# DataEng: Project Assignment 3

### **Data Integration**

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Data Engineering Winter 2021
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**Assignment date:** February 16

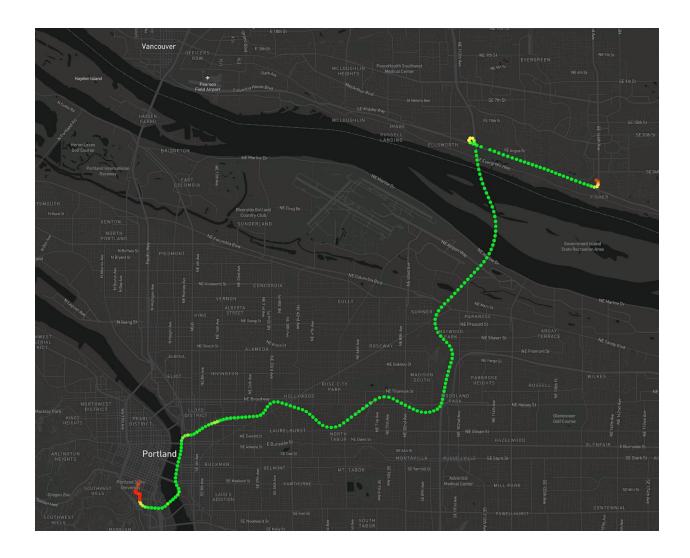
**Due date:** February 28, 2021 @10pm PT **Submit:** <u>assignment submission form</u>

### Submission

### Visualization 1.

A visualization of speeds for a single trip for any bus route that crosses the Glenn Jackson I-205 bridge. You choose the day, time and route for your selected trip. To find a trip that traverses this bridge, consider finding a trip that includes breadcrumb sensor points within this bounding box: [45.592404, -122.550711, 45.586158, -122.541270]. Any bus trip that includes breadcrumb points within that box either crosses the bridge or goes swimming in the Columbia river!

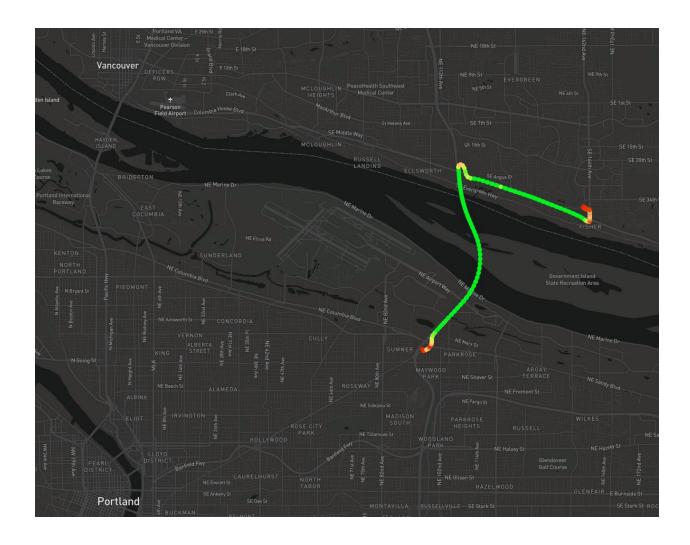
- One trip
- On route 164
- Which crosses the Glenn Jackson I-205 bridge
- On a weekday schedule
- Returning to the start
- On 2020-10-19
- Starting at 15:34:47
- Ending at 15:59:06



# Visualization 2.

All outbound trips that occurred on <u>route 65</u> on any Friday (you choose which Friday) between the hours of 4pm and 6pm.

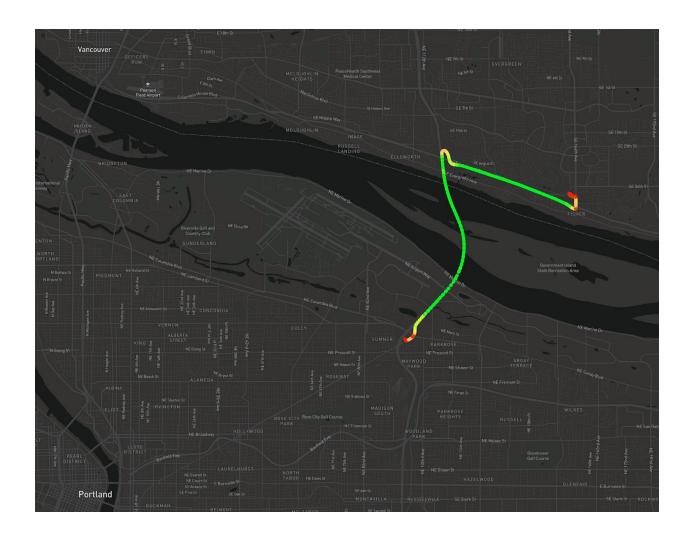
- All outbound trips
- On route 65
- On Friday 2020-10-18
- 4:00 pm 6:00 pm



# Visualization 3.

All outbound trips for route 65 on any Sunday morning (you choose which Sunday) between 9am and 11am.

