

Game Theory

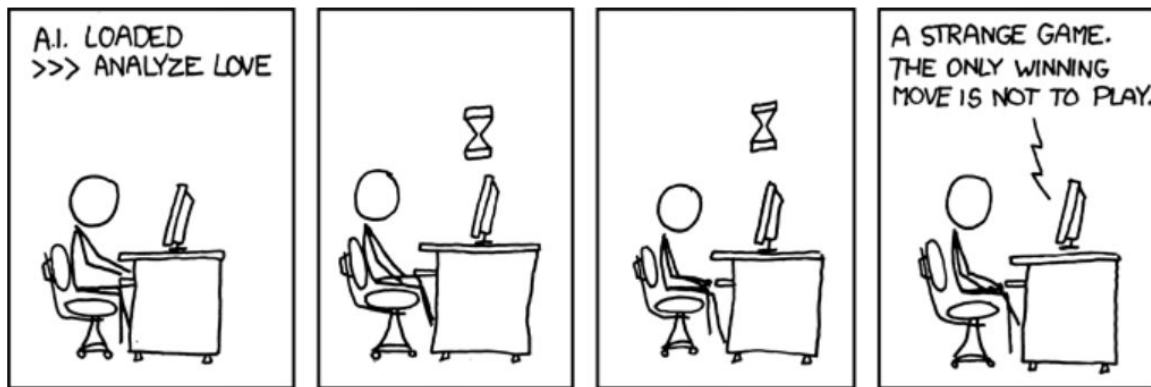
Ethen Yuen {ethening}

2021-04-24

Games (?)

- What kinds of games?

Game Theory



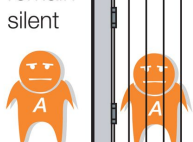



Title text: Wait, no, that one also loses. How about a nice game of chess?

Games Theory

- You may have heard of Prisoner's Dilemma?

Prisoners' dilemma










		prisoner B	
		confess	remain silent
prisoner A	confess	 5 years 5 years	 0 year 20 years
	remain silent	 20 years 0 year	 1 year 1 year

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Games Theory






















- These games are important in various areas (economy, biology, sociology, ...), but not our main focus today.

Payoff matrix with saddlepoint

		party B					
		support		oppose		evade	
party A	support	 A 60% B 40%	 A 20% B 80%	 A 80% B 20%			
	oppose	 A 80% B 20%	 A 25% B 75%	 A 75% B 25%			
	evade	 A 35% B 65%	 A 30% B 70%	 A 40% B 60%			
				saddlepoint			

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Biological competition

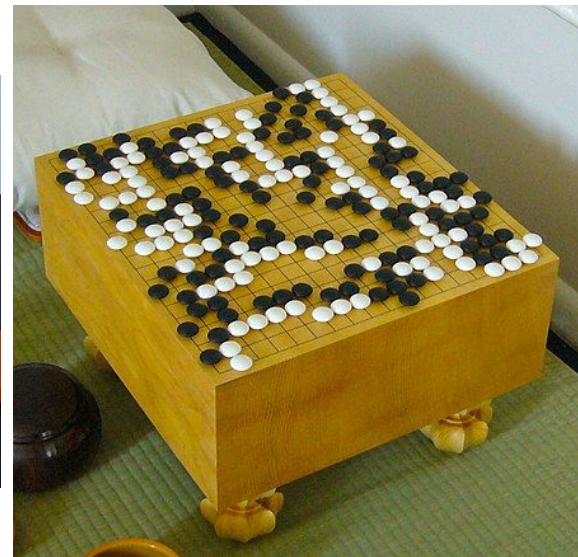
		 hawk		 dove		 bourgeois	
	hawk	 lose -5 offspring	 lose -5 offspring	 gain +10 offspring	 gain none, lose none	 gain +2.5 offspring	 lose -2.5 offspring
	dove	 gain none, lose none	 gain +10 offspring	 gain +2 offspring	 gain +2 offspring	 gain +1 offspring	 gain +6 offspring
	bourgeois	 lose -2.5 offspring	 gain +2.5 offspring	 gain +6 offspring	 gain +1 offspring	 gain +5 offspring	 gain +5 offspring

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Combinatorial Games

- A branch of game theory that frequently appears in competitive programming / computer science
- Usually do not involved probabilities, unlike mainstream game theory
- **Sequential Game:** Players take turns to change the game state with moves
- **Perfect Information:** No hidden or chance moves
- **Progressively Finite:** The game ends in a finite number of moves
- Two Players (usually)

Common examples



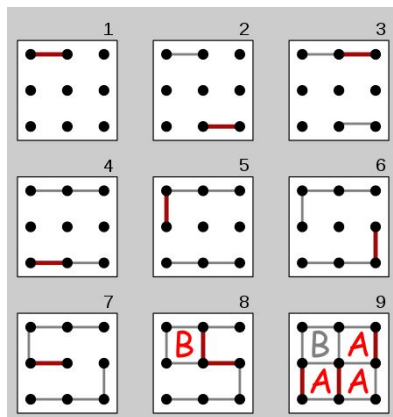
- Tic-tac-toe, Chess, Go

(Not so) Common examples

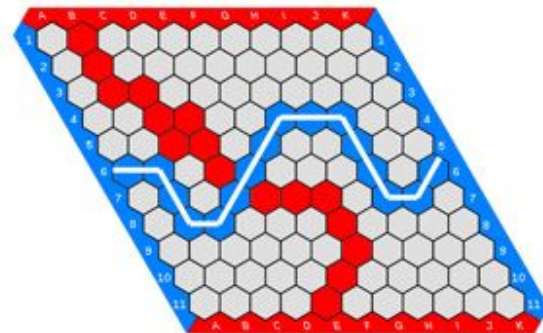
- Many games appear in *Clubhouse Games: 51 Worldwide Classics* are combinatorial games



