



## Building a bus rapid transport system simulator with SimPy and GeoPandas

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# About us...

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Data Scientist



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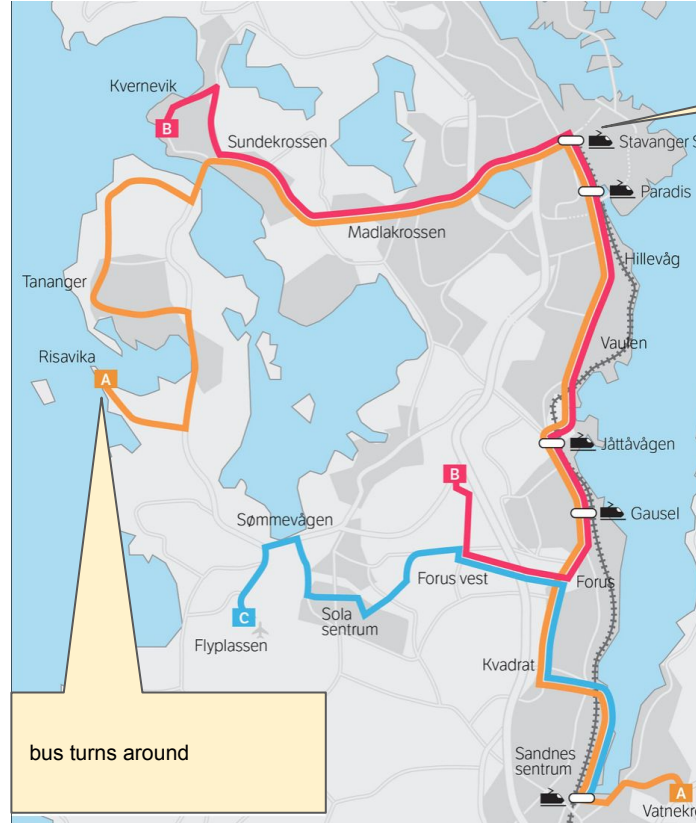
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# Objective

- “Build a traffic simulator for the new BRT system”
- Client: Kolumbus AS
- Provider: Computas AS
- Time frame: mars-okt 2018
- “Don´t use microscopic traffic simulation framework e.g. SUMO”
- Our choice of technology: Python + Simpy + Geopandas

# Bus rapid transport in Rogaland/Norway

- Three line:
  - A: 37 km
  - B: 25 km
  - C: 14 km
- Constructed as separate dual bus lane mid-placed between two car lanes
- Other bus lines share the same track but no other traffic (taxis, electric cars etc.)
- Currently 15% is build
- Expected date of completion: 2023
- More info:
  - <http://bussveien.no>
  - <https://www.vegvesen.no/vegprosjekter/bussveien>



Stavanger bus terminal

104 roundabouts



81 bus stops



bus turns around

# Congestion prevention

Vehicle holding strategies for avoiding “bus bunching”

- First bus rules
- Simple interval regularization
- Optimal interval regularization

...other strategies

- Skipping stops
- Dwelling times



# Quick demo

Find the code here:

<https://github.com/Ture2019/DemoTrafficLightSimulator.git>

# Use of Geopandas

- We used it to calculate the distance from previous waypoints:

```
route['prev_geometry'] = route.geometry.shift(1)
route['distance'] = route.apply(lambda row: row.geometry.distance(row.prev_geometry), axis=1)
```

- Or for joining geographic data:

```
gdf = gpd.sjoin(left_df=gdf, right_df=right_df, how='left')
gdf[column] = gdf.index_right + 1
gdf.drop(columns='index_right', inplace=True)
```

- As the sentral data structure “Driving book”  
(see next slide)

