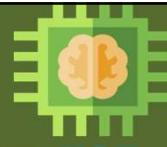


Elective Course

Course Code: CS4103

Autumn 2025-26

**Lecture #15**

Artificial Intelligence for Data Science

Week-4: PROBLEM SOLVING BY SEARCH

Adversarial Search Problem--- Games [Practice Example]

CONSTRAINT SATISFACTION PROBLEM (CSP)

Course Instructor:**Dr. Monidipa Das**

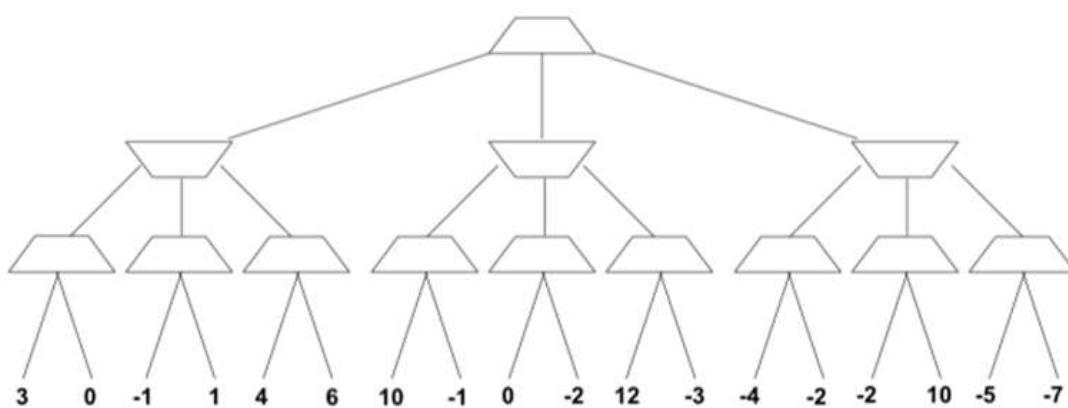
Assistant Professor

Department of Computational and Data Sciences

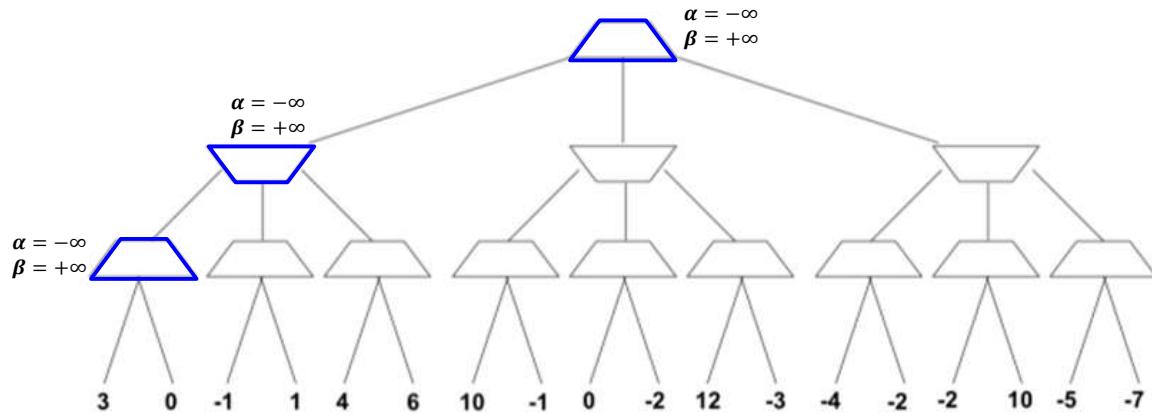
Indian Institute of Science Education and Research Kolkata, India 741246



Practice Problem

Which leaf nodes are never visited due to pruning?

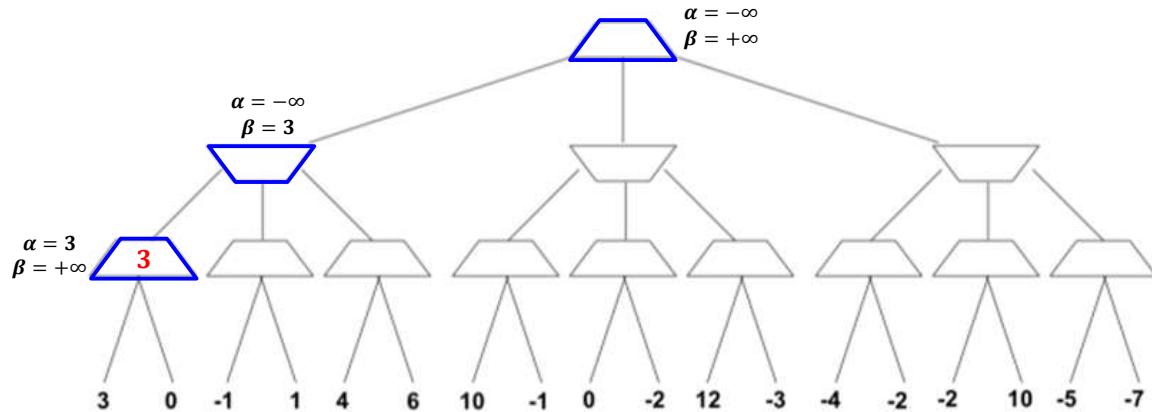
Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