- All outbound trips
- On route 65
- On Sunday 2020-10-25
- 9:00 am 11:00 am



## Visualization 4.

The longest (as measured by time) trip in your entire data set. Indicate the date, route #, and trip ID of the trip along with a visualization showing the entire trip.

The longest duration trip I have full data for is: 170770658.

A lot of the other very long trips are from before we started ingesting Stop Event data.

```
ctran=> select t.*, ib.*
ctran-> from trip t inner join (
ctran(> select max(tstamp), min(tstamp), max(tstamp) - min(tstamp) as trip_length, trip_id
ctran(> from breadcrumb b
ctran(> group by trip_id
ctran(> ) ib on t.trip_id = ib.trip_id
ctran-> order by ib.trip_length desc
ctran-> limit 20;
   trip_id | route_id | vehicle_id | service_key | direction |
                                                                                                                                                                                                  | trip_length |
                                                                                                                                  max
                                                                                                                                                                           min
                                                                                                                                                                                                                                trip_id
                                                                                                                   2020-10-01 22:02:44
2020-09-29 10:14:19
2020-09-24 14:06:46
  169302880
                                                  1254260
                                                                                                                                                            2020-10-01 16:30:18
                                                                                                                                                                                                     05:32:26
                                                                                                                                                                                                                               169302880
                                                                                                                                                            2020-09-29 07:02:14
                                                       2269
                                                                                                                                                                                                     03:12:05
  169026975
                                                                                                                                                                                                                               169026975
                                                                                                                                                            2020-09-24 11:16:41
2020-09-11 09:50:21
2020-10-20 17:27:30
2020-09-11 11:7:18
2020-09-11 11:00:11
2020-09-14 08:04:49
2020-09-17 21:20:58
2020-10-20 09:59:34
2020-09-21 16:01:00
2020-09-15 08:05:25
2020-09-16 16:00:59
2020-10-28 05:13:25
2020-09-17 16:00:52
2020-09-13 16:22:48
2020-10-23 16:22:48
2020-10-27 05:13:08
2020-09-22 05:13:11
  168692921
                                                       2251
                                                                                                                                                             2020-09-24 11:16:41
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                                                                                                                   2020-09-11 12:34:30
2020-10-20 19:23:25
 167674081
170770658
                                                  4026
1254260
                                                                                                                                                                                                                               167674081
170770658
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                                                                    Weekday
  167690539
                                                       4032
                                                                                                                   2020-09-11 13:09:26

2020-09-11 12:51:28

2020-09-14 09:55:47

2020-09-17 23:11:42

2020-10-20 11:47:22

2020-09-15 09:49:51

2020-09-15 09:49:51

2020-09-17 17:41:18

2020-10-28 06:51:37

2020-09-17 17:38:32

2020-10-13 06:52:09

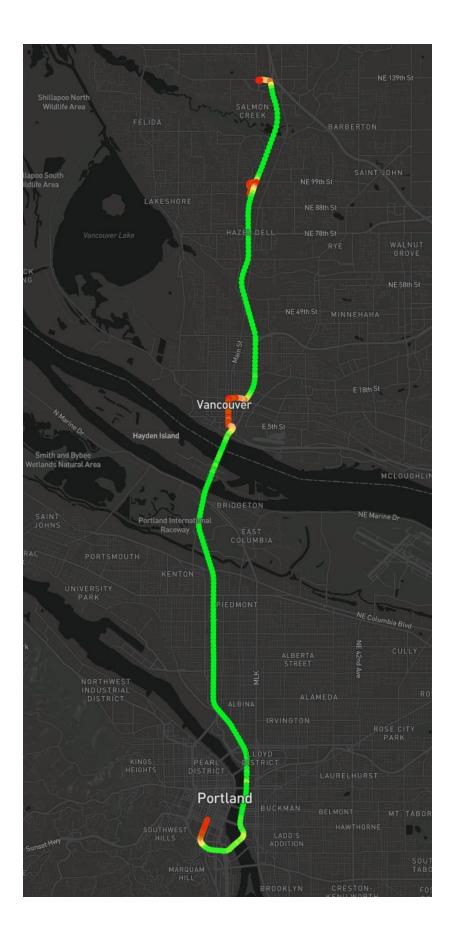
2020-09-23 18:00:06

2020-10-02 19:23:40

2020-10-27 06:49:11

2020-09-22 06:47:53
                                                                                                                    2020-09-11 13:09:26
                                                                                                                                                                                                     01:52:08
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167859443
  167688567
                                                       4020
                                                                                                                                                                                                     01:51:17
  167859443
                                                       4029
                                                                                                                                                                                                     01:50:58
  168094965
                                                       6001
                                                                                                                                                                                                     01:50:44
                                                                                                                                                                                                                               168094965
                                                       2291
2220
                                                                                                                                                                                                                               170809733
168425778
  170809733
                                   60
                                                                    Weekday
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                                                                                                                                                                                                     01:47:48
  168425778
                                                                                                                                                                                                     01:47:10
  167954916
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                                                       4025
                                                                                                                                                                                                     01:44:26
  167132327
                                                       4030
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                                                       2231
2232
 171423657
168124157
                                                                                                                                                                                                                               171423657
168124157
                                   47
                                                                    Weekday
                                                                                              0ut
                                                                                                                                                                                                     01:38:12
                                                                                                                                                                                                     01:37:40
  170239217
                                                       2243
                                                                                                                                                                                                     01:37:22
                                                                                                                                                                                                                               170239217
                                                                                                                                                                                                                               168621282
169466935
  168621282
                                                       2220
                                                                                                                                                                                                     01:37:18
  169466935
                                                                                                                                                                                                     01:36:45
                                                       2215
  171329672
                                                       2248
                                                                                                                                                                                                     01:36:03
                                                                                                                                                                                                                               171329672
                                   47
                                                                    Weekday
                                                                                              Out
  168499819
                                                       2248
                                                                                                                                                                                                     01:34:42
                                                                                                                                                                                                                               168499819
(20 rows)
```

