

# Efficient Route Planning

## SS 2011

Lecture 6, Friday June 24<sup>th</sup>, 2011  
(Highway & Contraction Hierarchies)

Prof. Dr. Hannah Bast  
Chair of Algorithms and Data Structures  
Department of Computer Science  
University of Freiburg

# Overview of this lecture

---

- Exercise Sheet 4 (Maps API etc.)
  - Your web applications
  - Your feedback
- Today: two new algorithms
  - Both based on the inherent **hierarchy** in road networks
  - **Highway Hierarchies** (from 2005): intuitive and simple, but quite complex to implement in practice (even the basics)
  - **Contraction Hierarchies** (from 2008): similar idea, but simpler (in its basic form) and faster
  - I will give you the idea and an outline for **HHs** and the details, including correctness proofs, for **CHs**
  - **Exercise Sheet for this week**: implement **Contraction Hierarchies** and test its performance ...

# Feedback for Exercise Sheet 4 (Maps API etc.)

---

## ■ Summary / excerpts

last update 24.6 01:15

- Interesting exercise sheet
- This time, the amount of work was ok
- Technologies involved were well explained
- Web applications are fun
- Please leave time to improve code from previous exercises
- Exercise was boring and unnecessary, the exercises on the algorithms were much more interesting

# A\* with Landmarks — Reprise

---

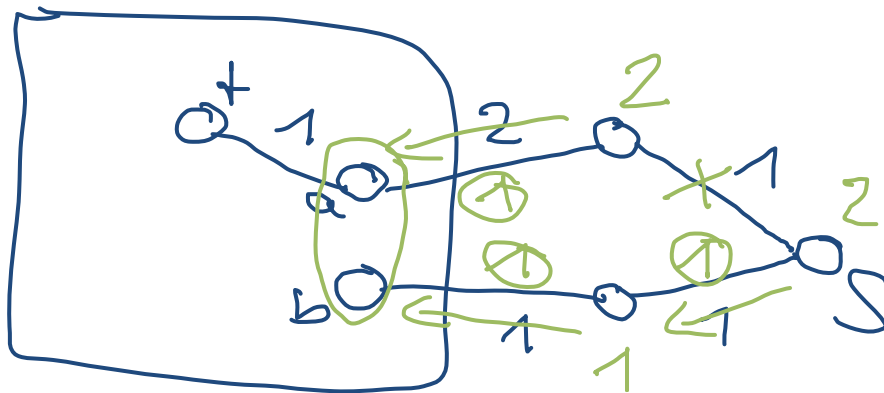
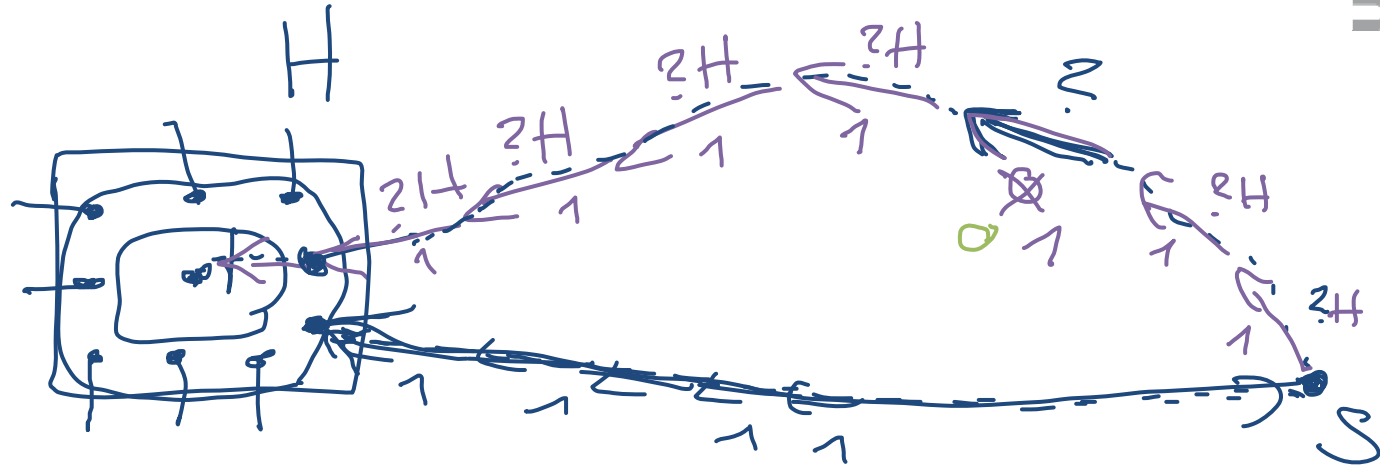
- Note the following optimization (thanks, Robin)
  - We used the following lower bound on  $\text{dist}(u, v)$   
 $\text{dist}(u, \ell) \leq \text{dist}(u, v) + \text{dist}(v, \ell)$   
hence  $\text{dist}(u, \ell) - \text{dist}(v, \ell) \leq \text{dist}(u, v)$
  - Similarly, using distances **from**  $\ell$ , we get  
 $\text{dist}(\ell, v) \leq \text{dist}(\ell, u) + \text{dist}(u, v)$   
hence  $\text{dist}(\ell, v) - \text{dist}(\ell, u) \leq \text{dist}(u, v)$
  - For us,  $\text{dist}(u, \ell) = \text{dist}(\ell, u)$  and  $\text{dist}(v, \ell) = \text{dist}(\ell, v)$   
hence  $|\text{dist}(u, \ell) - \text{dist}(v, \ell)| \leq \text{dist}(u, v)$
  - According to Robin, factor 3-4 smaller search space

