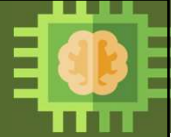


Elective Course

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

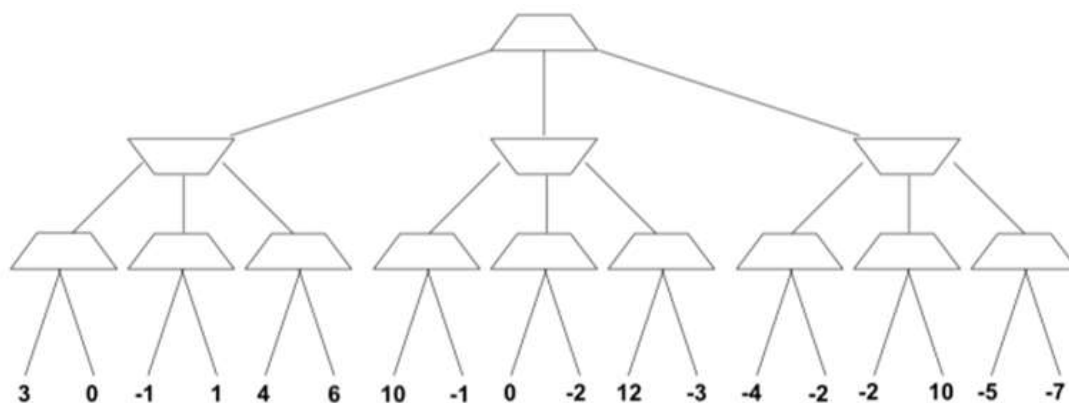
Department of Computational and Data Sciences

Indian Institute of Science Education and Research Kolkata, India 741246

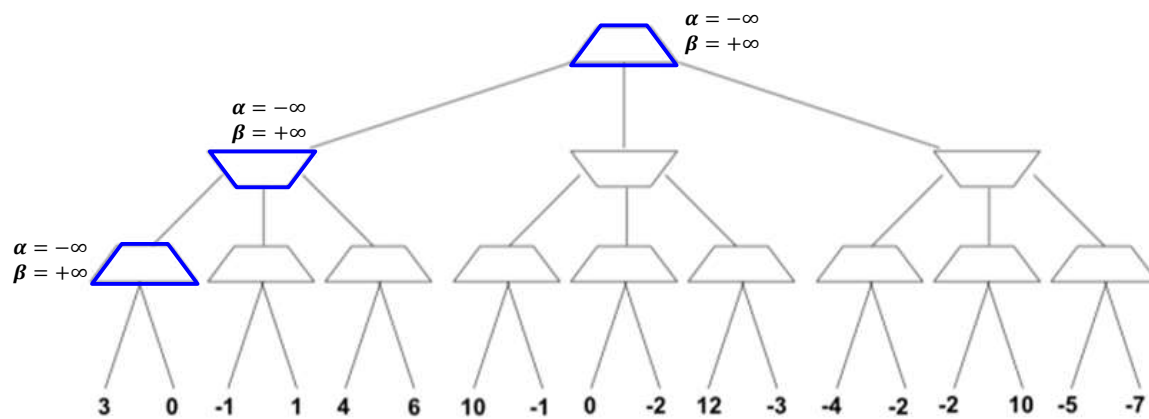
## Practice Problem



Which leaf nodes are never visited due to pruning?

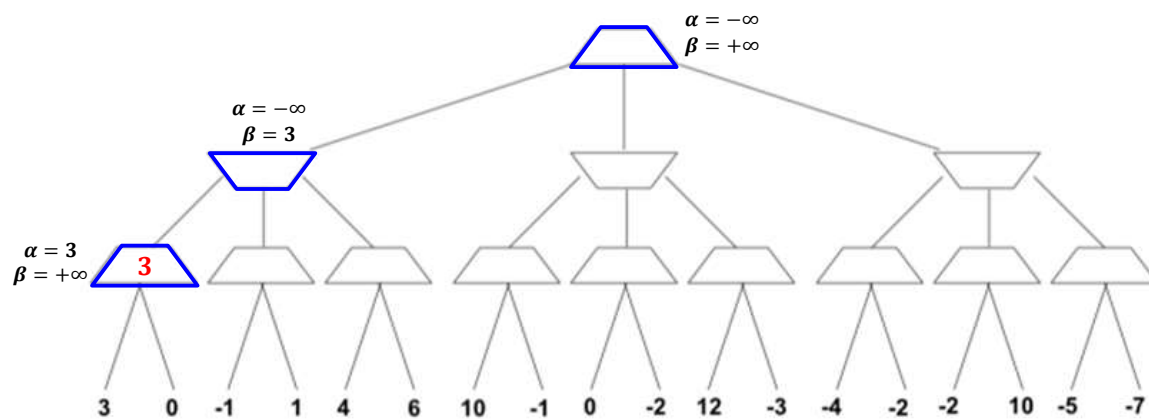


# Solution



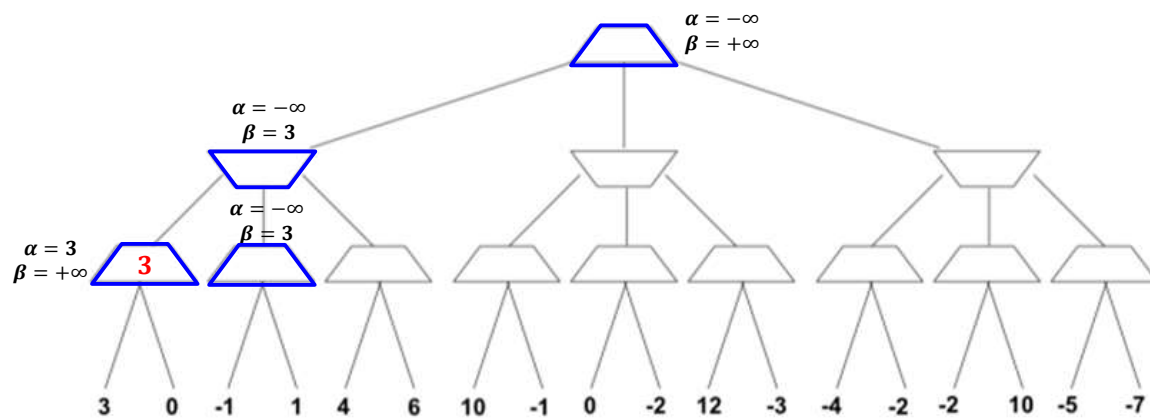
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



