

# Real Time Routing in Road Networks

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- Road junctions as graph vertices
- Connecting road segments as edges
- Static graph: constant edge weight
- Time Dependent graph: edge weight is a function of current traffic, weather conditions etc.
- Now use any shortest path algorithm on this graph, like Dijkstra's search[1].

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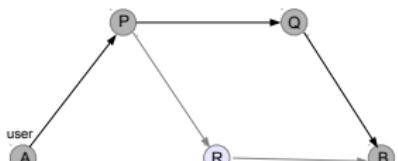
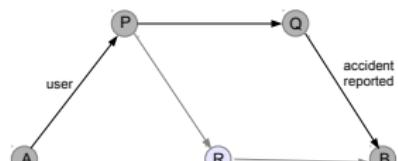
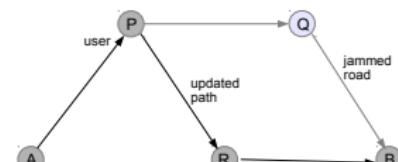
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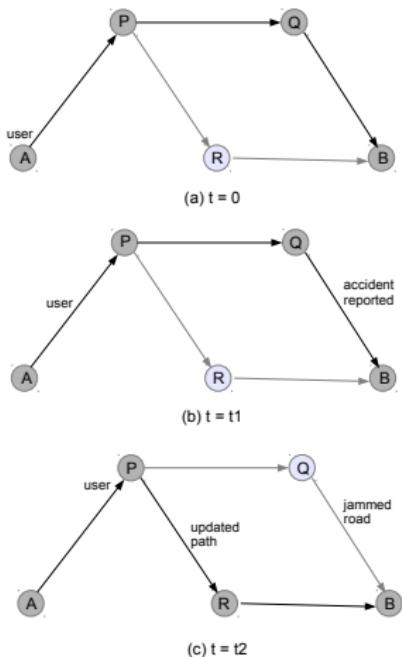
- Most of these approaches haven't shown success in dynamic case[7]
- These algorithms involve 2 steps - preprocessing (slow) and online computation (fast)
- Unrealistic to do the preprocessing step everytime as graph changes. Periodic updates don't use real time information.



# Real-Time processing requirement

(a)  $t = 0$ (b)  $t = t1$ (c)  $t = t2$

# Real-Time processing requirement



- Real time updates are not fully utilized if revised route not sent to the user
- Need for a proactive system
- Also avoids misdirection! Driver followed satellite navigation instructions in the dark and her car was hit by a train on a rail crossing that was not shown on the system [8].

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## The problem with such decentralized approach is

- Prohibitive for thin clients: all mobile devices do not have the capability to handle computations and communication that is required.

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- A graph density based method to choose time optimal algorithm for query dependent route computation.

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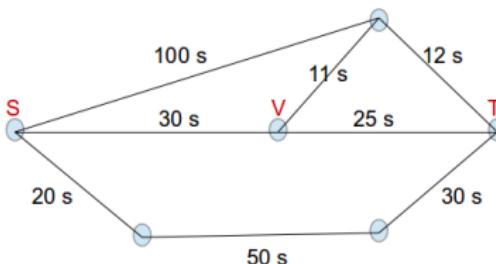
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- Edge weight represents the time it would take to travel on that edge at current time.

# Types of jobs

## Fresh

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- Given a unique ID which represents this user.
- Subsequent refresh and redo jobs carry forward this same ID.

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## Redo

- System was late in giving response to the user or user chooses to take a different path.
- Re-computation is required based on current location.

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- All jobs are aperiodic
- Independent of each other, don't follow any precedence relations among them.
- Non-preemptive, because a job cannot be paused and resumed as network might have seen updates during this time.

