### Reinforcement Learning (INF11010)

#### Lecture 15b: Minimax Search

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 Shannon, Claude E. (1950) "XXII. Programming a computer for playing chess."

## Minimax Search



## Combining Minimax search with RL

- If the tree becomes intractable, we can stop branching out early, and using some heuristic evaluation of the leaf nodes, compute an optimal policy up till then.
- There are good examples of applications that did well using only minimax search and handcrafted features and weights for a linear approximation of the state value (no RL methods).
- For example Deep Blue [Newborn, Monty. (2000) "Deep Blue's contribution to AI."].

# Combining Minimax search with RL

- The evaluation at the leaves can also be computed by using Monte Carlo or TD methods over simulations, typically with function approximation.
- There exist different methods for updating the value function, by propagating the error to the root or leaf nodes of the branched out trees. (e.g. TD leaf, TD root).
- Such problems can also be solved by ignoring the Minimax solution, and just applying, e.g., TD with the other agent(s) as part of the environment, or by *self-play*.
- For example, TD-Gammon [Tesauro, Gerald (1995) "Temporal difference learning and TD-Gammon." ].
- Alternatively, we can compute the value function with RL offline, and then use minimax search online, using the evaluations at the root nodes.