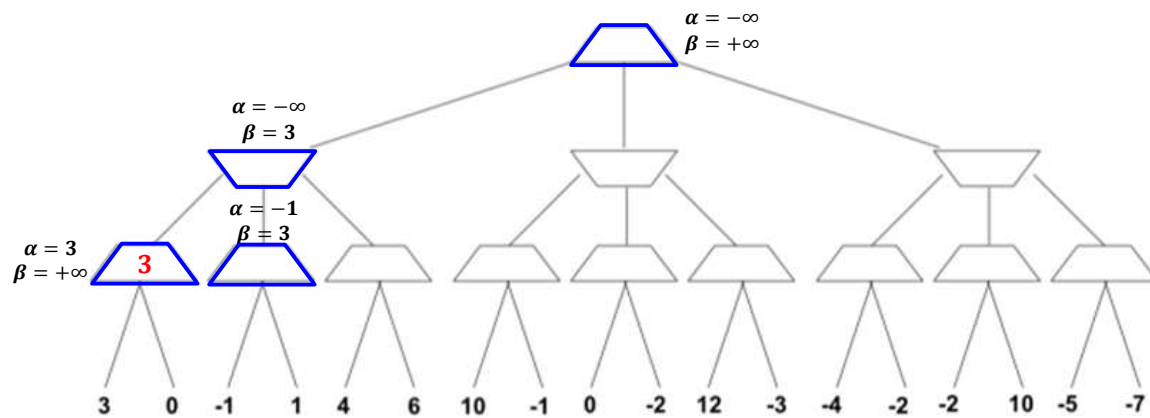
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



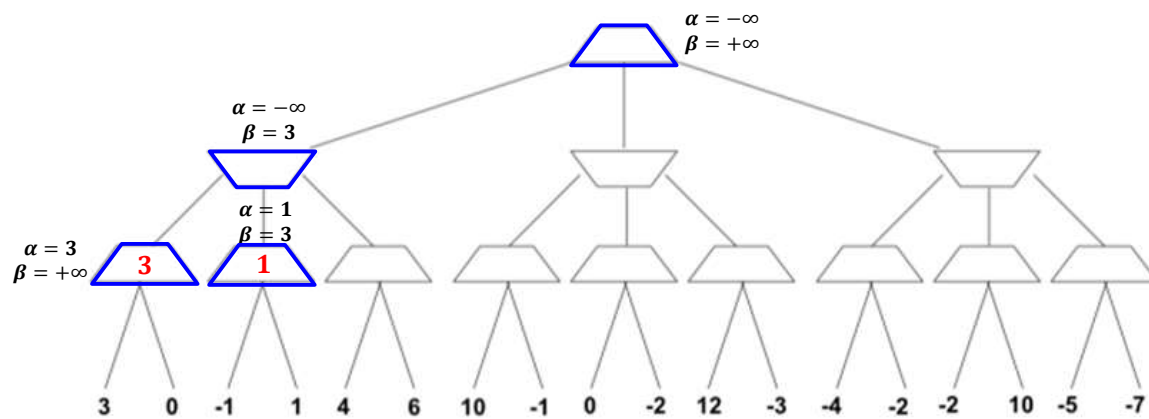
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



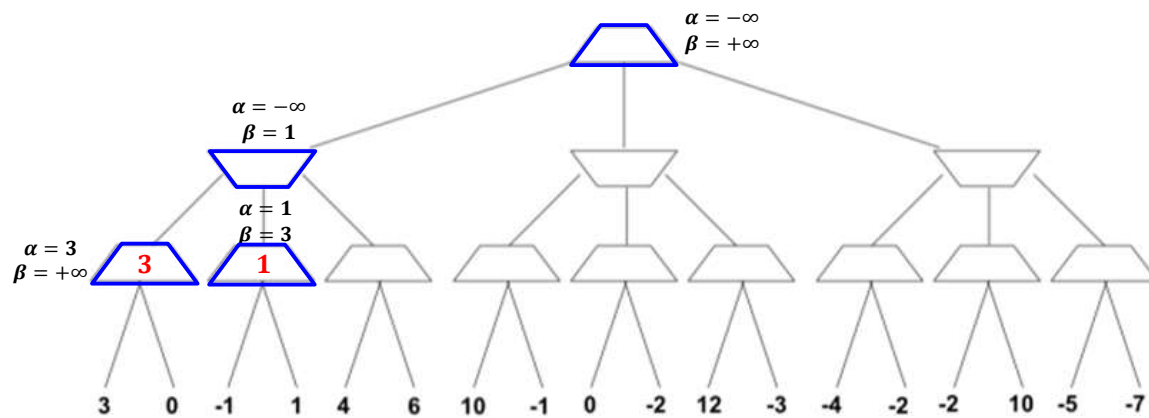
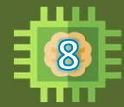
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