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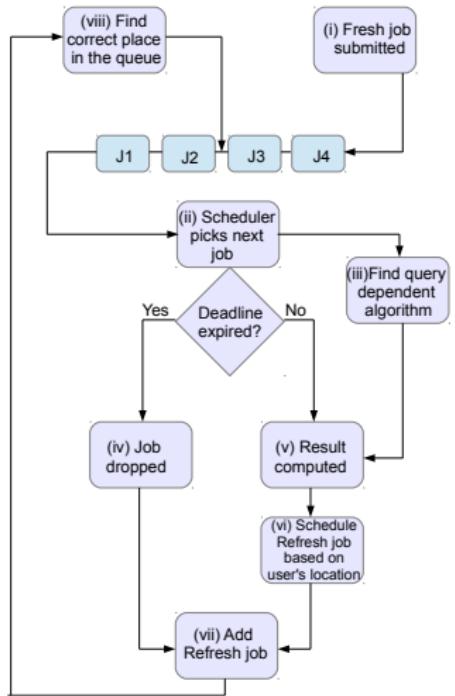
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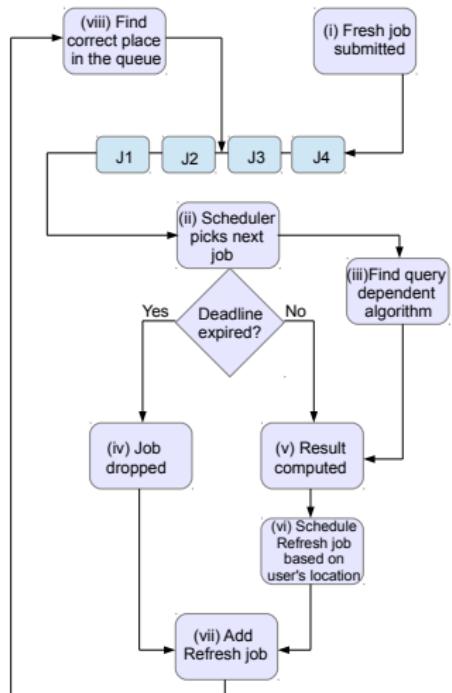
- *Dynamic*: no binding relation between a job and a particular processor.
- *Priority-driven*: scheduling decisions are based on the priorities of the jobs and take place when events such as job completions occur.

