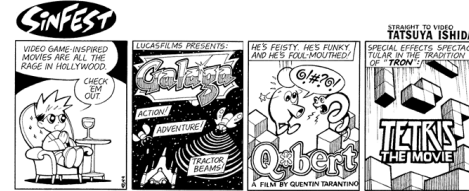


# Introduction To Game Theory: Two-Person Games of Perfect Information and Winning Strategies



## Lecture Outline

- Introduction
- Properties of Games
- Tic-Toe
- Game Trees
- Strategies
- Impartial Games
  - Nim
  - Hackenbush
- Sprague-Grundy Theorem



Wes Weimer, University of Virginia

#2

## Game Theory

- **Game Theory** is a branch of applied math used in the social sciences (econ), biology, compsci, and philosophy. Game Theory studies *strategic* situations in which one agent's success depends on the choices of other agents.



## Broad Applicability

- Finding equilibria (Nash) - sets of strategies where agents are unlikely to change behavior.
- Econ: understand and predict the behavior of firms, markets, auctions and consumers.
- Animals: (Fisher) communication, gender
- Ethics: normative, good and proper behavior
- PolySci: fair division, public choice. Players are voters, states, interest groups, politicians.
- PL: model checking interfaces can be viewed as a two-player game between the program and the environment (e.g., Henzinger, ...)

#4

## Game Properties

- **Cooperative** (binding contracts, coalitions) or **non-cooperative**
- **Symmetric** (chess, checkers: changing identities does not change strategies) or **asymmetric** (Axis and Allies, Soulcalibur)
- **Zero-sum** (poker: your wins exactly equal my losses) or **non-zero-sum** (prisoner's dilemma: gain by me does not necessarily correspond to a loss by you)

#5

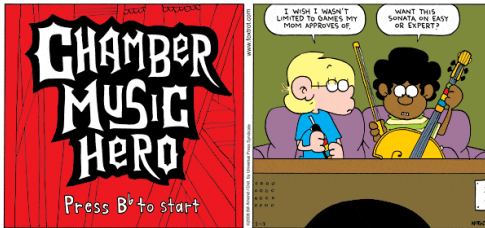
## Game Properties II

- **Simultaneous** (rock-paper-scissors: we all decide what to do before we see other actions resolve) or **sequential** (your turn, then my turn)
- **Perfect information** (chess, checkers, go: everyone sees everything) or **imperfect information** (poker, Catan: some hidden state)
- **Infinitely long** (relates to set theory) or **finite** (chess, checkers: add a "tie" condition)

#6

## Game Properties III

- **Deterministic** (chess, checkers, rock-paper-scissors, tic-tac-toe: the “game board” is deterministic, even if the players are not) vs **non-deterministic** (Yahtzee, Monopoly, poker: you roll dice or draw lots)
- More later ...



## Game Representation

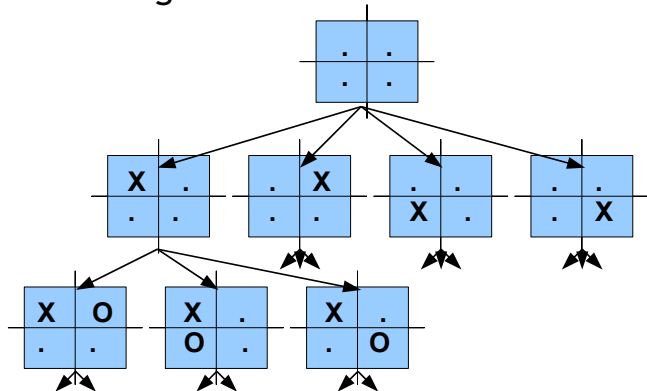
- We will represent games as **trees**
  - Tree of all possible game instances
- There is one **node** for every possible state of the game (e.g., every game board configuration)
  - **Initial Node:** we start here
  - **Decision Node:** I have many moves
  - **Terminal Node:** who won? what's my score?

## Introducing: Tic-Toe

- **Tic-Toe** is like Tic-Tac-Toe, but on a 2x2 board where two-in-a-row wins (not diagonal).
  - X goes first
  - Resolutions: X wins, tie, X loses
- Example game:
  - Later: Does X always win?
  - Later: Does X always win if X is smart?

