# TRANSIT <br> Ultrafast Shortest-Path Queries with Linear-Time Preprocessing 

Ferienakademie im Sarntal - Course 2<br>Distance Problems: Theory and Praxis

## Andreas Heider

Fakultät für Informatik
TU München

## Outline

(1) Introduction
(2) Transit Node Routing

The key observation
Formalization
Computing the Set of Transit Nodes
Computing the Distance Tables
Shortest-distance queries
Shortest-path queries (with edges)
Local queries
Multi-Level Grid
(3) Conclusions

## Overview

## Goal

- Faster Shortest-Path Queries
- Application: Navigation Systems


## Overview

## Goal

- Faster Shortest-Path Queries
- Application: Navigation Systems


## Example

- US Road Network: 24 million nodes, 58 million edges
- Traditional Dijkstra too slow: worst case $O(m+n \operatorname{logn})$
- Query time:
- Dijkstra: seconds
- Best other algorithms: milliseconds


## Overview

## Goal

- Faster Shortest-Path Queries
- Application: Navigation Systems


## Example

- US Road Network: 24 million nodes, 58 million edges
- Traditional Dijkstra too slow: worst case $O(m+n \operatorname{logn})$
- Query time:
- Dijkstra: seconds
- Best other algorithms: milliseconds
- Do we really need even faster algorithms?
- Yes: Web services, Traffic simulation, etc.


## Overview

## Solution

- Split the work into a preprocessing step and fast queries
- Considerations: Query time, preprocessing time, space usage, etc.


## Overview

## Solution

- Split the work into a preprocessing step and fast queries
- Considerations: Query time, preprocessing time, space usage, etc.


## Special properties of road networks

- Optimize for the special structure of the problem
- Nodes have a small degree (US road network: 2.4)
- There is a hierachy of more and more important roads
- The graph is relatively static
- Much more...


## The key observation

- When travelling far there are only a few points you will leave your neighborhood through
- Those will be called Transit Nodes


## Vierkirchen - Amsterdam



## Vierkirchen - Berlin



## Vierkirchen - Prague



## Vierkirchen - Amsterdam/Berlin



## Vierkirchen - Prague



## Altomünster - Prague



## Haimhausen - Prague



## The key observation

- When travelling far there are only a few points you will leave your neighborhood through
- Those will be called Transit Nodes


## Algorithm outline

- Precomputation step:
- For each neighborhood: find a set of Transit Nodes
- Calculate distance from each node to its neighborhoods Transit Nodes
- Run APSP (distances) between all Transit Nodes
- Shortest distance query: Find $t 1, t 2$ so that $\operatorname{dist}(\operatorname{src}, t 1)+\operatorname{dist}(t 1, t 2)+\operatorname{dist}(t 2, \operatorname{trg})$ is minimal


## Formalization

## How to implement 'far'

- Some metric is needed to determine wether a trip is far enough
- One possibility: Subdivide the map into a grid of cells



## Formalization

## How to implement 'far'

- Some metric is needed to determine wether a trip is far enough
- One possibility: Subdivide the map into a grid of cells
- A trip is long enough if the start and destination points are more
 than 4 cells apart
- To determine: best grid size


## Formalization

## How to implement 'far'

- Some metric is needed to determine wether a trip is far enough
- One possibility: Subdivide the map into a grid of cells
- A trip is long enough if the start and destination points are more than 4 cells apart
- To determine: best grid size



## Formalization

## Definitions

- C: The cell for which we want to compute the Transit Nodes



## Formalization

## Definitions

- C: The cell for which we want to compute the Transit Nodes
- Souter: Square with C at it's center, everything outside is 'far away'



## Formalization

## Definitions

- C: The cell for which we want to compute the Transit Nodes
- $S_{\text {outer }}$ : Square with $C$ at it's center, everything outside is 'far away'
- $S_{\text {inner }}$ : Between $C$ and $S_{\text {outer, }}$, all Transit Nodes cross $S_{\text {inner }}$



## Formalization

## Definitions

- $E_{C / i n n e r / o u t e r}:$ Edges that cross a square



## Formalization

## Definitions

- $E_{C / i n n e r / o u t e r}:$ Edges that cross a square
- $V_{C / i n n e r / o u t e r}$ : For each edge in $E$ : pick the node with the lower id



## Formalization

## Definitions

- $E_{C / i n n e r / o u t e r}:$ Edges that cross a square
- $V_{C / i n n e r / o u t e r: ~}$ For each edge in $E$ : pick the node with the lower id
- All far trips starting inside $C$ always first pass a node in $V_{C}$, then $V_{\text {inner }}$, then $V_{\text {outer }}$



