

# Heuristics

## Don't Let "Perfect" be the Enemy of "Good Enough"

- We use algorithms (recipes) to solve problems.
  - Each *instance* of a problem is a unique set of inputs.
  - For example, long division (on paper) is one algorithm for dividing two numbers
  - Some instances of this problem are:
    - $100 \div 5$ ,  $8 \div 2$ ,  $33 \div 11$

A handwritten long division problem showing 3 dividing 1641. The quotient 547 is written above the dividend. The dividend 1641 has a red '1' at the end. The division steps are: 3 goes into 16 five times (15), 3 goes into 14 four times (12), and 3 goes into 21 seven times (21). The final remainder is 0.

$$\begin{array}{r} 547 \\ 3 \overline{) 1641} \\ \underline{15} \phantom{0} \\ 14 \phantom{0} \\ \underline{12} \phantom{0} \\ 21 \\ \underline{21} \\ 0 \end{array}$$

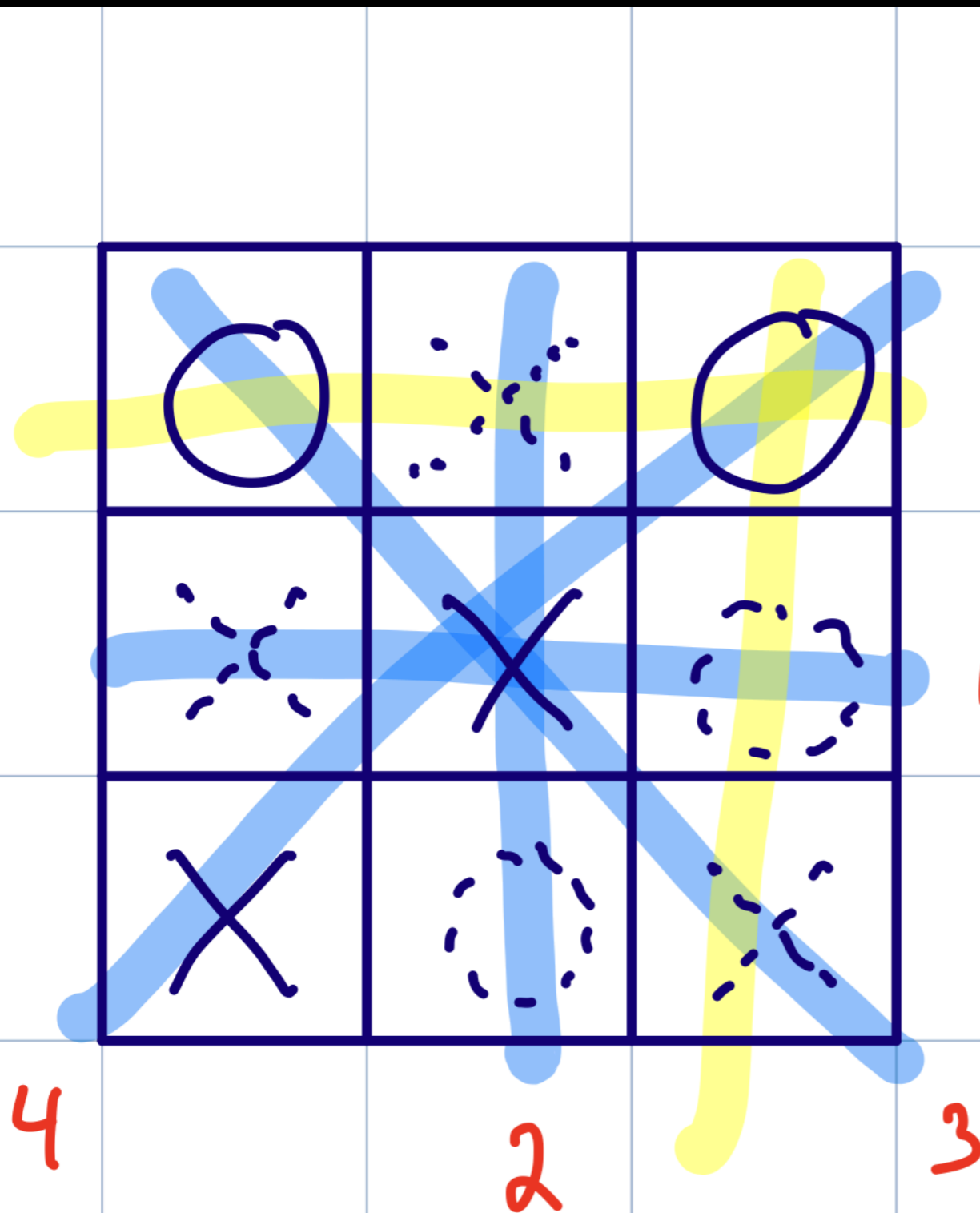
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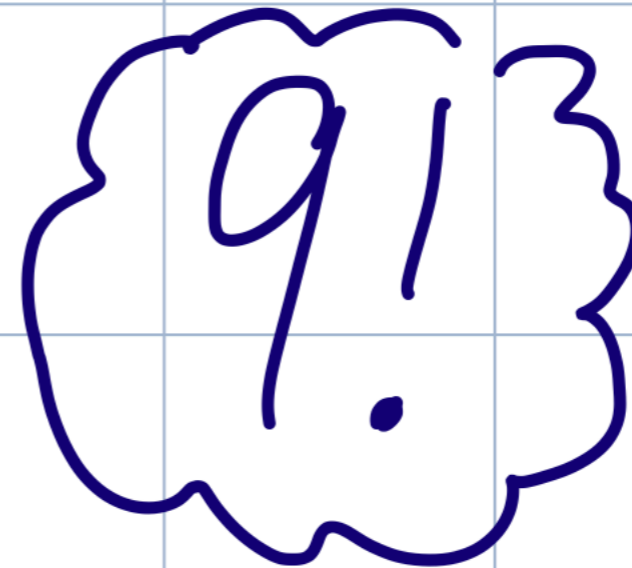
- Have you ever played Tic Tac Toe?
  - Play a game with a friend right now.
    - As you play, think out loud please.
    - What are you considering as you decide where to play next?