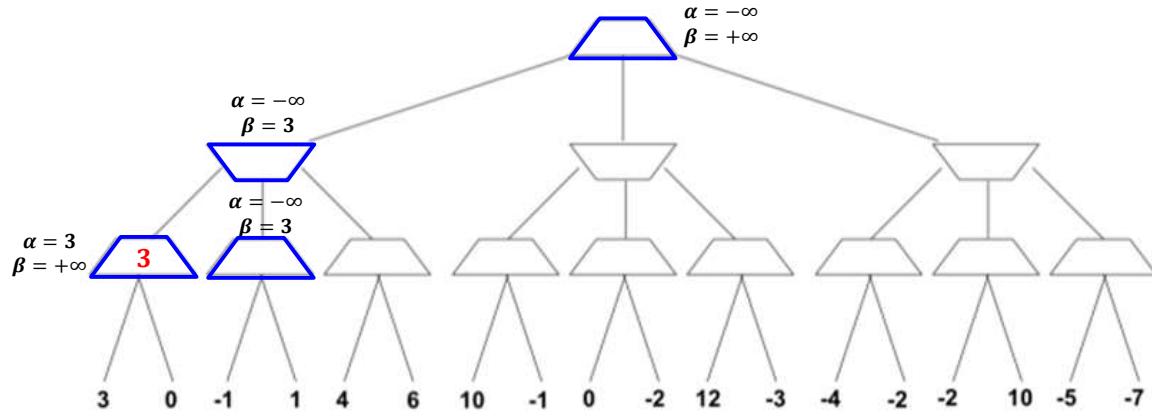


Solution



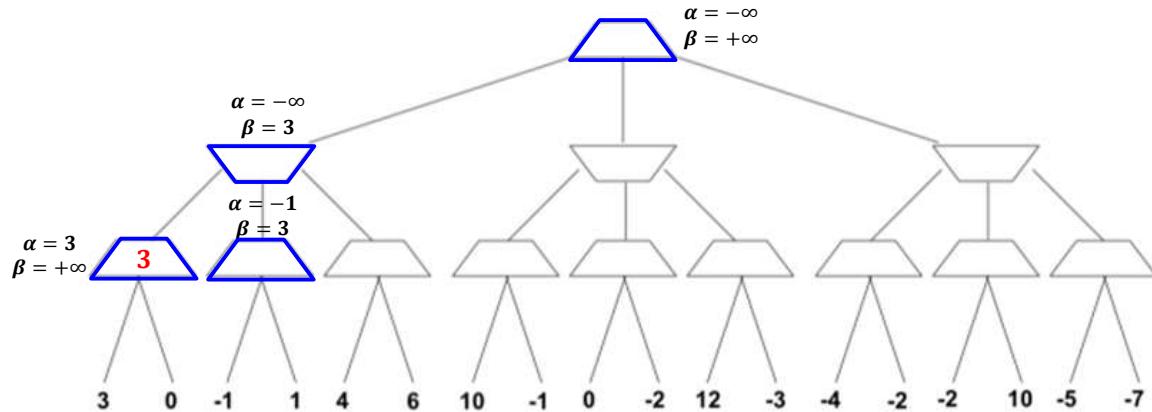
Dr. Monidipa Das, Department of CDS, IISER Kolkata

Solution



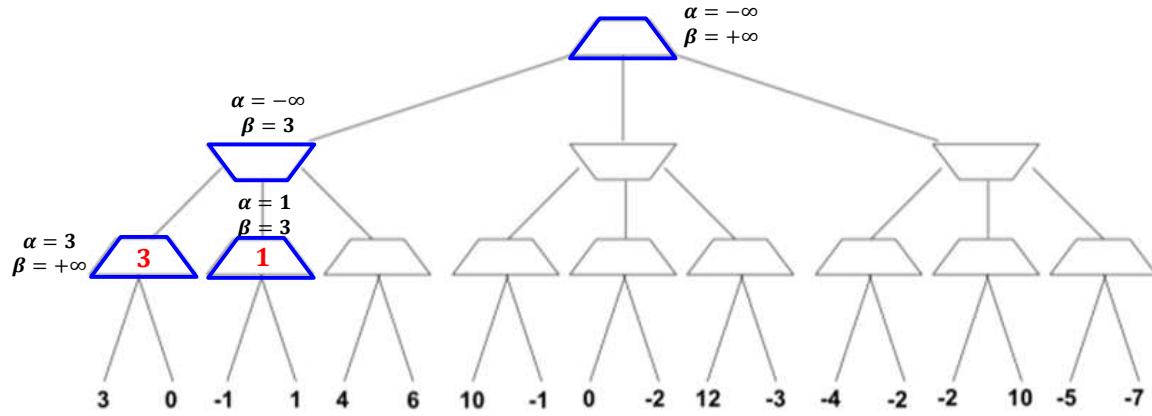
Dr. Monidipa Das, Department of CDS, IISER Kolkata

Solution



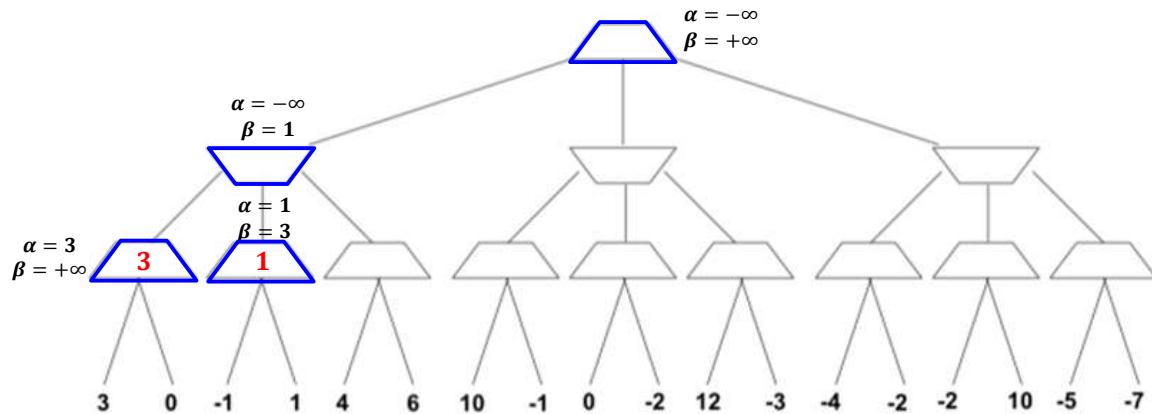
Dr. Monidipa Das, Department of CDS, IISER Kolkata

