Why study lattices

Deepak D'Souza

Department of Computer Science and Automation Indian Institute of Science, Bangalore.

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#### Outline

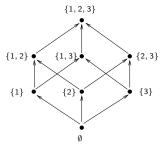
Why study lattices

- Why study lattices
- 2 Partial Orders
- 3 Lattices
- Master-Tarski Theorem
- Computing LFP

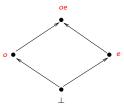
#### What a lattice looks like

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•000



Subsets of  $\{1, 2, 3\}$ , "subset"



Odd/even, "contained in"

## Why study lattices in program analysis?

### Why lattices?

Why study lattices

- Natural way to obtain the "collecting state" at a point is to take union of states reached along each path leading to the point.
- With abstract states also we want a "union" or "join" over all paths (JOP).

### Why fixpoints?

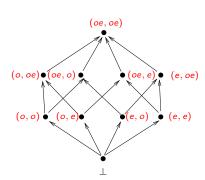
- Guaranteed to safely approximate JOP (\* Conditions apply).
- Easier to compute than JOP.
- Knaster-Tarski theorem tells us about the existence of fixpoints and their structure in a lattice.

# Motivation: Interpreting a program with even/odd abstract values

```
1: p := 5;
2: q := 2;
3: while (p > q) {
4: p := p+1;
5: q := q+2;
   print p;
6:
```

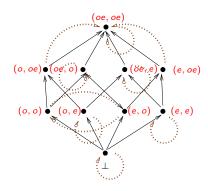
# Motivation: Interpreting a program with even/odd abstract values

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### Why Fixed Points?

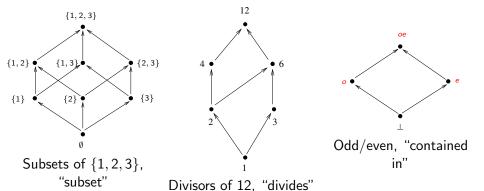
- JOP not always possible to compute
- LFP guaranteed to conservatively approximate JOP
- More efficient to compute LFP



Transfer function for p:=p+q

#### **Partial Orders**

- Usual order (or total order) on numbers:  $1 \le 2 \le 3$ .
- Some domains are naturally "partially" ordered:



### Partial orders: definition

- A partially ordered set is a non-empty set D along with a partial order  $\leq$  on D. Thus  $\leq$  is a binary relation on D satisfying:
  - $\leq$  is reflexive  $(d \leq d \text{ for each } d \in D)$
  - $\leq$  is transitive  $(d \leq d')$  and  $d' \leq d''$  implies  $d \leq d''$
  - $\leq$  is anti-symmetric ( $d \leq d'$  and  $d' \leq d$  implies d = d').

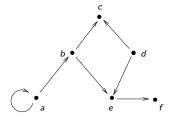
## Binary relations as Graphs

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We can view a binary relation on a set as a directed graph. For example, the binary relation

$$\{(a, a), (a, b), (b, c), (b, e), (d, e), (d, c), (e, f)\}$$

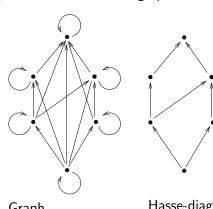
can be represented as the graph:



## Partial Order as a graph

A partial order is then a special kind of directed graph:

- Reflexive = self-loop on each node
- Antisymmetric = no 2-length cycles
- Transitive = "transitivity" of edges.



Graph representation

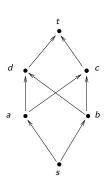
Hasse-diagram representation

## Upper bounds etc.

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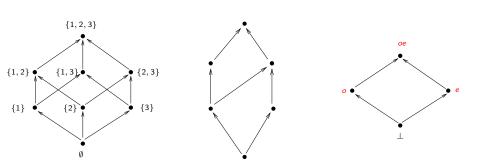
In a partially ordered set  $(D, \leq)$ :

- An element  $u \in D$  is an upper bound of a set of elements  $X \subseteq D$ , if x < u for all  $x \in X$ .
- u is the least upper bound (or lub or join) of X if u is an upper bound for X, and for every upper bound y of X, we have u < y. We write u = | |X|.
- Similarly,  $v = \prod X$  (v is the greatest lower bound or glb or meet of X).



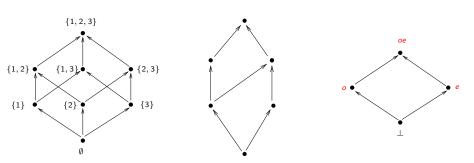
#### **Lattices**

- A lattice is a partially order set in which every pair of elements has an lub and a glb.
- A complete lattice is a lattice in which every subset of elements has a lub and glb.

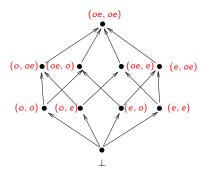


#### **Lattices**

- A lattice is a partially order set in which every pair of elements has an lub and a glb.
- A complete lattice is a lattice in which every subset of elements has a lub and glb.
- Examples below are all complete lattices.

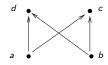


### **More lattices**



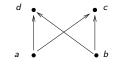
• Example of a partial order that is not a lattice?

