

# Intention-Aware Routing to Minimise Delays at Electric Vehicle Charging Stations

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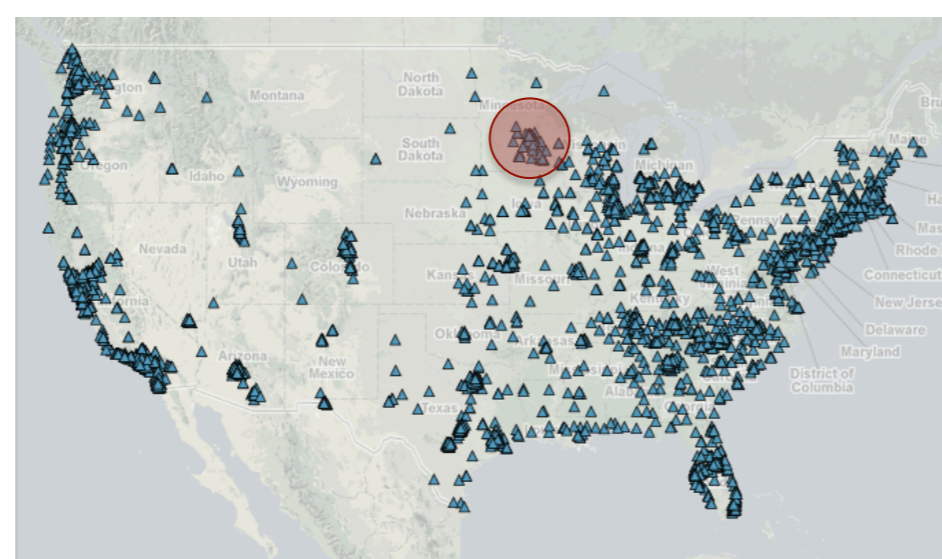
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## Electric Vehicles

Electric vehicles (EVs) reduce:  
- CO<sub>2</sub> emissions and  
- dependence on fossil fuels.

