## Föreläsning 14

Recursive search
TDDD86: DALP
Utskriftsversion av Föreläsing i Datastrukturer, algoritmer och programmeringsparadigm 10 October 2023

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## 1 Recursive search

## Recursive problem solving

if ( the problem is simple enough) \{

- Solve the problem directly
- Return the solution


## \}else \{

- Divide the problem into one or several similar smaller problems
- Solve the smaller problems
- Combine the results to get a solution to the original problem
- Return the solution
\}


### 1.1 Exhaustive search

## Generate all possibilities

- It is not rare that one needs to generate all objects satisfying a given constraint
- Word chains: Generate all words that only differ in a single letter
- The objects can often be generated iteratively
- In several cases it is better to think about a recursive method to generate all the possibilities.


## Subsets

- Given a set $S$, we can generate a subset of $S$ by chosing a number of elements from $S$
- Exampel:
- $\{0,1,2\}$ is a subset of $\{0,1,2,3,4,5\}$
- \{dikdik, ibex \} is a subset of $\{$ dikdik, ibex $\}$
$-\{A, G, C, T\}$ is a subset of $\{A, B, C, D, E, \ldots, Z\}$
$-\{ \} \subseteq\{a, b, c\}$
$-\{ \} \subseteq\{ \}$
- Many important problems in Computer Science can be solved by listing all possible subsets of a set $S$ and by finding the "best" one.

$$
\{0,1,2\}
$$

Generate subsets

Generate subsets

$$
\{0,1,2
$$



Generate subsets

$$
\begin{aligned}
& \{0,1,2\} \\
& \left\{\begin{array}{l}
1 \\
1 \\
I
\end{array}\right\} \\
& \left\{2, \quad \begin{array}{l}
1 \\
1 \\
1
\end{array}\right\} \\
& \left.\{1\} \begin{array}{l}
1 \\
1 \\
1
\end{array}\right\} \\
& \left\{1,2,\left\{\begin{array}{l}
1 \\
1 \\
1
\end{array}\right\}\right.
\end{aligned}
$$

$$
\begin{aligned}
& \{0,1,2\}
\end{aligned}
$$

Generate subsets

$$
\begin{gathered}
\{0,1,2\} \\
\left\{\begin{array}{c}
2\} \\
\left\{\begin{array}{l}
2
\end{array}\right. \\
\left\{\begin{array}{l}
1,2\} \\
\{0,2\}
\end{array}\right. \\
\{0,1, \\
\{0,1,2\}
\end{array}\right.
\end{gathered}
$$

Generate subsets


Generate subsets

- Base case:
- The only subset of the empty set is the empty set
- Recursive case:
- Choose an element $x$ in the set original set
- Generate all subsets of the set obtained by excluding $x$ from the set
- These subsets are also subsets to the original set
- All subsets obtained by adding $x$ are also subsets to the original set


## Follow the recursion

$$
\{\mathrm{A}, \mathrm{H}, \mathrm{I}\}
$$

## Follow the recursion

\{ A, H, I \}
\{ H, I \}

## \{ A, H, I \}

## \{ H, I \}

## \{ I \}

Follow the recursion
\{ A, H, I \}
\{ H, I \}

## \{ I \}

\{ \}

Follow the recursion
\{ A, H, I \}
\{ H, I \}

## \{ I \}

\{ \}
\{ \}

## Follow the recursion

\{ A, H, I \}
\{ H, I \}

## \{ I \}

\{ \}
\{I\}, \{ \}
\{ \}

Follow the recursion

## \{ A, H, I \}

## \{ H, I \} <br> \{H, I\}, \{H\}, \{I\}, \{ \}

## \{ I \}

\{ \}
\{I\}, \{ \}
\{ \}

Follow the recursion
\{ A, H, I \}
$\{A, H, I\},\{A, H\},\{A, I\},\{A\}$ $\{H, I\},\{H\},\{I\},\{ \}$
\{ H, I \}
\{H, I\}, \{H\}, \{I\}, \{ \}
\{ I \}
\{I\}, \{ \}
\{ \}
\{ \}

Analyzing the method

- How many subsets are there in a set with $n$ elements?
- For each element, we choose if it will be part of the subset or not
- We make $n$ choices with 2 possible outcomes for each choice. This results in $2^{n}$ subsets.
- The returned set of subsets will use $\mathscr{O}\left(2^{n}\right)$ in memory


## Reducing memory usage

- We need often to perform some operations on each subset, without needing to save them.
- Idea: Generate each subset, handle it, then throw it away
* Question: How do we do that?