# Overall System Model

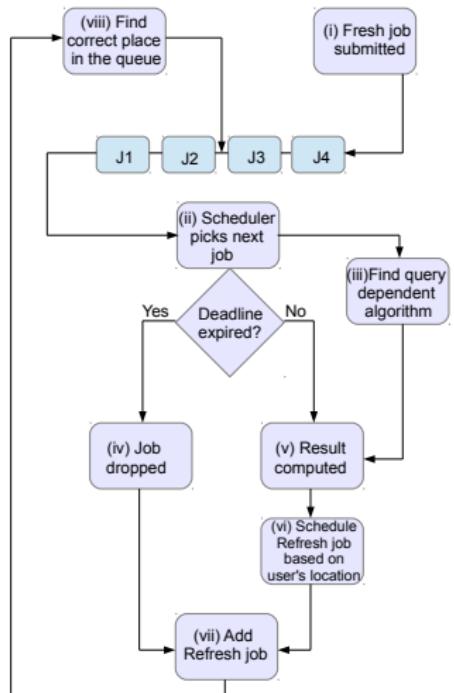


# Overall System Model

- Fresh jobs enter job queue from one end

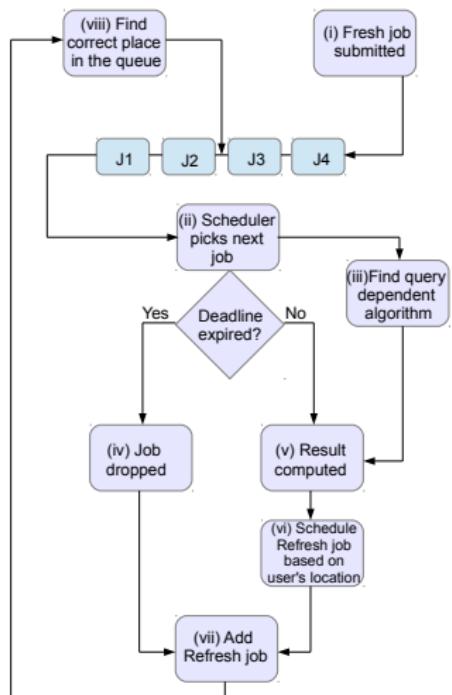


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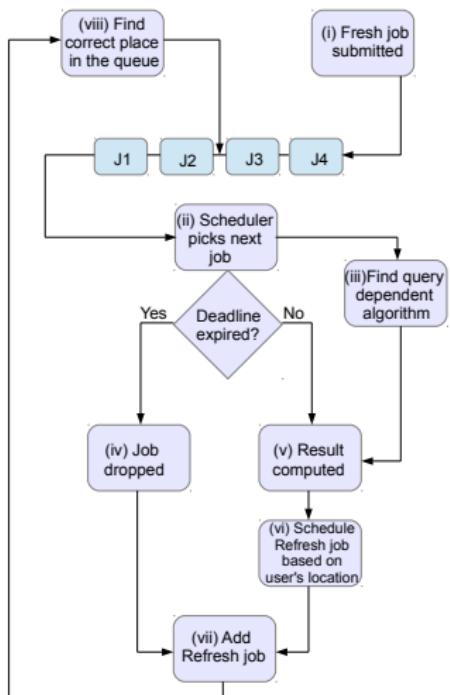
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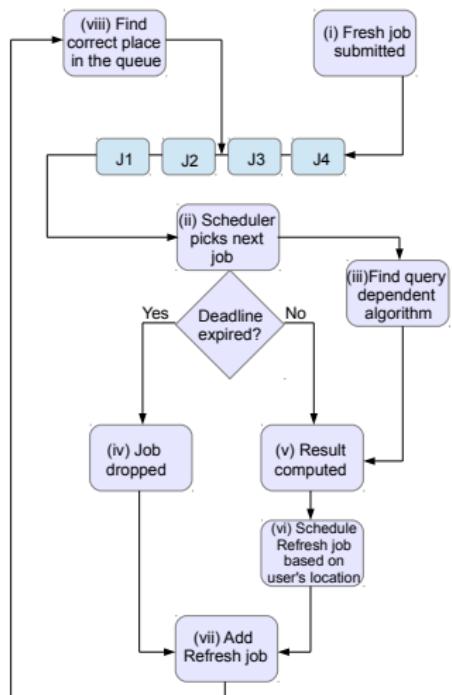
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- If deadline not expired, result is computed. Otherwise dropped.
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- Deadline of refresh jobs decides their priority and appropriate place in the job queue.

# Computing Job Deadlines

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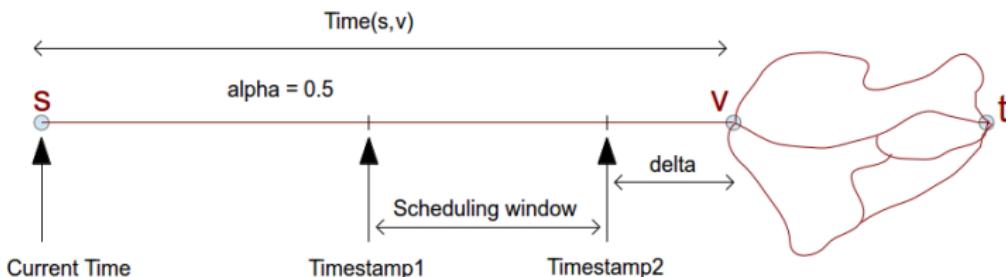
$$\text{Timestamp1} \leq \text{Scheduling\_time} \leq \text{Timestamp2} \quad (1)$$

$$\text{Timestamp1} = \text{Current\_time} + \alpha * \text{time}(s, v) \quad (2)$$

$$\text{Timestamp2} = \text{Current\_time} + \text{time}(s, v) - \Delta \quad (3)$$

$\alpha$  is any constant  $\epsilon (0,1)$  and  $\Delta$  is the estimated upper bound on computation plus communication time.

