## Highway Hierarchies Star

Daniel Delling Peter Sanders<br>Dominik Schultes<br>Dorothea Wagner

Institut für Theoretische Informatik - Algorithmik I/II
Universität Karlsruhe (TH)
http://algo2.iti.uka.de/schultes/hwy/

9th DIMACS Challenge, November 13, 2006

## Route Planning

## Goals:

exact shortest (i.e. fastest) paths in large road networksfast queriesfast preprocessinglow space consumption
## Applications:

$\square$ route planning systems in the internet
car navigation systems
$\square$ ...

## Our Approach: Highway Hierarchies ${ }^{1}$

$\square$ complete search within a local areasearch in a (thinner) highway network

= minimal graph that preserves all shortest paths
$\square$ contract network, e.g.,

$\square$ iterate $\rightsquigarrow$ highway hierarchy

[^0]
## Local Area

$\square$ choose neighbourhood radius $r(s)$
(by a heuristic)
$\square$ define neighbourhood of $s$

$$
\mathcal{N}(s):=\{v \in V \mid d(s, v) \leq r(s)\}
$$

## Highway Network



Edge $(u, v)$ belongs to highway network iff there are nodes $s$ and $t$ s.t.
$\square(u, v)$ is on the "canonical" shortest path from $s$ to $t$ and
$\square(u, v)$ is not entirely within $\mathfrak{N}(s)$ or $\mathfrak{N}(t)$

## Contraction



Bidirectional version of Dijkstra's Algorithm

## Restrictions:

$\square$ Do not leave the neighbourhood of the entrance point to the current level. Instead: switch to the next level.

$\square$ Do not enter a component of bypassed nodes.

- entrance point to level 0
- entrance point to level 1
- entrance point to level 2


## Drawbacks

$\square$ No effective abort when forward and backward search meet.


## Distance Table: Construction

$\square$ Construct fewer levels.
e.g. 4 instead of 9
$\square$ Compute an all-pairs distance table for the core of the topmost level $L$.
$13465 \times 13465$ entries

## Distance Table: Query


$\square$ Abort the search when all entrance points in the core of level $L$ have been encountered. $\approx 55$ for each direction
$\square$ Use the distance table to bridge the gap. $\approx 55 \times 55$ entries

Delling/Sanders/Schultes/Wagner: Highway Hierarchies Star

## Distance Table: Search Space Example



## Drawbacks

$\square$ Search is not goal-directed.
$\rightarrow$ main topic of this talk:
combination with a goal-directed approach

$\square$ No effective abort when forward and backward search meet.
$\rightarrow$ main problem that we face

## Goal-directed Search

$\square$ push search towards target
$\square$ add potential $\pi$ to priority of each node
$\square$ A* equivilant to DIJKSTRA's algorithm on graph with reduced costs

$$
w_{\pi}(u, v)=w(u, v)-\pi(u)+\pi(v)
$$

$\square$ potential feasible if reduced costs $\geq 0$better potential $\rightarrow$ smaller search space

## Bidirectional A*

$\square$ problems bidirectional variant:

- forward potential $\pi_{f}$, backward potential $\pi_{r}$
- both searches might operate on different graphs
$\square$ solution:
- potentials consistent iff $w_{\pi_{f}}(u, v)$ in $G$ equal $w_{\pi_{r}}(v, u)$ in reverse graph
- use average potentials: $p_{f}=\left(\pi_{f}-\pi_{r}\right) / 2=-p_{r}$
- but: leads to worse lower bounds


## ALT

$\square$ bidirected goal-directed search ( $\mathbf{A}^{*}$ )
$\square$ use Landmarks to compute potentials (lower bounds)
$\square$ Preprocessing:

- choose landmarks from node set
- calculate distances from and to all nodes
$\square$ On-line stage:
- use Triangle inequality to compute lower bounds on the distance to the target

$$
d(s, t) \geq d\left(L_{1}, t\right)-d\left(L_{1}, s\right) \text { and } d(s, t) \geq d\left(s, L_{2}\right)-d\left(t, L_{2}\right)
$$