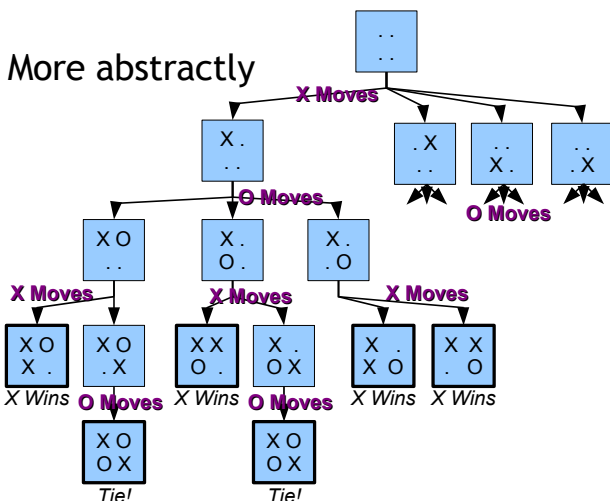
## Tic-Toe Trees

- Partial game tree for Tic-Toe



## Tic-Toe Trees

- More abstractly



## More Definitions

- An **instance of a game** is a path through a game tree starting at the initial node and ending in a terminal node.
- **X's moves** in a game instance P are the set of edges along that path P taken from decision nodes labeled “X moves”.
- A **strategy for X** is a function mapping decision each node labeled “X moves” to a single outgoing edge from that node.

## Still Going!

- A deterministic strategy for X, a deterministic strategy for O, and a deterministic game lead deterministically to a single game instance
  - Example: if you always play tic-tac-toe by going in the uppermost, leftmost available square, and I always play it by going in the lowermost, rightmost available square, every time we play we'll have the same result.
- Now we can study various strategies and their outcomes!

#13

## Winning Strategies

- A **winning strategy for X** on a game G is a strategy S1 for X on G such that, **for all** strategies S2 for O on G, the result of playing G with S1 and S2 is a win for X.
- Does X have a winning strategy for Tic-Toe?
- Does O have a winning strategy for Tic-Toe?
- **Fact:** If the first player in a turn-based deterministic game has a winning strategy, the second player cannot have a winning strategy.
  - Why?

#14

## Impartial Games

- An **impartial** game has (1) allowable moves that depend only on the position and not on which player is currently moving, and (2) symmetric win conditions (payoffs).
  - Only difference between Player1 and Player2 is that Player1 goes first.
- This is not the case for Chess: White cannot move Black's pieces
  - So I need to know which turn it is to categorize the allowable moves.
- A game that is not impartial is *partisan*.

#15

## Nim

- **Nim** is a two-player game in which players take turns removing objects from distinct heaps.
  - Non-cooperative, symmetric, sequential, perfect information, finite, **impartial**
- One each turn, a player **must remove** at least one object, and may remove **any number of** objects provided they all come from the **same heap**.
- If you cannot take an object, **you lose**.
- Similar to Chinese game "Jianshizi" ("picking stones"); European refs in 16<sup>th</sup> century

#16

## Example Nim

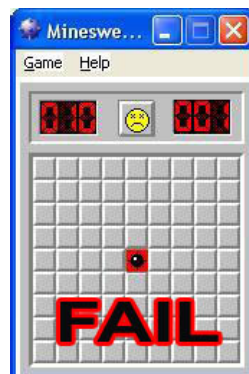
- Start with heaps of 3, 4 and 5 objects:
  - AAA, BBBB, CCCCC
- Here's a game:
 

- AAA	BBBB	CCCCC	I take 2 from A
- A	BBBB	CCCCC	You take 3 from C
- A	BBBB	CC	I take 1 from B
- A	BBB	CC	You take 1 from B
- A	BB	CC	I take all of A
-	BB	CC	You take 1 from C
-	BB	C	I take 1 from B
-	B	C	You take all of C
-	B		I take all of B
-			You lose! (you cannot go)

#17

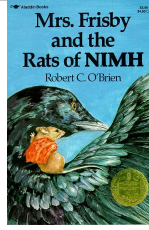
## Real-Life Nim Demo

- I will now play Nim against audience members.
- Starting Board: 3, 4, 7
  - AAA, BBBB, CCCCCC
- You go first ...