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9.8.7. ...:2.1



362,880

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- Tic Tac Toe is an example of *factorial time* problem.
  - For the first move, there are 9 possible locations.
  - For the second move, there are 8 possible locations, and so on.
  - So, very roughly,  $O(n!)$
  - It's beyond the scope of the course to formally analyze the complexity of Tic Tac Toe, but it's an example of a *superpolynomial* time problem.

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- There are different categories of problems, too.
  - Delivery company scheduling drivers to deliver packages to final destinations on the most efficient route (like UPS or Fedex) ... these are *optimization* problems
  - Some problems, like finding whether a given number is even, is easy – that is a *decision* problem.
    - An example of a hard decision problem is deciding whether two numbers have exactly two prime factors.
      - e.g.: 39 is a "yes" ( $3 \times 13$ )
      - 32,616,811 is a "yes" ( $1321 \times 24691$ )

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- As numbers get larger, determining whether there are exactly two prime factors takes a long time, but it *is* something that will result in a yes or no answer.
- Some problems are *undecidable*.
  - The best example of this is analyzing a program – code verification.
    - For all possible inputs, will the program result in an infinite loop?
    - Or will it halt?

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- You will read more about categories of problems in the suggested exercises, with a *lot* of detail.
  - It's *not required* to be able to identify whether a given problem is undecidable or not.
  - You simply need to be *aware of* the different categories of problems identified just now.

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- Summary:
  - A *decidable* problem is a decision problem for which it is possible to obtain a yes or no answer.
  - An *undecidable* problem is one for which no algorithm can be constructed that is *always capable* of providing a yes or no answer.
  - An undecidable problem may have some instances that have a solution, but there is no algorithmic solution that could solve *all* instances of the problem.

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- Now consider games like checkers, or chess.
- Analyzing all possible game outcomes from a single move (a brute-force approach) is way too much work to complete in a *reasonable* amount of time – even for a computer.
- A more common approach is to choose a move that *most likely* results in an advantageous position, but *might not* be the absolutely best move.
  - This is known as applying a *heuristic*.