# Illustration



- Route computation before  $Timestamp1$  will not have the latest information.
- Route computation after  $Timestamp2$  will not be complete before user reaches ' $v$ ', hence not useful.

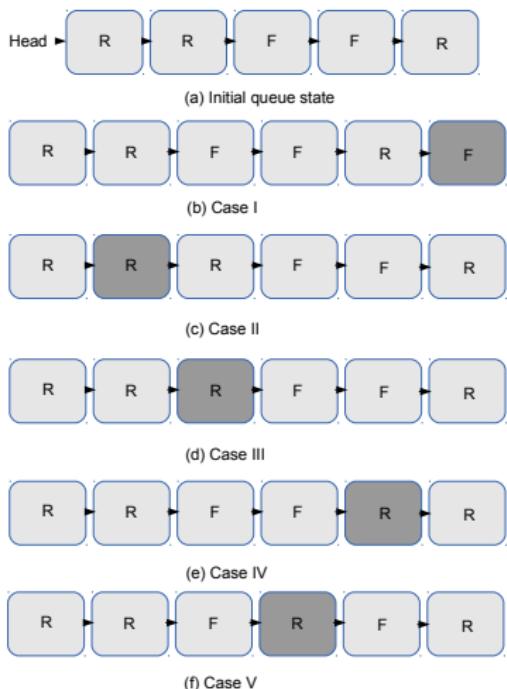
# Job Scheduling Algorithm

---

```
1: while (1) do
2:   while !(Queue Empty) do
3:     ptr  $\leftarrow$  queue head
4:     if ptr.jobtype = fresh then
5:       goto compute
6:     else
7:       if ptr.jobtype = refresh & matured(ptr) = true then
8:         goto compute
9:       else
10:        if ptr.jobtype = refresh & expired(ptr) = true then
11:          dropped jobs ++
12:          goto add
13:        else
14:          ptr  $\leftarrow$  next(ptr)
15:        end if
16:      end if
17:    end if
18:  end while
19:  compute :
20:    compute shortest path
21:    add :
22:      find next hop
23:      add refresh job
24: end while
```

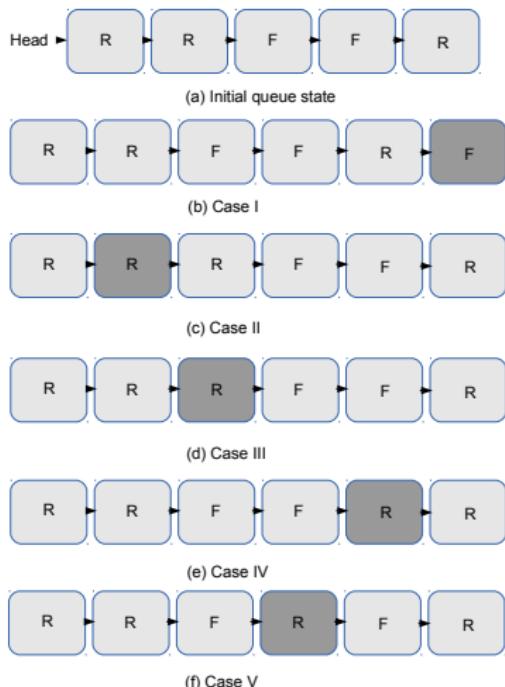
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# Job Queue Insertion