#18

## The Rats of NIM



- How did I win every time?
  - Did I win every time? If not, pick on me mercilessly.
- Nim can be mathematically solved for any number of initial heaps and objects.
- There is an easy way to determine which player will win and what winning moves are available.
  - Essentially, a way to evaluate a board and determine its payoff / goodness / winning-ness.

#19

## Analysis

- You lose on the empty board.
- Working backwards, you also lose on two identical singleton heaps (A, B)
  - You take one, I take the other, you're left with the empty board.
- By **induction**, you lose on two identical heaps of *any size* ( $A^n, B^n$ )
  - You take  $x$  from heap A. I also take  $x$  from heap B, reducing it to a smaller instance of "two identical heaps".

#20

## Analysis II

- On the other hand, you win on a board with a singleton heap (C).
  - You take C, leaving me with the empty board.
- You win with a single heap of any size ( $C^n$ ).
- What if we add these insights together?
  - (AA, BB) is a loss for the current player
  - (C) is a win for the current player
  - (AA, BB, C) is what?

#21

## Analysis III

- (AA, BB, C) is a win for the current player.
  - You take C, leaving me with (AA, BB) - which is just as bad as leaving me with the empty board.
- When you take a turn, it becomes my turn
  - So leaving me with a board that would be a loss for you, if it were your turn
  - ... becomes a win for you!
- (AAA, BBB, C) - also a win for Player1.
- (AAAA, BBBB, CCCC) - also a win for Player1.

#22

## Generalize

- We want a way of evaluating nim heaps to see who is going to win (if you play optimally).
- Intuitively ...
- Two equal subparts cancel each other out
  - (AA, BB) is the same as the empty board ( , )
- Win plus Loss is Win
  - (CC) is a win for me, (A,B) is a loss for me, (A,B,CC) is a win for me.
- What do we know that's kind of like addition but cancels out equal numbers?

#23

## The Trick!

- **Exclusive Or**
  - XOR,  $\oplus$ , vector addition over  $GF(2)$ , or *nim-sum*
- If the XOR of all of the heaps is 0, you lose!
  - empty board = 0 = lose
  - (AAA, BBB) =  $3 \oplus 3 = 0 =$  lose
- Otherwise, goal is to leave opponent with a board that XORs to zero
  - (AAA, BBB, C) =  $3 \oplus 3 \oplus 1 = 1$ , so move to
    - (AAA, BBB) or (AA, BBB, C) or (AAA, BB, C)

#24

## Real-Life Nim Demo II

- I played Nim against audience members.
- Starting Board: 3, 4, 7
  - AAA, BBBB, CCCCCC
- The nim sum is  $3 \oplus 4 \oplus 7 = 0$ 
  - A loss for the first player!
- This time, I'll go first.
- You, the audience, must beat me. Muahaha!



#25

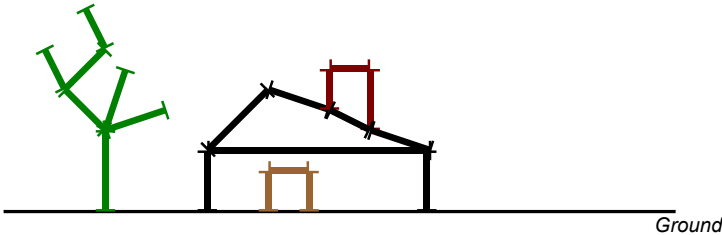
## Hackenbush

- **Hackenbush** is a two-player impartial game played on any configuration of line segments connected to one another by their endpoints and to a **ground**.
- On your turn, you “cut” (erase) a line segment of your choice. Line segments no longer connected to the ground are erased.
- If you cannot cut anything (empty board) you lose.

#26

## Hackenbush Example

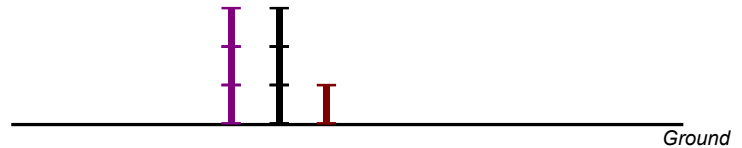
- Each  $\text{—}$  is a line segment. Ignore color.
- Let's play! I'll go first.