## Landmark-Selection

reduction of search space highly depends on quality of landmarksseveral selection strategies:- avoid:
identify regions that are not covered by landmarks
- maxCover:
$4 \cdot$ avoid + local optimisation
- advancedAvoid:
reselect first avoid landmarks
$\square$ long computation time: $\approx 90$ minutes for 16 maxCover landmarks


## Using Highway Hierarchies for Selection

idea: reduce preprocessing by using hierarchy for selectionadvantages:

- reduction of prepocessing:
$<1$ minute for selecting 16 maxCover landmarks on core-3
- important edges are covered
$\square$ disadvantages:
- highway hierarchy shrinks to the center
- nodes on the edge of the map are good landmarks
- for ALT: compute distances (6 minutes)



## Landmark Quality (different cores)

|  | times metric (Europe) |  |  | distance metric (Europe) |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: |
| [\#settled nodes] | avoid | adv.avoid | maxCov | avoid | adv.avoid | maxCov |
| full graph | 93520 | 86340 | 75220 | 253552 | 256511 | 230110 |
| core-1 | 84515 | 82423 | 75992 | 254596 | 252002 | 230979 |
| core-2 | 89001 | 86611 | 75379 | 259145 | 257963 | 230310 |
| core-3 | 91201 | 91163 | 72310 | 264821 | 275991 | 239584 |

$\square$ (almost) no loss of quality for higher cores
$\square$ advancedAvoid not worth the effort
$\square$ maxCover core-3 outperforms avoid in general
$\rightarrow$ switching to higher cores seems promising

## Landmark Quality (different strategies)

$\square$ all landmarks from full graph, 10 different sets

|  | times metric (Europe) |  |  | distance metric (Europe) |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: |
| [\#settled nodes] | average | $\min$ | $\max$ | average | $\min$ | $\max$ |
| avoid | 93520 | 72720 | 103929 | 253552 | 241609 | 264822 |
| adv.avoid | 86340 | 72004 | 95663 | 256511 | 218335 | 283911 |
| maxCov | 75220 | 71061 | 77556 | 230110 | 212641 | 254339 |

$\square$ minimum the same for all strategies
$\square$ maxCover more robust

Local Queries ALT (Europe, travel times metric)

$\rightarrow$ approximate queries not much faster

## Highway Hierarchies*

## Combination of Highway Hierarchies with ALT

$\square$ replace edge weights by reduced costs
$\square$ use potential functions $\pi_{f}$ and $\pi_{r}$
$\rightsquigarrow$ search directed to the respective target
$\rightsquigarrow$ we quickly find a good (or even the best) path
$\leadsto$ good upper bounds are available early

However: only the order of events is changed; search space is not reduced

## Highway Hierarchies*

## Solution:

$\square$ abort when forward and backward search meet

- works well for ALT (combined with reach-based routing)
- does not work with highway hierarchies
$\square$ pruning
- edge pruning
- node pruning (used by HH*):
key of node $u>$ upper bound $\rightarrow$ do not relax $u$ 's edges lower bound


## Positive Aspects

$\square$ no consistent potential functions required
$\leadsto$ more effective goal-direction
$\rightsquigarrow$ good upper bounds available very earlynode pruning very simple
if one node is pruned, search can be stopped (in that direction)select only one landmark for each direction, no dynamic updates of the chosen landmark(s)
distance table bridges the middle part

goal-direction works well
$s \rightarrow t$ and $s \rightarrow u$ : common subpath

Delling/Sanders/Schultes/Wagner: Highway Hierarchies Star

## Negative Aspect (for travel time metric)


goal-direction works well
$s \rightarrow t$ and $s \rightarrow u$ : common subpath

pruning fails
$d(s, t) \geq d(s, u)-d(t, u)$

## Approximate Queries

## Dilemma:

$\square$ finding a good path: very fast
$\square$ guaranteeing optimality: comparatively slow
$\rightsquigarrow$ guarantee weakened: look for a path $P$ s.t.

$$
\text { length of } P \leq(1+\varepsilon) \cdot O P T
$$

## Implementation:

adapted node pruning: $(1+\varepsilon) \cdot($ key of node $u)>$ upper bound

## Optimisations

## Reducing Space Consumption

Store landmark-distances only at all core-1 nodes.
$\rightsquigarrow$ split search in two phases:
$\square$ initially, non-goal-directed search to the core-1 nodes
$\square$ then, goal-directed search from the core-1 nodes

