

CS2 9/17/9 Last lecture

①

9/8 3/3 Backtracking search:

- one var at a time
- backtrack when no legal vals left

Key functions of alg:

var \leftarrow selectUnassignedVar()

foreach val in OrderDomainVals()

Heuristics:

- Minimum Remaining values (MRV)
 - choose var with fewest legal values
- Degree Heuristic
 - choose var those most constrains others
 - \Rightarrow max reduction in tree size

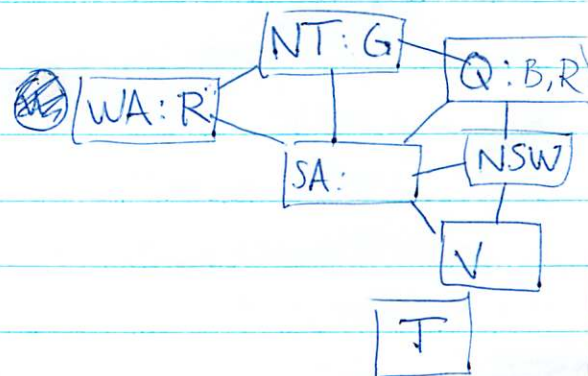
selecting
variables

- Least constraining value

- choose value that rules out fewest choices for neighbors

How?

check graph & domain vals



\rightarrow (*) Forward Checking

CS2 (2)
CST (9)

What about the order of the values?

Eg. WA = R NT = G Q = ? B? No. then SA is {}

Choose: Least constraining value
idea: it is most like to yield a soln.

⊗ Can we do better?

want to reduce search space as much as possible.

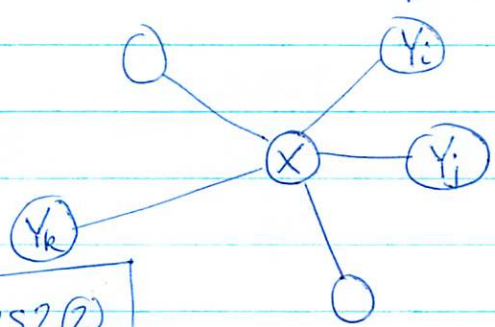
What if we did more intelligent checking?

~~Backtracking~~

Forward checking:

Idea: whenever a var ~~X~~ X is assigned,
look at each unassigned var Y that X is connected to

and delete vals from Y's domain, that are inconsistent with X.



→ ⊗ on CS2 (2)

	WA	NT	Q	NSW	V	SA	T
Initial domain	RGB	RGB	RGB	RGB	RGB	RGB	RGB
WA = R	Ⓡ	× GB	inconsistent	consistent	consistent	× GB	"
Q = G	Ⓡ	× B	Ⓢ	R × B	"	× B	"
V = B	Ⓡ	B	G	R ×	Ⓢ	×	"