# Arc flags — Reprise

---

- The following had to be done for Exercise Sheet 3
  - Compute rectangular regions
    - KD-tree was quite some extra work, but voluntary
  - Compute boundary nodes for each region
  - Full Dijkstra computation from each boundary node
  - Maintain parent pointers during Dijkstra computation and backtrack them to get arcs on shortest paths
  - Set arc flags accordingly; use a `vector<bool>` !
  - At query time, outside target region, check arc flags
  - **Writing tests is more than half of the work**
  - But for good reason, without tests you are **doomed**

# Arc flags — Reprise



# Highway Hierarchies 1/5

---

## ■ Basic idea

- Road networks have an inherent hierarchy of more and more important roads: residential roads, national roads, motorways, etc.
- Intuitively, far away from source and target it suffices to use only more important roads
- Let's see some examples on Google Maps ...
- The question is: how to make "far away" and "important" precise, so that it's not just a heuristic with approximate results, but an exact algorithm

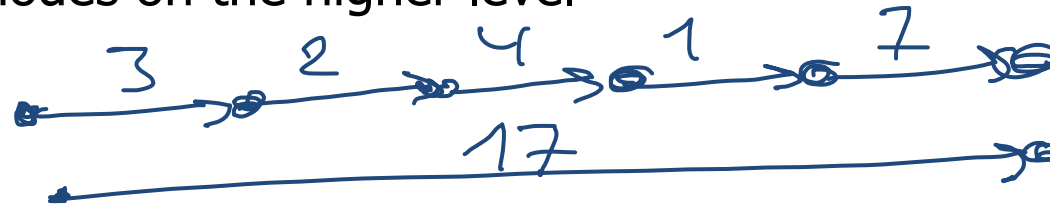
- Precomputation (for undirected graphs)
  - Don't rely on road labels, but compute a **level** for each arc
  - Initially all arcs have level 0
  - Consider the graph of all arcs with level  $\ell$
  - Let  $r_\ell$  be a suitably chosen **neighbourhood radius** for that level
  - Neighbourhood of a node  $N(u) = \{v : \text{dist}(u, v) \leq r_\ell\}$
  - Raise an arc  $(u, v)$  to level  $\ell + 1$  if and only if
    - there exists a shortest path  $(s, \dots, u, v, \dots, t)$  such that  $v$  is **not** in  $N(s)$  and  $u$  is **not** in  $N(t)$
    - Intuitively:  $(u, v)$  is in the middle of a long shortest path