All datapoints on the longest duration trip are mapped below.



Visualization 5a, 5b, 5c, .... Three or more additional visualizations of your choice. Indicate why you chose each particular visualization.

# 5a) Longest Route - Distance

What is the longest route in terms of estimated distance traveled? Map the longest trip for the longest route. Use a bounding box of the movement on the x and y axis to estimate length of the route.

I've defined the route length by getting the length of the hypotenuse of the bounding box of the route's maximum positions in either axis.

```
length estimate = sqrt((max(x) - min(x))^2 + (max(y) - min(y))^2)
```

When I first did this I was only multiplying the movement of the x and y axis. But after considering whether multiplying or adding would be a better representation (the area or half the perimeter of the bounding box), I realized the hypotenuse is much more accurate, and not weighted by the shape of the box (long and skinny vs square), nor by whether the box is more aligned with the x/y axis. However this is still just an estimate. For a more precise measurement of bus distance, I think we could convert the Geo Points of a trip to a Line String and pull its length. This would be a good area for future work.

#### **Query Description:**

Calculate the hypotenuse of the bounding box of points in the trip as the trip length. Order the result by the length of the trip, with longest first. Also return the trip info like the route id.

#### **Query Text:**

```
select t.*, ib.*
from trip t inner join (
 select
 min(latitude) S,
 max(latitude) N,
 max(latitude) - min(latitude) as y movement,
 min(longitude) E,
 max(longitude) W,
 max(longitude) - min(longitude) as x_movement,
 sqrt((max(latitude) - min(latitude))^2 + (max(longitude) - min(longitude))^2) as total_movement,
 trip id
 from breadcrumb
 group by trip id
 order by 7 desc
 ) ib
on t.trip id = ib.trip id
where route id > 0
```

```
and total_movement > 0 order by ib.total_movement desc :
```

#### **Data Selection:**

From the result, I picked the longest trip, for the top 3 routes occurring in the data. This redacted result is below.

trip_id	route_id	vehicle_id	service_key	direction	S	n	y_movement	. e	. w	x_movement	total_movement	trip_id
171076865 170817612 170872807		1254280	Weekday   Weekday   Weekday	Back	45.655968     45.517453     45.498058	45.72181		-122.677218	-122.543822	0.13339599999999052	0.29086132653379865 0.2440415461862903 0.2267564180458801	170817612

The points of most interest to our map are:

```
trip_id | route_id
------
171076865 | 47
170817612 | 105
170872807 | 190
```

I mapped each of these separately so we can clearly see each route without overlapping.