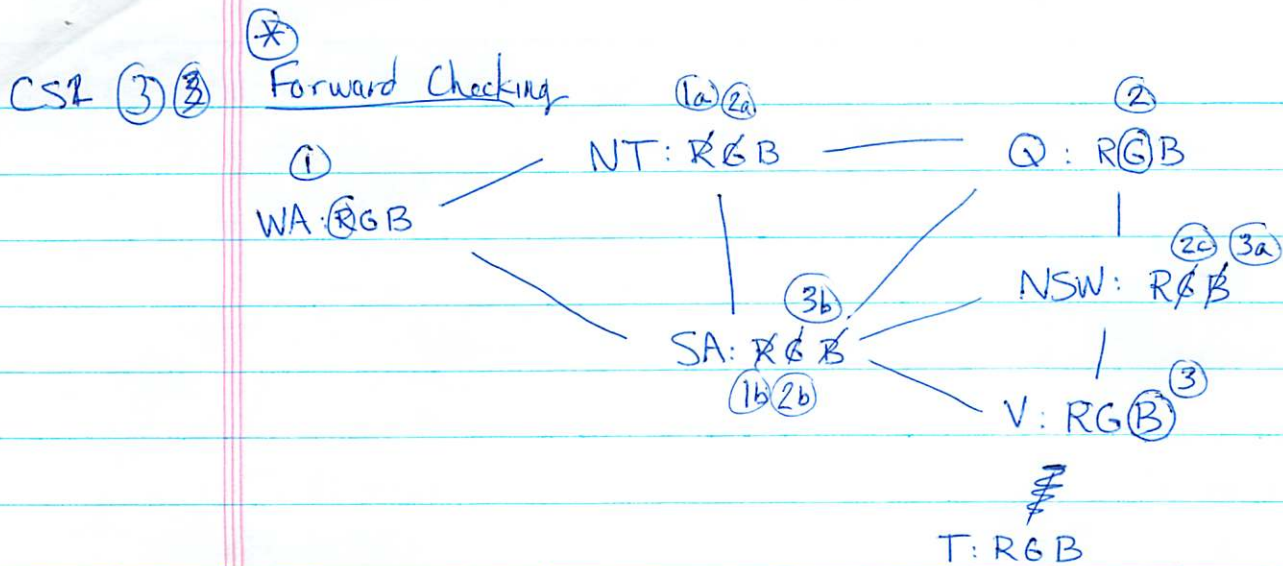
delete B
domain empty
⇒ early detection

make consistent by deleting B from domain of NSW

eliminated branching (big propagating information from WA → Q)

no soln ⇒ back track

FC + MRV gives 5-30x speed up



[Note]: MRV heuristic would choose NT or SA after (2) and detect failure sooner than choosing V.

At step (3b) SA domain is empty \Rightarrow back track immediately.

FC+MRV gives 5-30x speed up

~~USANIN~~

Can we do better than FC?

CSI 4 6

Constraint propagation (CP)

FC computes domain of each variable independently at start
~~propagates the constraints~~
 but doesn't detect all inconsistencies.

@ step 2

Last example A NT & SA can't both be B.

What if we propagated further by looking more ahead?
 (Yeah, but would that be as slow as doing search?)

CP ~~is repeatedly~~ repeatedly enforces constraints

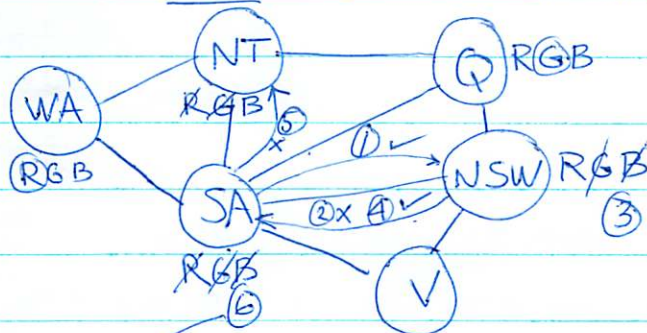
Simplest form: arc consistency

fast method of CP. Much stronger than FC.

Consider ~~state~~ state of Domains during FC

$WA=R \ \& \ Q=G \Rightarrow$ both ~~NT~~ NT & SA are forced B, which is inconsistent.

Arc is a directed arc in constraint graph.



$SA \rightarrow NSW$
 Arc is consistent if
~~for~~ for every value x of SA
 there is same val y of NSW
 that is consistent with x

~~consistent~~ consistent $\forall x$ of $X \exists$ some allowed y of Y .

$X \rightarrow Y$

~~at~~ @ step 6 SA is empty \Rightarrow back track

CS25

Arc consistency is applied repeatedly until no more consistencies remain.

Why? Any deletion could introduce new inconsistency

AC-3 alg. uses queue to keep track of arcs that need checking
Seems like a lot of work...

What is (time) complexity?

- binary CSP has at most $O(n^2)$ arcs
- inserted at most d times (only has d values to delete)
- \Rightarrow checking an arc is $O(d^2)$ (potentially every pair in domain must be checked)
- \Rightarrow total cost $O(n^2 d^3)$
- much ^{more} expensive than FC, but usually worth it

More general forms of and stronger forms of constraint propagation:

k-consistency

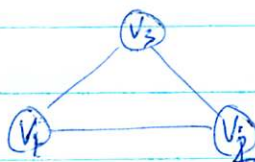
CSP is k-consistent if

- for any set of $k-1$ vars
- and for any consistent assignment of those vars
- a consistent value can be assigned to the k th var.