- Query algorithm (high-level description)
  - Bidirectional Dijkstra from source and target
  - For each node, maintain not only the tentative distance, but also the current level and the distance gap to the next applicable neighbourhood border
  - Initially (at source and target), the level is 0 and the gap is the neighbourhood radius  $r_0$
  - When relaxing an arc from a node with level  $\ell$  (= try to improve tentative distance of the head node of the arc)
    - consider only arcs of current level or higher
    - if cost of arc is  $>$  gap, increase level for adjacent node

## ■ Optimizations

- Without further ado, there will be long chains of degree-2 nodes on the higher level



- Those can and should be **contracted**
- This contraction can be generalized to higher degrees
  - will be explained in detail for contraction hierarchies
- Important for performance, but makes query algorithm even more complicated and error-prone than it already is

# Highway Hierarchies 5/5

---

## ■ Performance

- Can preprocess the road network of Western Europe in **less than 1 hour**, with small space overhead
- Achieves average query times around **1 millisecond**

## ■ Problems

- Non-trivial to get the levels right
- Complicated rule for when to switch to the next level in the Dijkstra computation at query time
  - especially when the various optimizations are added
- Easy to make mistakes, and then optimal paths are lost

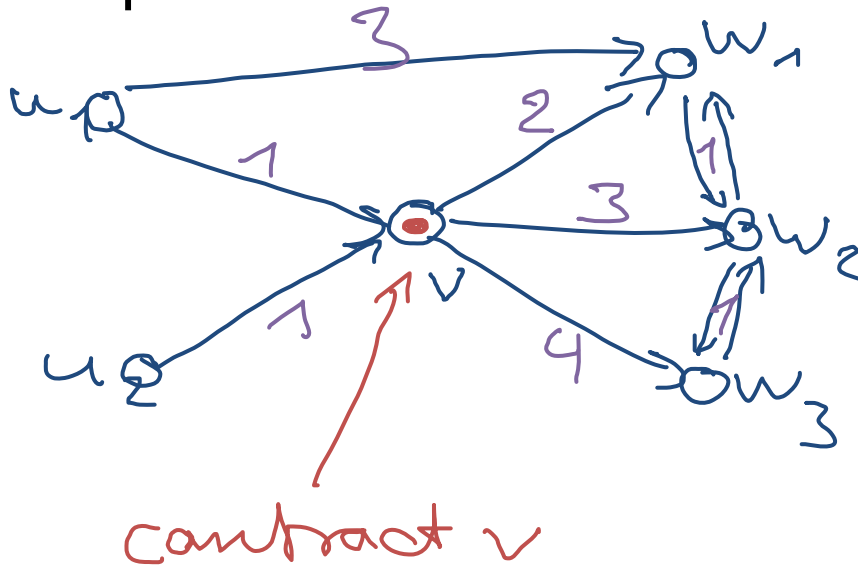
# Contraction Hierarchies

---

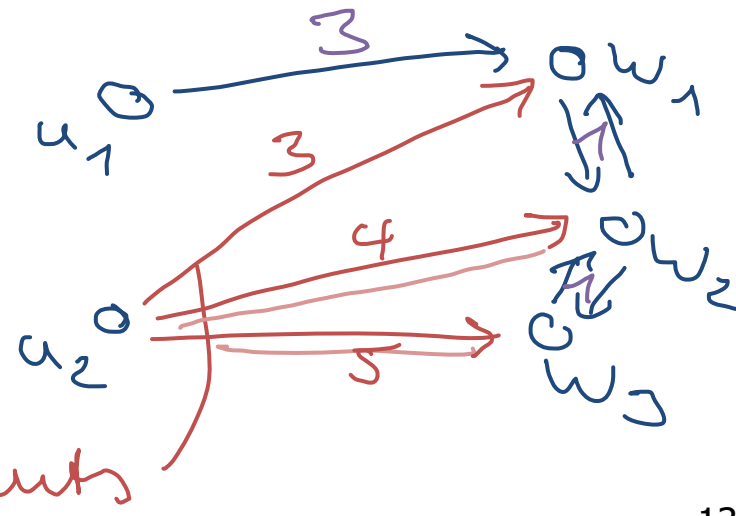
- Precomputation of a given graph  $G = (V, E)$ 
  - Consider an arbitrary ordering of the nodes
    - the algorithm that follows is correct for any order, but it is more efficient for some orders than for others
  - Process the nodes in this order, let  $v$  be the next node
  - Then  $v$  will be **contracted** as follows
    - Let  $\{u_1, \dots, u_l\}$  be the incoming arcs, i.e.  $(u_i, v) \in E$
    - Let  $\{w_1, \dots, w_k\}$  be the outgoing arcs, i.e.  $(v, w_j) \in E$
    - For each pair  $\{u_i, w_j\}$ , if  $(u_i, v, w_j)$  is the **only** shortest path from  $u_i$  to  $w_j$ , add the **shortcut** arc  $(u_i, w_j)$
    - Then **remove**  $v$  and its adjacent arcs from the graph