Solution



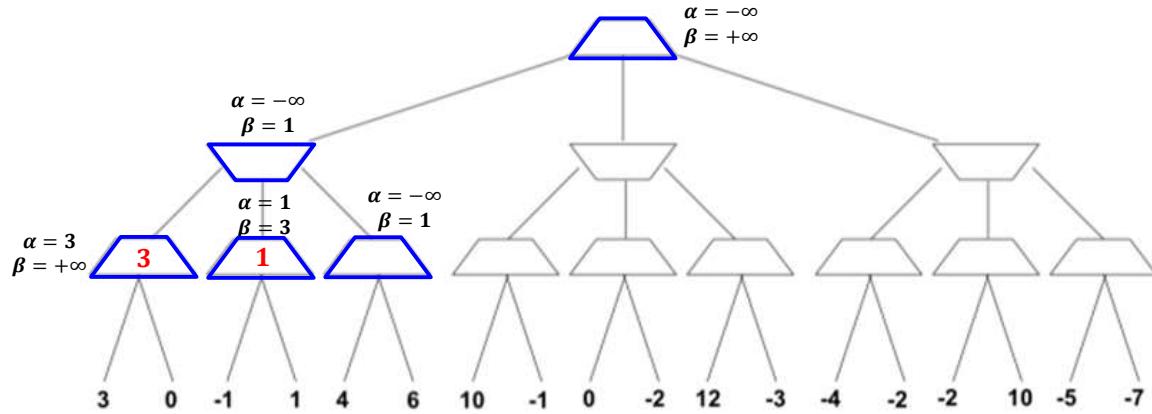
Dr. Monidipa Das, Department of CDS, IISER Kolkata

Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

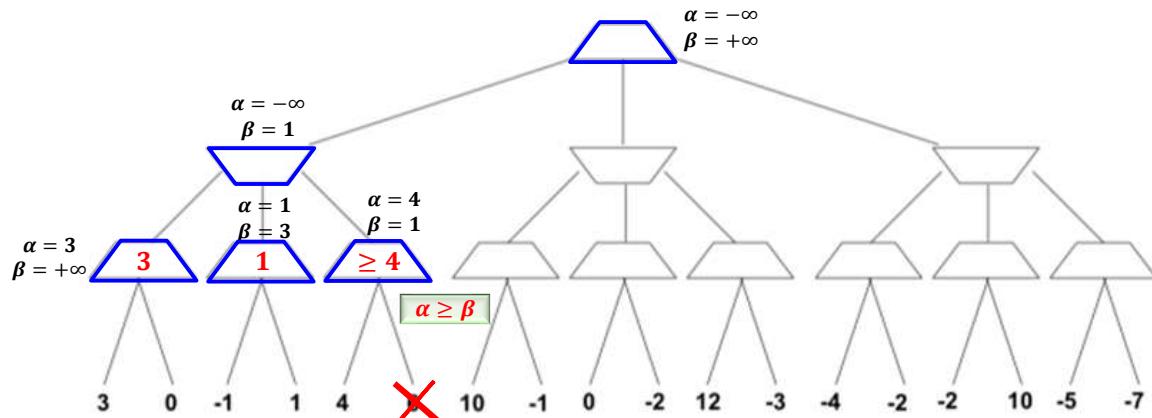
Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata



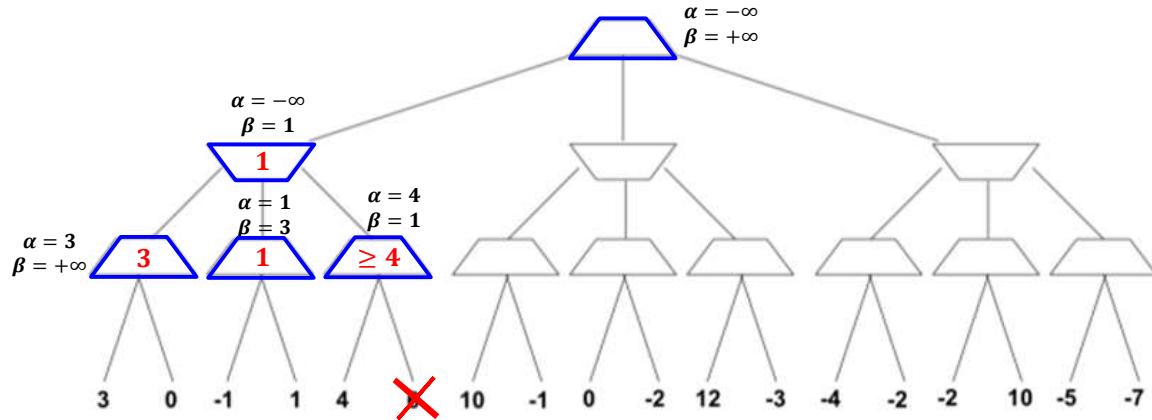
Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

