

Lecture 10

CS 170

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Horn Formulas

x_1, x_2, \dots, x_m are n boolean variables (can be TRUE/FALSE)

Input: C_1, \dots, C_m s.t. $\#i \in [m]$ C_i is either $(\bar{x}_1 \vee \bar{x}_2 \dots)$ "pure negative" or $(\bar{x}_1 \vee \bar{x}_2 \dots \vee x)$ "implication"

Goal: Is $F = C_1 \wedge C_2 \dots C_m$ satisfiable?

$(x_1 \wedge x_2 \wedge \dots) \Rightarrow x$
Special case $(\Rightarrow x)$ (x)

Example:

$(w \wedge y \wedge z) \Rightarrow x$	$(\bar{w} \vee \bar{z} \vee \bar{y})$
$(x \wedge z) \Rightarrow w$	(\bar{z})
$x \Rightarrow y$	
$\Rightarrow x$	
$(x \wedge y) \Rightarrow w$	

Greedy Approach

- Set all variables to FALSE
- Set a variable to TRUE only if absolutely necessary.

Horn(F)

Set x_1, \dots, x_n to FALSE
While \exists an unsatisfied implication clause C
set the right-hand variable in C
to TRUE

if all pure negative clauses are satisfied
then return the assignment x_1, \dots, x_n
else return "F is unsatisfiable!"

Run-time: $O(|F| \times n)$
size of the formula

Local to Global

Lemma: If Horn(F) sets a variable $x = \text{TRUE}$
then this is TRUE in all satisfying assignments
of F.

Proof: $k=1 \rightarrow \Rightarrow x \rightarrow$ then any satisfying assignment
must set x to TRUE

$k \rightarrow k+1$ $x_{i_1}, x_{i_2}, \dots, x_{i_n} \rightarrow$ set to TRUE
 $x_{i_{k+1}}$ is new variable being set to TRUE.

$(x_{i_1} \wedge x_{i_2} \wedge \dots \wedge x_{i_n}) \Rightarrow x_{i_{k+1}}$ \square
or a sub-set of them

Thm: Horn(F) output is correct.

Proof Case I: Horn(F) outputs an assignment. ✓

Case II: Horn(F) outputs "F is unsatisfiable."

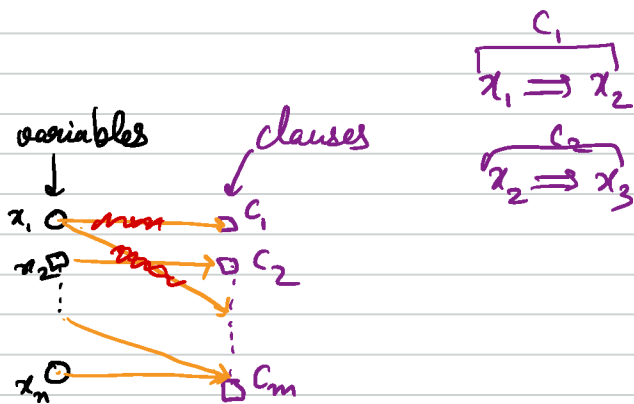
only sets those variables to be TRUE that are TRUE in all satisfying assignments.

↳ pure-negative clauses are unsatisfied

⇓
F has no satisfying assignment.

Can we improve the running time?

Idea: Don't need to recompute F every time a variable is set to TRUE.



Algorithm.

$Q = \emptyset$ // variables set to TRUE are pushed to the queue

Find nodes of indegree 0 and add them to Q

also set the variable to TRUE

while (Q is non-empty)

- Remove x from Q

- Delete edges out of x

- For any node with indegree 0 add it to Q and set variable to TRUE

- 1) right hand side variable in clause with indegree 0 need to set to TRUE
- 2) when a variable is set to TRUE all outgoing edges (from it) can be removed.

Run-time: $O(|F| + n)$

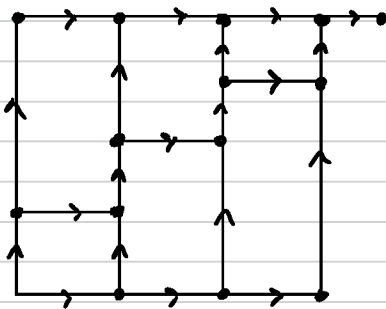
Dynamic Programming

versatile & powerful algorithm design tool.