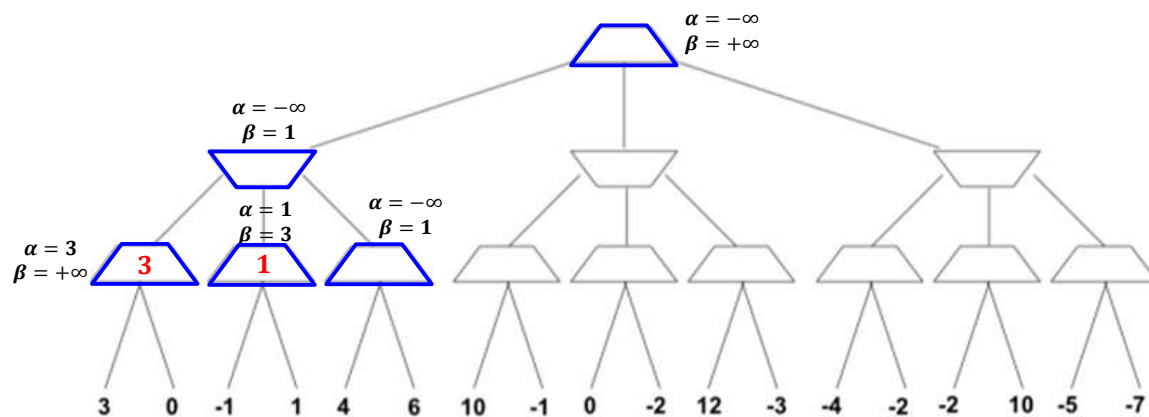
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



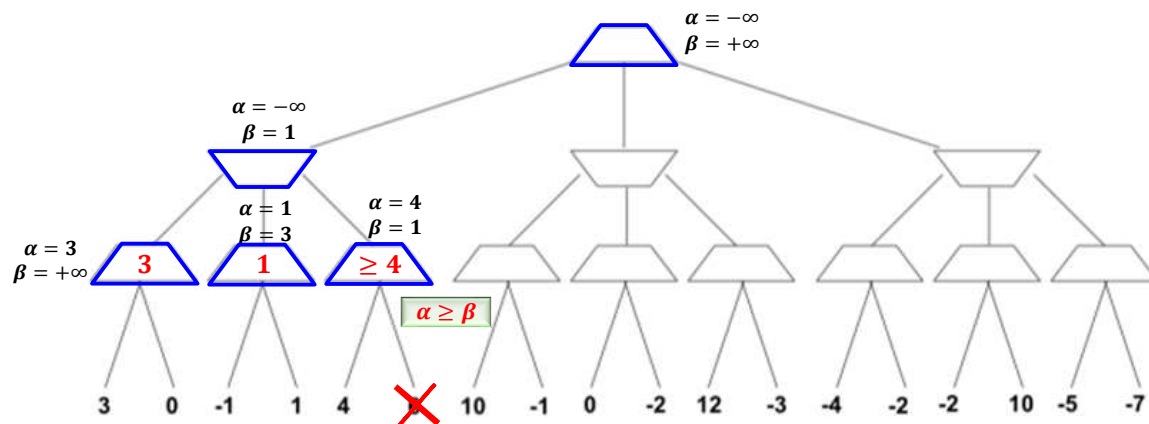
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



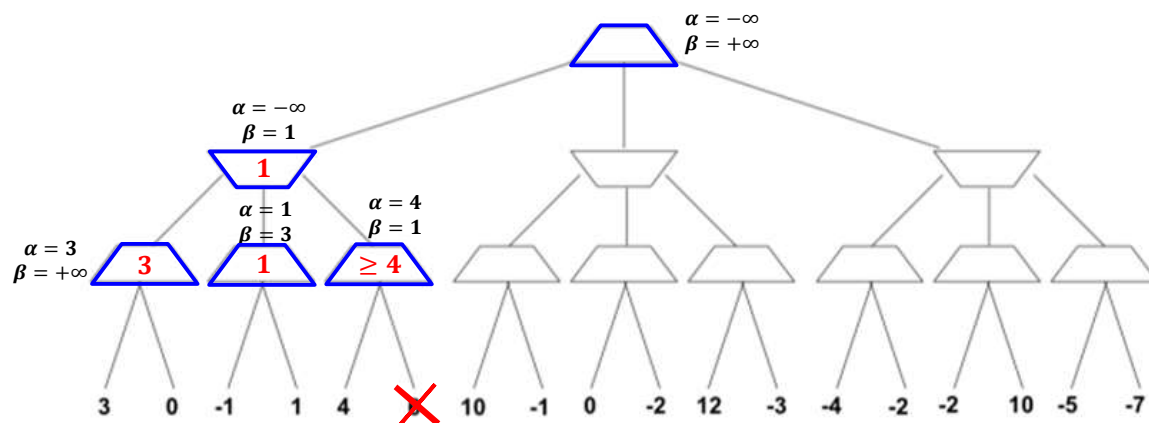
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