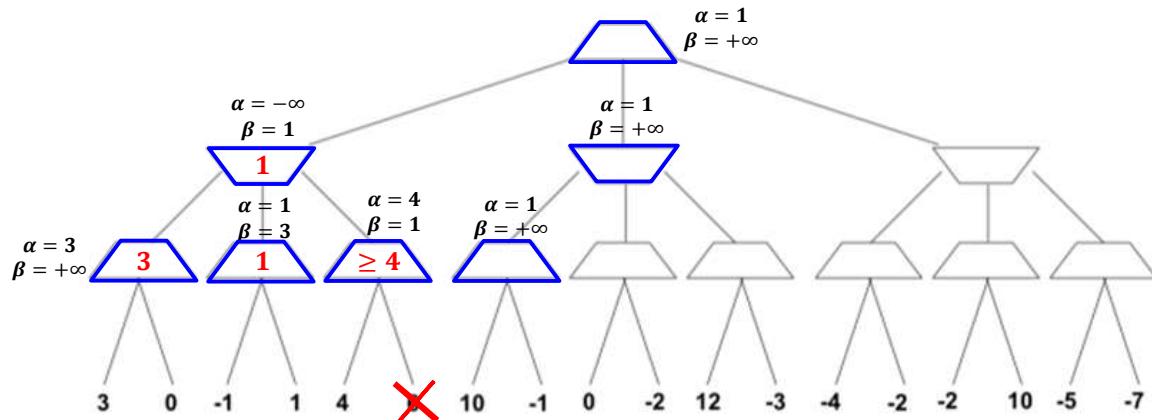
Solution

11



Dr. Monidipa Das, Department of CDS, IISER Kolkata

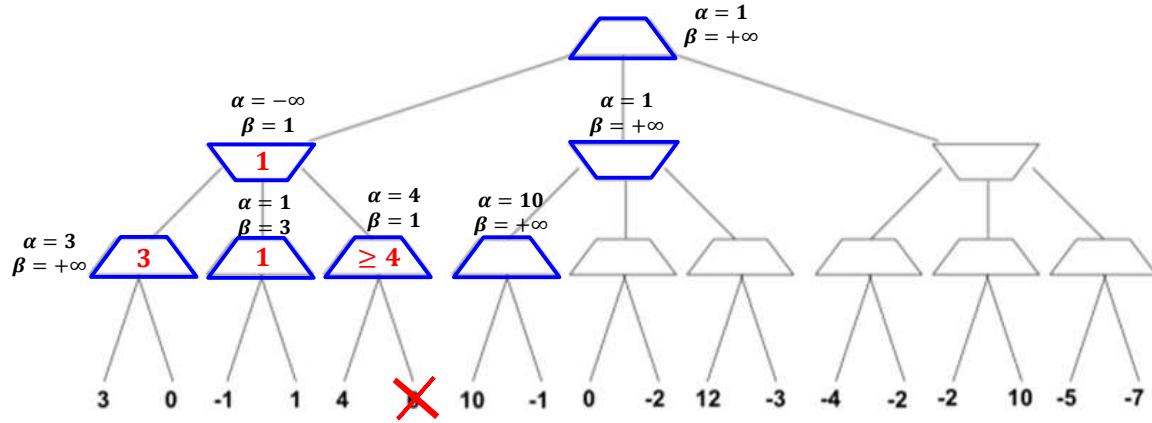
12



Dr. Monidipa Das, Department of CDS, IISER Kolkata

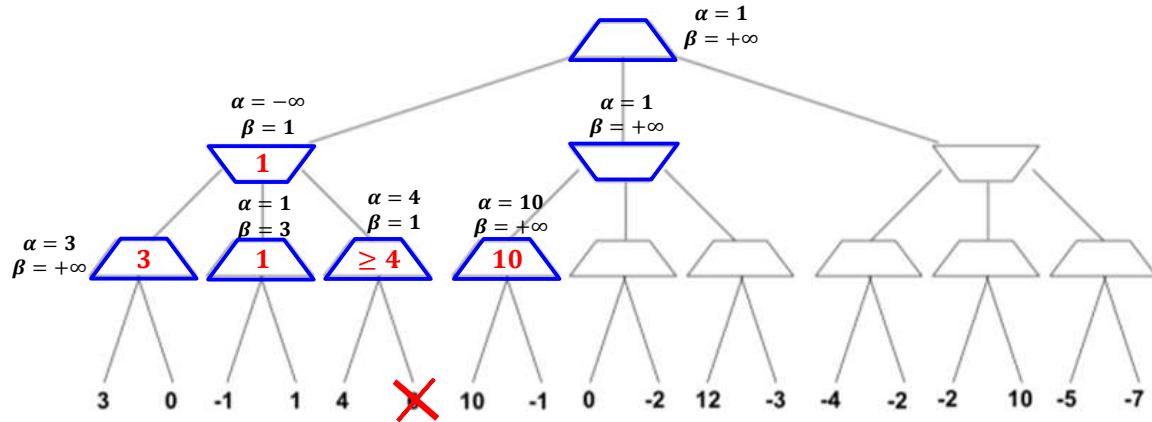
Solution

13



Dr. Monidipa Das, Department of CDS, IISER Kolkata

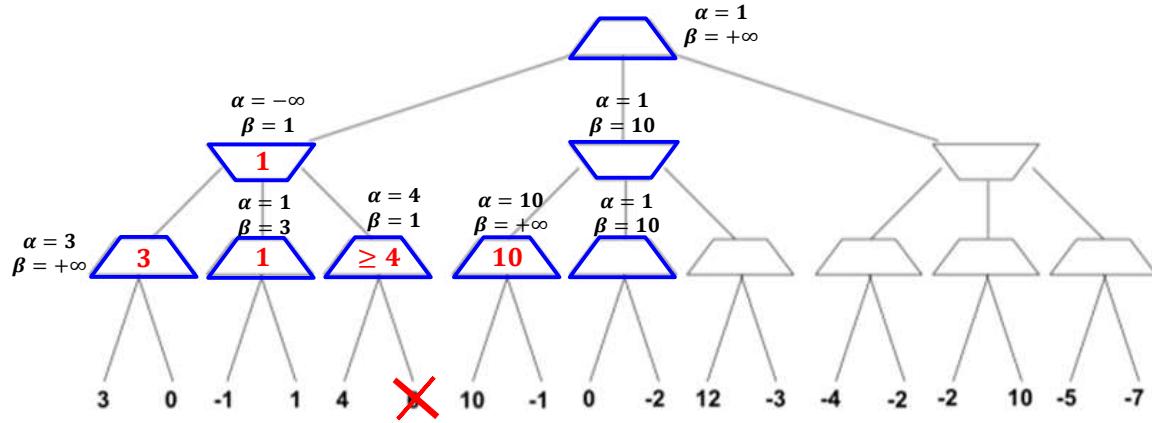
14



Dr. Monidipa Das, Department of CDS, IISER Kolkata

