## Task Scheduling

A Lecture in CE Freshman Seminar Series:
Ten Puzzling Problems in Computer Engineering


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## About This Presentation

This presentation belongs to the lecture series entitled "Ten Puzzling Problems in Computer Engineering," devised for a ten-week, one-unit, freshman seminar course by Behrooz Parhami, Professor of Computer Engineering at University of California, Santa Barbara. The material can be used freely in teaching and other educational settings. Unauthorized uses, including any use for financial gain, are prohibited. © Behrooz Parhami

| Edition | Released | Revised | Revised | Revised | Revised |
| :--- | :--- | :--- | :--- | :--- | :--- |
| First | May 2007 | May 2008 | May 2009 | May 2010 | May 2011 |
|  |  | May 2012 | May 2015 | May 2016 | May 2020 |
|  |  |  |  |  |  |

## Mini-Sudoku Puzzle

Complete entries in this chart so that numbers 1-6 appear without repetition in each row, each column and each $2 \times 3$ block

Standard Sudoku consists of a $9 \times 9$ chart, but this mini version is good for a quick fix

The following site carries mini-Sudoku puzzles:
https://sudoku.cool/mini-sudoku.php
Sudoku isn't a math puzzle: We can use the letters A-F, or any other six symbols, instead of the numbers 1-6

## Mini-Sudoku Puzzle: Solution Method

Complete entries in this chart so that letters A-F appear without repetition in each row, each column and each $2 \times 3$ block

To continue from here, write down all possible choices in the remaining blank boxes and see whether the resulting info leads to more progress

SuDoKu: abbr. in Japanese for "numbers must be single." Euler may have invented it; Howard Garns (US) \& Wayne Gould (НК) popularized it in modern times


## Sudoku Puzzle: Easy Example

Complete entries in this chart so that numbers 1-9 appear without repetition in each row, each column and each $3 \times 3$ block

Many newspapers carry these puzzles; there are also many collections in book form

Sudoku puzzles of varying difficulties (easy, medium, hard, evil) are available at http://www.websudoku.com and several other Web sites, such as USA Today's site http://puzzles.usatoday.com

## Sudoku Puzzle Solution Method

Strategy 2: When you can't make progress by Strategy 1, write down all candidate numbers in the cells and try to eliminate a number of options via reasoning. For example if $x y, x y$, xyz are candidates in three cells of a block, then the cell marked xyz must hold z

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## Sudoku Puzzle: Hard Example

Complete entries in this chart so that numbers 1-9 appear without repetition in each row, each column and each $3 \times 3$ block

Hard puzzles typically have fewer entries supplied, with each row, column, or block containing only a few entries
Hard puzzles may have handles or starting points ( 5 in the top left block or 9 in center and lower right blocks)

|  |  |  | 6 |  | 8 |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  |  | 4 |  |  |  |  |  | 5 |
|  |  | 1 |  | 5 |  |  | 6 | 4 |
|  | 3 | 9 | 4 |  |  |  |  | 1 |
|  |  |  |  | 2 |  |  |  |  |
| 5 |  |  |  |  | 1 | 7 | 9 |  |
| 8 | 5 |  |  | 3 |  | 1 |  |  |
| 9 |  |  |  |  |  | 2 |  |  |
|  |  |  | 9 |  | 6 |  |  |  |

## Constructing a (Mini-)Sudoku Puzzle

Begin with a completed puzzle and one by one remove selected entries that can be deduced from the remaining ones

This will ensure a unique solution, which is a desirable attribute

Q1: Remove additional entries from this puzzle while maintaining the uniqueness of solution

Q2: Build a $4 \times 4$ puzzle with unique solution and the fewest initial entries.

|  | 2 |  | 4 |  | 3 |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 3 |  | 4 |  |  | 1 |
| 6 | 4 | 3 | 1 |  |  |
| 2 | 1 | 5 | 3 | 4 | 6 |
| 4 | 3 | 2 | 6 | 1 | 5 |
|  |  |  |  | 3 | 4 |

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## Interesting Facts about Sudoku

Theoretically, $n^{2} \times n^{2}$ Sudoku is NP-complete, but for standard $9 \times 9$ puzzles, the number of possibilities is small enough to be tractable

The number of valid solution grids for the standard $9 \times 9$
Sudoku is 6,670,903,752,021,072,936,960. This number is equal to $9!\times 72^{2} \times 2^{7} \times 27,704,267,971$, the last factor of which is prime

In a $9 \times 9$ Sudoku puzzle, you may need at least 17 initial entries (clues) for the solution to be unique; no one knows whether
a 16-clue puzzle with unique solution exists

| 2 |  |  |  |  |  |  | 9 | 6 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 4 | 9 | 8 |  |  |  | 3 | 1 |  |
|  | 1 |  |  |  |  |  | 4 |  |
|  |  |  |  | 2 | 3 |  |  |  |
|  |  |  | 9 | 8 | 4 |  |  |  |
|  |  |  | 7 | 6 |  |  |  |  |
|  | 2 |  |  |  |  |  | 6 |  |
|  | 5 | 6 |  |  |  | 8 | 3 | 1 |
| 8 | 4 |  |  |  |  |  |  | 3 |

Q3: Solve this irregular Sudoku puzzle.