# Contraction Hierarchies

## ■ Example



— not needed,  
 — but also does  
 not form if  
 we add them



# Contraction Hierarchies

---

## ■ Query algorithm

- Given a source  $s$  and a target  $t$
- Do a full Dijkstra computation from  $s$  forwards, considering only arcs  $(u, v)$  with  $u < v$ 
  - we call  $G\uparrow = (V, \{(u, v) : u < v\})$  the **upward graph**
- Do a full Dijkstra computation from  $t$  backwards, considering only arcs  $(u, v)$  with  $u > v$ 
  - we call  $G\downarrow = (V, \{(u, v) : u > v\})$  the **downward graph**
- Let  $I$  be the set of nodes settled in both Dijkstras
- Take  $\text{dist}(s, t) = \min \{\text{dist}(s, v) + \text{dist}(v, t) : v \in I\}$
- Is this correct and if yes why?

# CH — Correctness Proof 1/4

## ■ Contraction preserves shortest paths

- Lemma: Let  $G = (V, E)$  be an arbitrary graph, and let  $G' = (V', E')$  be the graph after the contraction of an arbitrary node  $v \in V$ , that is,  $V' = V - \{v\}$ .

Then for all  $s, t \in V'$  it holds that  $\text{dist}_{G'}(s, t) = \underline{\underline{\text{dist}_G(s, t)}}$

Let  $P$  be the SP from  $s$  to  $t$  in  $G$

Case:  $v$  does not occur on  $P \Rightarrow P$  is also a path in  $G' \Rightarrow \text{dist}_{G'}(s, t) \leq \text{dist}_G(s, t)$

Case:  $v$  does occur on  $P$ ;  $P = s, \dots, u, v, w, \dots, t$   
 $\Rightarrow u, v, w$  is a SP  $\Rightarrow$  shortcut  $(u, w) \in E'$

Then  $P' = s, \dots, u, w, \dots, t$  is a path in  $G'$   
with same cost  $\Rightarrow \text{dist}_{G'}(s, t) \leq \text{dist}_G(s, t)$

■ Proof of Lemma continued ...

So far we have shown  $\text{dist}_{G'}(s, t) \leq \text{dist}_G(s, t)$


Vice versa:

Let  $P'$  be the SP from  $s$  to  $t$  in  $G'$

Case:  $P'$  contains no shortcuts, i.e., all arcs on  $P'$  are in  $E \Rightarrow P'$  is also a path in  $G \Rightarrow \text{dist}_G(s, t) \leq \text{dist}_{G'}(s, t)$

Case:  $P'$  contains a shortcut

$\Rightarrow \dots \Rightarrow \text{dist}_G(s, t) \leq \text{dist}_{G'}(s, t)$

analogously to previous slide, replace each shortcut  $(u, w)$  by  $(u, v, w)$  



- The query algorithm is correct
  - Lemma:  $\text{dist}(s, t) = \min \{ \text{dist}(s, v) + \text{dist}(v, t) : v \in I \}$
  - Let  $P$  be the shortest path from  $s$  to  $t$  in  $G$
  - Let  $v$  be the largest node (wrt the node ordering) on  $P$  in  $G$
  - Consider the **prefix maxima** on the path from  $s$  to  $v$ , that is, the nodes  $u_0 < u_1 < \dots < u_k$  such that  $P$  is
$$s = u_0 \rightarrow^* u_1 \rightarrow^* u_2 \rightarrow^* \dots \rightarrow^* u_k = v$$
where the subpaths  $u_{i-1} \rightarrow^* u_i$  use only nodes  $< u_{i-1}$
  - Claim:  $P' = (u_0, u_1, \dots, u_k)$  is the shortest path from  $s$  to  $v$  in the upward graph (and we can prove a similar thing for the path from  $v$  to  $t$  in the downward graph)