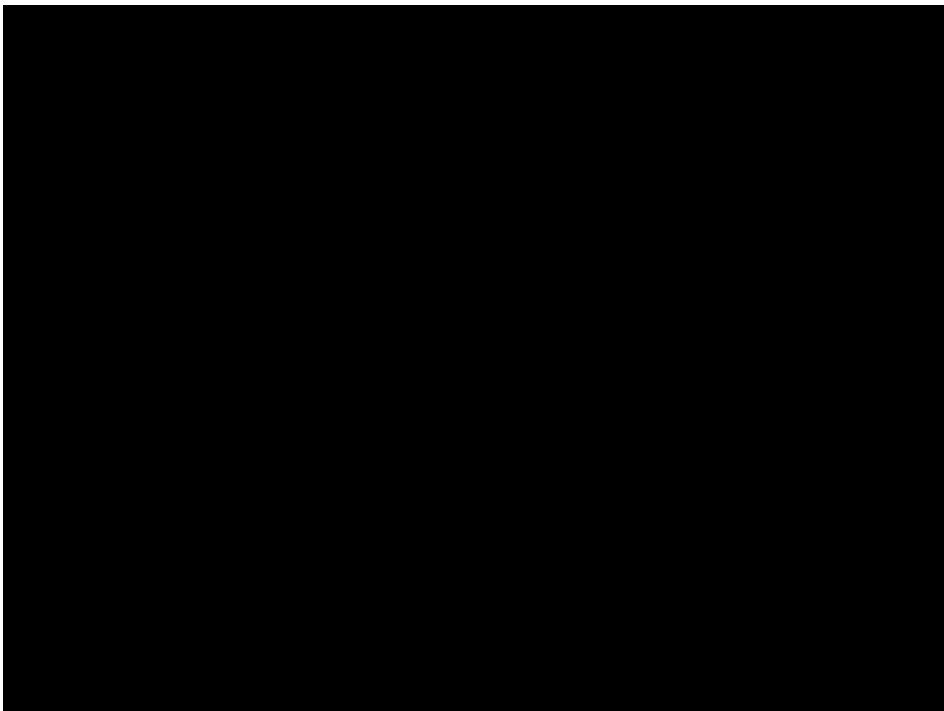


# Driving book

	route	A	B	C	direction	section	category	id	name	entrance	geometry	distance	azimuth	objectRef
0	A	0.0	NaN	NaN	go	a1g	stop	1.0	Risavika Havn	1.0	POINT (303172.98762263 6536164.5821019)	0.000000	322.0	stop01_RisavikaHavn
1	A	1.0	NaN	NaN	go	a1g	waypoint	0.0	waypoint_248	NaN	POINT (303417.56544243 6535834.8834327)	410.511294	323.0	NaN
2	A	2.0	NaN	NaN	go	a1g	trigger1	NaN	Kv3575 x Enerigivegen	1.0	POINT (303753.2779296887 6535806.445222044)	336.914835	275.0	crossing_Kv3575XEnerigivegen
3	A	3.0	NaN	NaN	go	a1g	trigger2	NaN	Kv3575 x Enerigivegen	1.0	POINT (303857.9032163142 6535797.582412188)	105.000000	275.0	crossing_Kv3575XEnerigivegen
4	A	4.0	NaN	NaN	go	a1g	trigger3	NaN	Kv3575 x Enerigivegen	1.0	POINT (303872.8496858321 6535796.316296494)	15.000000	275.0	crossing_Kv3575XEnerigivegen
5	A	5.0	NaN	NaN	go	a1g	crossing	0.0	Kv3575 x Enerigivegen	1.0	POINT (303887.79615535 6535795.0501808)	15.000000	275.0	crossing_Kv3575XEnerigivegen
6	A	6.0	NaN	NaN	go	a1g	trigger1	NaN	Kv3575 x Tankvegen	1.0	POINT (303994.3727563186 6535790.454311474)	106.675648	272.0	crossing_Kv3575XTankvegen
7	A	7.0	NaN	NaN	go	a1g	stop	2.0	Kontinentalvegen	1.0	POINT (304088.9769886167 6535786.374722846)	94.692153	272.0	stop02_Kontinentalvegen