Mancala

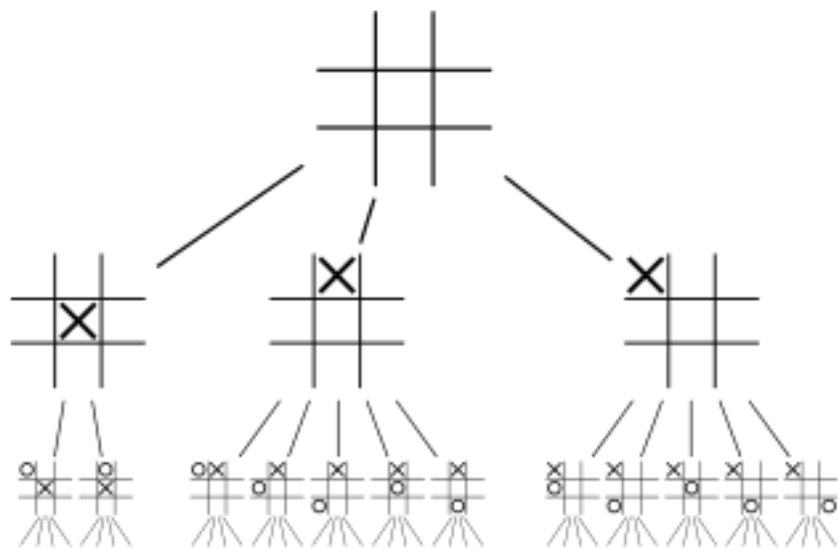


Dots and Boxes



Hex

Game State & Game Tree

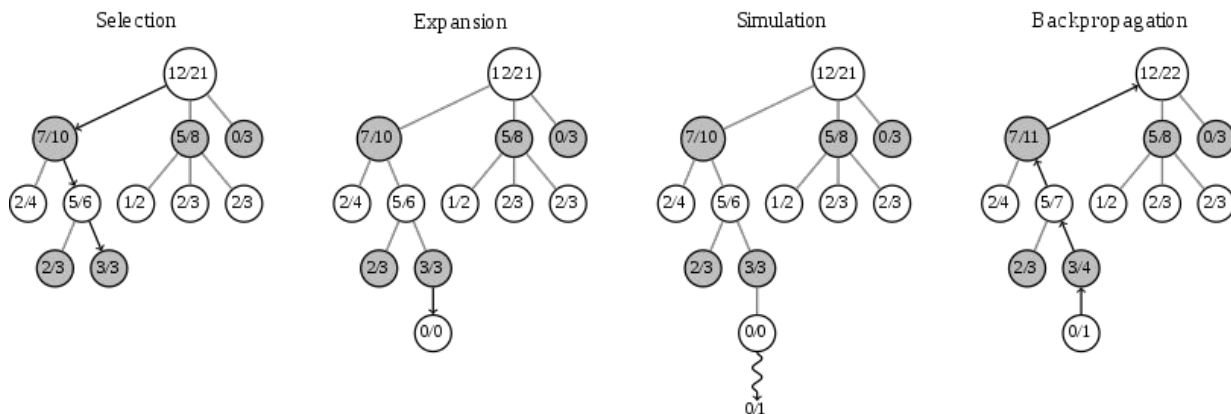


Can be tuned into a DAG

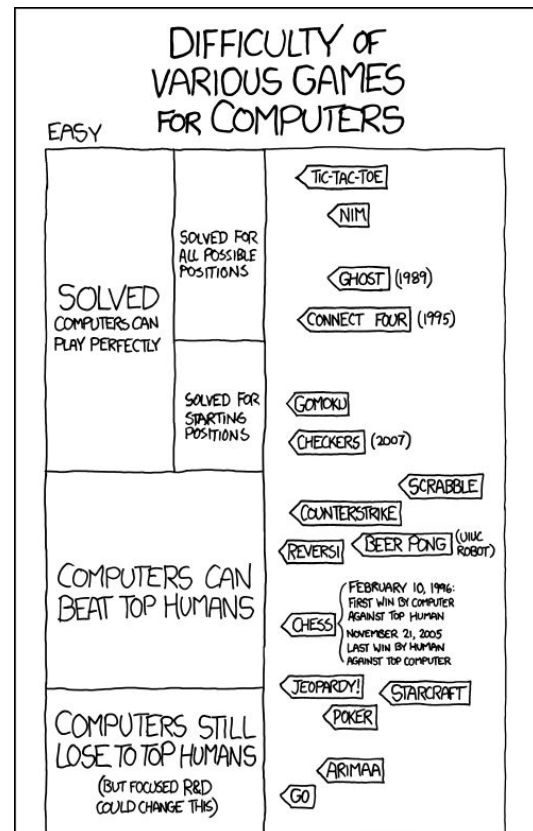
- Each **node** represents a state in game, each **edge** represents a valid move from that state.
- Leaf nodes (Terminal nodes) represent an ending game state: resulting in win / lose / draw.
- For larger games, only a partial game tree may be search to improve chances of picking a best move.

Deep Blue & Alpha Go

- **Deep Blue** (IBM): Chess → Mostly by brute force
- **AlphaGo** (Google Deepmind): Go → Monte Carlo Search Tree



Monte Carlo Tree Search (MCTS) Tutorial



Solving a game

- Find the outcome of the game (win / lose / draw), considering both players play optimally.
- (Optional) Finding the best possible move(s) of some game states
- Zermelo's theorem:
- **Drawing strategy:** In any finite sequential game with perfect information, at least one of the players has a drawing strategy.
- **Winning strategy:** If a game never ends with a draw, then exactly one of the players has a winning strategy.

Impartial Combinatorial Game

- **Impartial:** At any particular position, both players have the same set of available moves.
 - Nim is impartial.
 - Mancala, Chess, Go and Tic-tac-toe are not.

Normal & Misère game play

- There are (one or more) ending positions in the games we consider.
- **Normal:** first to reach an ending position wins.
- **Misère:** first to reach an ending position loses.
- Unless otherwise specified, we assume the normal game play.

Game 1: Take-away Game

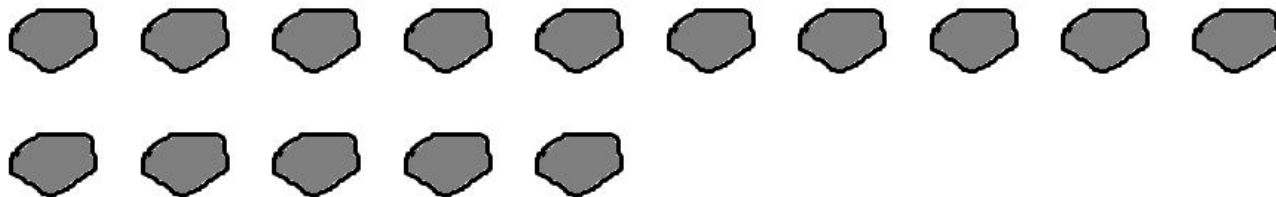
- Start with a pile of **N** stones.
- In each move, a player can remove any number of stones from **1 to K**.
- Player removes the last stone wins.
- Ending position: 0 stones left