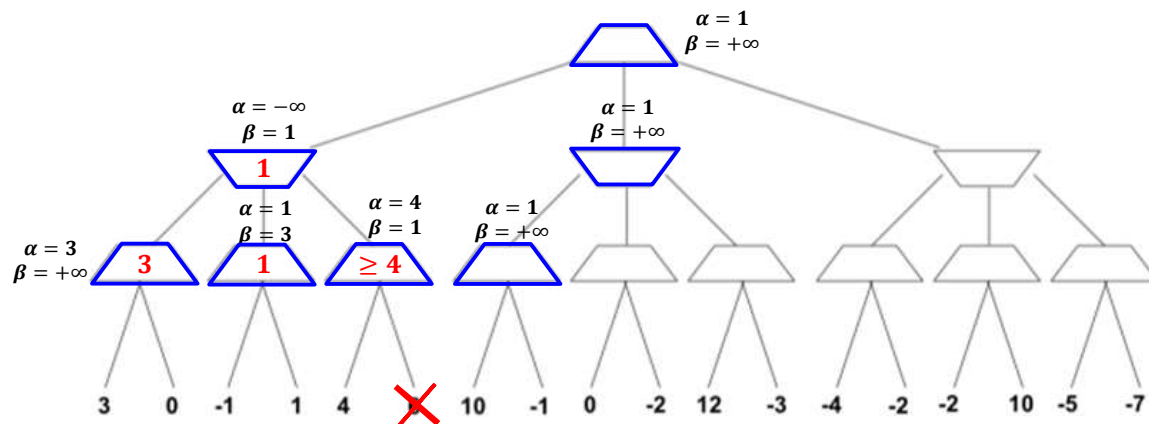
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



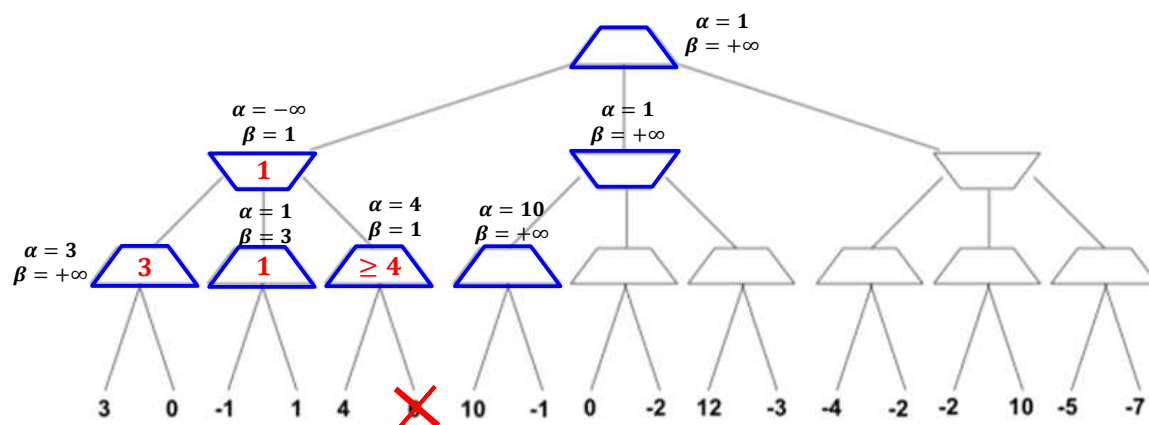
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



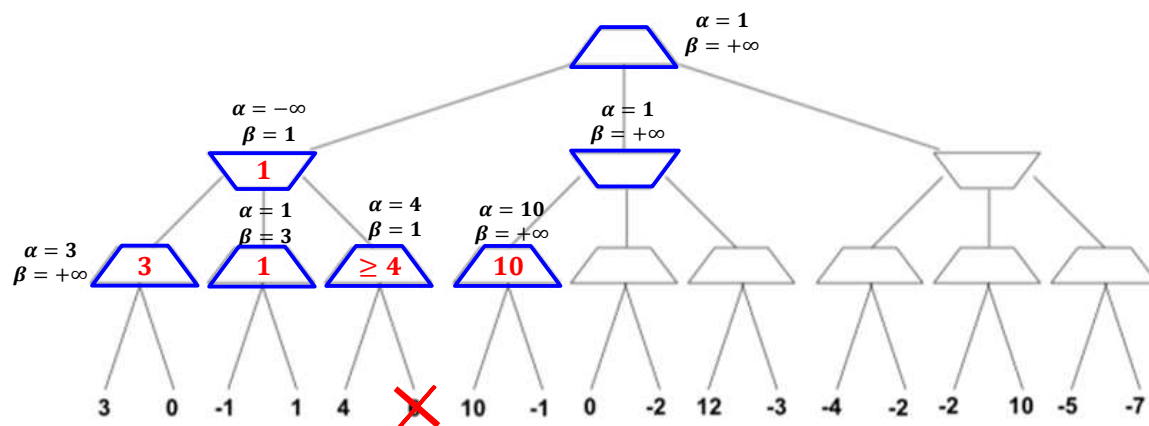
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



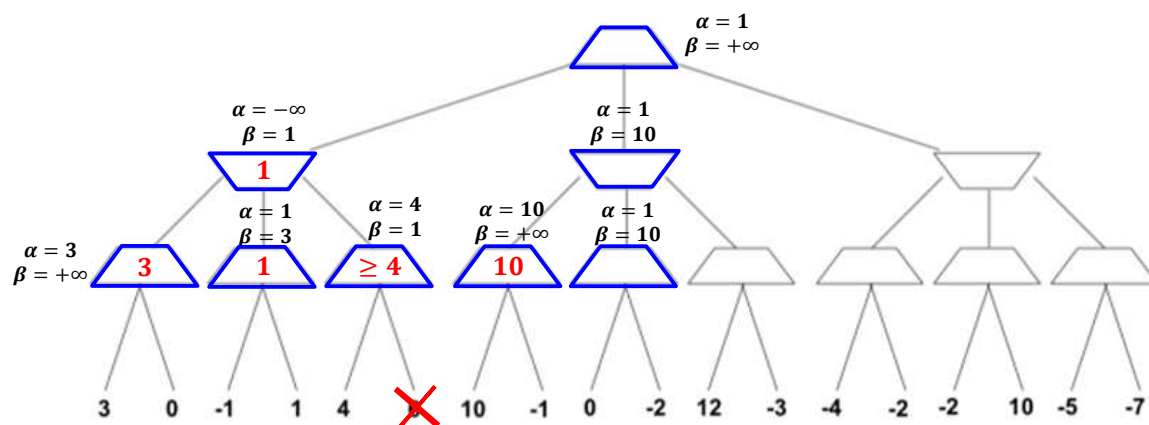
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