#27

## Hackenbush Subsumes Nim

- Consider (AAA, BBB, C) = (3, 3, 1) in Nim
- Who wins this *completely unrelated* Hackenbush game?



#28

## A Thorny Problem

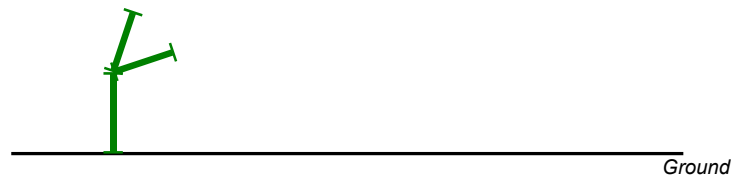
- What about that Hackenbush tree?
- What value (nim-sum) does it have? Who wins?



#29

## A Simple Twig

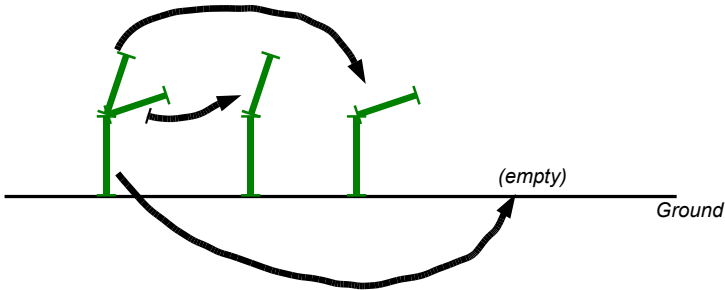
- Consider a simpler tree ...
- What moves do you have?



#30

## Twig Analysis

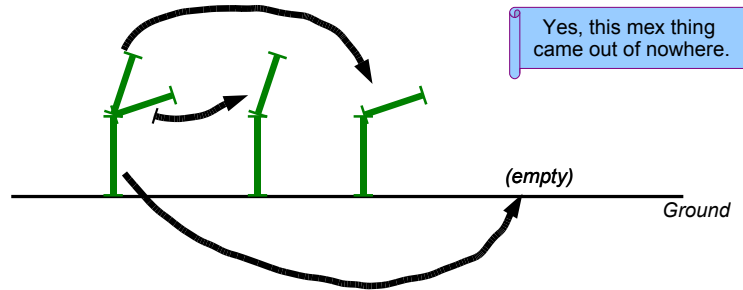
- Consider a simpler tree ...
- What moves do you have?



#31

## Maximum Excluded

- You can move to “2”, “2” or “0”.
- The *minimal excluded* of (2,2,0) is 1
  - $\text{mex}(2,2,0) = 1 = \text{value of that twig}$



#32

## Game Equivalence

- I've claimed that the twig has nim-sum 1
- How to prove that? When are games equal?
- We write  $G \approx G'$  when **G is equivalent to G'**.
- **Lemma 1.** Iff  $G \approx G'$  then for all H,  $G \oplus H \approx G' \oplus H$ .
- **Lemma 2.**  $G \oplus G \approx 0$ .
- **Lemma 3.**  $G \approx G'$  if and only if  $G \oplus G' \approx 0$ .
  - Restated:  **$G \approx G'$  iff  $G \oplus G'$  is a loss for Player 1.**
  - If  $G \approx G'$ , then  $G \oplus G \approx G \oplus G'$  (by Lemma 1).
  - Since  $G \oplus G \approx 0$  (by Lemma 2), we have  $0 \approx G \oplus G'$ .

#33

## A Simple Twig

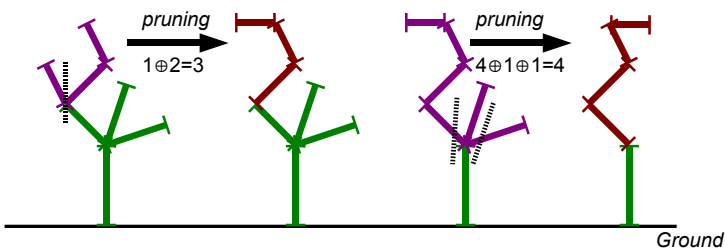
- So  $\text{twig} \approx 1$  if  $\text{twig} \oplus 1 \approx 0$
- $\text{twig} \oplus 1 \approx 0$  means  $\text{twig} \oplus 1$  is a first-player loss
  - You go first; two trials against me to verify ...