## Permutations

- Write a function permute that takes a string parameter and that outputs all possible permutations of the letters in the string. The order in which the permutations are output does not matter.
- Exampel: permute ("MARTY") outputs the following sequence:

| MARTY | MYRAT | ATYMR | RTMAY | TARMY | YMTAR |
| :--- | :--- | :--- | :--- | :--- | :--- |
| MARYT | MYRTA | ATYRM | RTMYA | TARYM | YMTRA |
| MATRY | MYTAR | AYMRT | RTAMY | TAYMR | YAMRT |
| MATYR | MYTRA | AYMTR | RTAYM | TAYRM | YAMTR |
| MAYRT | AMRTY | AYRMT | RTYMA | TRMAY | YARMT |
| MAYTR | AMRYT | AYRTM | RTYAM | TRMYA | YARTM |
| MRATY | AMTRY | AYTMR | RYMAT | TRAMY | YATMR |
| MRAYT | AMTYR | AYTRM | RYMTA | TRAYM | YATRM |
| MRTAY | AMYRT | RMATY | RYAMT | TRYMA | YRMAT |
| MRTYA | AMYTR | RMAYT | RYATM | TRYAM | YRMTA |
| MRYAT | ARMTY | RMTAY | RYTMA | TYMAR | YRAMT |
| MRYTA | ARMYT | RMTYA | RYTAM | TYMRA | YRATM |
| MTAYR | ARTMY | RMYAT | TMARY | TYAMR | YRTMA |
| MTRAY | ARYMMT | RMYTA | TMAYR | TYARM | YRTAM |
| MTYAR | ARYTM | RAMMRY | TMRAY | TYRMA | YTMAR |
| MTYRA | ATMYR | RATMY | RATYM | TMYAR | TMYAMM |
| MYART | ATRMMRA | YMART | YTAMR |  |  |
| MYATR | ATRYM | RAYMT | RAYTM | TAMRY | YMRATAT |
| YTARM | YTRMA |  |  |  |  |

Let's look at the problem

- Think about each permuation as a sequence of choices or decisions
- Which letter should be chosen first?
- Which letter should be chosen second?
- ...
- Solutions' space: set of all possible sets of decisions to be explored
- We want to generate all possible sequences of decisions
- for (each possible first letter):
- for (each possible second letter):
- for (each possible third letter):
- ...
- output the permuation!
- This amounts to a depth-first search

Decision tree

| chosen | available |
| :--- | :--- |
|  | M A R T Y |


1.2 Backtracking

Backtracking

- A general algorithm to find solutions to a problem by testing solutions to subproblems and giving up on them ("backtracking") if they turn out to be not suitable
- a "brute force"-technique (tests all possibilites)
- Often (but not always) implemented recursively
- Applications:
- produce all permutations of a set of values
- parsing a language
- games: anagrams, crosswords, 8 queens, Boggle
- Combinatorial and logic programming


## Backtracking algorithms

General pseudo-code for a backtracking algorithm:

- Explore(choice):
- if there are no further choices: stop
- otherwise, for each possible choice $C$ :
* choose $C$
* Explore the remaining choices
* "Unchoose" $C$ if needed (backtrack)


## Backtracking strategies

- Ask the following questions when you use backtracking to solve a problem:
- What represents a "choice" in this problem?
* What is the "base case(s)"? How do I know there are no more choices left?
- How do I "choose"?
* do I need extra variables to remember my choices?
* do I need to modify the values of the existing variables?
- How do I explore the remaining choices?
* Do I need to remove the made choices from the list of choices?
- what should I do when I am done exploring the remaining choices?
- How do I "unchoose" a choice?


## Permutations revisited

- Write a function permute that takes a string parameter and that outputs all possible permutations of the letters in the string. The order in which the permutations are output does not matter.
- Exampel: permute ("MARTY") outputs the following sequence:
- (In what way is this problem uniform? recursive?)