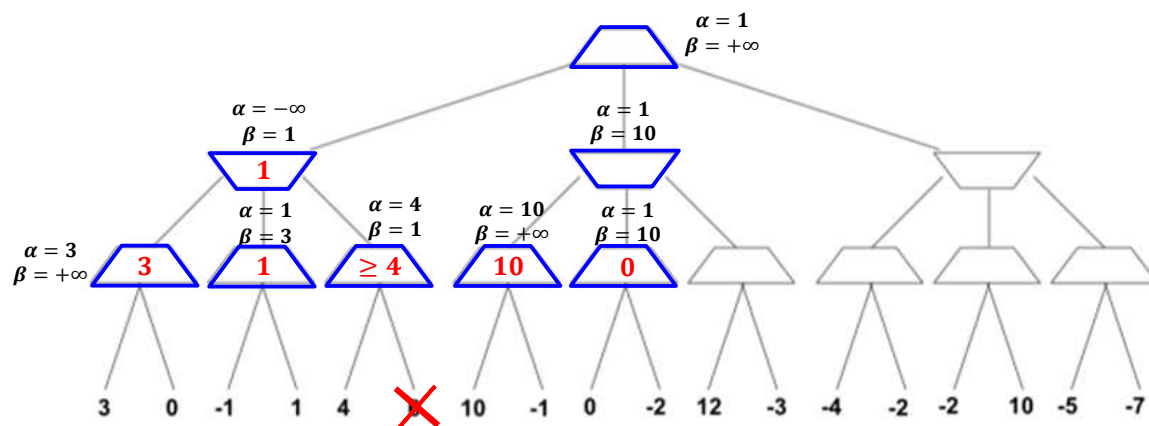
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

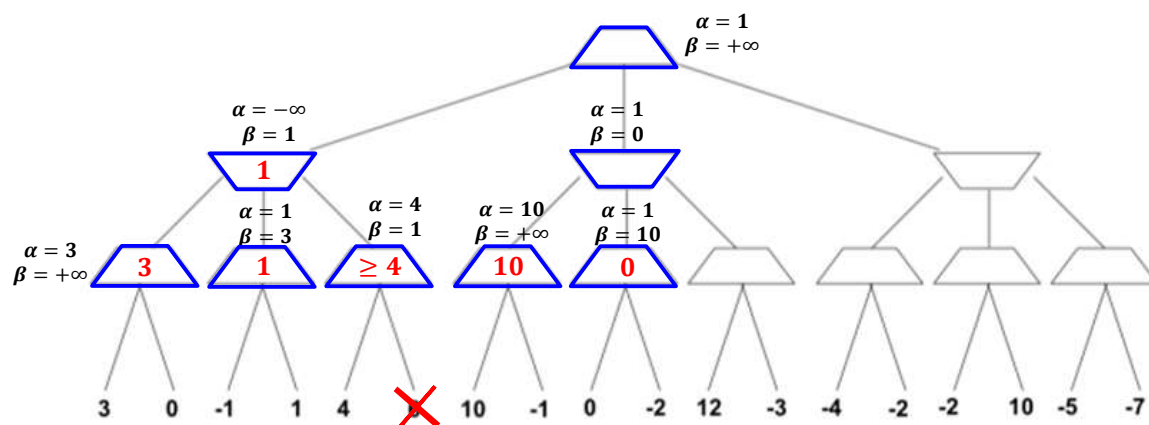
# Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