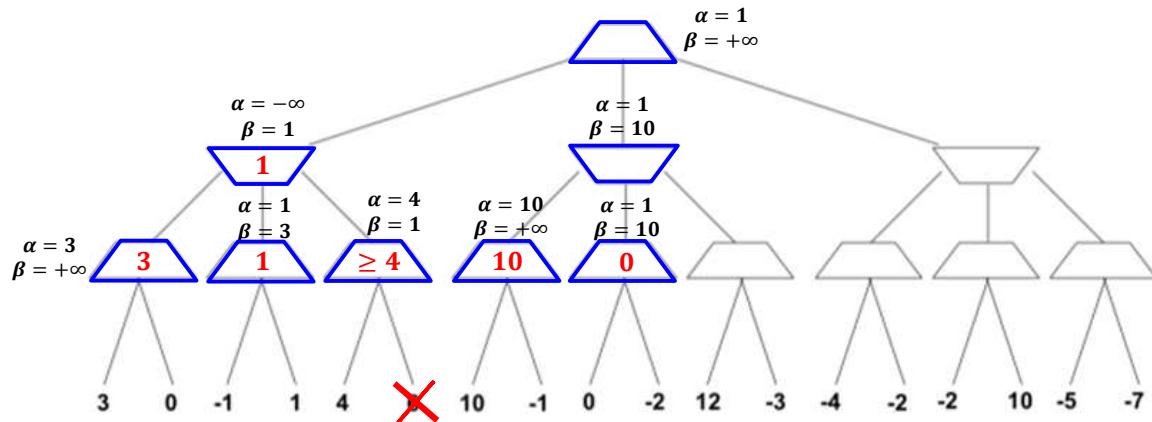
Solution

15



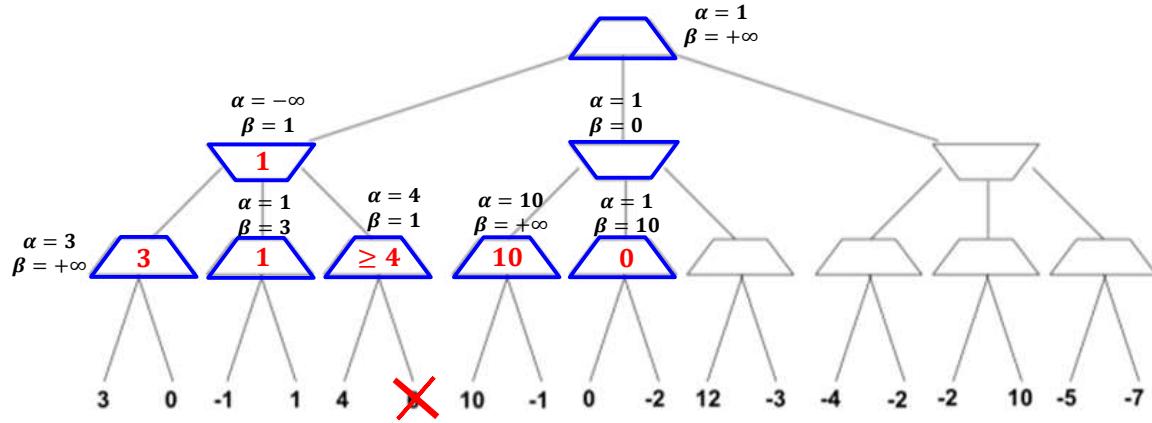
Dr. Monidipa Das, Department of CDS, IISER Kolkata

16



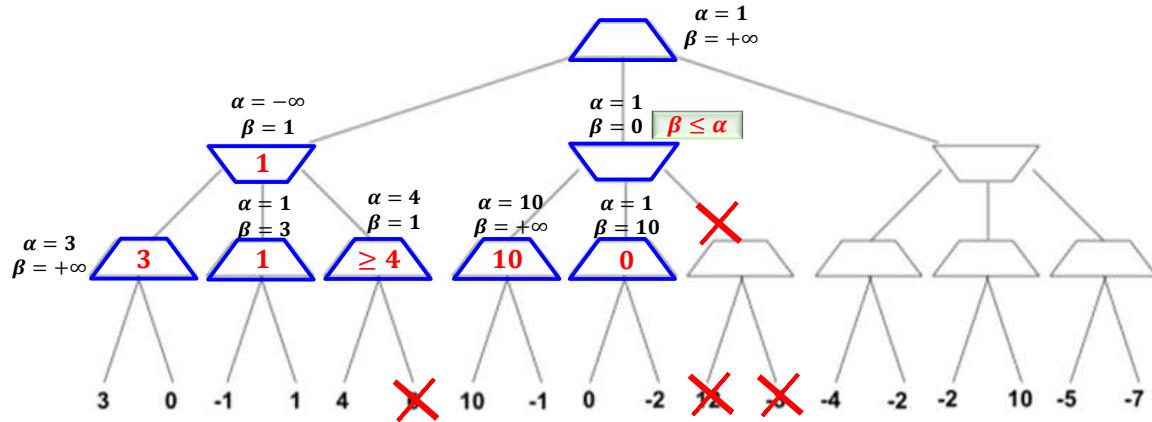
Dr. Monidipa Das, Department of CDS, IISER Kolkata

Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

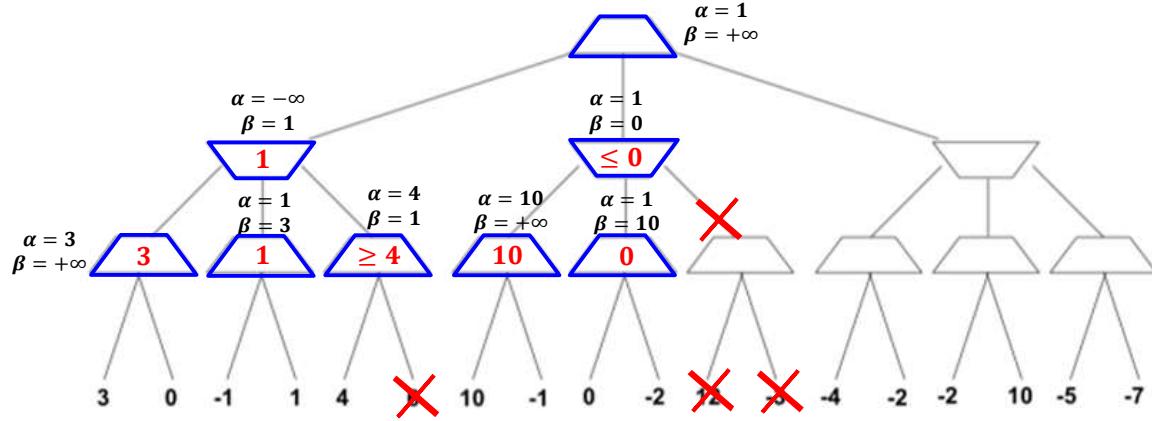
Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