# CH — Correctness Proof 4/4

■ Proof of the claim

$$u_0 < u_1 < \dots < u_2$$

$$P = u_0 \xrightarrow{*} u_1 \xrightarrow{*} \dots \xrightarrow{*} u_2$$

$\begin{matrix} \downarrow & & & & \downarrow \\ s & & & & t \end{matrix}$

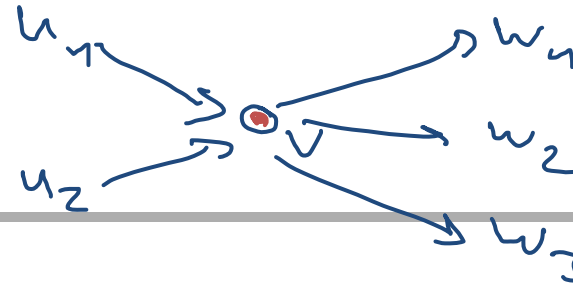
$P' = u_0, u_1, \dots, u_2$  is a path in  $G \uparrow$

By the previous lemma,  $(u_{i-1}, u_i) \in E \uparrow$   
 and with the same cost as  $u_{i-1} \xrightarrow{*} u_i$

$$\Rightarrow \text{dist}_{G \uparrow}(s, t) \leq \text{dist}_G(s, t)$$

after direction as before ...

# Shortcuts 1/2



- How to determine when a shortcut is needed?
  - **Recall:** when contracting node  $v$ , we need to insert the shortcut arc  $(u, w)$ , if and only if  $(u, v) \in E$  and  $(v, w) \in E$  and  $(u, v, w)$  is the only shortest path from  $u$  to  $w$
  - As before,  $\{u_i\}$  = incoming arcs and  $\{w_j\}$  = outgoing arcs
  - **Straightforward approach:** for each  $u_i$ , do a Dijkstra computation until all  $w_j$  are settled and see for which  $w_j$   $v$  lies on the shortest path from  $u_i$  to  $w_j$
  - **Improvement 1:** We can stop the search when we settle a node with cost  $> \text{dist}(u_i, v) + \max_j \text{cost}(v, w_j)$
  - **Improvement 2 (sketch):** A "1-hop backward search" from each of the  $w_j$  gives an even better bound → see paper

- How to determine when a shortcut is needed?
  - **Improvement 3 (heuristic)**: For each Dijkstra computation (from each of the  $u_i$ ), put a **limit** on the **number of hops** (distance in number of arcs from  $u_i$ ) and on the size of the **search space** (number of nodes settled)
    - With this heuristic, we may fail to find a shortest path from  $u_i$  to  $w_j$  that does not use  $v$ , and thus insert the shortcut  $(u_i, w_j)$  **unnecessarily**
    - But unnecessary shortcuts do not harm correctness, only performance (if there are too many of them)
    - So there is a trade-off: if the heuristic saves a lot of time in the precomputation at the cost of only a few unnecessary shortcuts, than it is worth it

# Implementation advice

---

- How to add shortcuts / remove contracted nodes?
  - If you implemented the adjacency lists with a `vector<vector<Arc> >`, adding arcs is straightforward
  - Removing nodes / arcs from the graph is more cumbersome, but luckily there is **no need** to do that
  - Instead, you can just ignore the respective nodes / arcs
    - In the precomputation, ignore all nodes with smaller id than the current one, and their incident arcs
    - At query time, for a Dijkstra search in the upward graph only consider arcs  $(u, v)$  with  $u < v$ , and similarly for the downward graph

## ■ General approach

- Maintain the nodes in a **priority queue**, in the order of how attractive it is to contract the respective node next
- Intuitively: the less shortcuts we have to add, the better
- For each node, maintain the **edge difference (ED)**:
  - $S$  = the number of shortcuts that would have to be added if that node were contracted
  - $E$  = the number of arcs incident to that node
  - Then the edge difference is simply  $ED = S - E$
- Note that when we contract a node, the edge difference of other nodes (not only the neighbours) may get affected