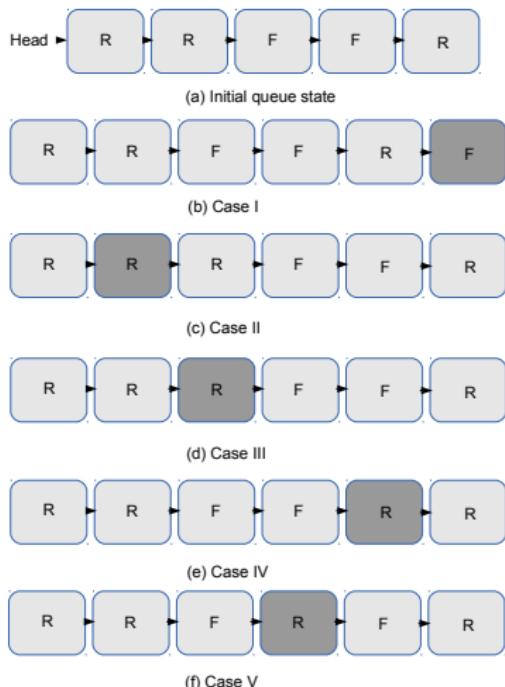


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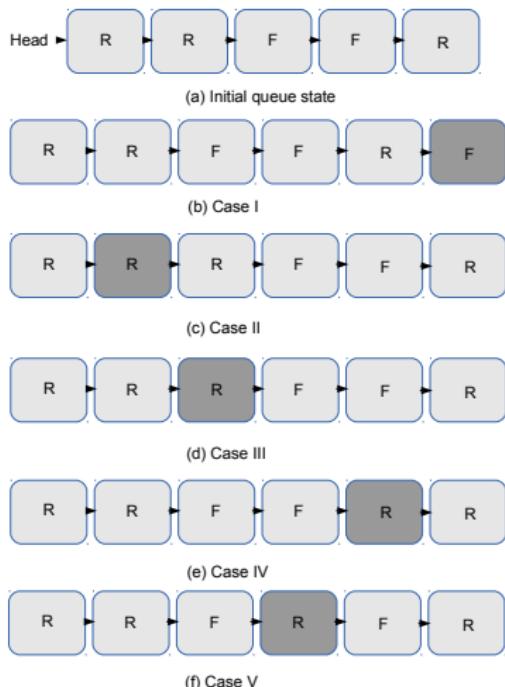


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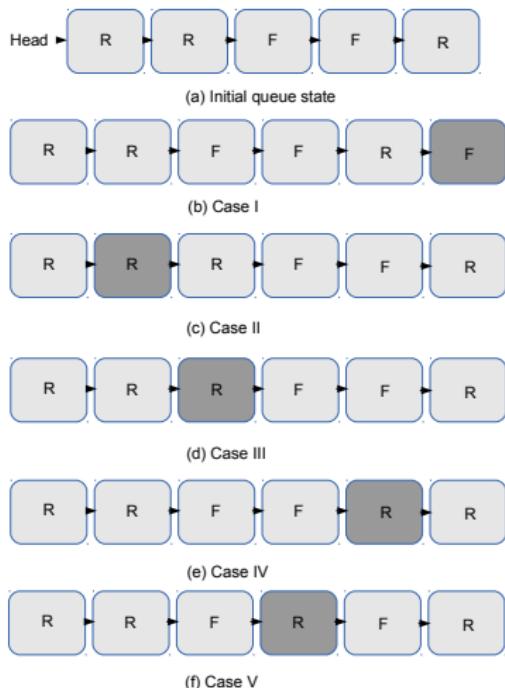
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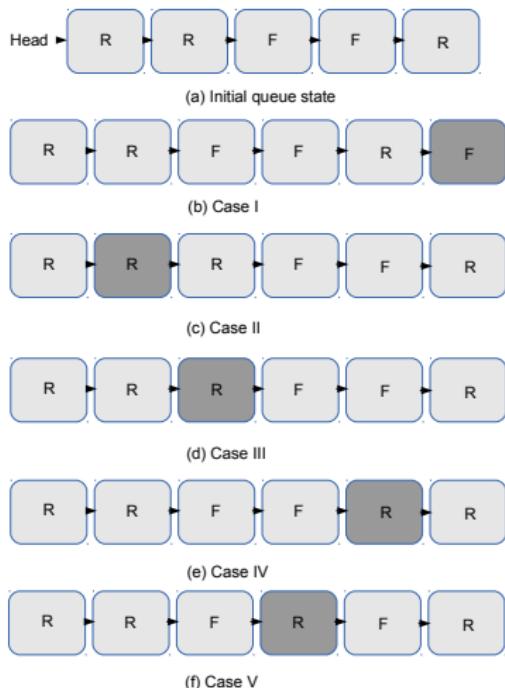
- **Case I:** Fresh job is simply added in the back
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- **Case III:** Refresh job is given higher priority over fresh job.