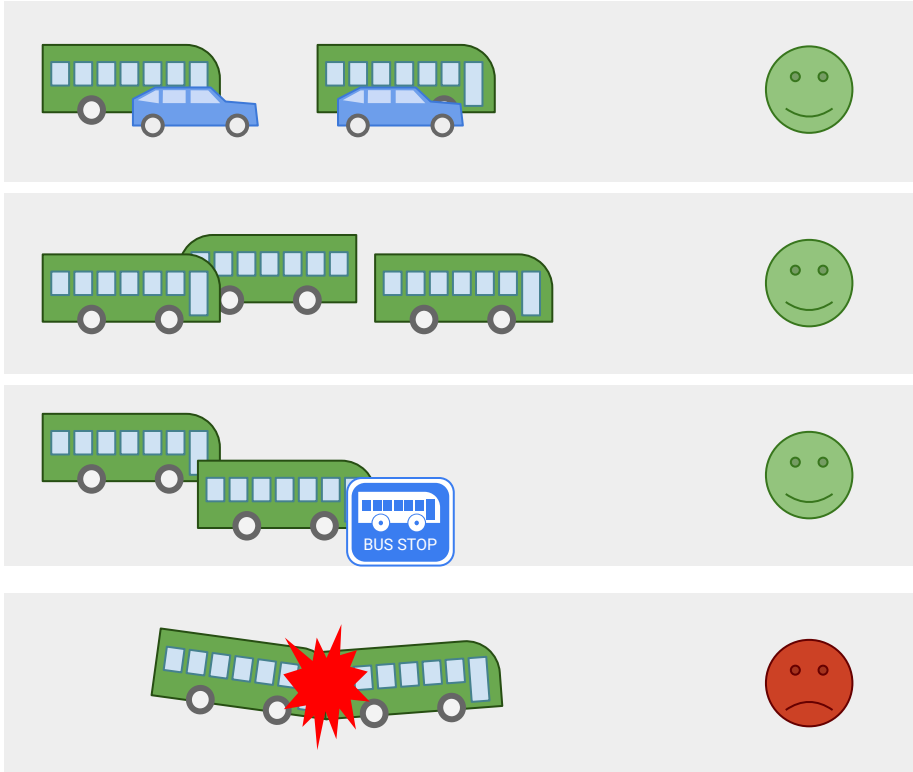


# Other libraries we used: matplotlib.animation

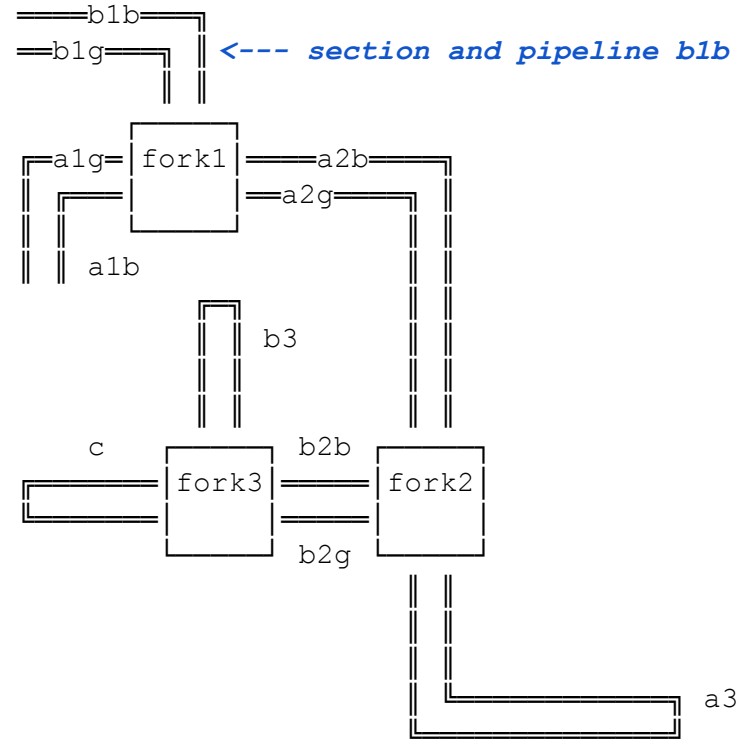
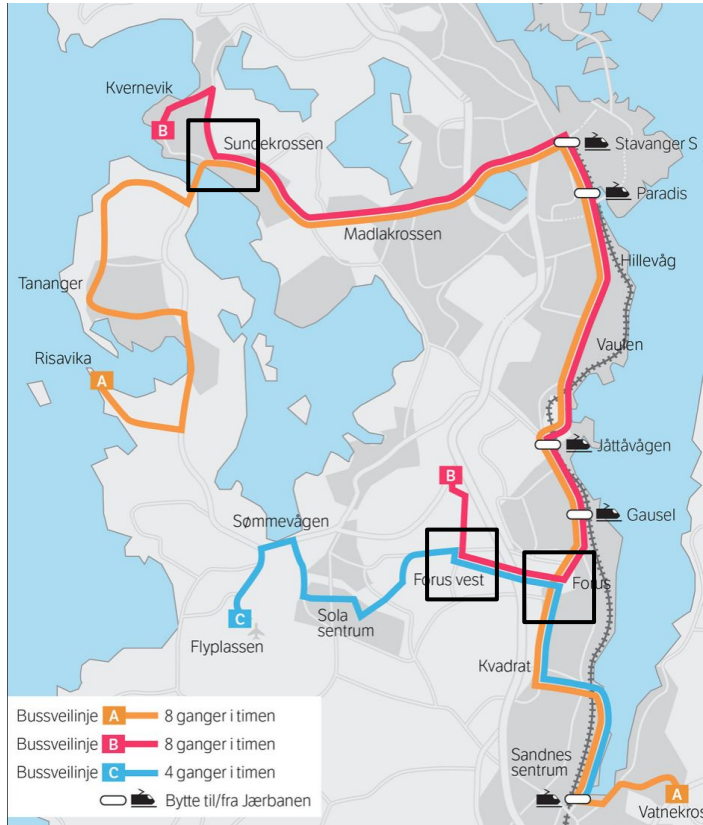


- Ref.  
[https://matplotlib.org/3.1.0/api/animation\\_api.html](https://matplotlib.org/3.1.0/api/animation_api.html)