Game 1: Sample Play

- $N = 15, K = 3$

Player 1

Player 2

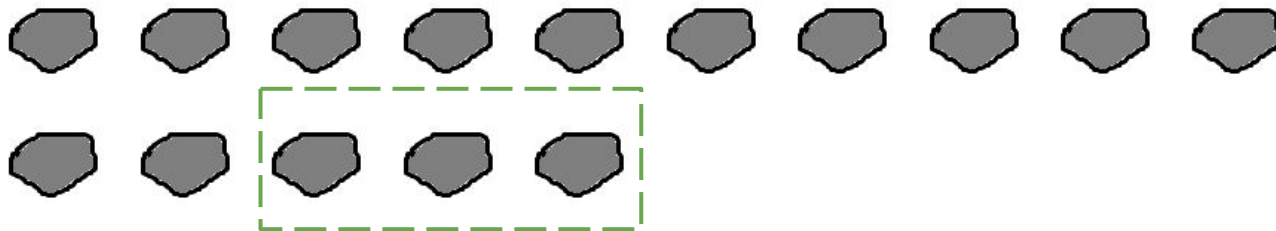


Game 1: Sample Play

- $N = 15, K = 3$

Player 1

Player 2

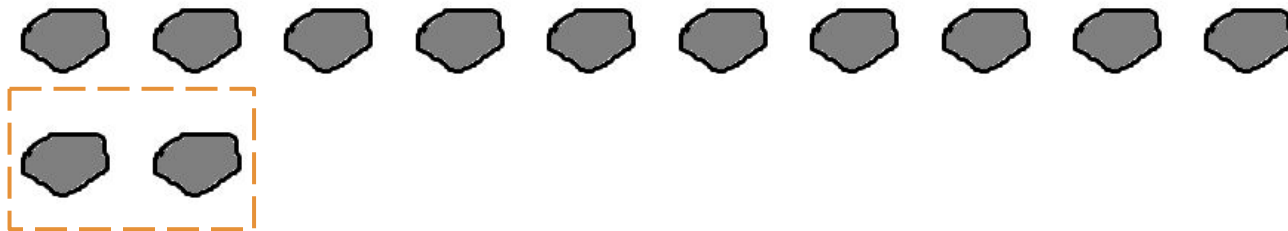


Game 1: Sample Play

- $N = 15, K = 3$

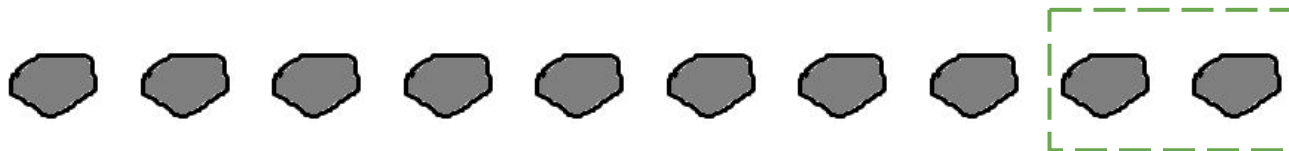
Player 1

Player 2



Game 1: Sample Play

- $N = 15, K = 3$



Player 1

Player 2

Game 1: Sample Play

- $N = 15, K = 3$



Player 1

Player 2

Game 1: Sample Play

- $N = 15, K = 3$

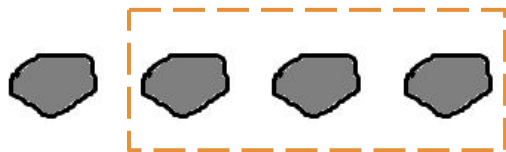


Player 1

Player 2

Game 1: Sample Play

- $N = 15, K = 3$



Player 1

Player 2

Game 1: Sample Play

- $N = 15, K = 3$



player 1 wins!!!

Player 1

Player 2

- The result has been determined from the initial state $(N, K) = (15, 3)$.
- Under perfect play, **Player 1** always win.

Game 1: Try it out

- <https://www.ictgames.com/mobilePage/bottleTakeAway/index.html>

Game 1: Solution

- Suppose $K = 3$, we can try the game with small N .
- Which player has the winning strategy?

N	0	1	2	3	4	5	6	7	8	9	10	11
	P2	P1	P1	P1	P2	P1	P1	P1	P2	P1	P1	P1

- If N is a **multiple of 4**, **Player 2** wins.
- Otherwise, **Player 1** wins.

Game 1: Winning Strategy

- If N is a **multiple of 4**, **Player 2** wins.
- Otherwise, **Player 1** wins.
- Why is this true?
- If N is a multiple of 4,
 - Suppose **Player 1** takes **X** stones ($1 \leq X \leq 3$).
 - **Player 2** should always respond by taking **$(4 - X)$** stones.
- After **Player 1** turns, number of stones $\neq 0 \pmod{4}$, never the ending state
- After **Player 2** turns, number of stones $= 0 \pmod{4}$

Game 1: Winning Strategy

- If N is a **multiple of 4**, **Player 2** wins.
- Otherwise, **Player 1** wins.
- If N is a multiple of 4,
 - Suppose **Player 1** takes X stones ($1 \leq X \leq 3$).
 - **Player 2** should always respond by taking $(4 - X)$ stones.
- If $N = 4k + X$ ($1 \leq X \leq 3$),
 - **Player 1** should take X stones.
 - Then, use the strategy above.

Game 1: Solution

- If N is a **multiple of 4**, **Player 2** wins.
- Otherwise, **Player 1** wins.

- General solution:
- If N is a **multiple of $(K + 1)$** , **Player 2** wins.
- Otherwise, **Player 1** wins.

P-position and N-position

- **P-position**: The **P**revious player has a winning strategy
- **N-position**: The **N**ext player has a winning strategy.
- Under normal play rule, the player first to reach an ending position wins.
- So, every ending position is a **P-position**.
- If initial position is a **N-position**, Player 1 wins.
- If initial position is a **P-position**, Player 2 wins.

P-position and N-position - Example

- For Take-away game with $K = 3$:
- Previously we use:

N	0	1	2	3	4	5	6	7	8	9	10	11
	P2	P1	P1	P1	P2	P1	P1	P1	P2	P1	P1	P1

- Now we use:

N	0	1	2	3	4	5	6	7	8	9	10	11
	P	N	N	N	P	N	N	N	P	N	N	N

P-position and N-position

- How do we determine whether a given position is P or N?
- Every ending position is a **P-position**.
- A position that has a way to move to a **P-position** is a **N-position**.
- A position that can **only** move to a **N-position** is a **P-position**.