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Why study lattices

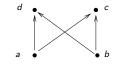
Example of a partial order that is not a lattice?



"Simplest" example of a partial order that is not a lattice?

Why study lattices

Example of a partial order that is not a lattice?

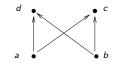


"Simplest" example of a partial order that is not a lattice?

a • b

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Example of a partial order that is not a lattice?



"Simplest" example of a partial order that is not a lattice?

Second Example of a lattice which is not complete?

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## Example of a partial order that is not a lattice?



"Simplest" example of a partial order that is not a lattice?

b

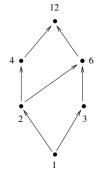
Second Example of a lattice which is not complete?



## Partial order induced by a subset of elements

Let  $(D, \leq)$  be a partially ordered set, and X be a non-empty subset of D. Then X induces a partial order, which we call the partial order *induced by* X in  $(D, \leq)$ , and defined to be  $(X, \leq \cap (X \times X))$ .

Example: the partial order induced by the set of elements  $X = \{2, 3, 12\}.$ 

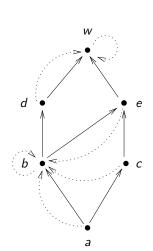




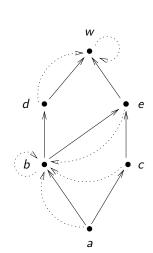
### **Monotonic functions**

Let  $(D, \leq)$  be a partially ordered set.

 A function f: D → D is monotonic or order-preserving if whenever x ≤ y we have f(x) ≤ f(y).



- A fixpoint of a function  $f: D \to D$  is an element  $x \in D$  such that f(x) = x.
- A pre-fixpoint of f is an element x such that  $x \leq f(x)$ .
- A post-fixpoint of f is an element x such that  $f(x) \leq x$ .



### Knaster-Tarski Fixpoint Theorem

Why study lattices

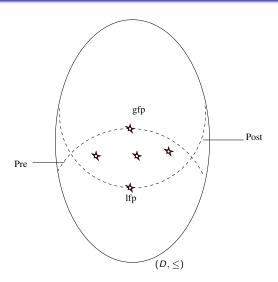
### Theorem (Knaster-Tarski)

Let (D, <) be a complete lattice, and  $f: D \to D$  a monotonic function on  $(D, \leq)$ . Then:

Lattices

- (a) f has at least one fixpoint.
- (b) f has a least fixpoint which coincides with the glb of the set of postfixpoints of f, and a greatest fixpoint which coincides with the lub of the prefixpoints of f.
- (c) The set of fixpoints P of f itself forms a complete lattice under <.

## Fixpoints of f

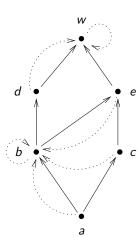


Stars denote fixpoints.

Consider the complete lattice and monotone function f below.

- Mark the pre-fixpoints with up-triangles (△).
- What is the lub of the pre-fixpoints?
- Mark post-fixpoints with down-triangles (♥).
- Fixpoints are the stars (♥).

Check that claims of K-T theorem hold here.



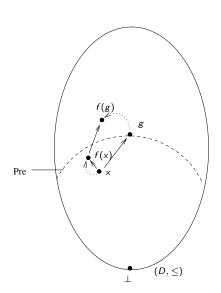
If you drop one of the conditions of the K-T theorem

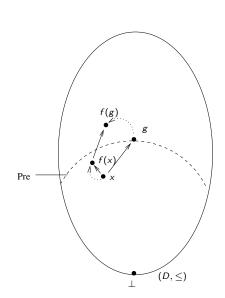
- Monotonicity of the function f
- Completeness of the lattice

does the conclusion of the theorem still hold?

#### Proof of Knaster-Tarski theorem

- (a) g = |Pre| is a fixpoint of f.
- **(b)** g is the greatest fixpoint of f.
- (c) Similarly  $I = \bigcap Post$  is the least fixpoint of f.
- (d) Let P be the set of fixpoints of f. Then  $(P, \leq)$  is a complete lattice.

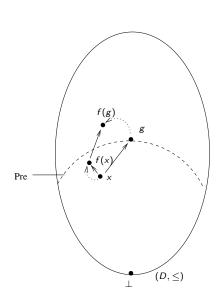




Why study lattices

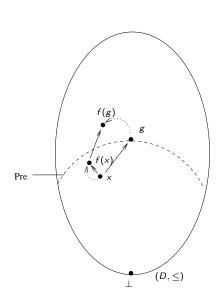
To show 
$$g = f(g)$$
:

•  $g \leq f(g)$ 



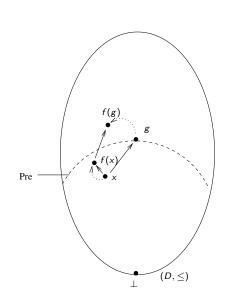
Why study lattices

- $g \leq f(g)$ 
  - Since f(g) can be seen to be u.b. of Pre.