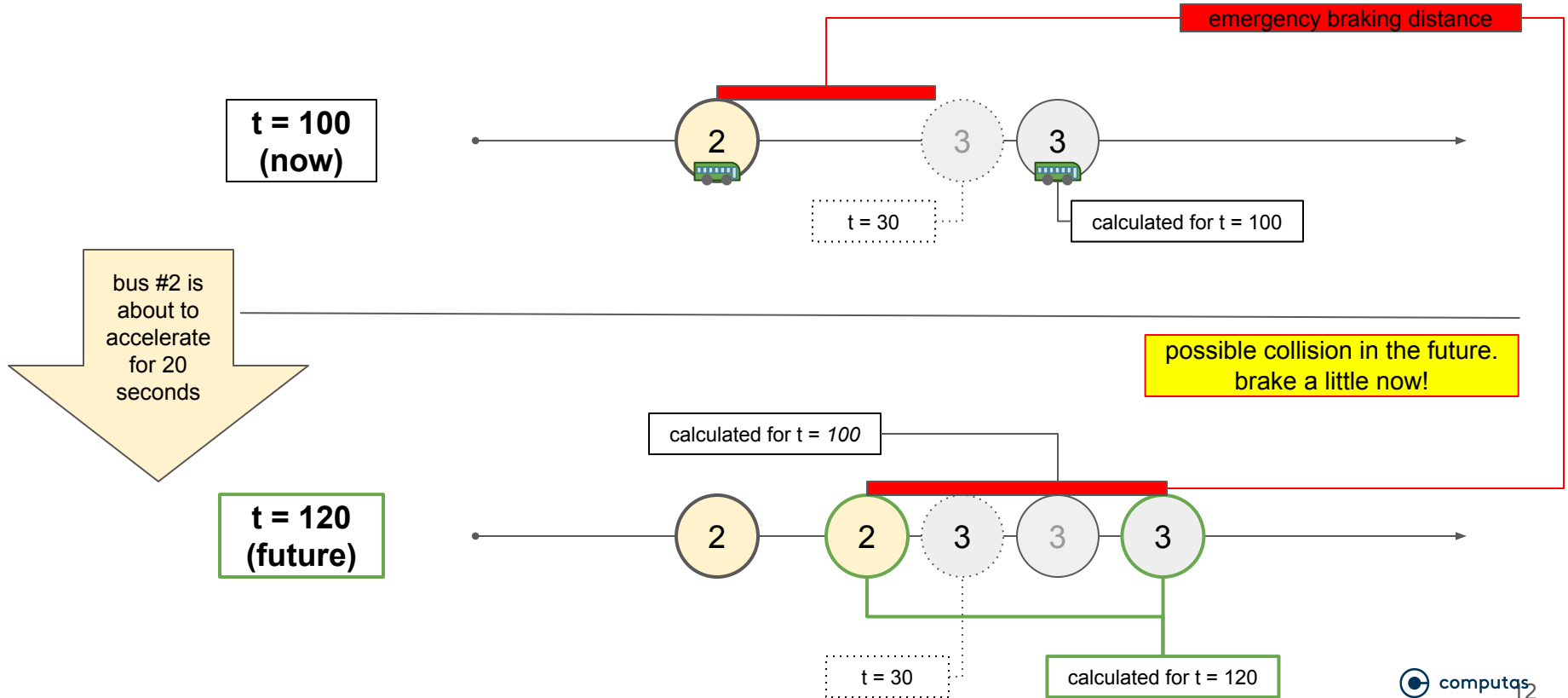
# Collision Detection



# Collision Detection - Buses in Pipelines

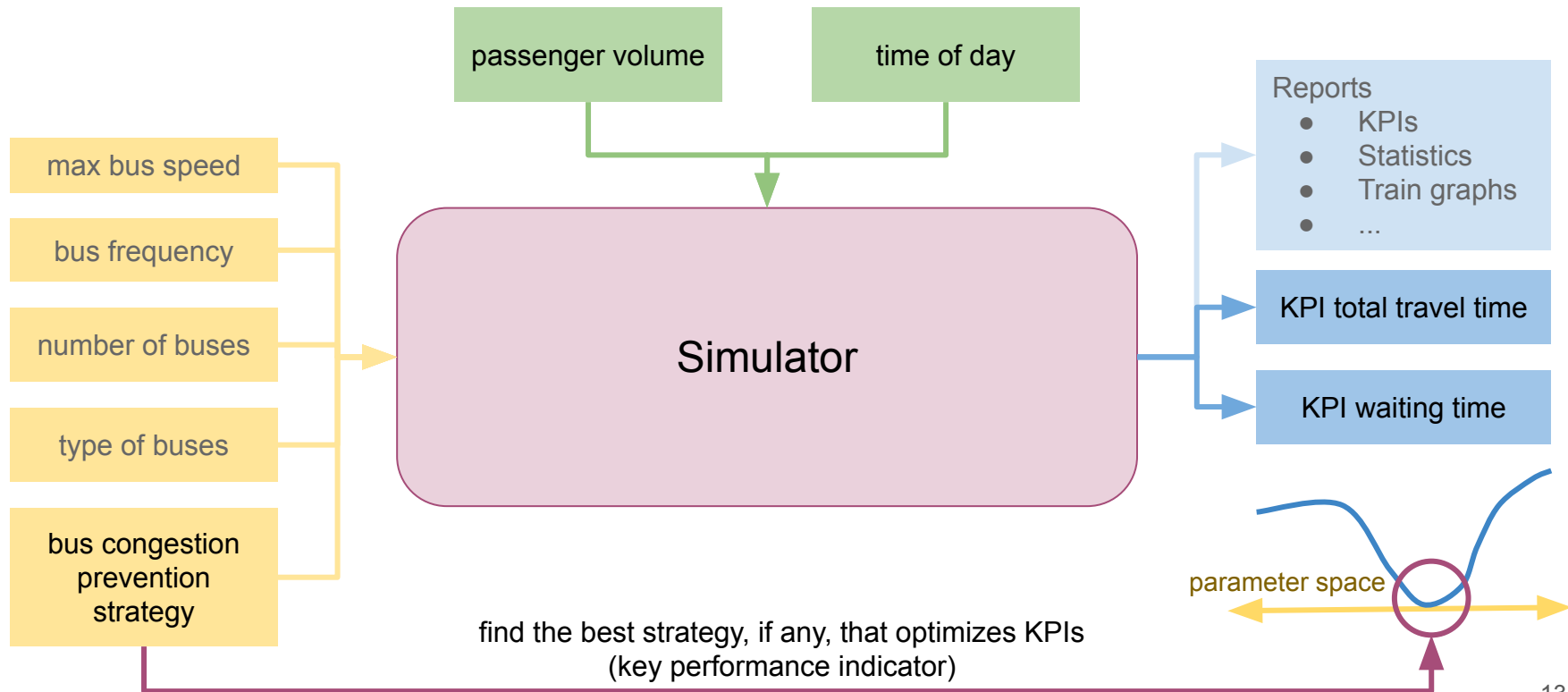


# Collision Detection and Avoidance



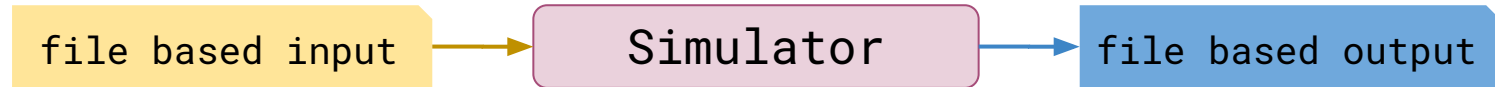
# Simulator as a Decisions Support System