P-position and N-position - Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
	P											

- $N = 0$ is an ending position \rightarrow P

P-position and N-position - Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
	P	N	N	N								

- $N = 1, 2, 3$ has a way to move to **P-position** ($N = 0$) \rightarrow **N**

P-position and N-position - Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
	P	N	N	N	P							

- $N = 4$ can only move to **N-position** ($N = 1, 2, 3$) \rightarrow **P**

P-position and N-position - Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
	P	N	N	N	P	N	N	N				

- $N = 5, 6, 7$ has a way to move to **P-position** ($N = 4$) \rightarrow **N**

P-position and N-position - Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
	P	N	N	N	P	N	N	N	P			

- $N = 8$ can only move to N-position ($N = 6, 7, 8$) \rightarrow P

P-position and N-position - Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
	P	N	N	N	P	N	N	N	P	N	N	N

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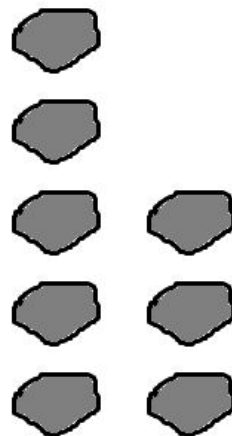
- Rest / Q&A

Game 2: Nim

- There are N piles of stones.
- The i -th pile contains $a[i]$ stones.
- On each turn, a player may remove any positive number of stones from any non-empty pile.
- Player removes the last stone wins.
- Ending position: 0 stones left

Game 2: Sample Play

- $N = 3$, $a[1] = 5$, $a[2] = 3$, $a[3] = 8$



Player 1

Player 2

Game 2: Sample Play

- $N = 3$, $a[1] = 5$, $a[2] = 3$, $a[3] = 8$

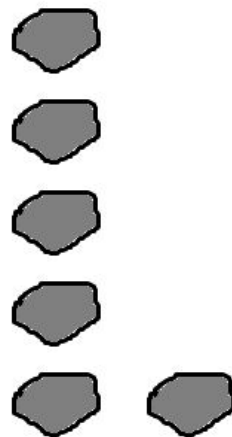


Player 1

Player 2

Game 2: Sample Play

- $N = 3$, $a[1] = 5$, $a[2] = 3$, $a[3] = 8$

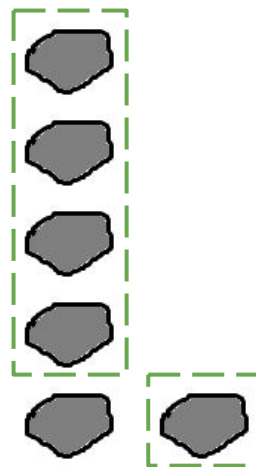
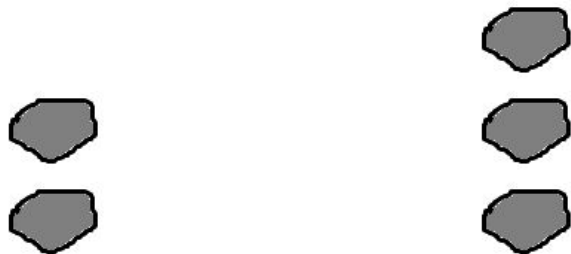


Player 1

Player 2

Game 2: Sample Play

- $N = 3$, $a[1] = 5$, $a[2] = 3$, $a[3] = 8$



Player 1

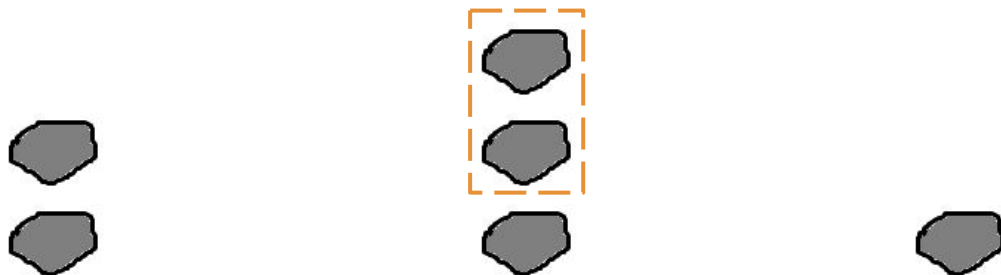
Player 2

Game 2: Sample Play

- $N = 3$, $a[1] = 5$, $a[2] = 3$, $a[3] = 8$

Player 1

Player 2

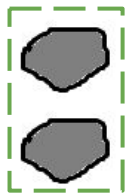


Game 2: Sample Play

- $N = 3$, $a[1] = 5$, $a[2] = 3$, $a[3] = 8$

Player 1

Player 2



Game 2: Sample Play

- $N = 3$, $a[1] = 5$, $a[2] = 3$, $a[3] = 8$

Player 1

Player 2



Game 2: Sample Play

- $N = 3$, $a[1] = 5$, $a[2] = 3$, $a[3] = 8$

Player 1

Player 2

- As with the previous game, the result has been determined from the initial state.
- Under perfect play, Player 1 always win.



player 1 wins!!!

Game 2: Nim

- Consider cases where N is small:
- If $N = 1$, ($a[1] > 0$), **Player 1** wins.
- If $N = 2$,
 - If $a[1] = a[2]$, **Player 2** wins (**Strategy Stealing**: mirror the moves of **Player 1**)
 - If $a[1] \neq a[2]$, **Player 1** wins (Makes 2 piles the same)
- What about bigger N ? Are we able to do case handling for all of those?



Game 2: Nim Sum

- (about to get a bit mathy)
 - For each game state \mathbf{g} , assign to it some integers \mathbf{G} as its “Nim-value”
 - Given two game state \mathbf{a} and \mathbf{b} , let $\mathbf{a} + \mathbf{b}$ be the game state with piles of \mathbf{a} put together with piles of \mathbf{b} .
If their Nim-values are \mathbf{A} and \mathbf{B} , we define an operator \oplus , where $\mathbf{A} \oplus \mathbf{B}$ is the Nim-value of state $\mathbf{a} + \mathbf{b}$.
-
- We hope there exists some operator that works nicely for \oplus .

Game 2: Nim Sum

- Consider the simplest possible game $\mathbf{N} = \mathbf{1}$ again.
- Intuitively, since the only information that distinguishes the piles from one another is the number of stones in them, let's say the Nim-value of this game is simply $\mathbf{a[1]}$.
- We can see that it is a **N-position** if $\mathbf{a[1]} > \mathbf{0}$, and a **P-position** if $\mathbf{a[1]} = \mathbf{0}$. We would like to reflect this in Nim-value as well \rightarrow a Nim-value \mathbf{G} indicates a **N-position** if $\mathbf{G} > \mathbf{0}$, and a **P-position** if $\mathbf{G} = \mathbf{0}$.