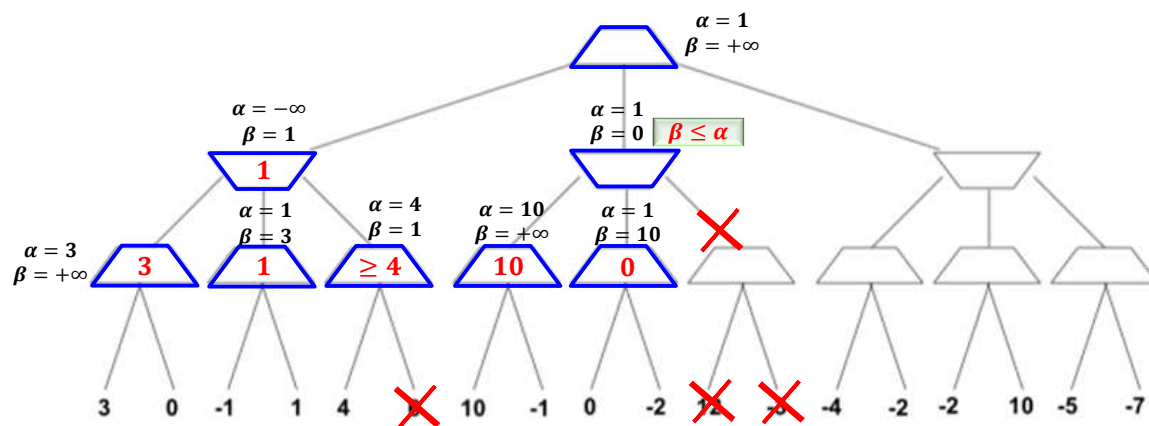


# Solution



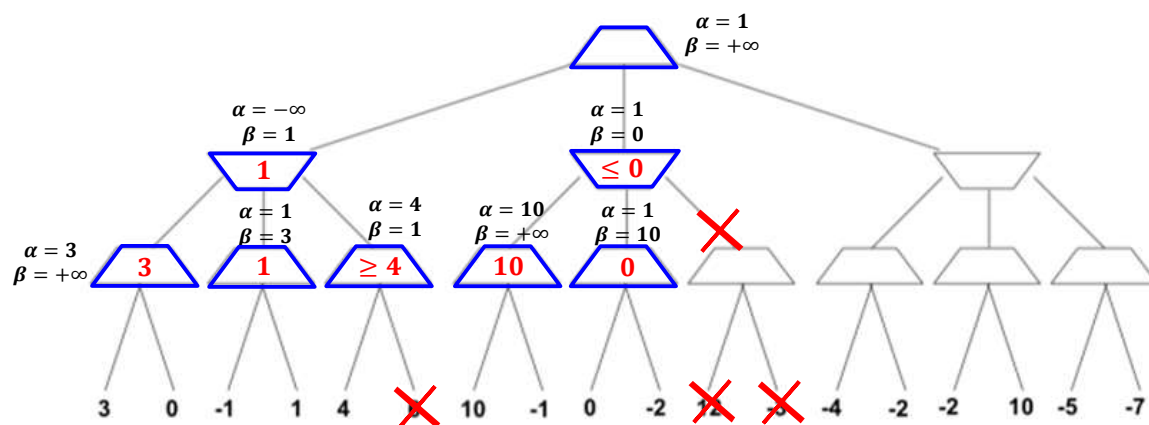
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



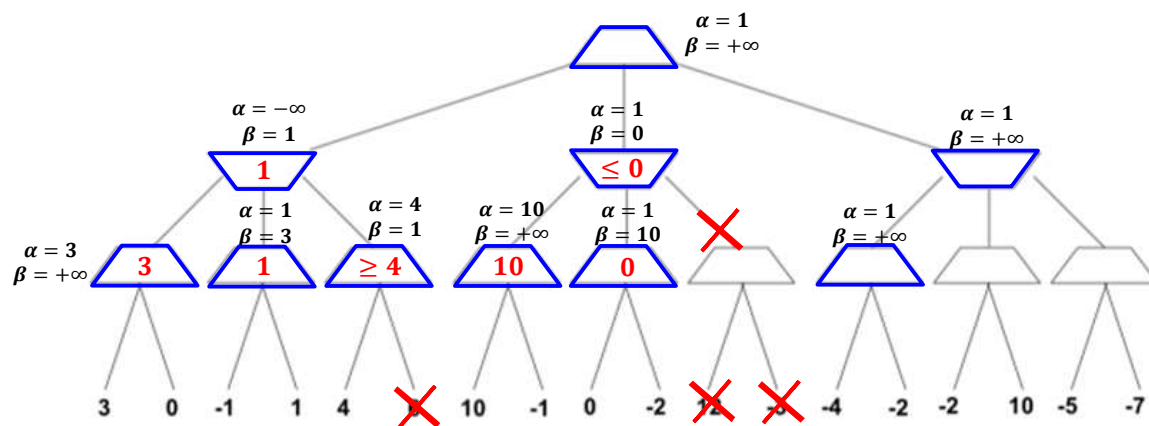
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



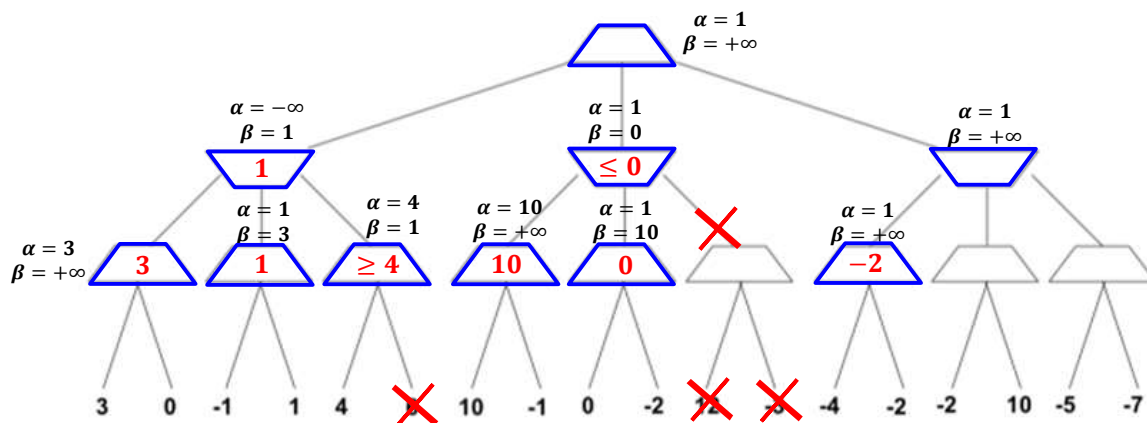
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



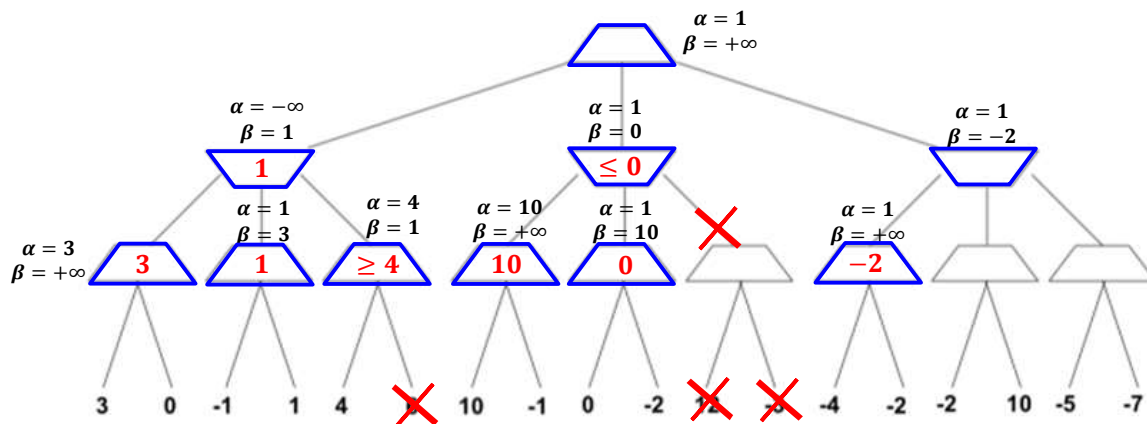
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