#34

## Generalized Pruning

- Can replace any subtree above a single branch point with the XOR of those branches
  - Via similar game-equivalence argument

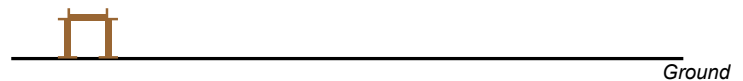


The whole tree has value “5”.

#35

## Door Analysis

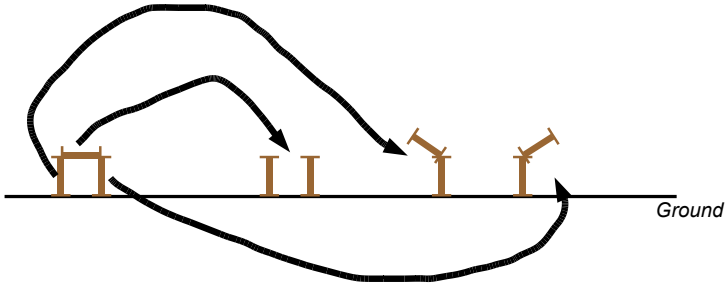
- What about cycles?
- What is the value (nim-sum) of this door?



#36

## Door Analysis

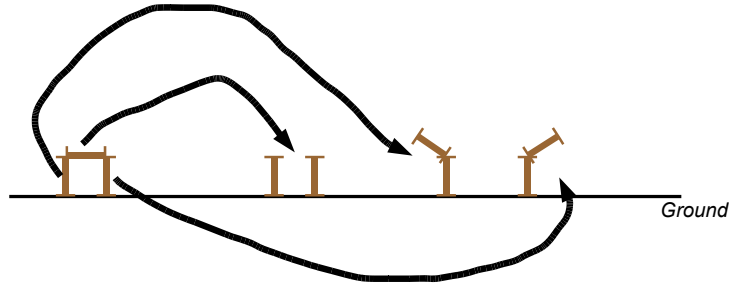
- Well, what moves can you take from here?



#37

## Door Analysis

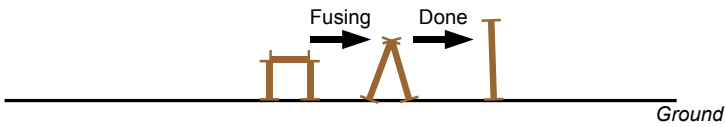
- You can move to "0", "2" or "2".
  - $\text{mex}(2,2,0) = 1$  (recall: minimal excluded)
  - Value of door = 1



#38

## Fusion Principle

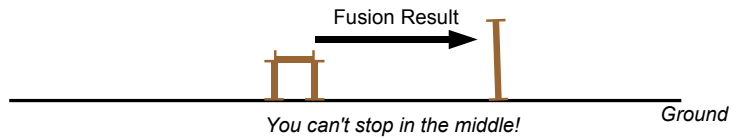
- We may replace any cycle with an equivalent subgraph where all of the non-ground vertices of that cycle are fused into one vertex and all of the ground vertices of that cycle are fused into another vertex.



#39

## Fusion Principle

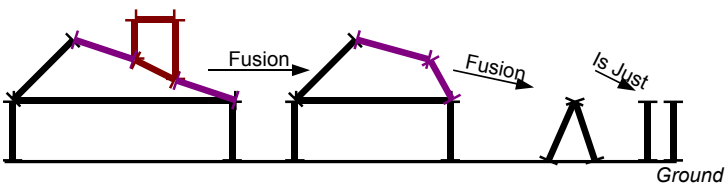
- We may replace any cycle with an equivalent subgraph where all of the non-ground vertices of that cycle are fused into one vertex and all of the ground vertices of that cycle are fused into another vertex.



#40

## Cold Fusion

- Let's boil the house down to something simple!



