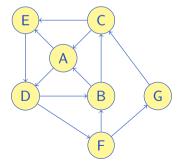


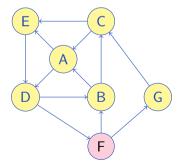
# How to Win Coding Competitions: Secrets of Champions

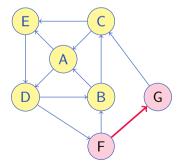
Week 4: Algorithms on Graphs

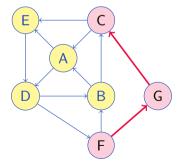
Lecture 7: Hamiltonian paths and Hamiltonian tours

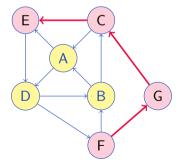
Maxim Buzdalov Saint Petersburg 2016

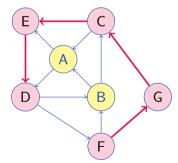


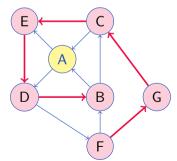


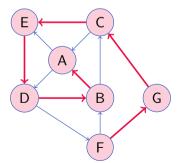


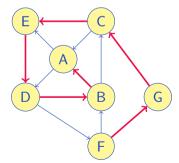




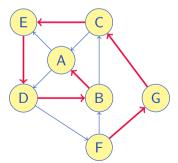




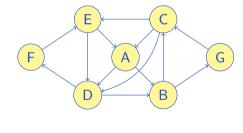




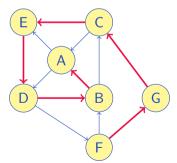
#### **FGCEDBA**



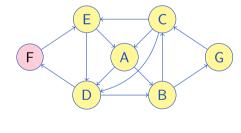
A Hamiltonian tour is a Hamiltonian path which starts and ends on the same vertex



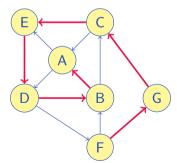
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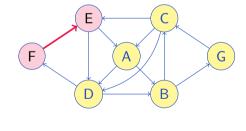
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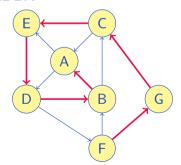


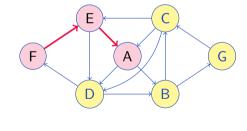
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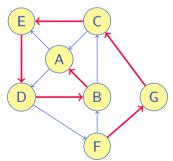
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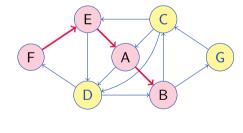




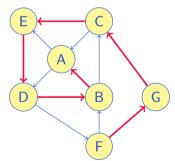
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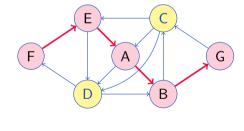
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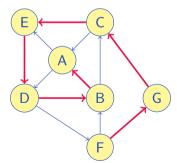
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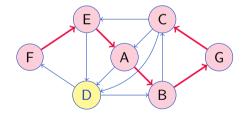
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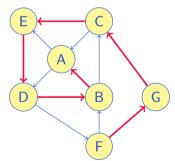
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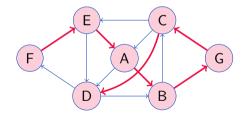
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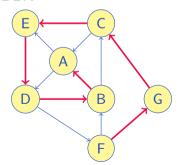
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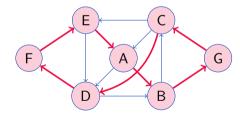
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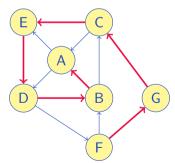
# **FGCEDBA**



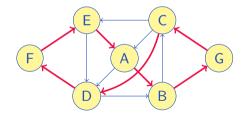
A Hamiltonian tour is a Hamiltonian path which starts and ends on the same vertex



#### **FGCEDBA**



A Hamiltonian tour is a Hamiltonian path which starts and ends on the same vertex



Checking whether a Hamiltonian path/tour exists is  $\ensuremath{\mathsf{NP\text{-}complete}}$ 

► No universal solution in polynomial time

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Naïve solution: check all possible paths

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▶  $O(N \cdot N!)$  where N = |V|

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Naïve solution: check all possible paths

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- $\blacktriangleright$  d[S][v]: whether a path exists which:
  - ► Starts at vertex 1
  - ► Ends at vertex *v*
  - ► Visits exactly vertices from set *S*

► No universal solution in polynomial time

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- ▶ d[S][v]: whether a path exists which:
  - ► Starts at vertex 1
  - ► Ends at vertex *v*
  - ► Visits exactly vertices from set *S*
- Vertex sets are stored as bitmasks
  - ▶ Numbers from 0 to  $2^N 1$
  - ▶ *i*-th bit is set if vertex number *i* is in the set