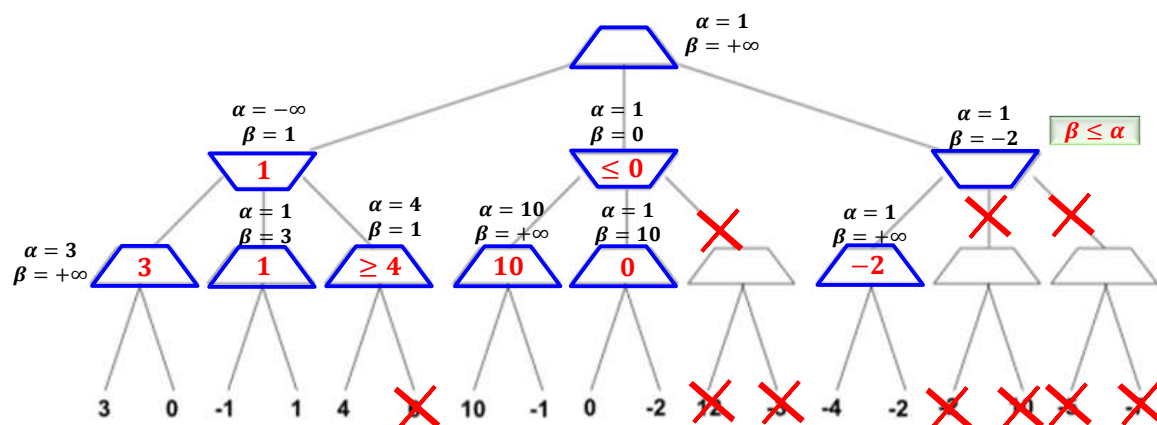
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



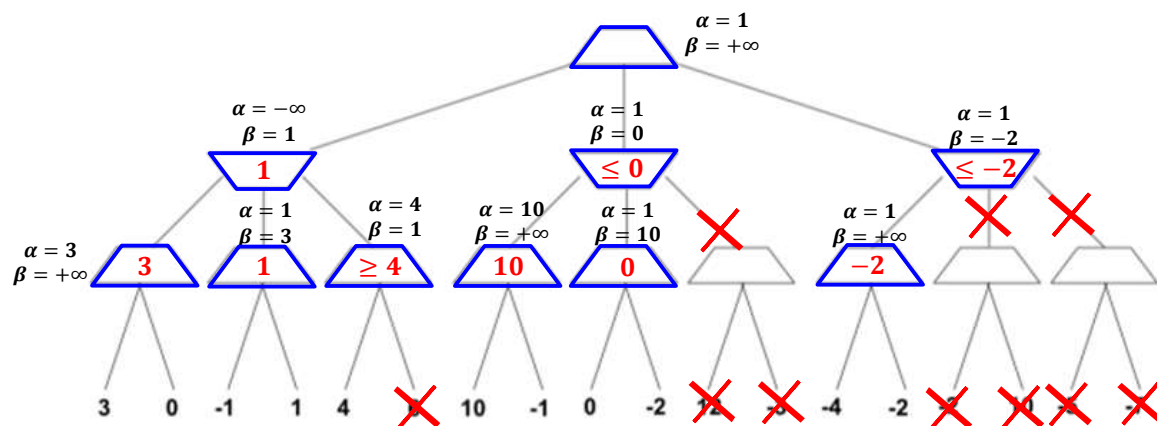
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



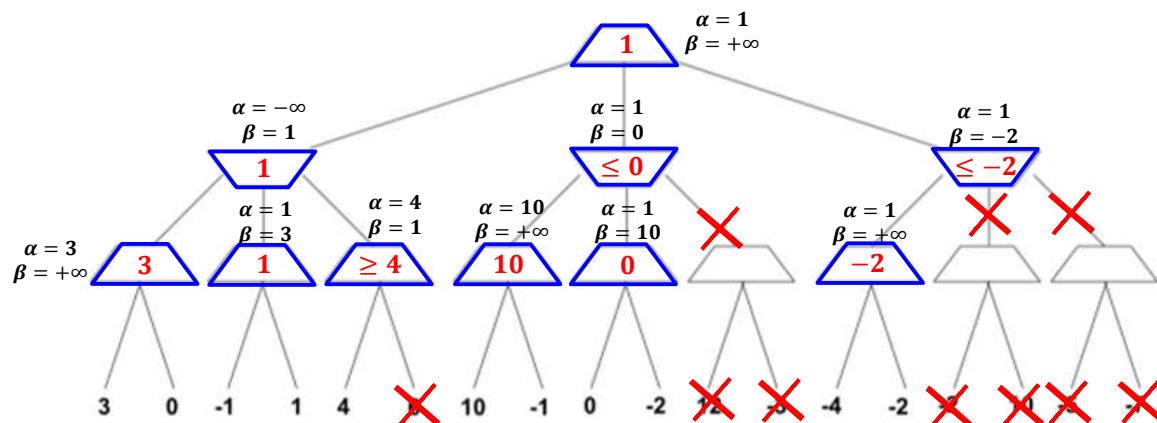
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