Find Optimal Strategy and Parametrization, Improve Understanding of the System

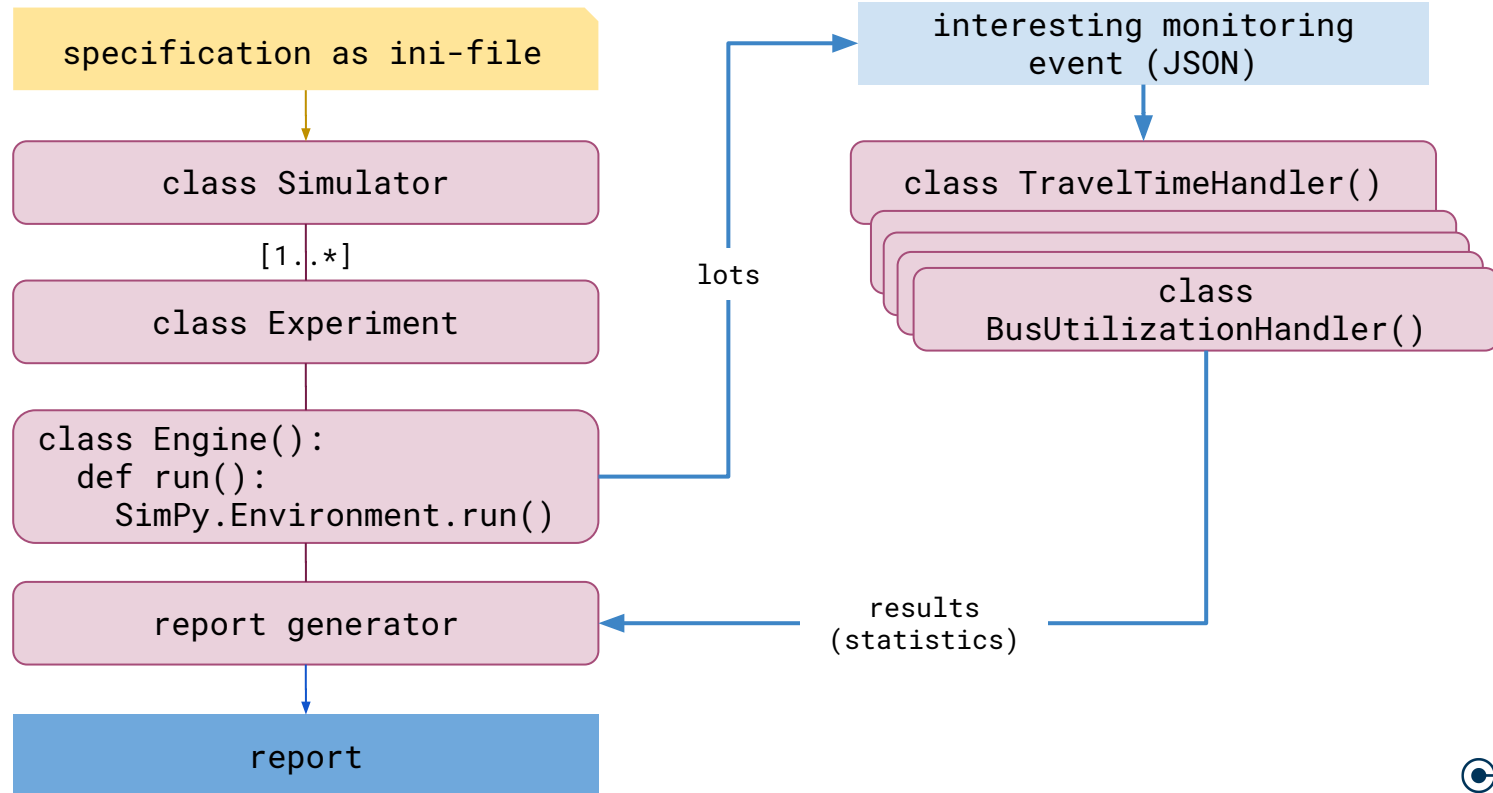


# Main Simulator Application Design Requirement

be able to generate and run  
many simulations  
with no user interaction required