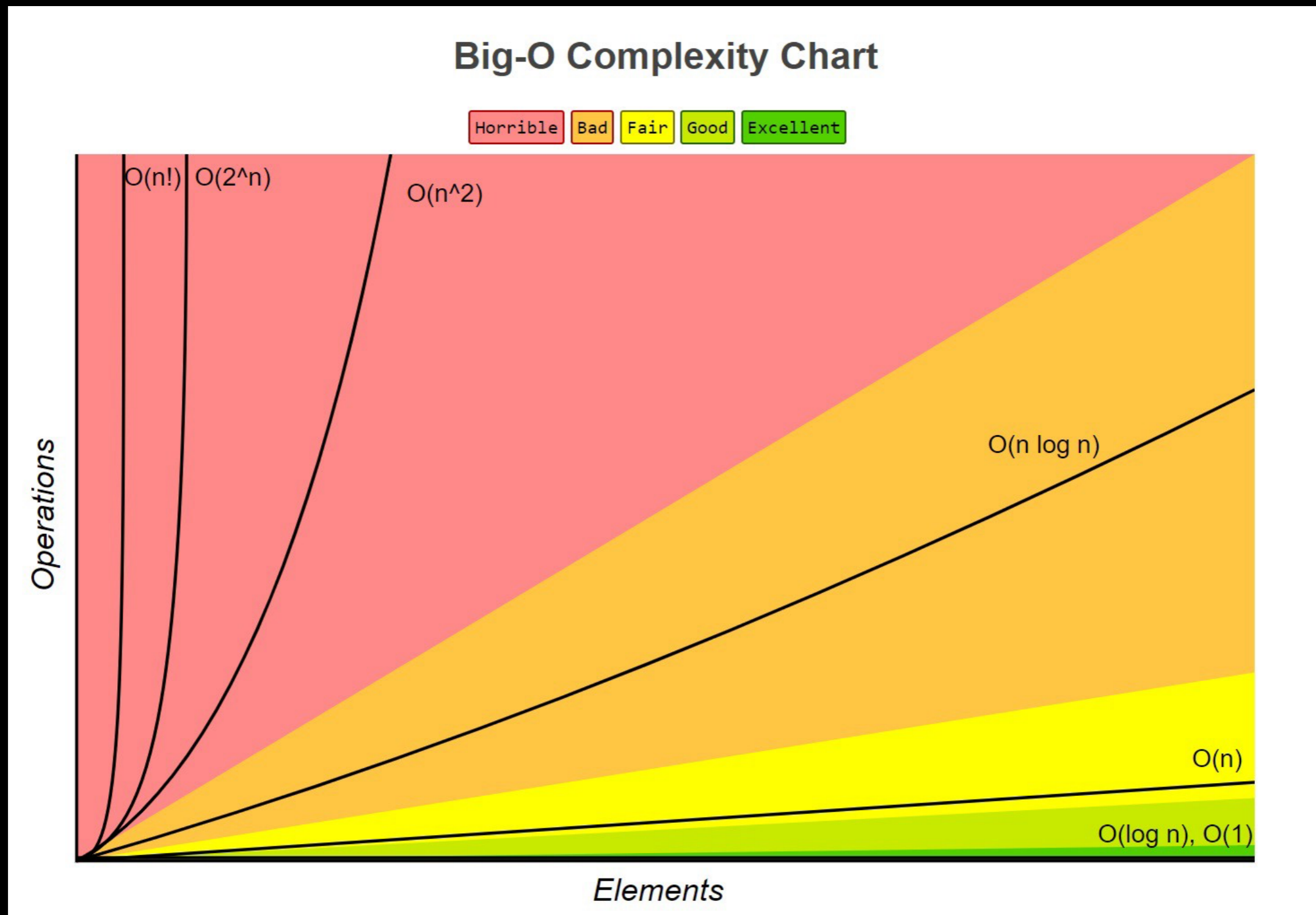
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- Programs that can solve a problem in *reasonable* amount of time are those whose runtimes increase no more than a *polynomial* function of  $n$ .
  - $O(1)$ ,  $O(\log n)$ ,  $O(n)$ ,  $O(n \log n)$ ,  $O(n^2)$
  - $O(n^2)$  is not awesome for high values of  $n$ , but it's still classified as having *reasonable* time complexity.
- Programs that run in an *unreasonable* amount of time have *superpolynomial* time complexities.
  - $O(2^n)$ ,  $O(n!)$

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## Don't Let "Perfect" be the Enemy of "Good Enough"

- When all possible outcomes of a problem cannot be found in a *reasonable* amount of time, a heuristic approach can provide a "good enough" solution.
- There are many heuristics that are used for a variety of problems.
- This can be hard to imagine, so here's a nice illustration of heuristics that can be applied to a classic computer science dilemma:
  - "Travelling Salesperson Problem"

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# Suggested Exercises

## Heuristics & Undecidable problems

- From Khan Academy, finish this module and it's related quiz:
  - Solving hard problems
    - NOTE: Undecidable problems gives a great example, but with far more detail than you'll need to know for the AP CSP exam.

Using heuristics

Undecidable problems