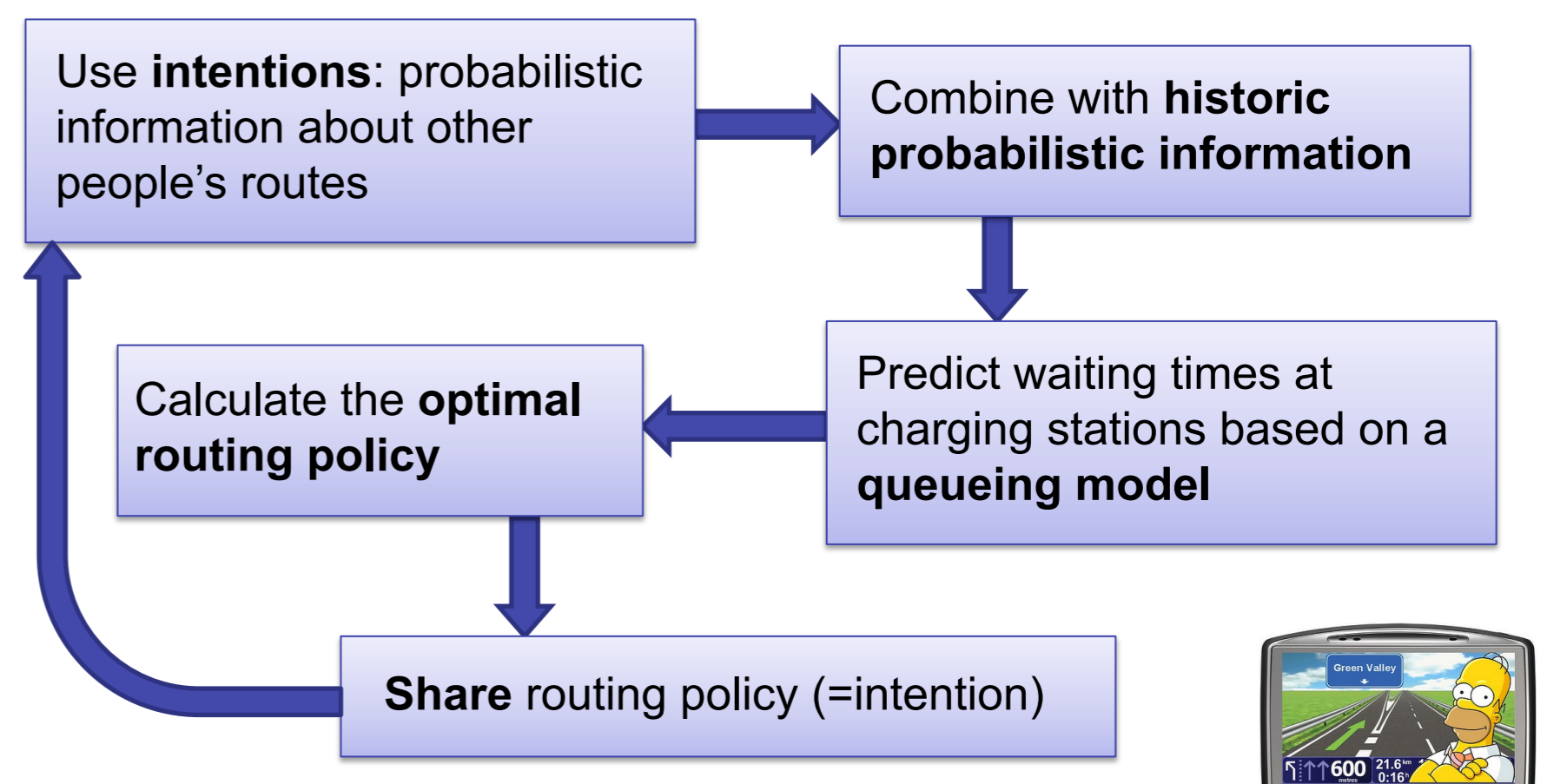


However, EVs have a **limited range** (typically <100 miles).

Public charging stations are **scarce** and charging is **slow** (at least 15-30 minutes), leading to potentially **long queues and delays**.

## Our Solution:

### Intention-Aware Routing System (IARS)

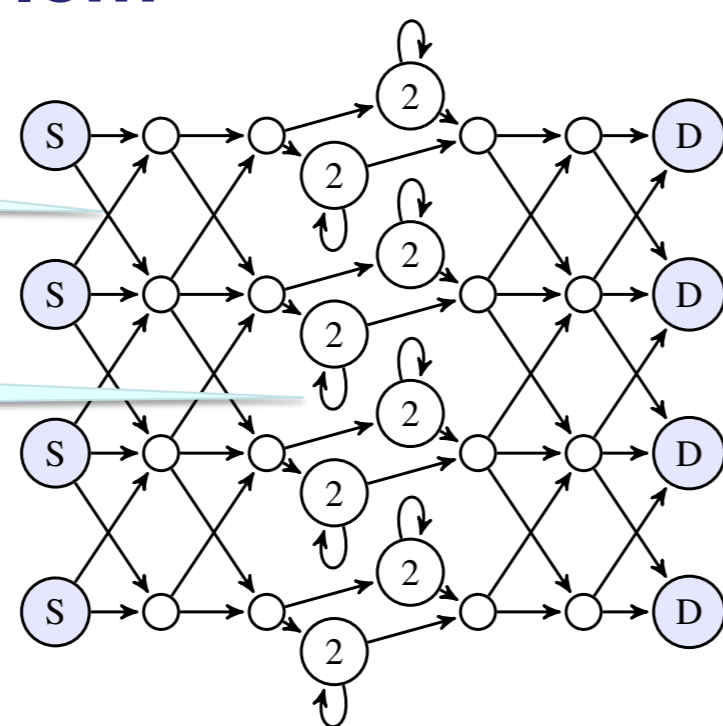


## Routing Problem

Traffic network is modelled as a graph:

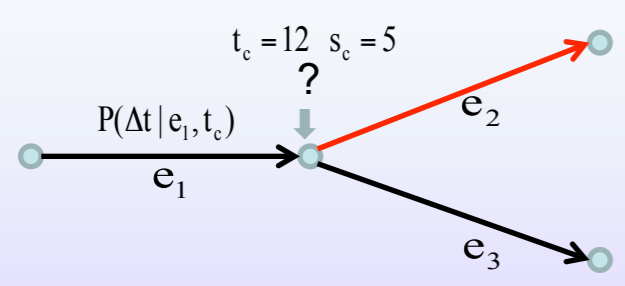
Edges represent roads...

... or charging stations.



Travel and waiting times are probabilistic and depend on time of day:  $P(\Delta t_e, t_c)$

Solution is a **routing policy** (state-dependent plan):  $\pi(e_1, t_c, s_c) = e_2$