| MARTY | MYRAT | ATYMR | RTMAY | TARMY | YMTAR |
| :--- | :--- | :--- | :--- | :--- | :--- |
| MARYT | MYRTA | ATYRM | RTMYA | TARYM | YMTRA |
| MATRY | MYTAR | AYMRT | RTAMY | TAYMR | YAMRT |
| MATYR | MYTRA | AYMTR | RTAYM | TAYRM | YAMTR |
| MAYRT | AMRTY | AYRMT | RTYMA | TRMAY | YARMT |
| MAYTR | AMRYT | AYRTM | RTYAM | TRMYA | YARTM |
| MRATY | AMTRY | AYTMR | RYMAT | TRAMY | YATMR |
| MRTAY | AMTYR | AYTRM | RYMTA | TRAYM | YATRM |
| MRTYA | AMYTR | RMATY | RMAMM | TRYMA | YRMAT |
| MRYAT | ARMTY | RMTAY | RYATM | TRYAM | YRMTA |
| MRYTA | ARMYT | RMTYA | RYTAM | TYMAR | YRAMT |
| MTARY | ARTMY | RMYATAT | TMARY | TYAAMR | YRTMA |
| MTAYR | ARTYM | RMYTAA | TMAYR | TYARMM | YRTAM |
| MTRYA | ARYMT | RAMTY | TMRAY | TYRMAA | YTMAR |
| MTYAR | RTMRY | RAMYT | TMRYA | TYRAM | YTMRA |
| MTYRA | ATMYR | RATYM | TMYAR | YMART | YTAMR |
| MYART | ATRMY | RAYMT | TAMRY | YMATR | YTARM |
| MYATR | ATRYM | RAYTM | TAMYR | YMRTA | YTRMAM |

## Solution

```
// Outputs all permutations of the given string.
void permute(string s, string chosen = "") {
    if (s == "") {
        cout << chosen << endl; // base case: no choices left
    } else {
        // recursive case: choose each possible next letter
        for (int i = 0; i < s.length(); i++) {
            char c = s[i]; // choose
            s.erase(i, 1);
                permute(s, chosen + c); // explore
                s.insert(i, 1, c); // un-choose
            }
    }
}
```


## Combinations

- Write a function combinations that takes a string and a natural number $k$ and that outpus all possible $k$-long-strings that can be obtained from unique letters from the string. The order in which the resulting combinations are output does not matter
- Exampel: combinations ("GOOGLE", 3) outputs the sequence of lines to the right.
- To simplify the problem, we assume the string contains at least $k$ unique letters.

| EGL | LEG |
| :---: | :---: |
| EGO | LEO |
| ELG | LGE |
| ELO | LGO |
| EOG | LOE |
| EOL | LOG |
| GEL | OEG |
| GEO | OEL |
| GLE | OGE |
| GLO | OGL |
| GOE | OLE |
| GOL | OLG |

## First attempt

```
// Outputs all unique k-letter combinations of the given string.
void combinations(string s, int length, string chosen = "") {
    if (length == 0) {
        cout << chosen << endl; // base case: no choices left
    } else {
        for (int i = 0; i < s.length(); i++) {
            if (chosen.find(s[i]) == string::npos) {
                    char c = s[i];
                    s.erase(i, 1);
                    combinations(s, length - 1, chosen + c);
                    s.insert(i, 1, c);
            }
        }
    }
}
```

- Problem: writes the same string several times.


## Solution

```
// Outputs all unique k-letter combinations of the given string.
void combinations(string s, int length) {
    Set<string> found;
    combinHelper(s, length, "", found);
```

```
}
```

```
void combinHelper(string s, int length, string chosen, Set<string>& found) {
    if (length == 0 && !found.contains(chosen)) {
        cout << chosen << endl; // base case: no choices left
        found.add(chosen);
    } else {
        for (int i = 0; i < s.length(); i++) {
            if (chosen.find(s[i]) == string::npos) {
                    char c = s[i];
                s.erase(i, 1);
                combinHelper(s, length - 1, chosen + c, found);
                s.insert(i, 1, c);
            }
        }
    }
}
```


## Rolling dices

- Write a function diceRoll that takes a natural number representing a number of 6-sided dices to be rolled. Output all possible combinations of values that can be obtained.


## diceRoll(2);

| $\{1,1\}$ | $\{3,1\}$ | $\{5,1\}$ |
| :--- | :--- | :--- |
| $\{1,2\}$ | $\{3,2\}$ | $\{5,2\}$ |
| $\{1,3\}$ | $\{3,3\}$ | $\{5,3\}$ |
| $\{1,4\}$ | $\{3,4\}$ | $\{5,4\}$ |
| $\{1,5\}$ | $\{3,5\}$ | $\{5,5\}$ |
| $\{1,6\}$ | $\{3,6\}$ | $\{5,6\}$ |
| $\{2,1\}$ | $\{4,1\}$ | $\{6,1\}$ |
| $\{2,2\}$ | $\{4,2\}$ | $\{6,2\}$ |
| $\{2,3\}$ | $\{4,3\}$ | $\{6,3\}$ |
| $\{2,4\}$ | $\{4,4\}$ | $\{6,4\}$ |
| $\{2,5\}$ | $\{4,5\}$ | $\{6,5\}$ |
| $\{2,6\}$ | $\{4,6\}$ | $\{6,6\}$ |