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- Vertex sets are stored as bitmasks
  - ▶ Numbers from 0 to  $2^N 1$
  - ▶ *i*-th bit is set if vertex number *i* is in the set
- ▶ We can solve Hamiltonian-related problems using the values of d[S][v]

```
procedure Hamiltonian DP(V, E)
    d[S][v]: if a path exists which starts at 1, ends at v and visits vertices from S
    d[\{1\}][1] \leftarrow \text{TRUE}
    for S \in 2^V in non-decreasing order of |S| where |S| \ge 2 do
        for v \in S \setminus \{1\} do
            d[S][v] \leftarrow \text{FALSE}
            S' \leftarrow S \setminus \{v\}
            for \mu \in S' do
                if (u, v) \in E then d[S][v] \leftarrow d[S][v] or d[S'][u] end if
            end for
        end for
    end for
end procedure
```

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procedure Hamiltonian DP(V, E)
    d[S][v]: if a path exists which starts at 1, ends at v and visits vertices from S
   d[\{1\}][1] \leftarrow \text{TRUE}
                                         ▶ A path consisting of vertex 1 exists
   for S \in 2^V in non-decreasing order of |S| where |S| \ge 2 do
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    for S \in 2^V in non-decreasing order of |S| where |S| \ge 2 do \triangleright Check all sets
        for v \in S \setminus \{1\} do
                                                               ▶ Check all possible endpoints
            d[S][v] \leftarrow \text{FALSE}
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                                                                        ▶ Initially no path
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           for \mu \in S' do
                                                 if (u, v) \in E then d[S][v] \leftarrow d[S][v] or d[S'][u] end if \triangleright Update
           end for
       end for
   end for
end procedure
```

```
boolean [][] hamiltonianDP(boolean [][] graph) {
    int n = graph.length:
    boolean [][] d = new boolean [(1 << (n-1))][n];
                                                             // save one bit, reduce memory 2x times
                                                              // count vertices from 0
   d[0][0] = 1:
    for (int mask = 1; mask < d.length; ++mask) {
                                                              // locally ordered by size
        for (int v = 1; v < n; ++v)
            if ((mask & (1 << (v - 1))) != 0) {
                                                             // mask contains v
                int prev = mask (1 << (v - 1)):
                                                           // previous mask
                boolean curr = d[prev][0] && graph[v][0]; // consider 0 separately
                for (int u = 1; u < n; ++u) {
                                                           // check previous vertices
                                                        // if graph has the (v,u) edge ...
                    if (graph[v][u]) {
                         if ((\text{prev \& }(1 << (u-1))) != 0)  { // ... and if u is in the mask ... curr |= d[prev][u]: // update the current value
                d[mask][v] = curr;
    return d:
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                   curr |= d[prev][u] && graph[v][u]; // if graph has the (v,u) edge, update
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       for (int v = 1; v < n; ++v) {
           if ((mask & (1 << (v - 1))) != 0) {
               int prev = mask (1 << (v-1));
               boolean curr = false:
               for (int u = 0; u < n; ++u) {
                   curr = d[prev][u] & graph[v][u]; // if graph has the (v,u) edge, update
               d[mask][v] = curr:
   return d:
```

```
// save one bit, reduce memory 2x times
        // count vertices from 0
         // locally ordered by size
       // mask contains v
// previous mask
       // consider O separately
      // check previous vertices
```

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   int n = graph.length;
   boolean [][] d = new boolean [(1 << (n-1))][n];
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   return d:
```

```
// save one bit, reduce memory 2x times
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       // mask contains v
// previous mask
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      // check previous vertices
```

► Does a Hamiltonian tour exist?

- ► Does a Hamiltonian tour exist?
  - ▶ Evaluate d[S][v] for all S and v
  - ▶ If, for some  $v \neq 1$ , d[V][v] = TRUE and  $(v, 1) \in E$ , then the Hamiltonian tour exists
  - ► Otherwise it does not exist
  - ► Running time:  $O(2^{|V|} \cdot |V|) + O(|V|)$

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  - ► Running time:  $O(2^{|V|} \cdot |V|) + O(|V|)$
- ▶ Does a Hamiltonian path between *a* and *b* exist?

- ► Does a Hamiltonian tour exist?
  - ▶ Evaluate d[S][v] for all S and v
  - ▶ If, for some  $v \neq 1$ , d[V][v] = TRUE and  $(v, 1) \in E$ , then the Hamiltonian tour exists
  - ► Otherwise it does not exist
  - ▶ Running time:  $O(2^{|V|} \cdot |V|) + O(|V|)$
- ▶ Does a Hamiltonian path between a and b exist?
  - ▶ Evaluate d[S][v] for all S and v
  - ▶ If there exists  $S' \subseteq 2^{V \setminus \{1,a,b\}}$ , such that:
    - ▶  $d[S' \cup \{1, a\}][a] = \text{TRUE}$
    - $ightharpoonup d[V \setminus S' \setminus \{a\}][b] = \text{TRUE}$

then a Hamiltonian path between a and b exists, otherwise not

- ▶ Simple special cases if a = 1 or b = 1
- ► Running time:  $O(2^{|V|} \cdot |V|) + O(2^{|V|})$

► Does any Hamiltonian path exist?