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- Case IV: Fresh job is given higher priority.

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- Case III: Refresh job is given higher priority over fresh job.
- Case IV: Fresh job is given higher priority.
- Case V: Relative priorities of fresh jobs and refresh jobs are dynamically computed.

# Computing relative priorities for insertion

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If,  $Timestamp2(R1) < Timestamp2(R2)$ , then:

$$Priority(R1) > Priority(R2) \quad (4)$$

If,  $AgingFactor(F) < Threshold$ , then:

$$Priority(R) > Priority(F) \quad (5)$$

If,  $AgingFactor(F) \geq Threshold$ , then:

$$Priority(F) > Priority(R) \quad (6)$$

# Algorithm for insertion of refresh job

---

```
1: if (Queue Empty) then
2:   queue head ← next_refresh_job
3:   return done
4: end if
5: ptr ← queue head
6: while ptr != NULL do
7:   if ptr.jobtype = refresh && ptr.timestamp2 > next_refresh_job.timestamp2
    then
8:     insert next_refresh_job before ptr
9:     return done
10:  end if
11:  if ptr.jobtype = fresh && ptr.age < threshold then
12:    insert next_refresh_job before ptr
13:    temp ← ptr
14:    while temp.jobtype = freshjob do
15:      temp.age ++
16:      temp ← next(temp)
17:    end while
18:    return done
19:  end if
20:  ptr ← next(ptr)
21: end while
22: add next_refresh_job at queue end
23: return done
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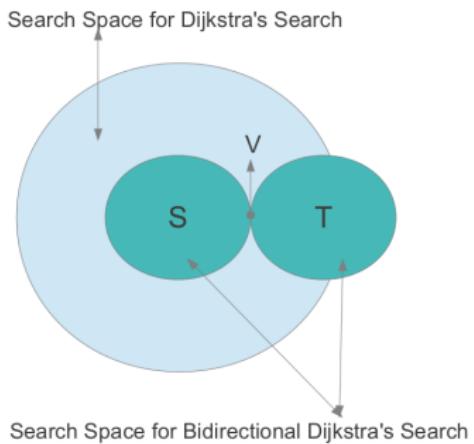
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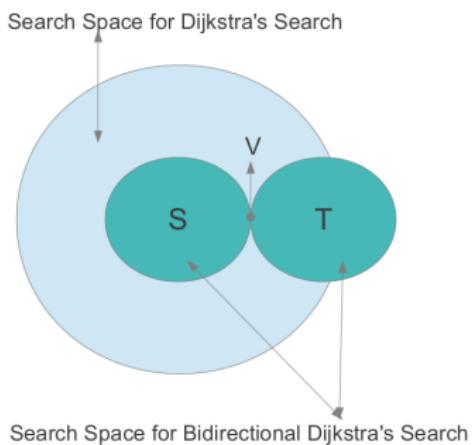