## Interesting Variations on Sudoku



From New York Times, Sunday 2018/12/16


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## Other Puzzles Based on Sudoku

Other sizes (e.g., $6 \times 6$, with $2 \times 3$ blocks; or $16 \times 16$, with $4 \times 4$ blocks)
Combining this 2000s phenomenon with Rubik's cube of the 1980s . . .


Q4: Construct Latin squares of sizes $3 \times 3$ and $4 \times 4$.


## Task Scheduling Problem

We have a set of of tasks

There are some "processors" that can execute tasks

Assign tasks to processors so as to meet certain constraints

A task may fit only some processors Tasks may have prerequisite tasks Preemption may be (dis)allowed Tasks may have deadlines Shortest schedule may be sought

Numbers in Sudoku puzzle

Cells in Sudoku puzzle can hold numbers

Place numbers in cells while honoring some constraints

Use only numbers 1-9
Some numbers already placed
Different numbers in each row
Different numbers in each column
Different numbers in each block

Virtually all instances of the task scheduling problem are difficult (NP-hard), just like Sudoku


## Resource Allocation Problem

We have a set of of resources

There are "locations" where resources may be placed

Assign resources to locations to meet certain constraints

A resource may fit only some locations Resources must be "easily" accessible Resource mobility may be (dis)allowed Resource cost may differ by location Lowest-cost assignment may be sought

## Numbers in Sudoku puzzle

Cells in Sudoku puzzle can hold numbers

Place numbers in cells while honoring some constraints

Use only numbers 1-9
Some numbers already placed Different numbers in each row
Different numbers in each column Different numbers in each block

Virtually all instances of the resource allocation problem are difficult (NP-hard), just like Sudoku


## Scheduling Required

 CE Courses| Units |
| :---: |
| 1 |
| 2 |
| 3 |
| 4 |
| 4 |







Constraints

## Prerequisite:

Solid downward arrow
Corequisite:
Dashed sideways arrow Units per quarter: $\leq 18$


CE Courses

| Units |
| ---: |
| 1 |
| 2 |
| 2 |
| 3 |
| 4 |
| 5 |


| 12 un |
| :--- |
| 16 un |
| 20 unt |
|  |
| Upp <br> divis <br> stan <br> aints |

## Constraints <br> Prerequisite:

Solid downward arrow
Corequisite:
Dashed sideways arrow Units per quarter: $\leq 18$

## Scheduling Required

ECE 1
Chem 1A $\rightarrow$ Chem 1AL


Jpper division standing


Task Scheduling


## Job-Shop Scheduling




| Job | Task | Machine | Time | Staff |
| :---: | :---: | :---: | :---: | :---: |
| Ja | Ta1 | M1 | 2 | 3 |
| Ja | Ta2 | M3 | 6 | 2 |
| Jb | Tb1 | M2 | 5 | 2 |
| Jb | Tb2 | M1 | 3 | 3 |
| Jb | Tb3 | M2 | 3 | 2 |
| $J C$ | Tc1 | M3 | 4 | 2 |
| Jd | Td1 | M1 | 5 | 4 |
| Jd | Td2 | M2 | 2 | 1 |


May 2020


## Schedule Refinement



## Truck Scheduling



## Multiprocessor Scheduling

## Task graph with unit-time tasks

Here's a heuristic known as list scheduling:

1. Find the depth $T_{\infty}$ of the task graph
2. Take $T_{\infty}$ as a goal for the running time $T_{p}$
3. Determine the latest possible start times
4. Assign priorities in order of latest times
$T_{\infty}=8$ (execution time goal)
Latest start times: see the layered diagram
Priorities: shown on the diagram in red
When two tasks have the same "latest start time," a secondary tie-breaking rule is used


## Assignment to Processors

Tasks listed in priority order

$$
\begin{array}{lllllllllllll}
1 * & 2 & 3 & 4 & 6 & 5 & 7 & 8 & 9 & 10 & 11 & 12 & 13
\end{array}
$$

$\mathrm{P}_{1}$| 1 | 2 | 3 | 4 | 6 | 5 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |


| $P_{1}$ | 1 | 2 | 3 | 4 | 6 | 8 | 10 | 12 | 13 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| $P_{2}$ |  |  |  | 5 | 7 | 9 | 11 |  |  |



Even in this simple case of unit-time tasks, multiprocessor scheduling remains difficult with as few as 3 processors


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## Two Related and Similar Problems

The knapsack problem
We have storage capacity $W$ and $n$ files of sizes $w_{i}$ and values $v_{i}$

Pick a max-value subset of files that fit in the storage space $W$

Files cannot be broken into pieces Naïve solution: Examine all $2^{n}$ subsets Dynamic programming solution Various heuristic aids
Approx. solutions (say, $90 \%$ of optimal)

Off-line game of Tetris

We have a rectangular bin and a sequence of tetrominos

Find optimal play to maximize the number of pieces used

Pieces can only be rotated Exponentially many choices


There are many other related and similarly hard problems, some of which don't even admit efficient approximations