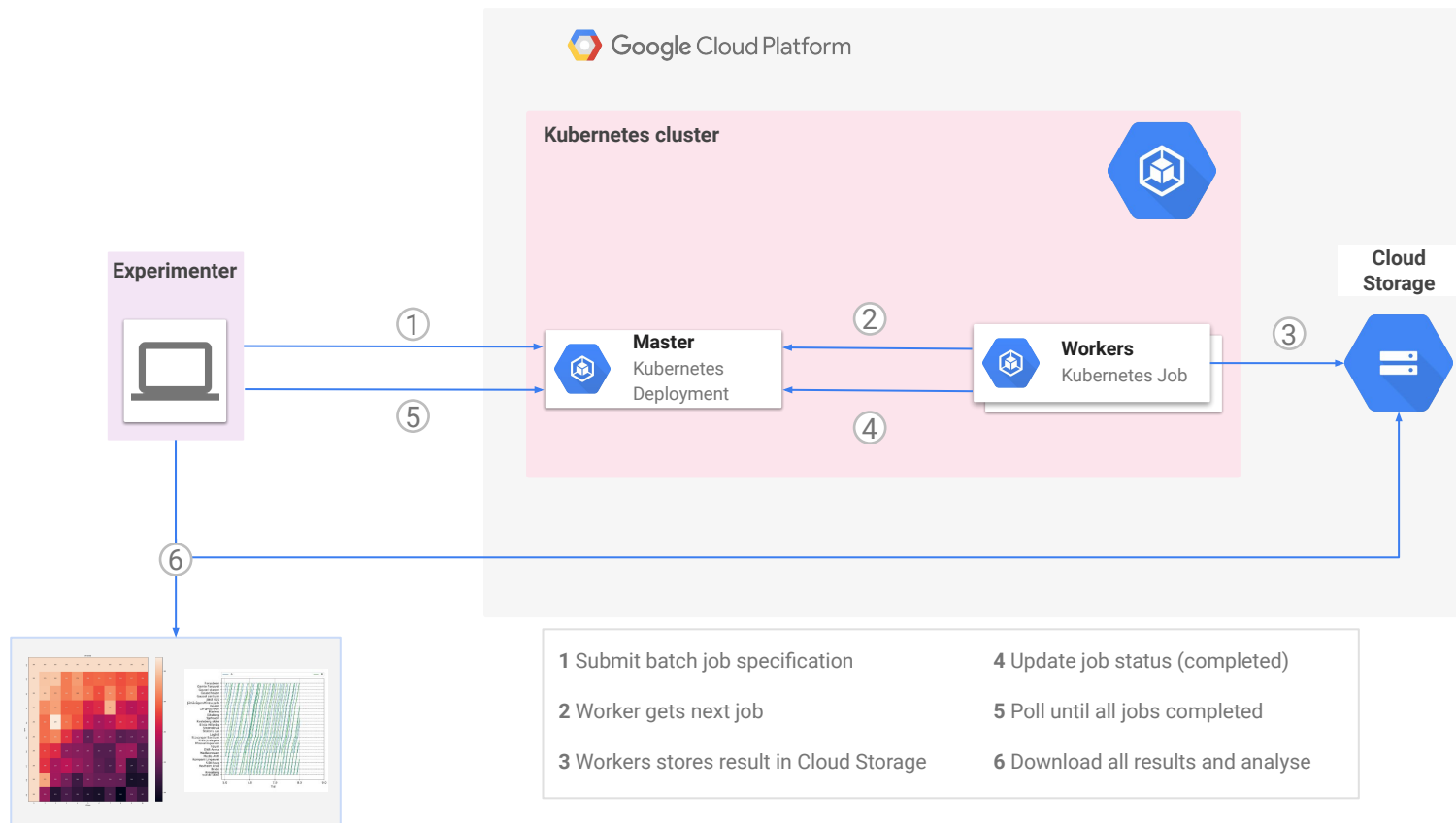


# Application Architecture