Solution

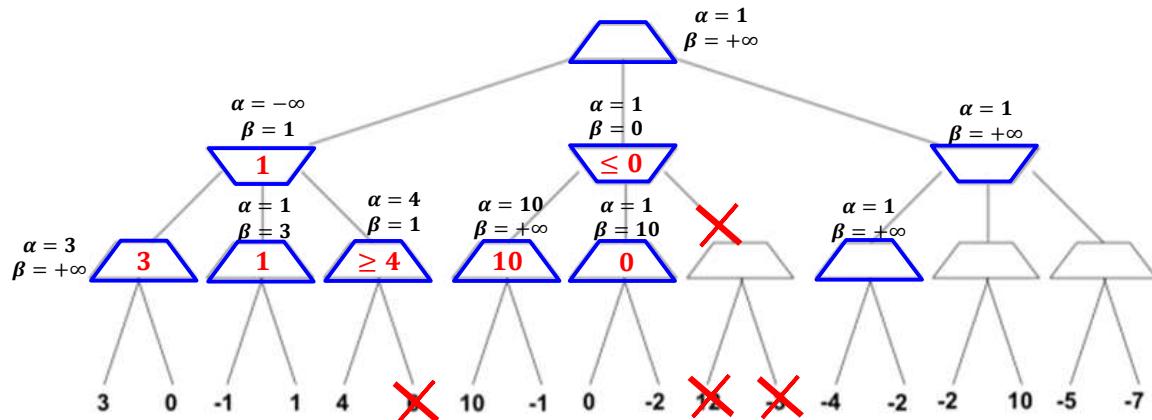
19



Dr. Monidipa Das, Department of CDS, IISER Kolkata

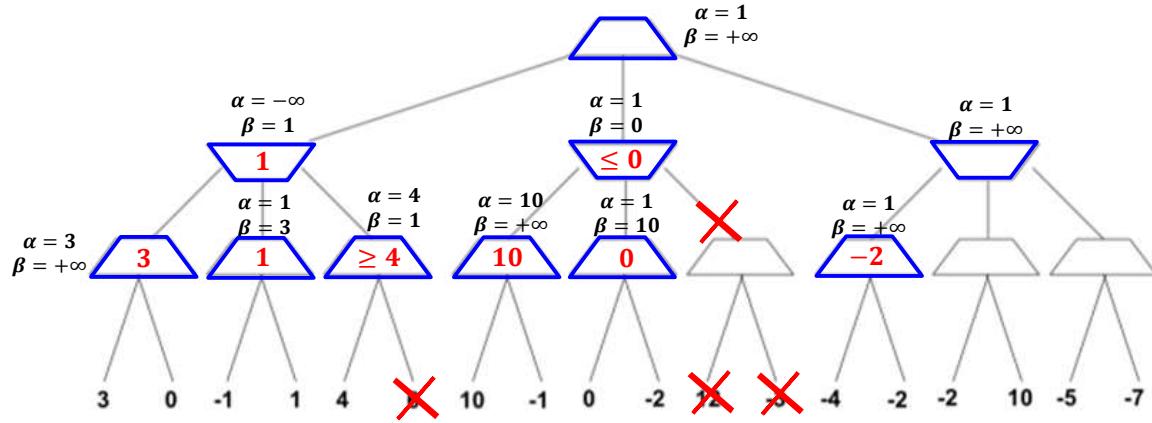
Solution

20



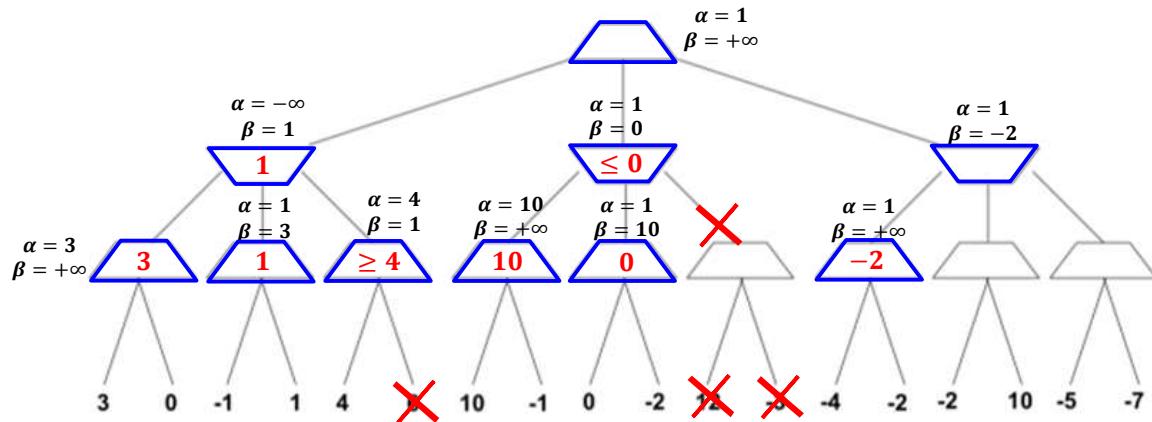
Dr. Monidipa Das, Department of CDS, IISER Kolkata

Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

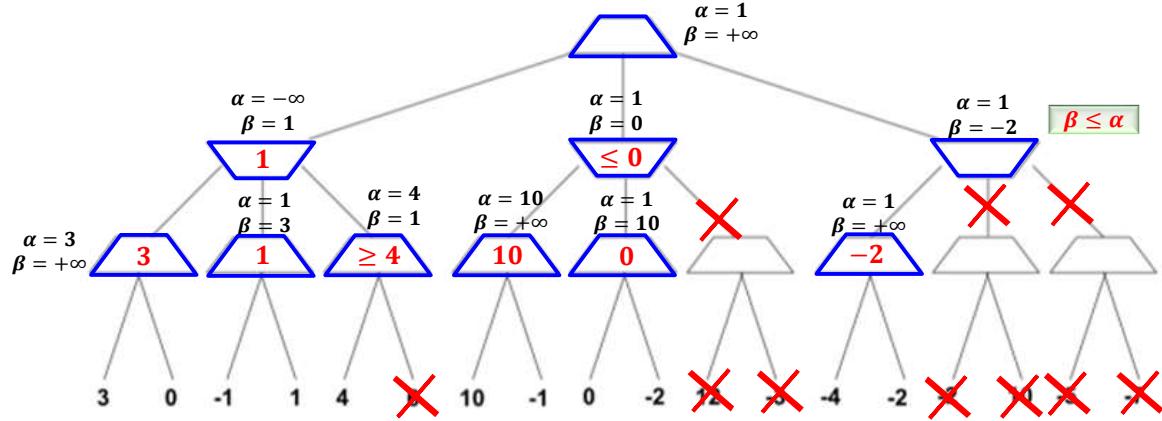
Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