Game 2: Nim Sum

- We also can deduce some properties of the operator \oplus composing Nim-values together.
- $(A \oplus B) \oplus C = A \oplus (B \oplus C)$ and $A \oplus B = B \oplus A$
Associative and commutative - order shouldn't matter for combining piles.
- $A \oplus 0 = A$
Operator identity equal 0 - adding a empty pile should not affect the game
- $A \oplus A = 0$
Inverse of each state is itself - strategy stealing

Game 2: Nim Sum

- $(A \oplus B) \oplus C = A \oplus (B \oplus C)$ and $A \oplus B = B \oplus A$
 - $A \oplus 0 = A$
 - **$A \oplus A = 0$**
-
- Ordered n-tuple of $\{0, 1\}$ with operation of addition modulo 2 between element?
 - $A \oplus B$ is basically the **bitwise XOR** of the two Nim-values (also known as Nim-sum)

Game 2: General Solution

- If $a[1] \oplus a[2] \oplus \dots \oplus a[N] = 0$,
 - It is a **P-position** (Player 2 wins).
- If $a[1] \oplus a[2] \oplus \dots \oplus a[N] \neq 0$
 - It is a **N-position** (Player 1 wins).

Game 2: Winning Strategy

- If $a[1] \oplus a[2] \oplus \dots \oplus a[N] = 0$,
 - After **Player 1**'s move, $a[1] \oplus a[2] \oplus \dots \oplus a[N] \neq 0$
 - There exists a move for **Player 2** so that after the move $a[1] \oplus a[2] \oplus \dots \oplus a[N] = 0$ (Proof next slide)
- If $a[1] \oplus a[2] \oplus \dots \oplus a[N] \neq 0$
 - **Player 1** should move to make $a[1] \oplus a[2] \oplus \dots \oplus a[N] = 0$
 - Then, use the strategy above.

Game 2: Why does it work?

- If Nim-sum is not zero,

XXXXXXXXXX

xxxx1xxxxx

XXXXXXXXXX

\oplus XXXXXXXXXXXX

00001xxxxx

- Find the most significant 1
- There exists a number with '1' in that place
- Reduce that number so that xor-sum is zero



Game 2: Why does it work?

- e.g. 5, 3, 8

$$\begin{array}{r} 0101 \\ 0011 \\ \oplus 1000 \\ \hline 1110 \end{array}$$

- **Find the most significant 1**
- There exists a number with '1' in that place
- Reduce that number so that xor-sum is zero

Game 2: Why does it work?

- e.g. 5, 3, 8

$$\begin{array}{r} 0101 \\ 0011 \\ \oplus 1000 \\ \hline 1110 \end{array}$$

- Find the most significant 1
- **There exists a number with '1' in that place**
- Reduce that number so that xor-sum is zero

Game 2: Why does it work?

- e.g. 5, 3, 8

$$\begin{array}{r} 0101 \\ 0011 \\ \oplus 1000 \rightarrow 0110 \\ \hline 1110 \end{array}$$

- Find the most significant 1
- There exists a number with '1' in that place
- **Reduce that number so that xor-sum is zero**

Game 2: Mini-test

- In a Nim game, suppose $N = 4$, $a[1] = 35$, $a[2] = 18$, $a[3] = 27$.
- In order to win, what should **Player 2** choose for $a[4]$?

Game 2: Mini-test Answer

- In a Nim game, suppose $N = 4$, $a[1] = 35$, $a[2] = 18$, $a[3] = 27$.
- **Player 2** wants $a[1] \oplus a[2] \oplus a[3] \oplus a[4] = 0$,
- That is, $a[4] = a[1] \oplus a[2] \oplus a[3] = 35 \oplus 18 \oplus 27 = \mathbf{42}$
- Note that the answer is unique.

Importance of Nim Game

- Nim is considered to be the prototypical game among the impartial combinatorial games
- Other games can be analyzed using the idea of Nim!
- Some variant of Nim:
Fibonacci Nim - https://en.wikipedia.org/wiki/Fibonacci_nim
Kayles (Circular Nim) - <https://en.wikipedia.org/wiki/Kayles>

Blank slide

- Rest / Q&A

Game 3: Nim Game with addition

- There are N piles of stones. The i -th pile contains $a[i]$ stones.
- The normal rules of Nim apply, except there is an extra move: instead of removing stones from a pile, the current turn player may choose to **spend their turn adding any number of stones to a pile** instead. They can add as many stones as they want, so long as, again, they are all added to the same pile.
- Assume this addition move may only be done a **finite** number of times per player.

Game 3: Solution

- Turns out this game is exactly the same as normal Nim.
- If the current turn player is in a losing state, under the normal set of Nim rules,
 - If they add **s** stones to some pile, the other player can just spend their turn removing **s** stones from that same pile, effectively undoing the last move.
- A winning player, meanwhile, can just play the game like normal Nim, only deviating from the strategy to **undo any additions** the opposing player makes, as necessary.
- Since the game will **still end after a finite number of moves** (and this is important), the winning player can be determined like normal Nim.



Game 4: Square-number Nim Game

- There are N piles of stones. The i -th pile contains $a[i]$ stones.
- The normal rules of Nim apply, except there is an restriction: a player can only take a perfect square number of stones from a pile.
- A lot more complicated than the original game.

Game 4: Square-number Nim Game

- Common Tweak: Putting limitations / conditions on taking stone.
- Back to our original strategy: decompose the game state into piles, find some properties for each pile, and composing them together to get the answer.
- Consider a single pile with p stones first.

Game 4: Directed Graph

- Consider a single pile with **p** stones first.
- How to determine if it is a P-position or N-position?
- Construct a **directed graph** with **p + 1** nodes, labelled **0** to **p**.
- Node = game state, label = how many stones in the pile at the state.
- Add a directed edge from **u** to **v** if there exist **valid transition** from **u** stones to **v** stones.
- In this game, node 11 would have directed edge to node 10, 7, and 2, corresponding to taking 1, 4, or 9 stones.



Game 4: Dynamic Programming

- We could solve this by dynamic programming then.
 - The terminal vertices (outdegree = 0) are **P-positions**.
 - If a node points to at least one **P-position**, it is a **N-position**.
 - If a node **only** points to **N-position**, it is a **P-position**.
- If there are no cycles in the graph (the game ends in a finite number of moves), the DP could work by updating in topological order.
- Instead of just assigning P/N-position to node, let's assign some integer value to each node like what we do with Nim-values from earlier.



Sprague-Grundy function

- Usually abbreviated as SG function.
- Suppose current game state is X .
- If X is a terminal state, $SG(X) = 0$.
- Otherwise,
 - If positions x_1, x_2, \dots, x_k can be reached from the current state X ,
 - **$SG(X) = \text{mex}(\{SG(x_1), SG(x_2), \dots, SG(x_k)\})$**



MEX (Minimum EXcluded)

- MEX of a set of non-negative integers is the smallest non-negative integer **not** in the set.