Longest Path in a DAG.

Input: $G = (V, E)$ a DAG

Goal: Find l the length of the longest path in G .

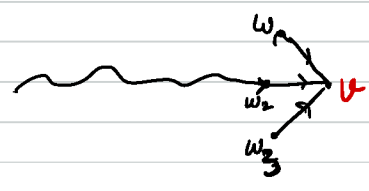


Subproblem:

$L(v)$ = length of the longest path ending in v

$$l = \max_{v \in V} L(v)$$

Connecting the subproblems - Recurrence relation

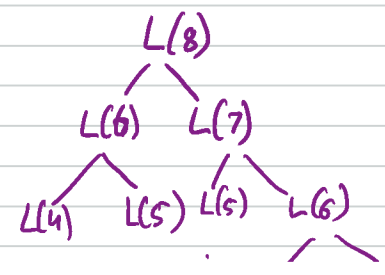
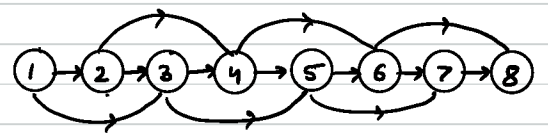


$$L(v) = \begin{cases} 1 + \max_{(w,v) \in E} L(w) \\ 0 \end{cases}$$

if v has no incoming edges.

Recursive Algorithm

$L(v)$ If no incoming edge to v then return 0 else $1 + \max_{(w,v) \in E} L(w)$



Avoiding repeat computation (memoization - don't recompute if computed once)

Input $G=(V,E)$

- Sort in topological order - i is the i^{th} vertex in topological ordering s.t. $\forall (i,j) \in E \quad j > i$
- For all i , set $L(i) = 0$
- For all $i=1 \dots n$, set $L(i) = 1 + \max_{(j,i) \in E} L(j)$
 $\hookrightarrow 0$ if no incoming edges.

Run-time: $O(|V| + |E|)$

Longest Increasing Subsequence.

4 → 5 6 6 9

4 → 2 3 6 9

5 2 8 6 3 6 9 7

⋮

⋮

2 ↔ 2 9

Input: a_1, a_2, \dots, a_n

Goal: l = length of the longest increasing subsequence.

Reduces to finding longest path in a graph.

$$G = (V, E)$$

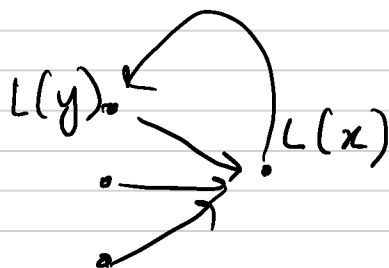
$$V = \{1, \dots, n\}$$

$$E = \{(i, j) \mid i < j \text{ \& } a_i \leq a_j\}$$

Approach

- 1) Define appropriate **subproblems**
- 2) Write a **recurrence relation**
- 3) Determine **order** of computation.

↳ induces a DAG structure



Edit Distance

Input : $x[1 \dots n]$ & $y[1 \dots m]$

Goal : Find minimum # of keystrokes needed to edit x to y

↓
 1 keystroke is needed to add a character
remove a character
substitute a character

Example #

CAP → CUP → 1

AAPL → APPLE → 2

SUNNY → SNOWY

SUNNY $\xrightarrow[\text{u}]{\text{del}}$ SNNY $\xrightarrow[\text{N} \rightarrow \text{O}]{\text{sub}}$ SNO_Y $\xrightarrow[\text{W}]{\text{insert}}$ SNOWY

How to visualize?

DISK →

D	S	I	K
N	N	␣	Y
-	O	W	Y

S	U	N	N	Y
S	U	N	N	Y

 $\xrightarrow[\text{u}]{\text{del}}$

S	U	N	N	Y
S	-	N	N	Y

 $\xrightarrow[\text{N} \rightarrow \text{O}]{\text{sub}}$

S	U	N	N	Y
S	-	N	O	Y

 $\xrightarrow[\text{W}]{\text{insert}}$

S	U	N	N	␣	Y
S	-	N	O	W	Y

S	U	N	N	Y	␣	␣	␣	␣	␣
␣	␣	␣	␣	␣	S	N	O	W	Y