$k=1$ 1-consistency "node consistency"

$k=2$ 2-consistency same as arc consistency

$k=3$ 3-consistency "path consistency"



any pair can be extended to a third

Trade-off between extra cost of stronger checks & reduction in branching factor

CS2 ⑥ cryptarithmic problem

$$\begin{array}{r} \text{TWO} \\ + \text{TWO} \\ \hline \text{FOUR} \end{array}$$

Obviously there are constraints
All digits are different.

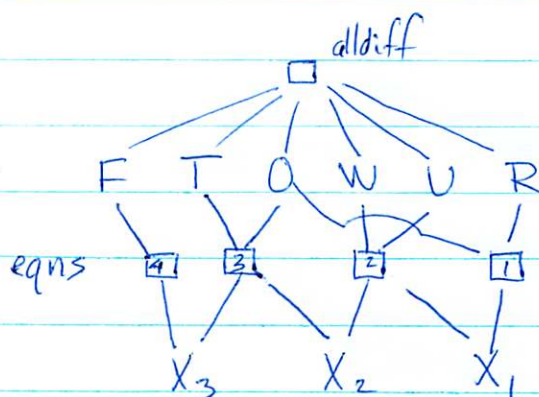
[?] How do we specify the problem?

Carry out standard arithmetic.

- ① $O + O = R + 10 \cdot X_1$ → we don't know if $O + O \geq 10$
so add auxiliary vars to represent carry over
- ② $X_1 + W + W = U + 10 \cdot X_2$
- ③ $X_2 + T + T = O + 10 \cdot X_3$
- ④ ~~eqs~~ $X_3 = F$

Constraint hypergraph:

~~eqs~~



CS2 (6)

Example:
Mine sweeper

0	0	1	V_1		
0	0	1	V_2		
0	0	1	V_3		
1	1	2	V_4		
V_8	V_7	V_6	V_5		

Which squares have bomb?

- squares with #'s don't
- other squares might
- # is how many bombs in neighboring squares

How do we solve this as a CSP?

[?] What do we want to know? \rightarrow values of blank squares

[?] What should we choose as the representation?

All blanks? No

Just ones on border, or who have non-blank neighbors

[2] What's the domain?

$$D = \{\text{space, bomb}\} = \{S, B\}$$

[?] What are the constraints? What values can vars have? : $V_1 + V_2 = 1$

~~neighbors (4) = 4~~ $V_1 + V_2 + V_3 = 1$

$$C = \{(V_1, V_2) : \{(B, S), (S, B)\}\}$$

$$(V_1, V_2, V_3) : \{(B, S, S), (S, B, S), (S, S, B)\}$$

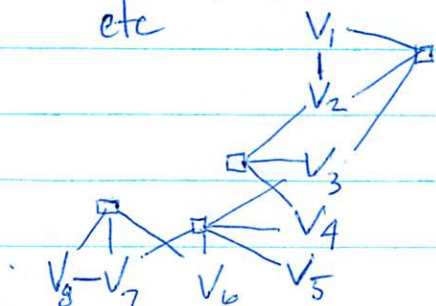
etc

~~neighbors (3) = 3~~ $V_2 + V_3 + V_4 = 1$

$V_3 + V_4 + V_5 + V_6 + V_7 = 2$

$V_8 + V_7 + V_6 = 1$

$V_7 + V_8 = 1$



CS271 Local Search for CSPs

HC, SA typically work with "complete states": all vars assigned

To apply to CSPs

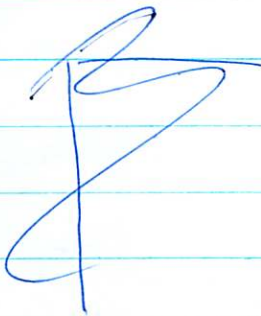
- allow states with ^{unsatisfied} ~~unsatisfied~~ constraints
- operators reassign var values

Variable selection:

- randomly select any conflicted var

Value selection (min. conflicts heuristic)

- choose value that violates fewest constraints[†]
i.e. hill climb with $h(n) = \# \text{violated constraints}$



[slide]