

# CS 2

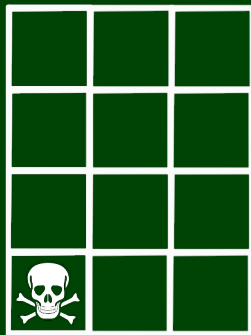
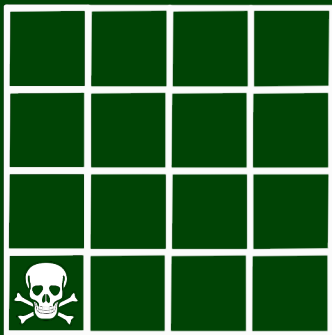
## Introduction to Programming Methods

# Games: Part I



## Chomp!

Two players. On their turn, a player chooses a square on the chocolate bar and eats all squares above and to the right. The player who is forced to eat the “poison” square in the bottom left loses.



If we assume optimal play, who wins in each game? Why?



- AI testbed

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- Beautiful Mathematical theory

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- Beautiful Mathematical theory
- Complexity Theory research
- Application of data structures such as trees and graphs
- Fusion of math and programming



Garry Kasparov, left, playing against the I.B.M. Deep Blue computer in the sixth and final game of a match in New York in May 1997. The computer's pieces were moved by Joseph Hoane, right, an I.B.M. scientist. Stan Honda/Agence France-Presse — Getty Images

# *Computer Checkers Program Is Invincible*



By Kenneth Chang

July 19, 2007

For an exercise in futility, go play checkers against [a computer program named Chinook](#).

Developed by computer scientists at the University of Alberta in Canada, Chinook vanquished human competitors at tournaments more than a decade ago. Now, in an article published today on the Web site of the journal Science, the scientists report that they have rigorously proved that Chinook, in a slightly improved version, cannot ever lose. An opponent, no matter how skilled, practiced or determined, can at best achieve a draw.

## *Daily Report: AlphaGo Shows How Far Artificial Intelligence Has Come*



The Google artificial intelligence program AlphaGo beat the top-ranked Chinese Go player, Ke Jie, in Wuzhen, China, in the first game of a three-game match. Wu Hong/European Pressphoto Agency

NEWS · 30 OCTOBER 2019

## Google AI beats top human players at strategy game *StarCraft II*

DeepMind's AlphaStar beat all but the very best humans at the fast-paced sci-fi video game.

NEWS · 30 NOVEMBER 2020

## **‘It will change everything’: DeepMind’s AI makes gigantic leap in solving protein structures**

Google’s deep-learning program for determining the 3D shapes of proteins stands to transform biology, say scientists.

## Definition (Combinatorial Game)

A two-player game with **perfect information** (i.e., no hidden state) and no **randomness** in which the players alternate turns. Certain positions in the game are denoted “terminal” and the game ends if any of these positions are reached.

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## Definition (Partisan Game)

A combinatorial game in which players may have different moves available based on their identity.



## "Game" Plan



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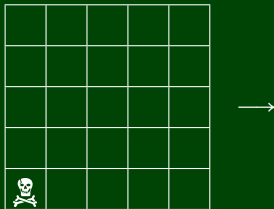
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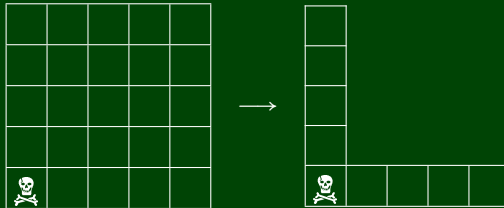
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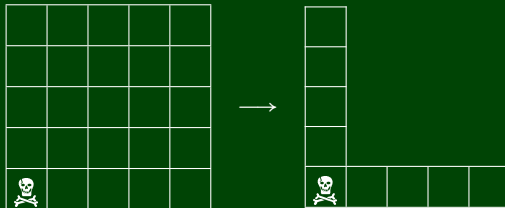
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This series of topics very nicely underlines the core material in this course.







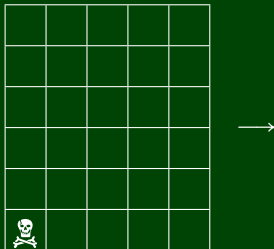


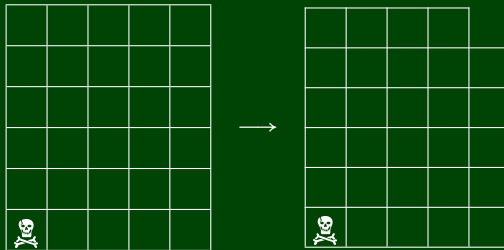
### Mirroring

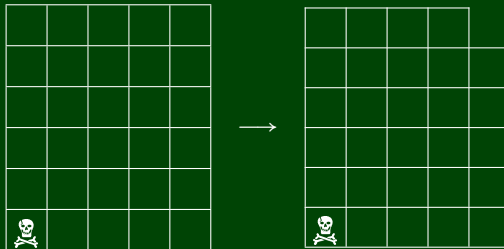
On a square Chomp! board, the first player has a winning strategy:

- Choose  $(2,2)$  as the first move.
- For all remaining moves, **mirror** the other player across the diagonal.

**Mirroring is highly effective!**







### Strategy Stealing

**Claim:** Player 1 has a winning strategy on a rectangular board.

**Proof:** Consider the move that eats only the top right square. If this position “leads” to a win, make that move. If it doesn’t, then player 2 has a winning move. Note that since the remaining board is a strict sub-board of the original one, the first player could have made that winning move!

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- All terminal positions are P-Positions.
- From every P-Position, all moves are to N-Positions.
- From every N-Position, there is a move to a P-Position position.

Let's play a game...



## Nim

Two player game. On your turn, you may take any number of coins **from a single pile**. If you cannot take at least one coin, you lose.

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## Too Easy...

- $\mathcal{P} = \{0\}$
- $\mathcal{N} = \mathbb{N} \setminus \{0\}$

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**How about three piles? How about  $n$  piles?**



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- Consider the left-most bit of  $X$ , where  $d_i = 1$ . (This exists because  $X \neq 0$ .)
- Choose  $x_j$  such that the  $i$ th bit of  $x_j$  is also 1. (If they were all zeroes,  $d_i$  would also be zero.)
- Choose  $x'_j$  such that the  $i$ th bit of  $x_j$  is flipped iff  $d_i = 1$ .

Trivially,  $X \oplus x_j \oplus x'_j = 0$ , because we rigged it that way above. Also,  $x'_j < x_j$ , because the most significant bit we flipped was  $1 \rightarrow 0$ .