambda \text{ is a limit ordinal} \}$$

$$= \bigcup \{ \{ \gamma \mid \gamma < \beta \} \mid \beta < \lambda \}$$

$$= \bigcup \{ \beta \mid \beta < \lambda \} \qquad \{ \text{since } \beta = \{ \gamma \mid \gamma < \beta \} \}$$

$$= \bigcup_{\beta < \lambda} \beta$$

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Properties of limit ordinals

- A limit ordinal λ is such that if $\gamma < \lambda$ then $\exists \beta : \gamma < \beta < \lambda$
- This is not true of $\eta < \eta + 1$ whence of successor ordinals

Ordinals are well-ordered by \in

- If $\alpha < \beta$ then $\beta = \{ \gamma \mid \gamma < \beta \}$ so $\alpha \in \beta$
- Reciprocally, if $\alpha \in \beta$ then $\beta = \{\gamma \mid \gamma < \beta\}$ implies $\alpha \in \{ \gamma \mid \gamma < \beta \} \text{ so } \alpha < \beta$
- we conclude that $\alpha < \beta \iff \alpha \in \beta$

Ordinals are well-ordered by " "

$$egin{array}{lll} & lpha < eta \ & \iff & orall \gamma: (\gamma < lpha) \Longrightarrow (\gamma < eta) \ & \iff & orall \gamma: (\gamma \in lpha) \Longrightarrow (\gamma \in eta) \ & \iff & lpha \subseteq eta \end{array}$$

So ordinals are \in -transitive in that $\forall \alpha \in \beta : (\alpha \subseteq \beta)$. Every member of an ordinal is \in -transitive.

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Transfinite inductive definitions on ordinals

$$\begin{split} &-g(0)=a\\ &-g(\beta+1)=f(\beta,g(\beta))\\ &-g(\lambda)=h(\lambda,g\upharpoonright\lambda)\quad\text{when λ is a limit ordinal}\\ &\text{is well defined and unique.} \end{split}$$

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Proof by transfinite induction on ordinals

$$P(0),$$
 $orall eta:P(eta)\Longrightarrow P(eta+1),$
 $orall \lambda ext{ limit ordinal}:(orall eta<\lambda:P(eta))\Longrightarrow P(\lambda)$
 $orall lpha:P(lpha)$

More generaly, transfinite inductive definitions on α have the form:

$$egin{aligned} &-f \in (lpha imes y imes ((lpha imes y) \mapsto y) \ &-d(eta,b) \stackrel{\mathrm{def}}{=} f(eta,b,g \upharpoonright \{\langle \gamma,\,b
angle \mid \gamma < eta \}) \ & ext{and} \ g \in (lpha imes y) \mapsto y ext{ is well-defined and unique.} \end{aligned}$$

Totally ordered set

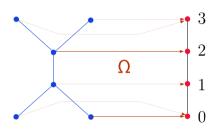
- A total order (or "totally ordered set", or "linearly ordered set") is a partial order $\langle x, \leq \rangle$ such that any two elements are comparable:

$$orall a,b\in x:(a\leq b)ee(b\leq a)$$

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Ordinal number (rank) of a well ordered set

- Let $\langle x, \leq \rangle$ be a well ordered set. We define the rank $\rho \in x \mapsto \mathbb{O}$ as follows:
 - $-\rho(a)=0$ iff a the minimal element of x
 - $\rho(a) = \bigcup_{b < a} \rho(b)$
 - $-\rho(x)=\bigcup_{a\in x}\rho(a)$



Course 16.399: "Abstract interpretation", Tuesday March 1st, 2005 ◀ ◀ ◀ ◄ 115 — | ■ — ▷ ▷ ▶ ♠ ⓒ P. Cousot, 2005

Well ordered set.

- A well ordered set is a well-founded total order.
- totally ordered set is well ordered.
- The set of integers \mathbb{Z} , which has no least element, is an example of a set that is not well ordered.

Burali-Forti Paradox

Assume \mathbb{O} is a set. We have seen that:

- 1. Every well ordered set has a unique rank;
- 2. Every segment of ordinals (i.e., any set of ordinals arranged in natural order which contains all the predecessors of each of its elements) has a rank which is greater than any ordinal in the segment, and
- 3. The set \mathbb{O} of all ordinals in natural order is well ordered.

Then by statements (3) and (1), \mathbb{O} has a rank, which is an ordinal β . Since β is in \mathbb{O} , it follows that $\beta < \beta$ by (2), which is a contradiction.

So the class \mathbb{O} of ordinals is not a set 31 .

³¹ It's an ordinal $\mathbb{O} \in \mathbb{O}$

Axiomatizations

Two main Axiomatizations of naïve set theory:

- Zermalo/Fraenkel
- Bernays/Gödel

that lead to a rigourous treatment of the notion of set/class avoiding seeming paradoxes.

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Paul I. Bernays Adolf A. Fraenkel Ernst Zermelo

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