Examples:

- $\text{mex}(\{0, 2, 4\}) = 1$
- $\text{mex}(\{0, 5, 1, 3\}) = 2$
- $\text{mex}(\{2, 0, 1\}) = 3$
- $\text{mex}(\{1, 3, 5\}) = 0$
- $\text{mex}(\{\text{all positive integers}\}) = 0$
- $\text{mex}(\text{empty set}) = 0$



SG-function: Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
SG	0											

- $N = 0$ is an ending position $\rightarrow SG(0) = \text{mex}(\{\}) = 0$

SG-function: Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
SG	0	1										

- $SG(1) = \text{mex}(\{SG(0)\}) = \text{mex}(\{0\}) = 1$

SG-function: Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
SG	0	1	2									

- $SG(2) = \text{mex}(\{SG(0), SG(1)\}) = \text{mex}(\{0, 1\}) = 2$

SG-function: Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
SG	0	1	2	3								

- $SG(3) = \text{mex}(\{SG(0), SG(1), SG(2)\}) = \text{mex}(\{0, 1, 2\}) = 3$

SG-function: Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
SG	0	1	2	3	0							

- $SG(4) = \text{mex}(\{SG(1), SG(2), SG(3)\}) = \text{mex}(\{1, 2, 3\}) = 0$

SG-function: Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
SG	0	1	2	3	0	1						

- $SG(5) = \text{mex}(\{SG(2), SG(3), SG(4)\}) = \text{mex}(\{2, 3, 0\}) = 1$

SG-function: Example

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
SG	0	1	2	3	0	1	2	3	0	1	2	3

- $SG(6) = \text{mex}(\{SG(3), SG(4), SG(5)\}) = \text{mex}(\{3, 0, 1\}) = 2$
- $SG(7) = \text{mex}(\{SG(4), SG(5), SG(6)\}) = \text{mex}(\{0, 1, 2\}) = 3$
- $SG(8) = \text{mex}(\{SG(5), SG(6), SG(7)\}) = \text{mex}(\{1, 2, 3\}) = 0$
- $SG(9) = \text{mex}(\{SG(6), SG(7), SG(8)\}) = \text{mex}(\{2, 3, 0\}) = 1$
- $SG(10) = \text{mex}(\{SG(7), SG(8), SG(9)\}) = \text{mex}(\{3, 0, 1\}) = 2$
- $SG(11) = \text{mex}(\{SG(8), SG(9), SG(10)\}) = \text{mex}(\{0, 1, 2\}) = 3$

SG-function: Comparing with P/N-position

- For Take-away game with $K = 3$:

N	0	1	2	3	4	5	6	7	8	9	10	11
SG	0	1	2	3	0	1	2	3	0	1	2	3

N	0	1	2	3	4	5	6	7	8	9	10	11
	P	N	N	N	P	N	N	N	P	N	N	N

SG function: Properties

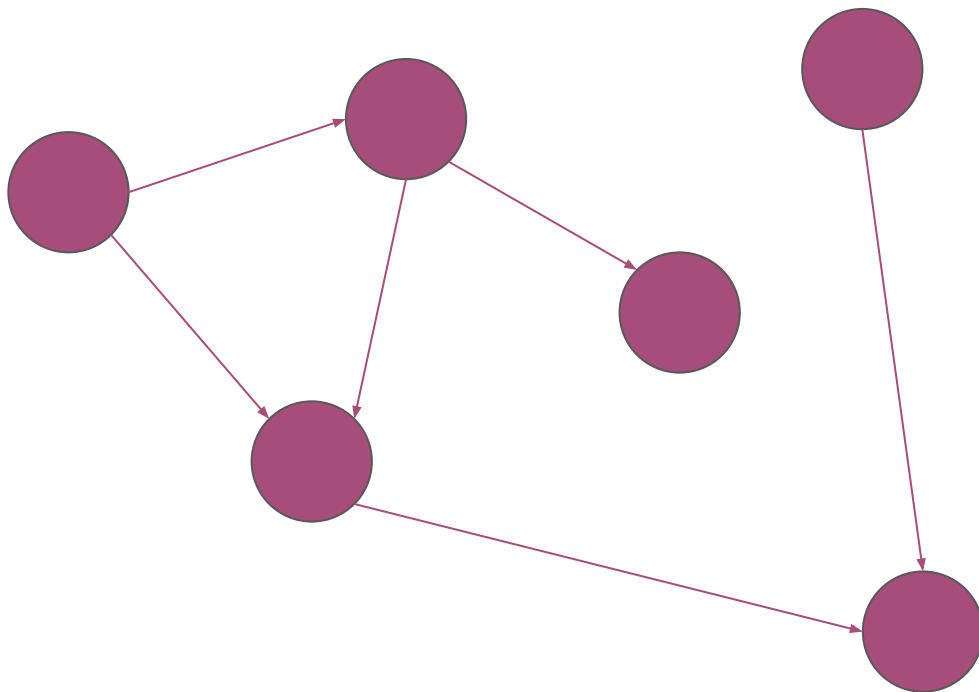
- If SG value = 0,
 - It is a **P-position** (Player 2 wins).
- If SG value $\neq 0$
 - It is a **N-position** (Player 1 wins).
- Any ending position has SG value 0