#### Queries to pull the data:

```
select longitude, latitude, speed from
breadcrumb where trip_id = 171076865;
select longitude, latitude, speed from
breadcrumb where trip_id = 170817612;
select longitude, latitude, speed from
breadcrumb where trip_id = 170872807;
```

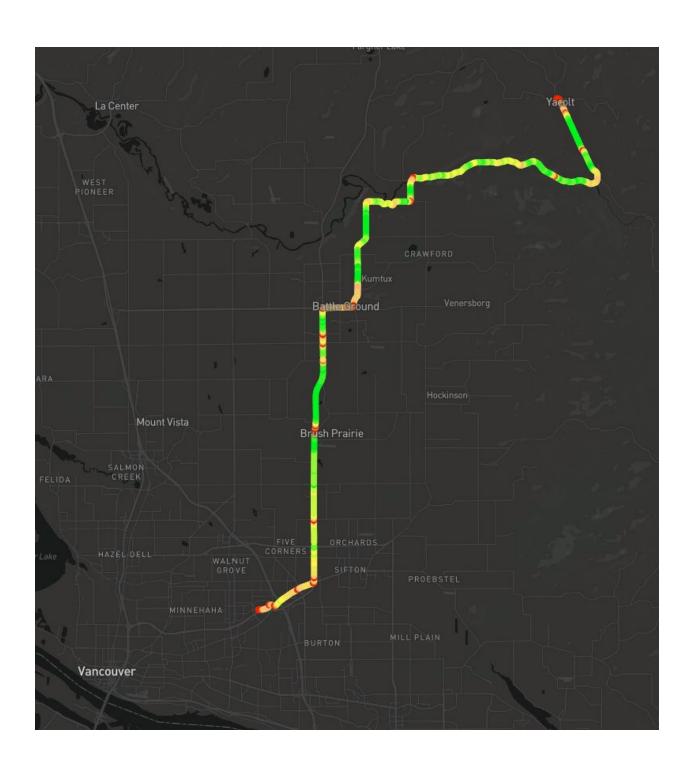
#### Maps:

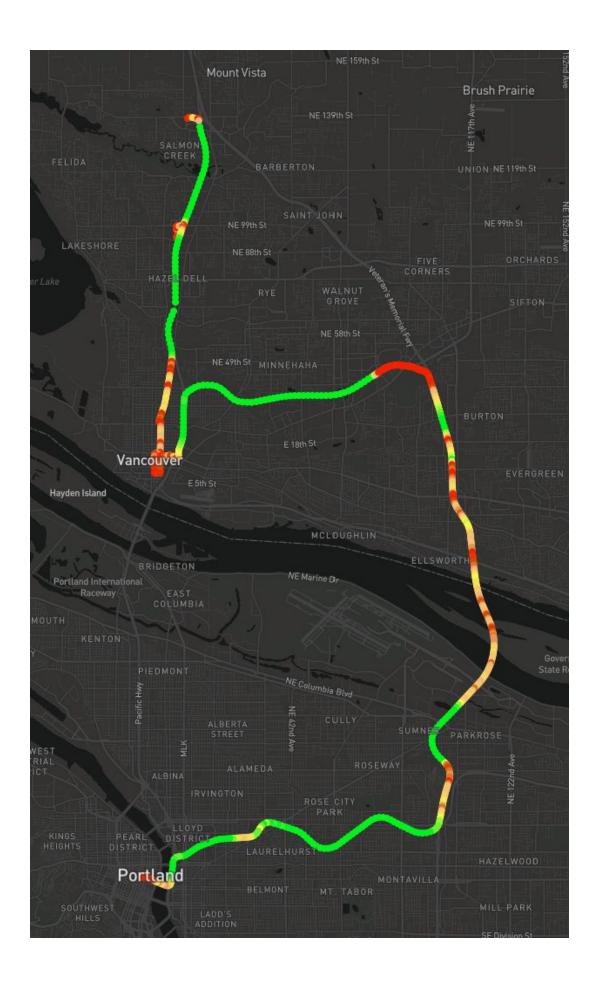
On following pages, in this order:

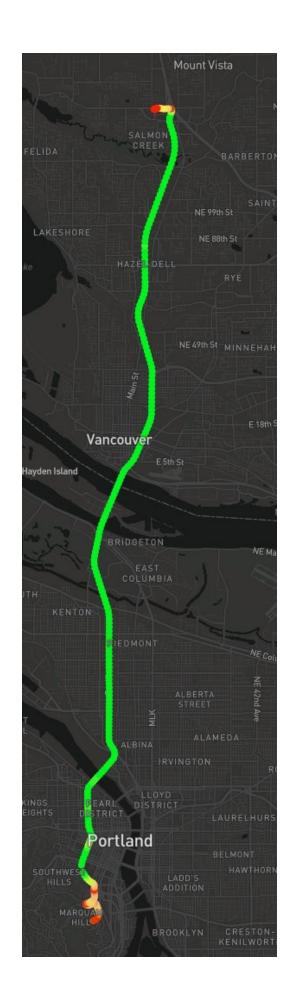
```
trip_id | route_id
------
171076865 | 47
170817612 | 105
170872807 | 190
```

#### Improvements:

Now that I look at the maps. For most of them you could simply use the start/end point of the route instead of calculating the min/max of the x and y coordinates. That would be a suitable simplification. However this is more precise like this.







### 5b) Shortest Route - Distance

What is the shortest in terms of estimated distance traveled? Map the shortest trips.

At first glance this seems easy. Simply use the same query as in 5a, just filter it in the other direction.

#### **Query Description:**

Calculate the hypotenuse of the bounding box of points in the trip as the trip length. Order the result by the length of the trip, with shortest first. Also return the trip info, like the route id.

### **Query Text:**

```
select t.*, ib.*
from trip t inner join (
 select
 min(latitude) S,
 max(latitude) N,
 max(latitude) - min(latitude) as y_movement,
 min(longitude) E,
 max(longitude) W,
 max(longitude) - min(longitude) as x_movement,
 sqrt((max(latitude) - min(latitude))^2 + (max(longitude) - min(longitude))^2) as total_movement,
 trip id
 from breadcrumb
 group by trip_id
 order by 7 desc
 ) ib
on t.trip_id = ib.trip_id
where route id > 0
and total_movement > 0
order by ib.total_movement
```

#### **Example Result:**



We can already see, something strange is going on. If this were really a representation of the shortest trips, we would see many of the same route id, the shortest route. Let's map it anyway to check it out. Map the first 50, the "shortest trips".

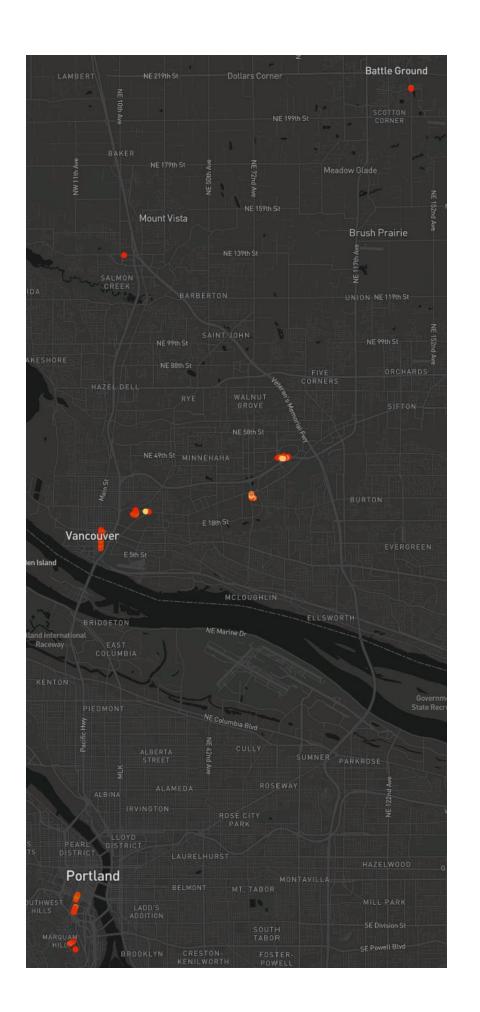
#### Queries to pull the data:

Pull the trip IDs for the first 50:

select longitude, latitude, speed from breadcrumb where trip\_id in (171243872, 171194612, 171425201, 171448991, 171424072, 170990962, 170978926, 171329689, 170876985, 170681624, 171345414, 171255642, 171355552, 171426727, 171422221, 170623254, 170810398, 170905299, 170802666, 171457736, 170704974, 171345036, 171457732, 171338818, 170905294, 171522296, 171361154, 171566814, 170806553, 170785513, 171203157, 171119328, 171120834, 170810394, 170809934, 170567074, 170633158, 170566806, 171091671, 170901573, 170877257, 171339538, 170621802, 170998738, 171435768, 170969487, 171339229, 170685686, 170716794, 170684224)

#### Map:

All the data points, and a zoom in on downtown Vancouver.