- ▶ Does any Hamiltonian path exist?
  - ▶ Evaluate d[S][v] for all S and v
  - ▶ Check all  $S' \subseteq V \setminus \{1\}$ :
    - ▶ If exists  $a \in S'$  such that  $d[S' \cup \{1\}][a] = \text{TRUE}...$
    - ▶ ...and  $b \notin S'$  such that  $d[V \setminus S'][b] = \text{TRUE}...$
    - ▶ ...then a Hamiltonian path exists between a and b
    - ightharpoonup ... and this can be done in O(1) per single S' using bit arithmetic!
  - ▶ Running time:  $O(2^{|V|} \cdot |V|) + O(2^{|V|})$

- ▶ Does any Hamiltonian path exist?
  - ▶ Evaluate d[S][v] for all S and v
  - ▶ Check all  $S' \subseteq V \setminus \{1\}$ :
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  - Running time:  $O(2^{|V|} \cdot |V|) + O(2^{|V|})$
- ► Restore a Hamiltonian path/tour

- ▶ Does any Hamiltonian path exist?
  - ▶ Evaluate d[S][v] for all S and v
  - ▶ Check all  $S' \subseteq V \setminus \{1\}$ :
    - ▶ If exists  $a \in S'$  such that  $d[S' \cup \{1\}][a] = \text{TRUE}$ ...
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  - Running time:  $O(2^{|V|} \cdot |V|) + O(2^{|V|})$
- ► Restore a Hamiltonian path/tour
  - ▶ Values of d[S][v] provide enough information to restore a path in  $O(|V|^2)$

- ▶ Does any Hamiltonian path exist?
  - ▶ Evaluate d[S][v] for all S and v
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    - ▶ ...then a Hamiltonian path exists between a and b
    - ightharpoonup ... and this can be done in O(1) per single S' using bit arithmetic!
  - Running time:  $O(2^{|V|} \cdot |V|) + O(2^{|V|})$
- ► Restore a Hamiltonian path/tour
  - ▶ Values of d[S][v] provide enough information to restore a path in  $O(|V|^2)$
- ► Count Hamiltonian paths/tours

- ▶ Does any Hamiltonian path exist?
  - ▶ Evaluate d[S][v] for all S and v
  - ▶ Check all  $S' \subseteq V \setminus \{1\}$ :
    - ▶ If exists  $a \in S'$  such that  $d[S' \cup \{1\}][a] = \text{TRUE}...$
    - ▶ ...and  $b \notin S'$  such that  $d[V \setminus S'][b] = \text{TRUE}...$
    - ▶ ...then a Hamiltonian path exists between a and b
    - ightharpoonup ... and this can be done in O(1) per single S' using bit arithmetic!
  - Running time:  $O(2^{|V|} \cdot |V|) + O(2^{|V|})$
- ► Restore a Hamiltonian path/tour
  - ▶ Values of d[S][v] provide enough information to restore a path in  $O(|V|^2)$
- ► Count Hamiltonian paths/tours
  - ▶ d[S][v] stores the number of paths from 1 to v using vertices from S

- ▶ Does any Hamiltonian path exist?
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- ► Shortest Hamiltonian path/tour (Traveling Salesperson Problem)

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- ► Restore a Hamiltonian path/tour
  - ▶ Values of d[S][v] provide enough information to restore a path in  $O(|V|^2)$
- ► Count Hamiltonian paths/tours
  - $\blacktriangleright$  d[S][v] stores the number of paths from 1 to v using vertices from S
- ► Shortest Hamiltonian path/tour (Traveling Salesperson Problem)
  - ▶ d[S][v] stores the shortest length of a path from 1 to v using vertices from S

Special case: Every tournament has a Hamiltonian path.



## Special case: Every tournament has a Hamiltonian path. Proof:

- ► Start building this path from an arbitary vertex, say, v<sub>1</sub>
- ▶ Assume a path  $v_1 \dots v_k$  is built. Add a new vertex v:
  - ▶ If there is an edge  $(v, v_1) \in E$ , prepend v
  - ▶ Otherwise, if there is an edge  $(v_k, v) \in E$ , append v
  - ▶ Otherwise: find i such that  $(v_i, v) \in E$  and  $(v, v_{i+1}) \in E$  it will exist because the graph is a tournament then insert v between  $v_i$  and  $v_{i+1}$