SG function: Mini-test

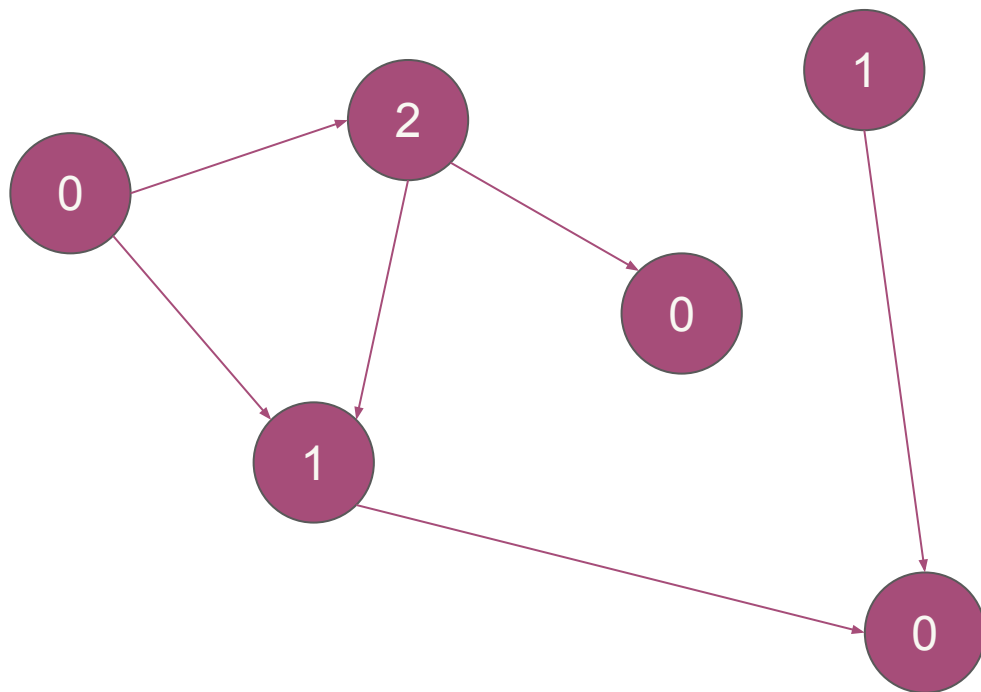
- Given game represented by a DAG (directed acyclic graph).
- Node = Game State
- Edge from Node A to B = one can move from state A to state B
- Fill in the SG values of each state



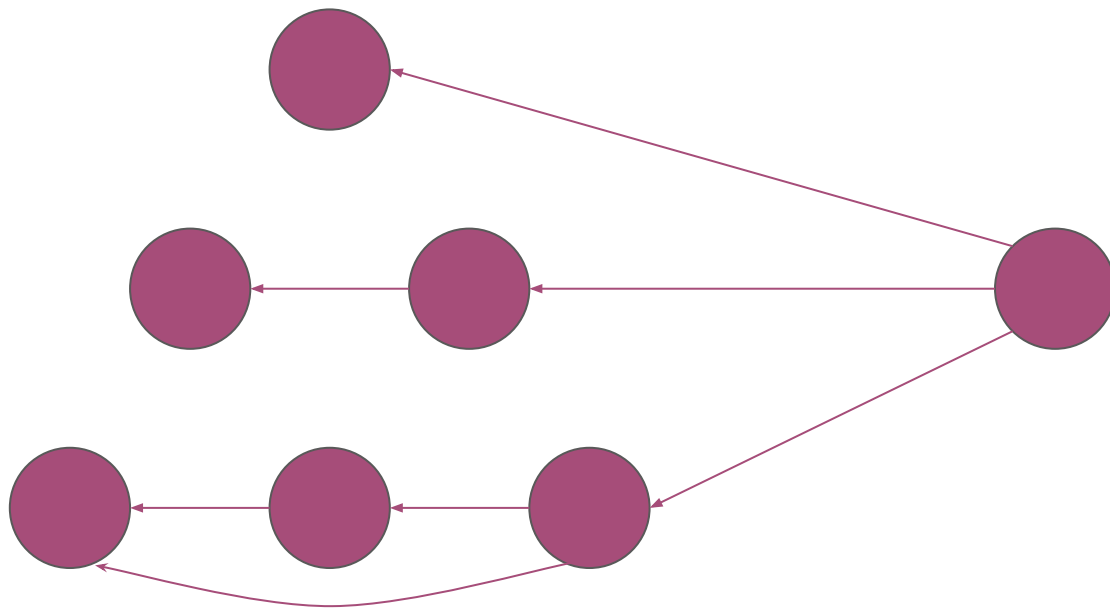
SG function: Mini-test 1



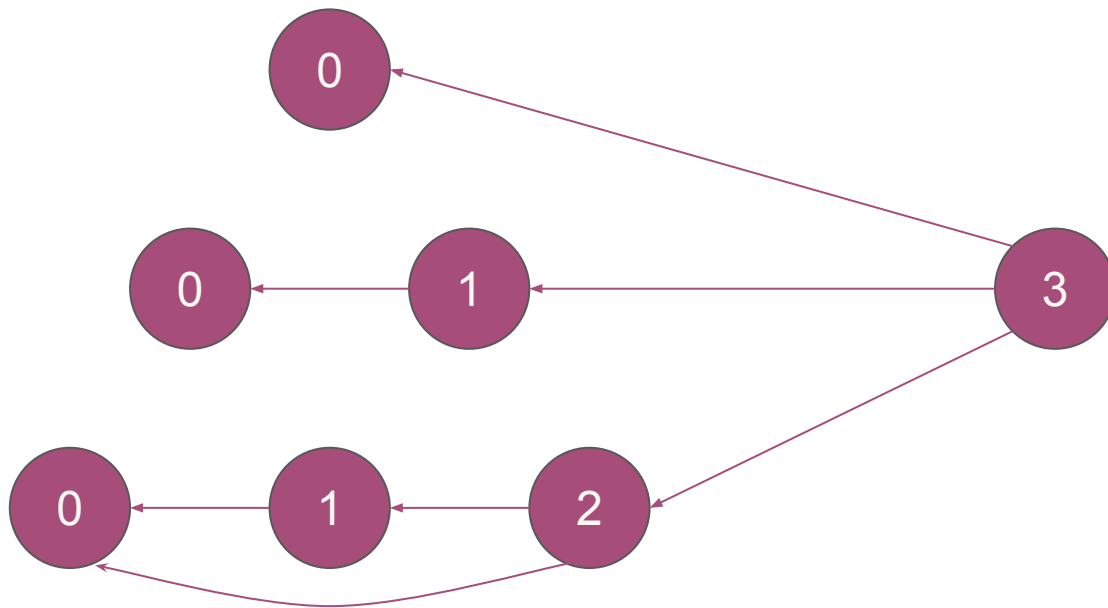
SG function: Mini-test 1 Solution



SG function: Mini-test 2



SG function: Mini-test 2 Solution



SG function: Computation Order

- Any topological ordering works fine.
- In most combinatorial game, the ordering is just 1, 2, 3, ...