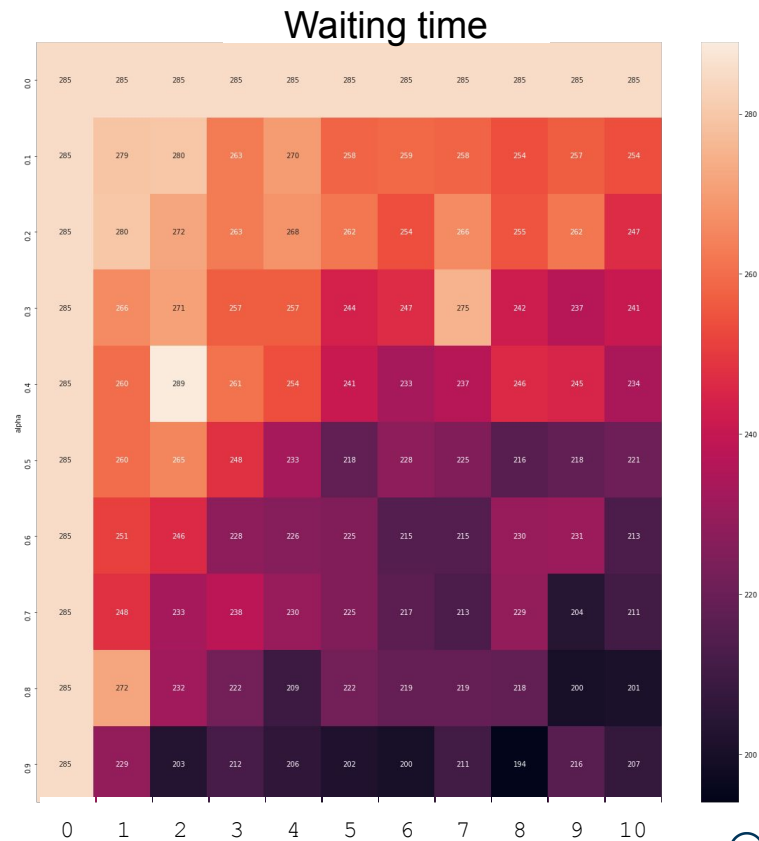
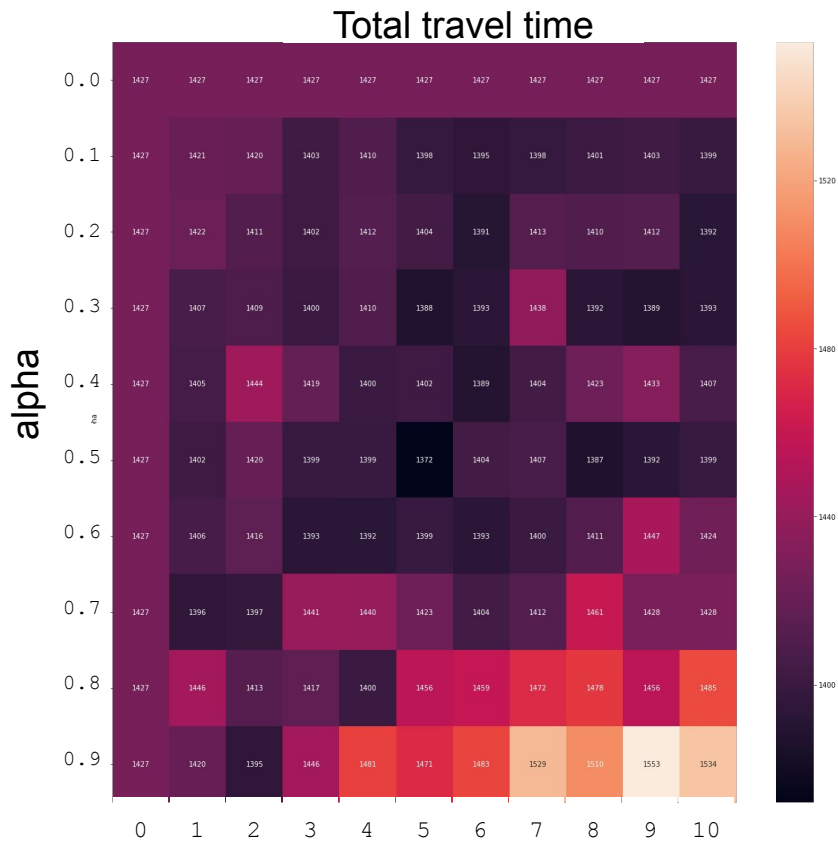