## Limiting Component Sizes

introduce a shortcut hops limit
$\rightsquigarrow$ indirectly limits the component sizes
important to ensure an efficient initial query phase

Main Results

## Europe

| metric |  | 0 | DistTab | ALT | both |  |
| :--- | :--- | ---: | ---: | ---: | :---: | :---: |
| time | preproc. time [min] | 16 | 18 | 19 | 21 |  |
|  | total disk space [MB] | 886 | 1273 | 1326 | 1713 |  |
|  | \#settled nodes | 1662 | 916 | 916 | 686 | $(176)$ |
|  | query time [ms] | 1.49 | 0.79 | 1.04 | 0.68 | $(0.21)$ |
| dist | preproc. time [min] | 46 | 46 | 49 | 48 |  |
|  | total disk space [MB] | 894 | 1506 | 1337 | 1948 |  |
|  | \#settled nodes | 10284 | 5067 | 3347 | 2138 | $(177)$ |
|  | query time [ms] | 10.93 | 6.02 | 4.33 | 2.54 | $(0.30)$ |

Local Queries HH* (Europe, travel time metric)


Approximation Error HH* (Europe, travel time metric)

guaranteed maximum error $\varepsilon=10 \%$
actual total error (for a random sample of 1000000 node pairs) $=0.056 \%$

## Determine Shortest Paths

## 1. Bridge the Distance Table Gap

from the forward entrance point $u$ to the backward entrance point $v$
greedily determine the next hop:
while $u \neq v$ do
foreach $(u, w) \in$ "edges in the topmost core" do
if $d(u, w)+d(w, v)=d(u, v)$ then
$u:=w ;$
break;

Note: $d(w, v)$ can be looked up in the distance table.

## Determine Shortest Paths

## 2. Unpack Shortcuts

$\square$ Variant 1

- no additional data
- for each shortcut $(u, v)$, perform a search from $u$ to $v$
- use some pruning rules
$\square$ Variant 2
- store for each shortcut unpacking information (recursively)
$\square$ Variant 3
- store for important shortcuts complete unpacking information
- no recursion

Determine Shortest Paths

|  | Europe |  |  |
| :--- | ---: | ---: | ---: |
|  | preproc. <br> [min] | space <br> $[M B]$ | query |
|  | [ms] |  |  |
| Variant 1 | $0: 00$ | 0 | 16.70 |
| Variant 2 | $1: 11$ | 112 | 0.45 |
| Variant 3 | $1: 15$ | 180 | 0.17 |

## Summary

$\square$ selecting landmarks only on a contracted graph
$\leadsto$ saves preprocessing time.
$\square$ storing landmark-distances only on a contracted graph
$\rightsquigarrow$ saves space
$\square$ highway hierarchies can handle the distance metric

- increased preprocessing time ( $\approx$ factor 2 )
- similar memory usage
- increased query time ( $\approx$ factor 3-4)


## Summary

$\square$ for the travel time metric:

- distance table optimisation slightly better than ALT
- combination yields only small improvementfor the distance metric:
- ALT better than distance table optimisation
- combination worthwhileapproximate queries: very fast, only small errorsfast computation of complete descriptions of the shortest paths


## Work in Progress

$\square$ computation of $M \times N$ distance tables
(e.g. $10000 \times 10000$ table in one minute)
joint work with [S. Knopp, F. Schulz, D. Wagner] ${ }^{2,3}$
to be presented at ALENEX '07
$\square$ storing all entrance points into the core of the topmost level
$\rightsquigarrow$ very fast queries ( $\rightarrow$ tomorrow's talk)

[^1]
## Future Work

fast, local updates on the highway network(e.g. for traffic jams)
$\square$ implementation for mobile devices (flash access, ...)multi-criteria shortest paths

joint work with [M. Müller-Hannemann, M. Schnee] ${ }^{4}$
$\square$ . . .

[^2]
[^0]:    ${ }^{1}$ presented at ESA 2005 and ESA 2006

[^1]:    ${ }^{2}$ Universität Karlsruhe, Algorithmik I
    ${ }^{3}$ PTV AG, Karlsruhe

[^2]:    ${ }^{4}$ Technische Universität Darmstadt