## Naive approach

## Computing the Transit Nodes

- For each cell: Compute all shortest paths between $V_{C}$ and $V_{\text {outer }}$
- Mark all nodes in $V_{\text {inner }}$ that lie on such a path, these are the Transit Nodes
- All paths starting inside $V_{C}$ and ending outside $V_{\text {outer }}$ will pass one of the Transit Nodes

- This requires a shortest paths run with a radius of 5 cells


## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available

|  |  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |

## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available

|  |  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |

## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available

|  |  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |

## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available

|  |  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |

## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available

|  |  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |

## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available

|  |  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |

## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available

|  |  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |

## Sweep-line algorithm

## Sweep-line algorithm

- A line is moved across the whole grid
- All roads that cross the line get processed
- When the line reaches the other end, the solution is available



## Sweep-line algorithm

## Computing the Transit Nodes

- For all roads intersecting the sweep line:
- Choose one endpoint $v$
- $C_{\text {left }}, C_{\text {right }}$ : Cells two grid units left/right
- Find all boundary nodes $v_{L}, v_{R}$ on $C_{\text {left }}, C_{\text {right }}$
- Run Dijkstra starting at $v$ until we know the distance $d\left(v, v_{L / R}\right)$ for all boundary nodes
- To do this we mostly need to
 look at nodes no more than 3 cells away


## Sweep-line algorithm

## Computing the Transit Nodes

- We now know all $d\left(v, v_{L / R}\right)$
- Look at all combinations of boundary nodes in $\left(v_{L}, v_{R}\right)$ with a vertical distance of $<=4$
- And determine $v$ so that $d\left(v_{L}, v\right)+d\left(v, v_{R}\right)$ is minimal
- This $v$ is a Transit Node for the cells containing $v_{L}$ and $v_{R}$



## Sweep-line algorithm

## Computing the Transit Nodes

- We now know all $d\left(v, v_{L / R}\right)$
- Look at all combinations of boundary nodes in $\left(v_{L}, v_{R}\right)$ with a vertical distance of $<=4$
- And determine $v$ so that $d\left(v_{L}, v\right)+d\left(v, v_{R}\right)$ is minimal
- This $v$ is a Transit Node for the cells containing $v_{L}$ and $v_{R}$
- After one horizontal and one vertical sweep we computed exactly the Transit Nodes as defined before



## Computing the Distance Tables

- For each node inside $C$ : store the distance to all of Cs Transit Nodes


## Computing the Distance Tables

- For each node inside $C$ : store the distance to all of Cs Transit Nodes
- For each Transit Node: compute and the distance to all other Transit Nodes
- This is possible because only a few vertices are Transit Nodes
- Most cells only have about 10 Transit Nodes
- Transit Nodes are often shared between adjacent cells
- Ballpark figure: US road network using a $128 \times 128$ grid: 8000 Transit Nodes


## Shortest-distance queries

- Transit Nodes also work in reverse: Every 'far' trip entering a cell will do it through one of the Transit Nodes
- All 'far' trips can be split up into three parts: src - transit $_{\text {src }}$ - transit dest - dest
- Try all possible combinations of transit nodes to find the minimum of $d\left(\right.$ src, transit $\left._{\text {src }}\right)+$ $d\left(\right.$ transit $_{\text {src }}$, transitdest $)+$ $d\left(\right.$ transit $_{\text {dest }}$, dest $)$



## Shortest-distance queries

- Transit Nodes also work in reverse: Every 'far' trip entering a cell will do it through one of the Transit Nodes
- All 'far' trips can be split up into three parts: src - transit $_{\text {src }}$ - transit dest - dest
- Try all possible combinations of transit nodes to find the minimum of $d\left(\right.$ src, transit $\left._{\text {src }}\right)+$ $d\left(\right.$ transit $_{\text {src }}$, transitdest $)+$ $d\left(\right.$ transit $_{\text {dest }}$, dest $)$



## Shortest-distance queries

- Transit Nodes also work in reverse: Every 'far' trip entering a cell will do it through one of the Transit Nodes
- All 'far' trips can be split up into three parts: src - transit $_{\text {src }}$ - transit dest - dest
- Try all possible combinations of transit nodes to find the minimum of $d\left(\right.$ src, transit $\left._{\text {src }}\right)+$ $d\left(\right.$ transit $_{\text {src }}$, transitdest $)+$ $d\left(\right.$ transit $_{\text {dest }}$, dest $)$