# Scaling / Parallelizing Using Kubernetes Jobs

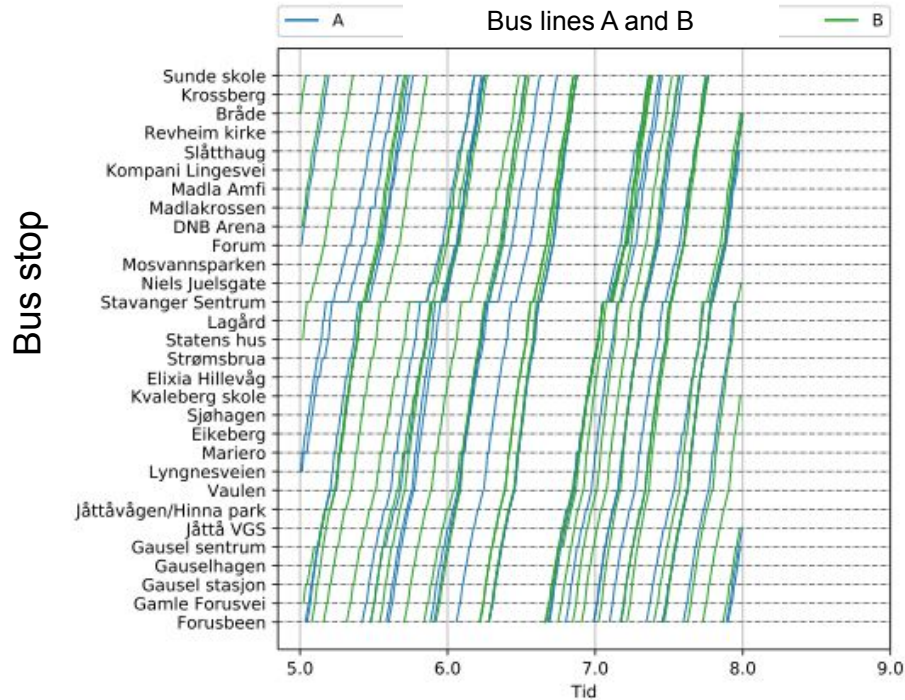


# Optimizing Optimal Interval Regulation, Morning Rush 06:00-09:00

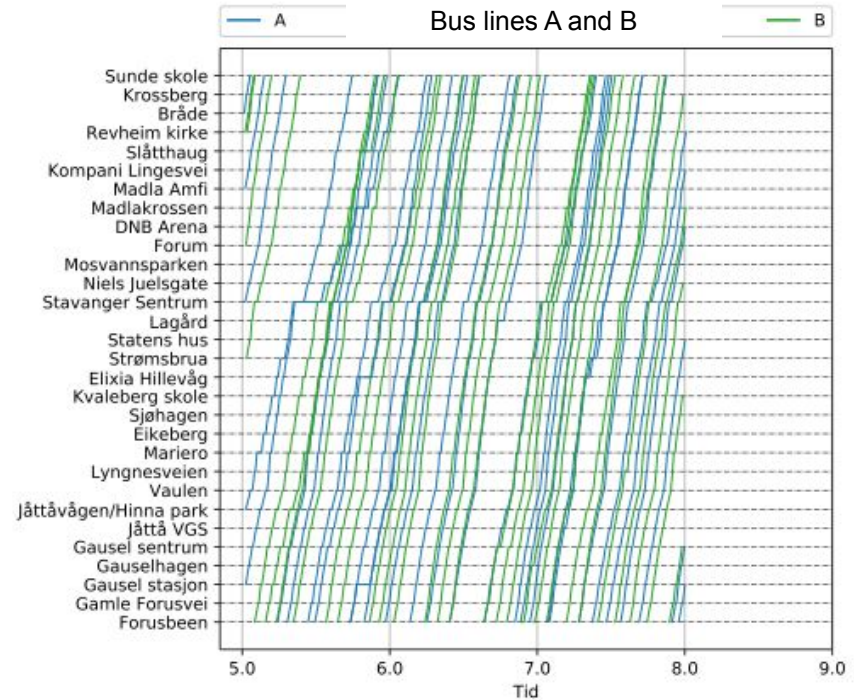


# Train Graphs, Morning Rush 06:00-09:00

## No interval regulation



## Optimized optimal interval regulation



Time of day

# Review

- Technical limitations
  - performance
- Review design decisions
  - Discrete-Event-Simulation (DES) pattern
- Which strategy is best?
- Is the simulator suitable as a planning tool?
  - practical values of simulators and models (abstractions / simplifications of reality)
- Can it be used as a tool for real time decision support?