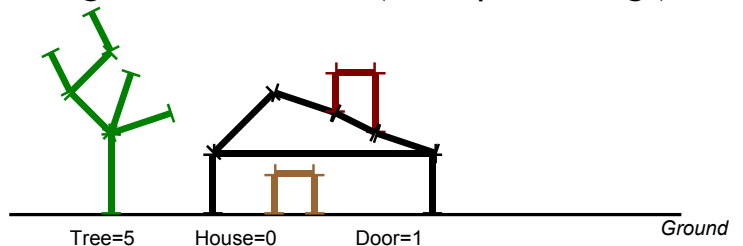
The whole house has value  $1 \oplus 1 = 0$ .

How would I check that?

#41

## Hackenbush Example

- This board has value  $5 \oplus 0 \oplus 1 = 4$ .
- You go first. Beat me. (Time permitting.)



#42

## Why Do We Care?

- ... about Nim and Hackenbush?
- **Theorem (Sprague-Grundy, '35-'39). Every impartial game is equivalent to a nim sum.**
- Proof: How?
  - Hint: what is the most important proof technique in computer science?

#43

## Why Do We Care?

- ... about Nim and Hackenbush?
- **Theorem (Sprague-Grundy, '35-'39). Every impartial game is equivalent to a nim sum.**
- Proof: By structural **induction** on the set (tree) representing the game.
  - Proof not shown here
  - Proof sketch can be found at end of slide set

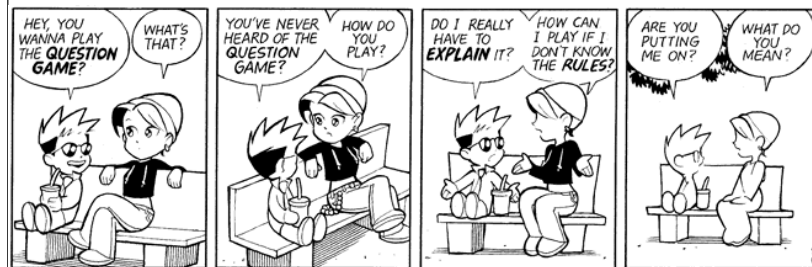
#44

## Old-School CS Work

- Explore a new formalism
- Define properties and categories
- Investigate a few popular instances
- Show that many interesting instances are in fact in the **same equivalence class**
- ... and thus that your results about that equivalence class have broad applicability.
- **Today: all impartial games are just nim!**

#45

## Questions?



#46

## Sprague-Grundy Proof!

- **Theorem (Sprague-Grundy, '35-'39). Every impartial game is equivalent to a nim sum.**
- Proof: By structural **induction** on the set (tree) representing the game.
  - Let  $G = \{G_1, G_2, \dots, G_k\}$ .  $G_i$  is the game resulting if the current player takes move  $i$ .
  - By IH, each  $G_i$  is a nim sum,  $G_i \approx N_i$ .
  - Let  $m = \text{mex}(N_1, N_2, \dots, N_k)$ . We'll show:  $G \approx m$ .

#47

## Sprague-Grundy Proof

- Let  $G' = \{N_1, N_2, \dots, N_k\}$ . Then  $G \approx G'$ . Why?
  - Player 1 makes a move  $i$  in  $G$  to  $G_i \approx N_i$ . Then Player 2 can make a move equivalent to  $N_i$  in  $G'$ . So the resulting game is a first-player loss, so by Lemma 3,  $G \approx G'$ .
- To show  $G \approx m$ , we'll show  $G+m$  is a first-player loss.
- We'll give an explicit strategy for the second player in the *equivalent*  $G'+m$ .

#48



## Sprague-Grundy Proof II

- To Show: P2 Wins in  $G+m$
- Suppose P1 moves in the  $m$  subpart to some option  $q$  with  $q < m$ . But since  $m$  was the minimal excluded number, P2 can move in  $G'$  to  $q$  as well.
- Suppose instead P1 moves in the  $G'$  subpart to the option  $N_i$ .
  - If  $N_i < m$  then P2 moves in the  $m$  subpart from  $m$  to  $N_i$ .
  - If  $N_i > m$  then P2, using the IH, moves to  $m$  in the  $G'$  subpart (which has been reduced to the smaller game  $N_i$  by P1's move). There must be such a move since  $N_i$  is the mex of options in  $N_i$ . If  $m < N_i$  were not a suboption, the mex would be  $m$ !
- Therefore,  $G+m$  is a first-player loss. By Lemma 1,  $G+m$  is a first-player loss. So  $G=m$ . QED.