## Gems of TCS

## GRaph Coloring Algorithms

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## Previously...

- Exact Algorithms
- Randomized Algorithms
- Approximate Algorithms


## Previousty...

- Exact Algorithms
- Randomized Algorithms
- Approximate Algorithms
- Today: More examples


## Map Coloring

## South America



## The Land of Oz



## SwIss Cantons



## Four Color Theorem

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- Induction on the number of countries $n$.
- Base case. $n \leq 6$ : can color with 6 colors.
- Induction assumption. All maps with $k$ countries can be colored with 6 colors.
- Induction step. We'll show that any map with $k+1$ countries can be colored with 6 colors.


## Six Color Theorem. Proof

## Lemma

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- The chromatic number $\chi(G)$ of a graph $G$ is the smallest number of colors needed to color the graph.

Chromatic Number


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## Chromatic Number

Chromatic number is 3


## Complete Graphs

The chromatic number of $K_{n}$ is $n$.


## Path Graphs

For $n>1$, the chromatic number of $P_{n}$ is 2 .

## Cycle Graphs

For even $n$, the chromatic number of $C_{n}$ is 2 .


## Cycle Graphs

For odd $n>2$, the chromatic number of $C_{n}$ is 3 .


## Bipartite Graphs

The chromatic number of a bipartite graph (with at least 1 edge) is 2 .


Applications

## EXAM SCHEDULE

- Each student takes an exam in each of her courses
- All students in one course take the exam together
- One student cannot take two exams per day
- What is the minimum number of days needed for the exams?


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## Other Applications

- Scheduling Problems
- Register Allocation
- Sudoku puzzles
- Taxis scheduling


## Exact Algorithm for Coloring

## Dynamic Programming

- Given graph $G$ on $n$ vertices, find $\chi(G)$-minimum number of colors in a valid coloring of $G$


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- Given graph $G$ on $n$ vertices, find $\chi(G)$-minimum number of colors in a valid coloring of $G$
- Dynamic programming is one of the most powerful algorithmic techniques
- Rough idea: express a solution for a problem through solutions for smaller subproblems


## Subproblems

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$$
\chi(S)=\min _{U \text { without edges }} 1+\chi(S \backslash U)
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## Order of Subproblems

- Need to process all subsets $S \subseteq\{1, \ldots, n\}$ in order that guarantees that when computing the value of $\chi(S)$, the values of $\chi(S \backslash U)$ have already been computed


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- For example, we can process subsets in order of increasing size


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return $\chi(\{1, \ldots, n\})$

## Running Time

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FOR ALL $U \subseteq S, U$ without edges

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RETURN $\chi(\{1, \ldots, n\})$

Randomized Algorithm for 3-Coloring

## Randomized Algorithm

- Given a 3-colorable graph, find a 3-coloring


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- This problem is NP-hard, we'll give an exponential-time algorithm


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- Repeat the algorithm $(3 / 2)^{n}$ times

Approximate Algorithm for 3-Coloring

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- Given a 3-colorable graph, finding an $n$-coloring is trivial
- We'll see how to find an $O(\sqrt{n})$-coloring in polynomial time


## Graphs of Bounded Degree

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All remaining vertices have degree $<\sqrt{n}$. Color the rest of the graph using $\sqrt{n}$ new colors

ANALYSIS