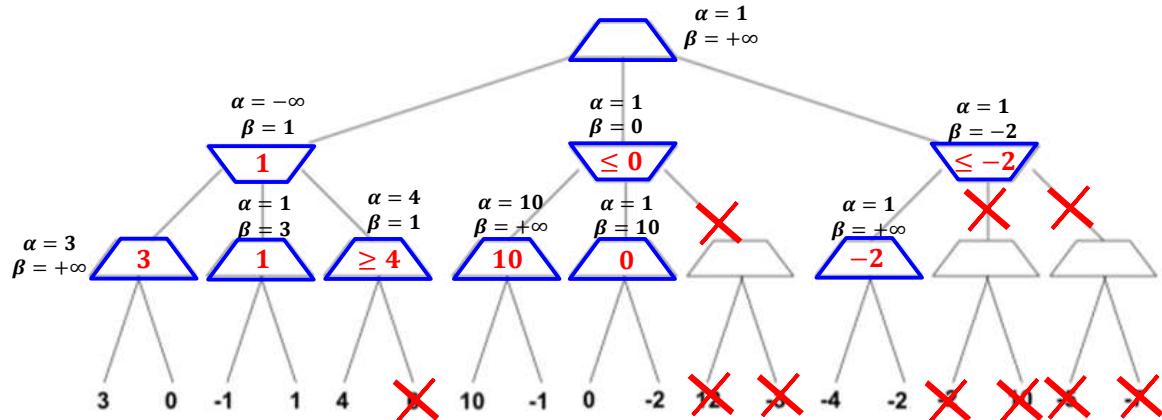
Solution

23



Dr. Monidipa Das, Department of CDS, IISER Kolkata

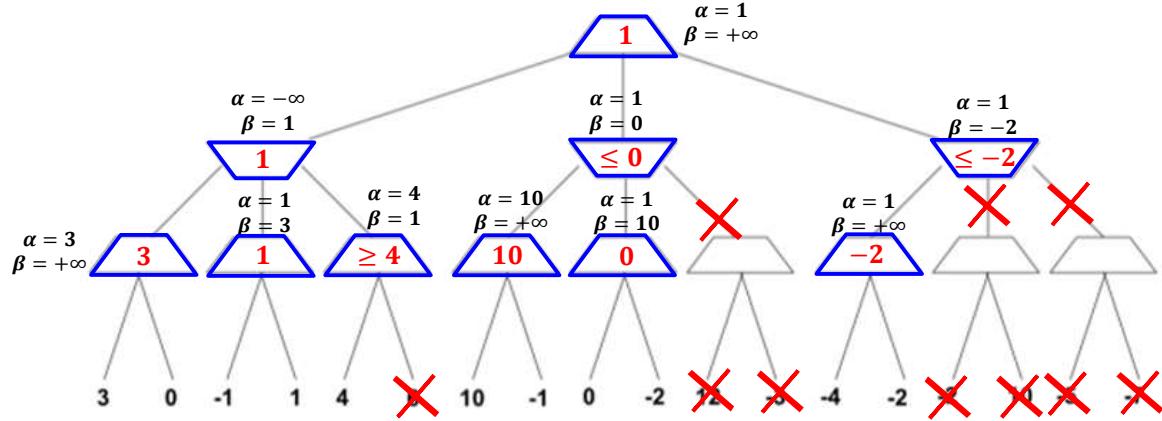
24



Dr. Monidipa Das, Department of CDS, IISER Kolkata

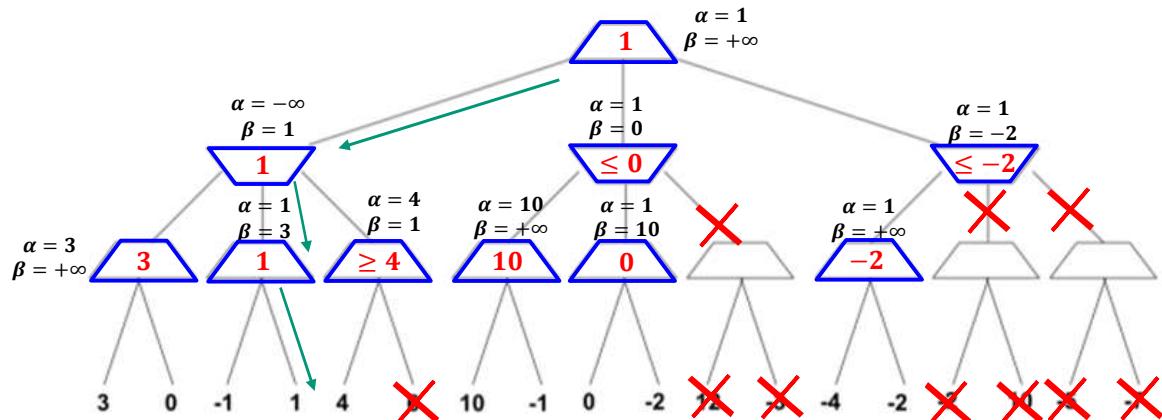
Solution

25



Dr. Monidipa Das, Department of CDS, IISER Kolkata

26



Dr. Monidipa Das, Department of CDS, IISER Kolkata



Constraint Satisfaction Problems (CSPs)

Slides adapted from Prof. Tuomas Sandholm
Carnegie Mellon University, Computer Science Department