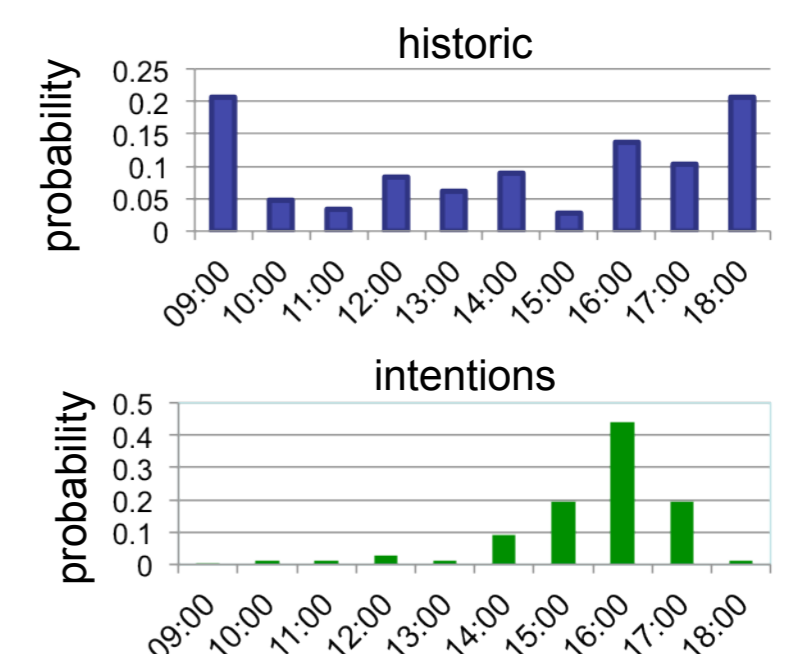
Optimal policy maximises user's expected utility  $E(U(t,s))$ .

**t**: time of arrival at destination  
**s**: state of charge at destination

Developed two algorithms to solve this, based on dynamic programming and AO\*.

## Waiting Time Distributions at Charging Stations

**Step 1:** Compute probability  $P_i^{arr}(e, t)$  of vehicle  $i$  arriving at station  $e$  at time  $t$ , using historic information or intentions, when available.

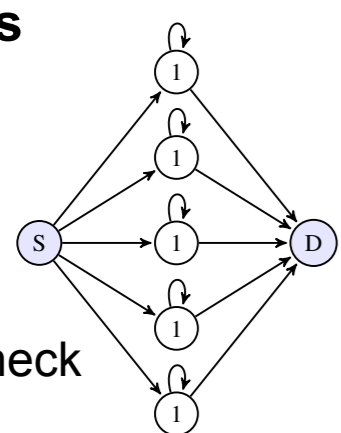


**Step 2:** Approximate waiting time distribution by sampling from  $P_i^{arr}(e, t)$  and simulating waiting times using a queueing model.