Game 4: SG number

- Back to our Square-number Nim Game
- For game with a single pile, we could assign to each state the SG number as denoted above.
- E.g. **$SG(5) = \text{mex}(\{SG(5 - 1), SG(5 - 4)\}) = \text{mex}(SG(4), SG(1)) = \text{mex}(2, 1) = 0$** , which is a P-position (try work this out without SG number).
- How about when there are multiple piles?
- By Mathemagics, we can actually apply the same strategy with Nim-values: **Taking bitwise XOR of each piles' SG number.**

Sprague-Grundy Theorem

- Suppose we have N independent games, $G[1], G[2], \dots, G[N]$, each turn, a player can pick one game and make a valid move in that game.
- Suppose we have analyzed each independent game using SG function.
- Let $P[i]$ be the position in subgame $G[i]$,
- **$SG(P[1], P[2], \dots, P[N]) = SG(P[1]) \oplus SG(P[2]) \oplus \dots \oplus SG(P[N])$**

Game 4: SG number

- For the Square-number Nim Game, we can see that,

N	0	1	2	3	4	5	6
SG	0	1	0	1	2	0	1

- If we have a game state with piles of 1, 2, 3, 4, 6 stones, Nim-sum of this game is $SG(1) \oplus SG(2) \oplus SG(3) \oplus SG(4) \oplus SG(6) = 1 \oplus 0 \oplus 1 \oplus 2 \oplus 1 = 3$
- Player 1 has a winning strategy.
- For normal Nim game, since each state points to every state smaller than it, $SG(p) = p$, with aligned with our results in Game 2.

Game 4: SG number

- Why do this works though?
- The mex function can be viewed as a **promise**: if $\text{SG}(p) = g$, that every integer from **0 to $g - 1$ is available** in the list of valid moves from **p**.
- Then, we can corresponds every pile in our game from **having p stones with weird rules**, to **having $\text{SG}(p) = g$ stones but with normal Nim rules**.

Game 4: SG number

- Then, we can corresponds every pile in our game from **having p stones with weird rules**, to **having $SG(p) = g$ stones but with normal Nim rules**.
- This can be done because in Nim, we can transition from **a pile of size p to any pile of size less than p** .
- For the transformed SG number world, mex property guarantees that we can transition from **a 'pile' of size g to any 'pile' of size less than g** .
- That way, we can tackle any game like normal Nim, which we already know how to deal with.

Game 4: SG number

- Unlike in Nim, in our transformed game, it's possible to transition from a pile of size g to a pile of size **greater than g** .
- E.g. in Square-number Nim, $SG(5) = 0$, while $SG(5 - 1) = SG(4) = 2$, which increase a pile of **size 0 to size 2**.
- Still remember **Game 3** (Nim with addition)?
- If we transition from g to some **larger number h** , by properties of mex, we can visit any numbers from **0 to $h - 1$** . Since $g < h$, we can always transition back to **g** .
- Same as the undo steps in Game 3.

Impartial Combinatorial Game

- **Any impartial combinatorial game** that can be represented as a DAG can be formulated in terms of SG numbers and reduced to normal **Nim** game.
- It is all Nim after all!
- N independent games = N -pile Nim

Blank slide

- Rest / Q&A

Problem-solving session

- Let's solve some game theory problems!
- Solve = Describe an efficient algorithm to find the answer. Not necessarily something 'mathematical' or elegant.

Strategy

- Look for invariants.
- **Try small cases.**
- Analyse the game using SG function.
- Sum of games can be dealt with by Nim-sum (\oplus).
 - No need to worry about “N piles of stones” as long as they are independent.
- If you want to convince yourself, prove your results using induction.

Problem 1

- [[Codeforces 705B](#)]
- N (≤ 100000) piles of stones.
- i -th pile has $a[i]$ ($\leq 1e9$) stones.
- Each move = split a pile of X stone into two piles of Y and Z stones, where $Y > 0, Z > 0, X = Y + Z$
- For each $K \leq N$, determine who wins if the game is played with the first K piles.

Problem 2

- [[HKOI Junior J163](#)]
- N (≤ 50000) piles of stones.
- i -th pile has $s[i]$ ($\leq 1e6$) stones.
- Each round, a value $v[i]$ is decided.
- Each move,
 - add 1 stone to a pile $< v[i]$ stone
 - take away 1 stone from a pile $> v[i]$ stone
- For each $v[i]$, determine who wins.

Problem 3

- [[Codechef June CHCOINSG](#)]
- One pile of N ($\leq 1e9$) stones.
- Each move = remove p^k stones, where p is prime and k is a non-negative integer.
- Determine who wins.

Problem 4

- [[CP-algorithm Crosses-crosses](#)]
- Given a strip of N (≤ 100000) empty cells.
- Each move = put one stone into an empty cell, no two stones can be put into adjacent cells.
- Determine who wins.

Problem 5

- [[Codeforces 36D](#)]
- Given two piles of A and B stones ($A, B \leq 1e9$).
- Each move = remove one stone from one pile or remove $K (\leq 1e9)$ stones from both piles.
- Determine who wins.

Problem 6

- [[Codeforces 1312F](#)]
 - N (≤ 300000) of stones.
 - i -th pile has $a[i]$ ($\leq 1e18$) stones.
 - Each move = decrease $a[i]$ ($a[i] > 0$) by X , Y or Z (≤ 5). (If X , Y , $Z > a[i]$, it will set $a[i]$ to 0)
 - Additional restriction: Decrease by Y cannot be applied to the same pile continuously (same for Z).
-
- Determine who wins & the number of options (i , $X/Y/Z$) the first player can choose in his first move such that the first player can win.

Problem 7

- [[AtCoder Grand Contest 010D](#)]
- N ($\leq 1e5$) positive integers $a[1], a[2], \dots, a[N]$ ($\leq 1e9$).
- $\gcd(a[1], a[2], \dots, a[N]) = 1$.
- Each move = replace an $a[i]$ ($a[i] > 1$) by $a[i] - 1$.
- Afterwards, divide each $a[i]$ by $\gcd(a[1], a[2], \dots, a[N])$.
- Determine who wins.

Summary

- After this training session, you should be able to:
- Identify impartial combinatorial games;
- Use P-N positions/SG function to solve these games;
- Tackle “sum of games” and “splitting into subgames” with ease;
- HAVE FUN solving CGT problems 😊

References

- HKOI training - Game Theory (2019) by Alex Tung
<https://assets.hkoi.org/training2019/game-theory.pdf>
- Codeforces Blog - The Intuition Behind NIM and Grundy Numbers in Combinatorial Game Theory
<https://codeforces.com/blog/entry/66040>

Other Fun Games, Puzzles & Related stuff

- Wythoff Game (explained by James Grime)
<https://www.youtube.com/watch?v=pzIpi7Iji4k>
https://www.youtube.com/watch?v=AYOB-6wyK_I
- Coin Flipping Puzzle (explained by Matt Parker & Grant Sanderson)
<https://www.youtube.com/watch?v=as7Gkm7Y7h4>
https://www.youtube.com/watch?v=wTJI_WuZSwE
- Prisoner Hat Puzzle
<https://www.youtube.com/watch?v=N5vISNXPEwA> (intro by TED-Ed)
https://en.wikipedia.org/wiki/Induction_puzzles (many variants)