## Shortest-distance queries

- Transit Nodes also work in reverse: Every 'far' trip entering a cell will do it through one of the Transit Nodes
- All 'far' trips can be split up into three parts:
src - transit $_{\text {src }}$ - transit dest - dest
- Try all possible combinations of transit nodes to find the minimum of $d\left(\right.$ src, transit $\left._{\text {src }}\right)+$ $d\left(\right.$ transit $_{\text {src }}$, transitdest $)+$ $d\left(\right.$ transit $_{\text {dest }}$, dest $)$



## Shortest-distance queries

- Transit Nodes also work in reverse: Every 'far' trip entering a cell will do it through one of the Transit Nodes
- All 'far' trips can be split up into three parts: src - transit $_{\text {src }}$ - transit dest - dest
- Try all possible combinations of transit nodes to find the minimum of $d\left(\right.$ src, transit $\left._{\text {src }}\right)+$ $d\left(\right.$ transit $_{\text {src }}$, transitdest $)+$ $d\left(\right.$ transit $_{\text {dest }}$, dest $)$



## Shortest-distance queries

- Transit Nodes also work in reverse: Every 'far' trip entering a cell will do it through one of the Transit Nodes
- All 'far' trips can be split up into three parts: src - transit $_{\text {src }}$ - transit dest - dest
- Try all possible combinations of transit nodes to find the minimum of $d\left(\right.$ src, transit $\left._{\text {src }}\right)+$ $d\left(\right.$ transit $_{\text {src }}$, transitdest $)+$ $d\left(\right.$ transit $_{\text {dest }}$, dest $)$



## Shortest-path queries (with edges)

- Gradually find all nodes along the path
- Split it up into an already known part and the unknown rest
- Suppose we already know the path from src to a node $u$ (initially src $=u$ )
- To find the next step, find the neighbor $v$ of $u$ so that $d(u$, dest $)=d(u, v)+d(v$, dest $)$


## Shortest-path queries (with edges)

- Problem: When approaching dest the path is no longer long enough


## Shortest-path queries (with edges)

- Problem: When approaching dest the path is no longer long enough
- Two Solutions:
- Reverse the search: start from dest instead of src
- Only possible if the overall path is not too short
- Just use another algorithm to find the shortest path


## Shortest-path queries (with edges)

- Problem: When approaching dest the path is no longer long enough
- Two Solutions:
- Reverse the search: start from dest instead of src
- Only possible if the overall path is not too short
- Just use another algorithm to find the shortest path
- It's possible to just fetch the next few steps instead of the whole path
- E.g. to just display the current region in navigation systems


## Local queries

- If src and dest are less than 4 cells apart the shortest distance wasn't precomputed
- In such cases often the small roads are faster
- Use another shortest-path algorithm instead: Dijkstra, Highway Hierachies, etc.
- Most other algorithms are faster if the distance is very short


## Multi-Level Grid

- Open Question: What grid size to choose?

| Size | $\|T\|$ | $\|T\| \times\|T\| /$ node | $\%$ global queries | preprocessing |
| :--- | :--- | :--- | :--- | :--- |
| $64 \times 64$ | 2042 | 0.1 | $91.7 \%$ | 498 min |
| $128 \times 128$ | 7426 | 1.1 | $97.4 \%$ | 525 min |
| $256 \times 256$ | 24899 | 12.8 | $99.2 \%$ | 638 min |
| $512 \times 512$ | 89382 | 164.6 | $99.8 \%$ | 859 min |
| $1024 \times 1024$ | 351484 | 2545.5 | $99.9 \%$ | 964 min |

- Still the same goal: Not too many Transit Nodes, almost no local queries


## Multi-Level Grid

- Solution: Precompute multiple grids of different sizes
- Query: Use the coarsest grid for which the query is still non-local
- Few Transit nodes, faster query time


## Multi-Level Grid

- Solution: Precompute multiple grids of different sizes
- Query: Use the coarsest grid for which the query is still non-local
- Few Transit nodes, faster query time
- Precomputation: Start with a coarse grid, do normal precomputation
- Add finer grids: Compute Transit Nodes like before, but only compute distances beween Transit Nodes if they are in the local region of the parent grid


## Conclusion

- Most work done in a preprocessing step
- Shortest-path queries reduced to a few table lookups
- Query time reduced from milliseconds to microseconds
- Exact responses, not an approximation
- Other stuff: Compress preprocessed data, ...


## Conclusion

- Most work done in a preprocessing step
- Shortest-path queries reduced to a few table lookups
- Query time reduced from milliseconds to microseconds
- Exact responses, not an approximation
- Other stuff: Compress preprocessed data, ...
- Interesting Problems:
- Directed graphs
- Best algorithm for local queries
- Graph changes require full recomputation

Thank you!