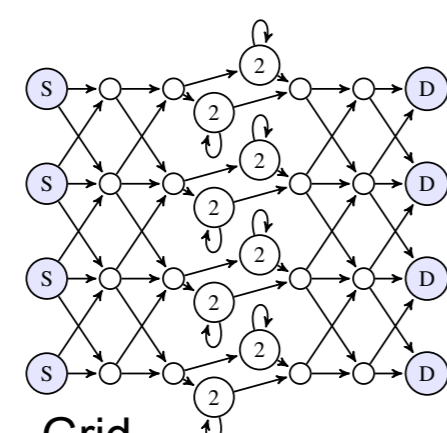


## Results

### Graphs

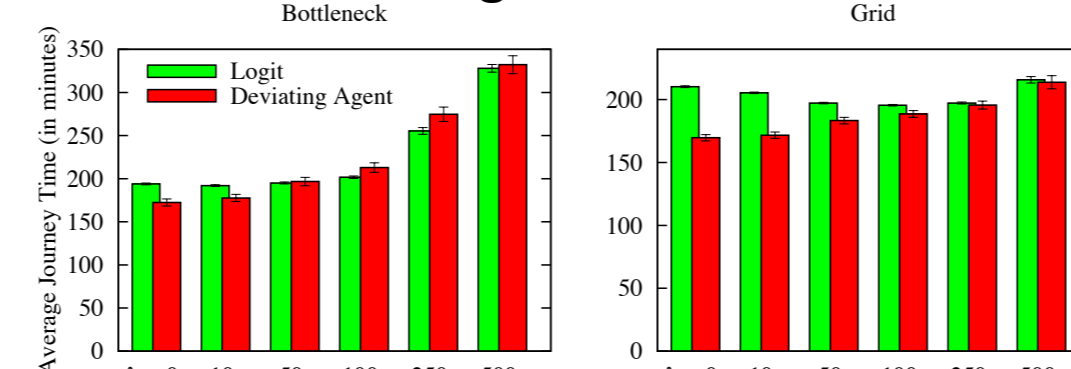


Bottleneck

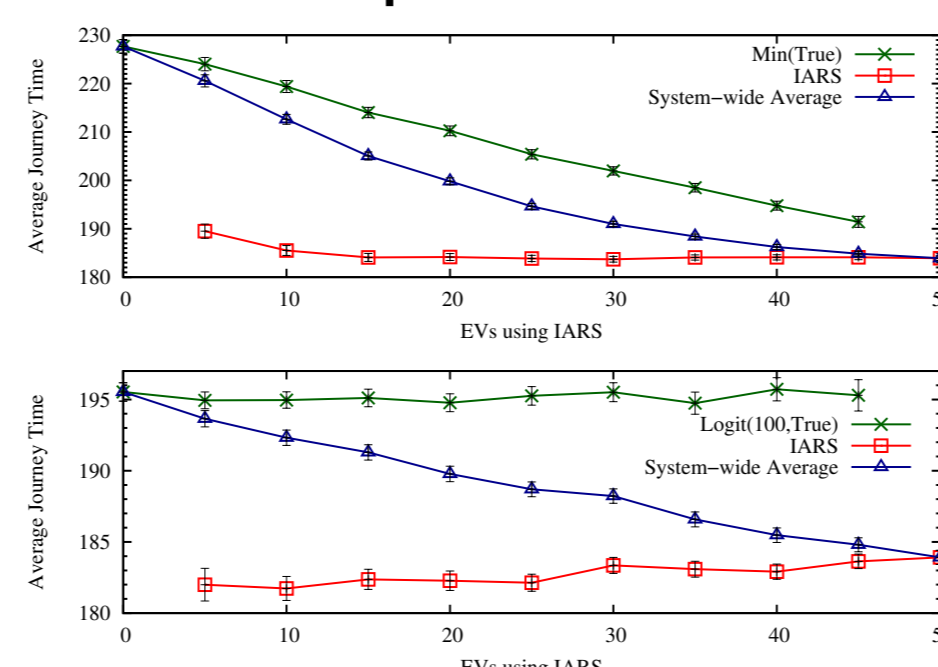


Grid

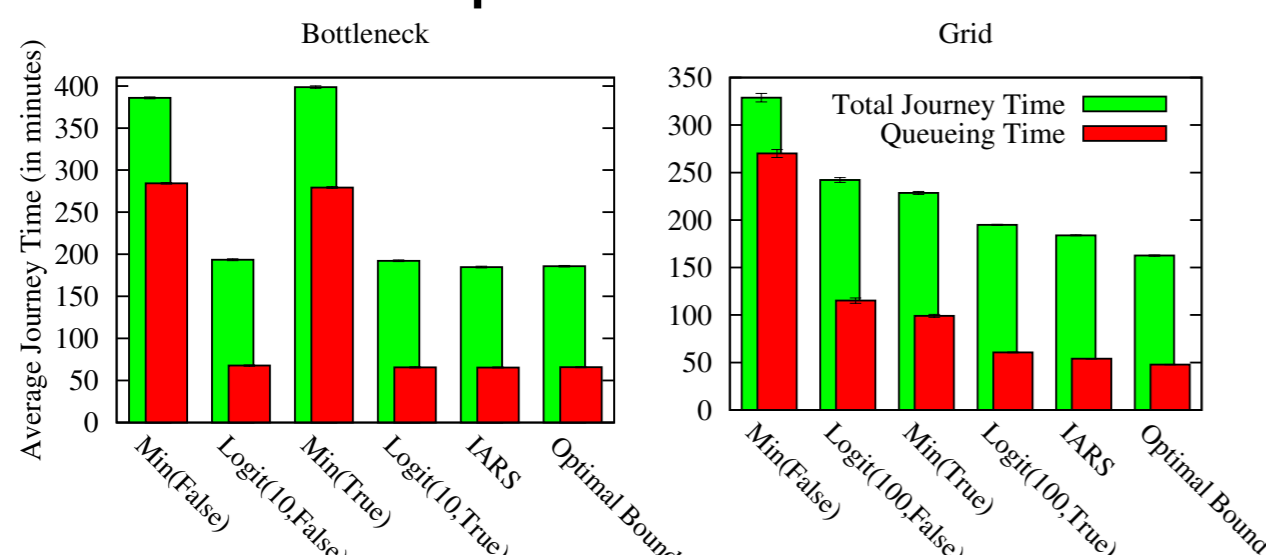
### Deviation from Logit



### Incentives to adopt IARS



### Performance Comparison



### Benchmarks

**Min(False):** Shortest path *without* considering historical waiting times.

**Min(True):** Shortest path considering historical waiting times.

**Logit( $\lambda$ , True/False):** As Min(True/False), but with random deviations (using logit function with parameter  $\lambda$ ).

**IARS:** Intention-Aware Routing System

## Conclusions

- Proposed **new routing model** for the EV charging setting.
- This incorporates **intentions** by:
  - Combining known EV policies with historic information.
  - Using a principled approach for approximating waiting time distributions based on a queueing model
- Evaluation shows **significant reduction in overall journey time**, compared to approaches using only historic information.
- **IARS benefits all agents**, even those not using the system.

## Future Work

- Evaluation on real road networks and traffic data.
- Comparison to reservation-based systems.
- More advanced queueing models, including variable charging times.