Dr. Monidipa Das, Department of CDS, IISER Kolkata



Course Structure/Syllabus

Syllabus	
Timeline	Topics to be Covered
Week 1	INTRODUCTION TO AI: Artificial Intelligence Introduction, Brief History, Intelligent Agents, Types of agents <i>Python Primer for AI</i>
Week 2-4	PROBLEM SOLVING BY SEARCH: Problem formulation, Concept of state space search Introduction to Uninformed Search Techniques: <i>Breadth First Search, Depth First Search, Depth First Search with Iterative Deepening, Uniform Cost Search</i> Introduction to Informed/Heuristic search techniques: <i>Greedy Best First Search, A* search, Hill Climbing search, Simulated Annealing search</i> Introduction to GA, GA Operations: Selection, Crossover, Mutation Solving N-Queen Problem using GA <div style="border: 1px solid red; padding: 5px; margin-left: 10px;"> Solving N-Queen Problem using GA </div> <div style="margin-left: 10px;"> Adversarial Search: <i>Minimax algorithm, Alpha-Beta Pruning</i> <i>Building a bot to play tic-tac-toe/Building 8-puzzle solver</i> </div> <div style="float: right; margin-top: -20px;"> To be discussed in the first two lectures after the mid-semester exam </div>
Week 5	CONSTRAINT SATISFACTION PROBLEM (CSP): Introduction to CSP, Constraint Graph, Binary and Higher order CSP, Backtracking Search, MRV heuristic, Degree heuristic, Least Constraining-value heuristic, Forward Checking, Arc Consistency, Min-Conflicts Algorithm <i>Solving map coloring problem, Solving puzzle</i>

Dr. Monidipa Das, Department of CDS, IISER Kolkata

Constraint satisfaction problems (CSPs)



- Standard search problem:
 - **state** is a "black box" – any data structure that supports successor function and goal test
- CSP:
 - **state** is defined by **variables** X_i with **values** from **domain** D_i
 - A set of **constraints** specifying allowable combinations of values for subsets of variables
- Allows useful **general-purpose** algorithms with **more power** than standard search algorithms

Dr. Monidipa Das, Department of CDS, IISER Kolkata

Example: Map-Coloring

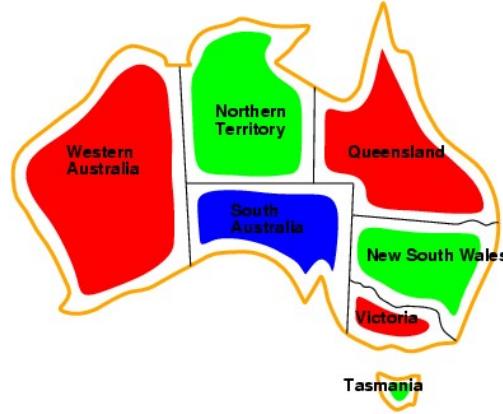


- **Variables:** WA, NT, Q, NSW, V, SA, T
- **Domains:** $D_i = \{\text{red, green, blue}\}$
- **Constraints:** adjacent regions must have different colors
- e.g., $WA \neq NT$, or $(WA, NT) \in \{(red, green), (red, blue), (green, red), (green, blue), (blue, red), (blue, green)\}$

Dr. Monidipa Das, Department of CDS, IISER Kolkata

Example: Map-Coloring

31



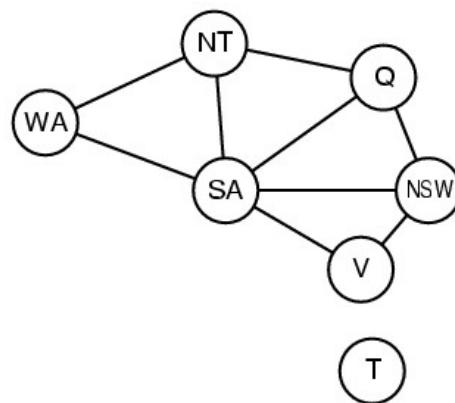
- Solutions are complete and consistent assignments
- e.g., WA = red, NT = green, Q = red, NSW = green, V = red, SA = blue, T = green

Dr. Monidipa Das, Department of CDS, IISER Kolkata

Constraint graph

32

- Binary CSP: each constraint relates two variables
- Constraint graph: nodes are variables, arcs are constraints



Dr. Monidipa Das, Department of CDS, IISER Kolkata

Varieties of CSPs



- **Discrete variables**
 - finite domains:
 - n variables, domain size $d \rightarrow O(d^n)$ complete assignments
 - e.g., Boolean CSPs, incl. Boolean satisfiability
 - infinite domains:
 - integers, strings, etc.
 - e.g., job scheduling, variables are start/end days for each job
 - need a constraint language, e.g., $StartJob_1 + 5 \leq StartJob_3$
- **Continuous variables**
 - e.g., start/end times for Hubble Space Telescope observations

Dr. Monidipa Das, Department of CDS, IISER Kolkata

Varieties of constraints



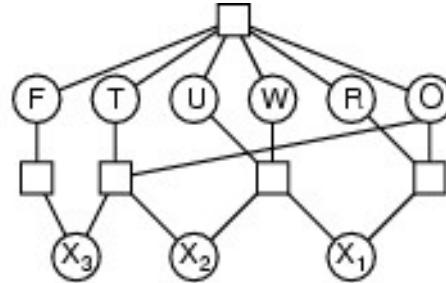
- **Unary** constraints involve a single variable,
 - e.g., SA ≠ green
- **Binary** constraints involve pairs of variables,
 - e.g., SA ≠ WA
- **Higher-order** constraints involve 3 or more variables,
 - e.g., cryptarithmetic column constraints

Dr. Monidipa Das, Department of CDS, IISER Kolkata

Example: Cryptarithmetic

35

$$\begin{array}{r} \text{T} \ \text{W} \ \text{O} \\ + \ \text{T} \ \text{W} \ \text{O} \\ \hline \text{F} \ \text{O} \ \text{U} \ \text{R} \end{array}$$



- **Variables:** $F, T, U, W, R, O, X_1, X_2, X_3$
- **Domains:** $\{0, 1, 2, 3, 4, 5, 6, 7, 8, 9\}$
- **Constraints:** $AllDiff(F, T, U, W, R, O)$

$$\begin{aligned} O + O &= R + 10 \cdot X_1 \\ X_1 + W + W &= U + 10 \cdot X_2 \\ X_2 + T + T &= O + 10 \cdot X_3 \\ X_3 &= F, T \neq 0, F \neq 0 \end{aligned}$$

Dr. Monidipa Das, Department of CDS, IISER Kolkata

36

Questions?

Dr. Monidipa Das, Department of CDS, IISER Kolkata