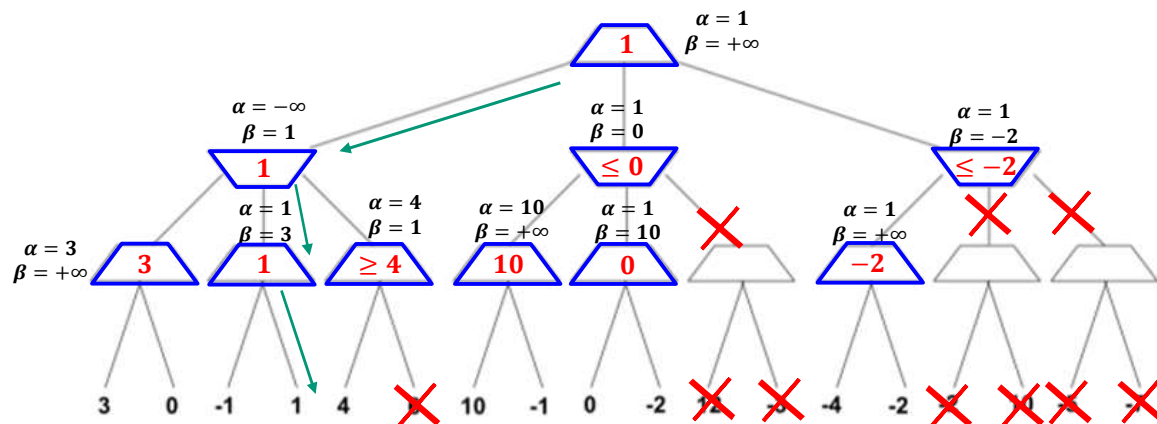
Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Solution



Dr. Monidipa Das, Department of CDS, IISER Kolkata



# Constraint Satisfaction Problems (CSPs)

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	<b>INTRODUCTION TO AI:</b> Artificial Intelligence Introduction, Brief History, Intelligent Agents, Types of agents <i>Python Primer for AI</i>
Week 2-4	<b>PROBLEM SOLVING BY SEARCH:</b> 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> <div style="border: 2px solid red; padding: 2px; display: inline-block;">             Introduction to GA, GA Operations: <i>Selection, Crossover, Mutation</i>  <i>Solving N-Queen Problem using GA</i> </div> <div style="color: blue; margin-left: 10px;">             To be discussed              in the first two              lectures after the              mid-semester exam           </div> Adversarial Search: <i>Minimax algorithm, Alpha-Beta Pruning</i> <i>Building a bot to play tic-tac-toe/Building 8-puzzle solver</i>
Week 5	<b>CONSTRAINT SATISFACTION PROBLEM (CSP):</b> 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

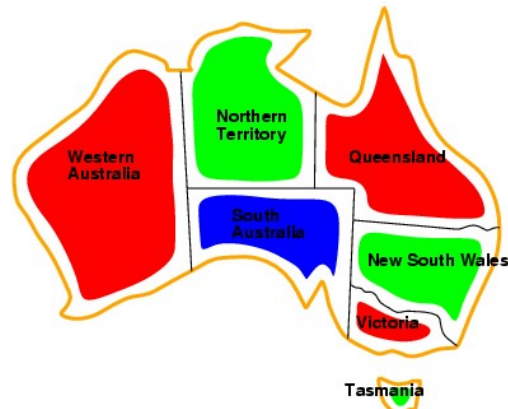
## Example: Map-Coloring



- **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  $(WA, NT) \in \{(\text{red, green}), (\text{red, blue}), (\text{green, red}), (\text{green, blue}), (\text{blue, red}), (\text{blue, green})\}$

Dr. Monidipa Das, Department of CDS, IISER Kolkata

## Example: Map-Coloring



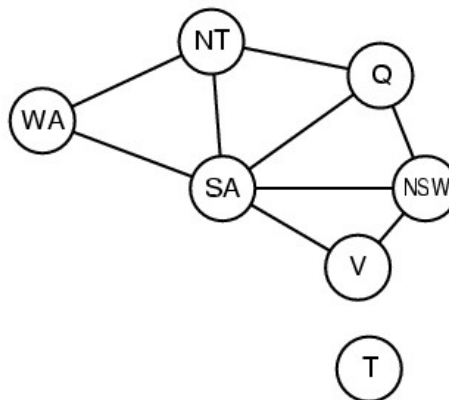
- **Solutions** are **complete** and **consistent** assignments
- e.g., WA = red, NT = green, Q = red, NSW = green, V = red, SA = blue, T = green

Dr. Monidipa Das, Department of CDS, IISER Kolkata

## Constraint graph



- **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



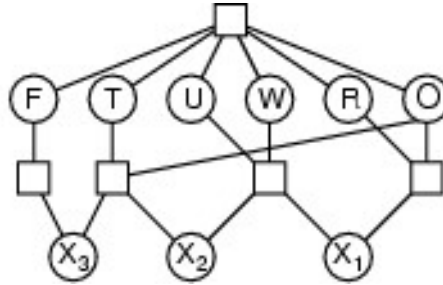
- **Unary** constraints involve a single variable,
  - e.g.,  $SA \neq \text{green}$
- **Binary** constraints involve pairs of variables,
  - e.g.,  $SA \neq WA$
- **Higher-order** constraints involve 3 or more variables,
  - e.g., cryptarithmic column constraints

Dr. Monidipa Das, Department of CDS, IISER Kolkata

# Example: Cryptarithmic



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



- **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:**  $\text{Alldiff}(F, T, U, W, R, O)$

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

Dr. Monidipa Das, Department of CDS, IISER Kolkata



## Questions?

Dr. Monidipa Das, Department of CDS, IISER Kolkata