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- Possible to select which of the two algorithms would be better for a given query.
- Also reduces the average query computation time.

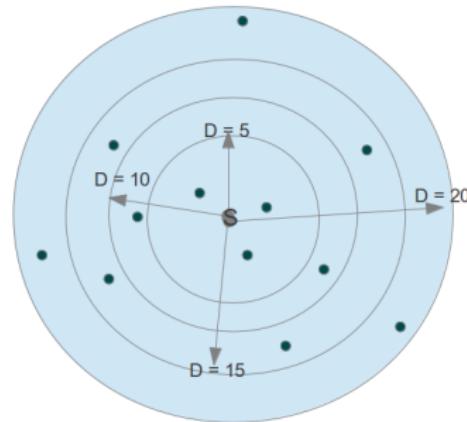
# Search Space and Graph Density



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Densities from source vertex  $S$



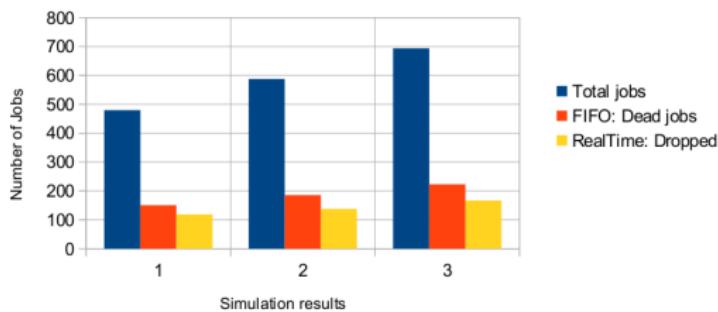
# Experimental Setup

- Road networks were taken from Dimacs Implementation Challenge.

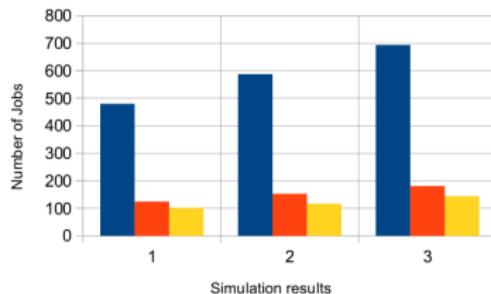
Table: Graph instances used

Graph Name	Number of Vertices	Number of Edges
TG	18263	23874
BAY	174956	223001
SF	321270	800172
COL	435666	1057066
LKS	2758119	6885658

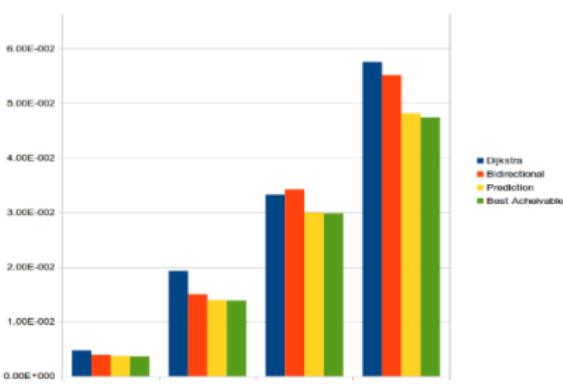
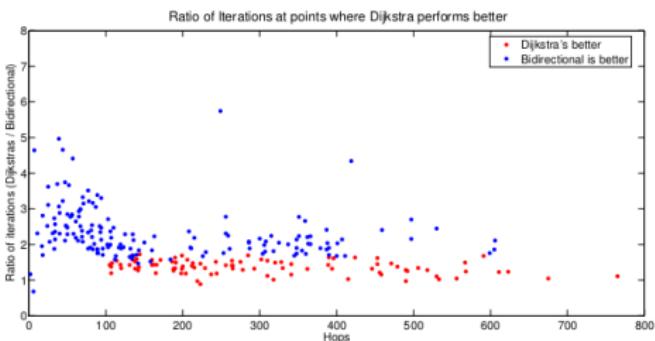
# Results for Real Time Routing



- Showing simulation results with  $\alpha = 0.6$  (top) and  $0.5$  (bottom) and two threads.
- For  $\alpha = 0.6$ , 31-32% queries are dead in FIFO, 23-24% queries are dropped by our framework.
- With increasing  $\alpha$ , scheduling window decreases and more number of queries result into dead/drop computation.
- Our framework processes 7-10% more number of useful queries and takes 10-12% lesser time than FIFO on an average.



# Results for Query Dependent Route Computation



# Future Work

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This work has been submitted to the 4th IEEE International Conference on Big Data and Cloud Computing (BDCloud 2014).

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# Thank you.