diceRoll(3);
$\{1,1,1\}$
$\{1,1,2\}$
$\{1,1,3\}$
$\{1,1,4\}$
$\{1,1,5\}$

| $\{1$, | 1, |
| :--- | :--- |
| $\{1$, | $6\}$ |
| 1, | $1\}$ |

$\{1,2,2\}$
$\{6,6,4\}$
$\{6,6,5\}$
$\{6,6,6\}$

Study the problem

- We want to generate all possible sequences of decisions
- for (each possible first letter):
- for (each possible second letter):
- for (each possible third letter):
- ...
- output!
- This is a depth-first search
- How can we exhaustively explore this large search space?


## Decision tree

| chosen | available |
| :---: | :---: |
| - | 4 dice |



## Solution

```
// Prints all possible outcomes of rolling the given
// number of six-sided dice in {#, #, #} format.
void diceRolls(int dice) {
    vector<int> chosen;
    diceRollHelper(dice, chosen);
}
// private recursive helper to implement diceRolls logic
void diceRollHelper(int dice, vector<int>& chosen) {
    if (dice == 0) {
            cout << chosen << endl; // base case
    } else {
            for (int i = 1; i <= 6; i++) {
                chosen.add(i); // choose
                diceRollHelper(dice - 1, chosen); // explore
                chosen.remove(chosen.size() - 1); // un-choose
            }
    }
}
```


## DiceSum

- Write a function diceSum that resembles diceRoll but that also takes a sum and that only writes those combinations whose sum is the given sum.


## diceSum(2, 7);

$\{1,6\}$
$\{2,5\}$
$\{3,4\}$
$\{4,3\}$
$\{5,2\}$
$\{6,1\}$

## diceSum(3, 7);

$\{1,1,5\}$
$\{1,2,4\}$
$\{1,3,3\}$
$\{1,4,2\}$
$\{1,5,1\}$
$\{2,1,4\}$
$\{2,2,3\}$
$\{5,1,1\}$

## Minimal modifications

```
// Prints all possible outcomes of rolling the given
// number of six-sided dice in {#, #, #} format.
void diceRolls(int dice, int desiredSum) {
    vector<int> chosen;
    diceSumHelper(dice, desuredSum, chosen);
}
void diceRollHelper(int dice, int desiredSum, vector<int>& chosen) {
    if (dice == 0) {
            if (sumAll(chosen) == desiredSum) {
                cout << chosen << endl; // base case
            }
        } else {
            for (int i = 1; i <= 6; i++) {
                chosen.add(i); // choose
                diceSumHelper(dice - 1, desiredSum, chosen); // explore
                chosen.remove(chosen.size() - 1); // un-choose
            }
        }
}
int sumAll(const vector<int>& v) {
```

```
    int sum = 0;
    for (int k : v) { sum += k; }
    return sum;
}
```


## Wasteful decision tree



## Optimizations

- We do not need to explore each branch in the tree
- Some branches will obviously not give any solution.
- We can terminate or "prune" these branches
- Innefficiencies in the previous solution:
- The current sum is sometimes already too high. (even a 1 in the next roll would exceed the targeted sum)
- The current sum is sometimes too low. (even sixes in all remaining rolls would not be enough to obtain the targeted sum.)
- Each time there are no more choices, the sums are computed.


## Solution

```
void diceSum(int dice, int desiredSum) {
    vector<int> chosen;
    diceSumHelper(dice, 0, desiredSum, chosen);
}
void diceSumHelper(int dice, int sum, int desiredSum, vector<int>& chosen) {
    if (dice == 0) {
            if (sum == desiredSum) {
                cout << chosen << endl; // base case
            }
    } else if ((sum + 1 * dice <= desiredSum) && (sum + 6*dice >= desiredSum)) {
            for (int i = 1; i <= 6; i++) {
                chosen.add(i); // choose
                diceSumHelper(dice - 1, sum + i, desiredSum, chosen); // explore
                chosen.remove(chosen.size() - 1); // un-choose
            }
    }
}
```