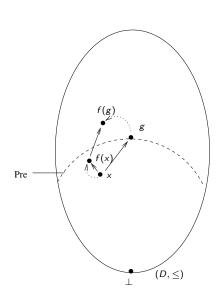


Why study lattices

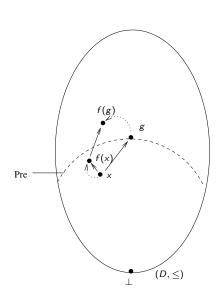
- $g \leq f(g)$ 
  - Since f(g) can be seen to be u.b. of Pre.
- $f(g) \leq g$



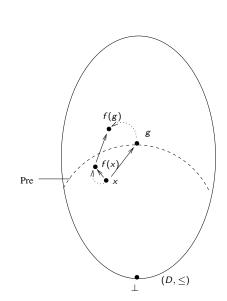
- $g \leq f(g)$ 
  - Since f(g) can be seen to be u.b. of Pre.
- $f(g) \leq g$ 
  - Since f(g) can be seen to be prefixpoint of f.



g is the greatest fixpoint of f.



g is the greatest fixpoint of f. Any other fixpoint is also a pre-fixpoint of f, and hence g must dominate it.



# Exercise: intervals and closure

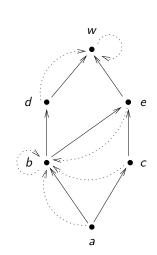
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Let  $(D, \leq)$  be a partial order, and let  $f: D \to D$ .

- Let  $a, b \in D$ . The interval from a to b, written [a, b], is the set  $\{d \mid a \le d \le b\}$ .
- A subset  $X \subseteq D$  is said to be closed wrt to f, if  $f(x) \in X$  for each  $x \in X$ .

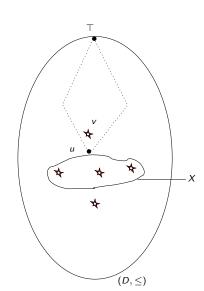
Exercise: Let  $(D, \leq)$  be a partial order with a  $\top$  element, and let  $f: D \to D$  be a monotone function on D.

- Show that an interval in *D* need *not* be closed wrt *f*.
- 2 Let u ∈ D be the lub of a set X of fixpoints of f. Prove that the interval [u, T] is closed wrt f.



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- $(P, \leq)$  is also a partial order.
- $(P, \leq)$  is a complete lattice
  - Let  $X \subseteq P$ . We show there is an lub of X in  $(P, \leq)$ .
    - Let u be lub of X in  $(D, \leq)$ .
    - Consider "interval"  $I = [u, \top] = \{x \in D \mid u \le x\}.$ ( $I, \le$ ) is also a complete lattice.
    - $f: I \to I$  as well, and monotonic on  $(I, \leq)$ .
    - Hence by part (a) f has a least fixpoint in I, say v.
    - Argue that v is the lub of X in (P, ≤).



## Chains in partial orders

Why study lattices

- A chain in a partial order  $(D, \leq)$  is a totally ordered subset of D.
- An ascending chain is an infinite sequence of elements of D of the form:

$$d_0 \leq d_1 \leq d_2 \leq \cdots$$
.

- An ascending chain  $\langle d_i \rangle$  is eventually stable if there exists  $n_0$ such that  $d_i = d_{n_0}$  for each  $i \geq n_0$ .
- $(D, \leq)$  has finite height if each chain in it is finite.
- $(D, \leq)$  has bounded height if there exists k such that each chain in D has height at most k (i.e. number of elements in each chain is at most k+1.)

• *f* is monotone:

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$$x \le y \implies f(x) \le f(y).$$

• *f* is distributive:

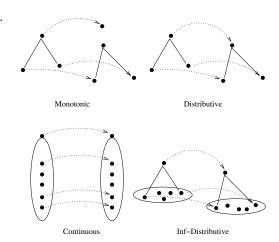
$$f(x \sqcup y) = f(x) \sqcup f(y).$$

• f is continuous: For any asc chain X:

$$f(\bigsqcup X) = \bigsqcup (f(X)).$$

• f is inf distributive: For any  $X \subseteq D$ :

$$f(| | X) = | | (f(X)).$$



## Characterising LFP of a function f in a complete lattice $(D, \leq)$

- If f is monotonic
  - Then

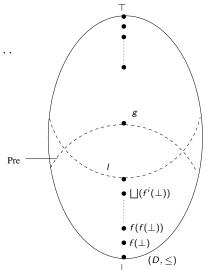
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$$\perp \leq f(\perp) \leq f^2(\perp) \leq f^3(\perp) \leq \cdots$$

is an ascending chain.

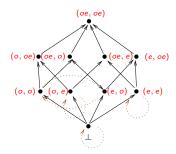
- If this chain stabilizes the stable value will be lfp(f).
- If (D, <) has finite height</li> then we can compute lfp(f) by finding the stable value of this chain.
- If f is continuous then

$$Ifp(f) = \bigsqcup_{i>0} (f^i(\bot)).$$



Why study lattices

Consider the statement "p := p + q". Show the transfer function of this statement in the parity lattice below.



Is it monotonic/distributive/continuous?