# Node ordering 2/3

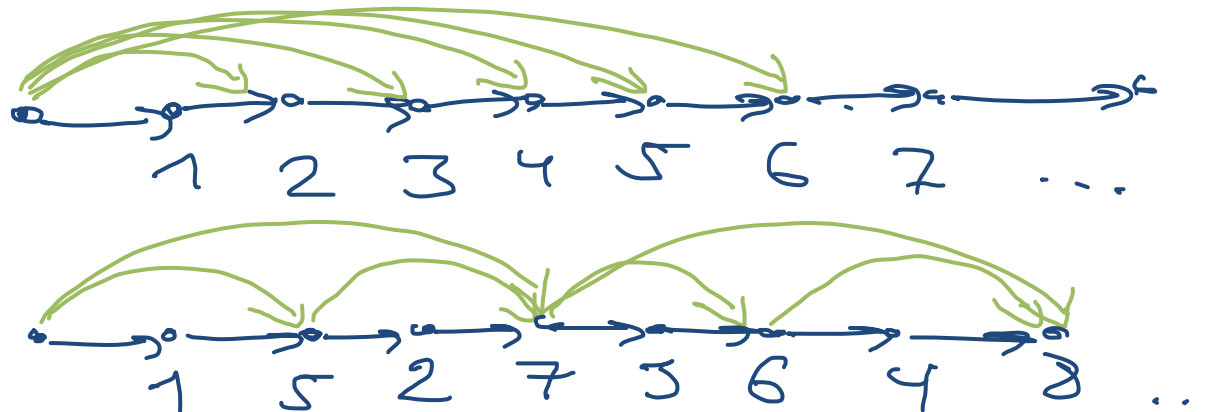
---

- How to maintain the ED for each node?
  - Initially compute the ED for each node (linear time)
  - **Straightforward approach:** recompute for all nodes after each single contraction → quadratic running time
  - **Lazy approach:** update EDs "on demand" as follows:
    - Before contracting node with currently smallest ED, recompute its ED and see if it is still the smallest
    - If not pick next smallest one, recompute its ED and see if that is the smallest now; if not, continue in same way ...
  - **Neighbour heuristic:** after each contraction, recompute EDs, but only for the neighbours of the contracted node
  - **Periodic update heuristic:** Full recomputation every  $x$  rounds

# Node ordering 3/3

## ■ Other criteria

- Spatial uniformity is also important, here is an example:



- **Simple heuristic:** for each node maintain a count of the number of neighbours that have already been contracted, and add this to the **ED**
  - the more neighbours have already been contracted, the later this node will be contracted



# Getting the arcs on the shortest path

---

- The query algorithm as described so far ...
  - ... gives a shortest path  $P'$  in the graph **with shortcuts**
    - find the  $v$  which minimizes  $\text{dist}(s, v) + \text{dist}(v, t)$
    - backtrack path to  $v$  in the forward search from  $s$
    - backtrack path to  $v$  in the backward search from  $t$
  - How to obtain the shortest path  $P$  in the original graph?
  - During the precomputation, for each shortcut arc  $e$  remember the contracted node due to which  $e$  was inserted
  - Replace each shortcut arc  $e = (u, w)$  in  $P'$  by the two arcs  $(u, v), (v, w)$ , where  $v$  is the node remembered for  $e$
  - Repeat until no more shortcut arcs left

# References

---

## ■ Highway Hierarchies

Engineering Highway Hierarchies

Highway Hierarchies Hasten Exact Shortest Path Queries

Dominik Schultes and Peter Sanders, ESA 2005 & 2006

<http://algo2.iti.uka.de/schultes/hwy/esa06HwyHierarchies.pdf>

<http://algo2.iti.uka.de/schultes/hwy/esaHwyHierarchies.pdf>

## ■ Contraction Hierarchies

Contraction Hierarchies: Faster and Simpler Hierarchical  
Routing in Road Networks

Geisberger, Sanders, Schultes, Delling, WEA 2008

<http://algo2.iti.uka.de/schultes/hwy/contract.pdf>