#### **Analysis and Future Work:**

There is no continuity between these points. They do not represent routes. I'm going to suspect these are error readings, where a trip was unexpectedly cut off. While my first inclination is to toss this and do a different visualization or filter these out, this query could be used for data validation, after the data has been loaded into the database. We could compare the average route length estimate for the route, and for any trips where the length is significantly smaller, those trips and their breadcrumbs should be dropped. A lot of these are in downtown Vancouver or other city centers, so it's possible they represent a bus starting up and shutting down, for example if a driver has a break scheduled at the and of a trip. This does not represent movement in traffic, and they are misrepresetingly slow moving (very red/orange due to slow speeds) so we don't want them mucking up our dataset, whose purpose is to investigate traffic movement problems.

To find the actual shortest route, you could do it very precisely by dropping what may be bad datapoints as described above. Alternatively, but a similar concept of data could likely have been gathered by collecting the max length trip, for the route with the shortest average trip. Something like:

### 5c) Slowest 50 trips

Map the slowest 50 trips.

Slowest is defined as the average speed of the trip. Don't include very shortened trips that may have been miscalculations.

We tried to find shortest trip, we may as well try to find the slowest. First off there is a similar issue, where many datapoints show a speed of 0. So we'll average the speed across the trip. Additionally, now that we know a lot of trips are bad data, let's filter them out. Only keep the trips, where its length is as expected.

#### **Query Description:**

What is the trip with the slowest average speed per trip, where the length of the trip is between the max length of trips on that route, and the average length of trips on that route? I used some CTEs for this to make it easier for me to conceptualize it.

#### **Query text:**

```
with greatest_cte as (
 select
 long routes.route id,
 max(long_routes.length_est) as max_length
 from (
       select t.*, ib.*
       from trip t inner join (
       sqrt((max(latitude) - min(latitude))^2 + (max(longitude) - min(longitude))^2) as
length_est,
       trip id
       from breadcrumb
       group by trip_id
       ) ib
       on t.trip id = ib.trip id
       where route_id > 0
 ) long routes
 group by 1
middling cte as
 select
 long_routes.route_id,
 avg(long_routes.length_est) as avg_length
 from (
       select t.*, ib.*
       from trip t inner join (
```

```
select
       sqrt((max(latitude) - min(latitude))^2 + (max(longitude) - min(longitude))^2) as
length_est,
       trip id
       from breadcrumb
       group by trip_id
       ) ib
       on t.trip_id = ib.trip_id
       where route_id > 0
 ) long_routes
 group by 1
),
this_trip_cte as
 select t.route_id, ib.*
 from trip t inner join (
       select
       avg(speed) as trip_speed,
       sqrt((max(latitude) - min(latitude))^2 + (max(longitude) - min(longitude))^2) as
length_est,
       trip_id
       from breadcrumb
       group by trip_id
       ) ib
 on t.trip_id = ib.trip_id
 where route_id > 0
select
 tc.trip_id,
 tc.trip_speed,
 tc.route_id,
 tc.length est,
 gc.max_length,
 mc.avg_length
from
 this_trip_cte tc
 join greatest_cte gc
 on tc.route_id = gc.route_id
join middling_cte mc
 on gc.route_id = mc.route_id
where tc.route_id in (6, 60, 19)
and tc.length_est <= gc.max_length
and tc.length_est >= mc.avg_length
order by 2;
```

### **Example result:**

			1 1111111111111111111111111111111111111	1	
trip_id	trip_speed	route_id	length_est	max_length	avg_length
171525855	4.526041666666667	6	0.05356358735186373	0.0936146677236058	0.03389456739974154
171269108	5.197530864197531	6	0.039727726464017316	0.0936146677236058	0.03389456739974154
170879378	5.276923076923077	19	0.052188512088390634	0.08867950993323866	0.051085317247486536
171357318	5.342541436464089	6	0.03994323783820918	0.0936146677236058	0.03389456739974154
171180798	5.394636015325671	19	0.05215056801224857	0.08867950993323866	0.051085317247486536
171161934	5.950920245398773	6	0.03985348800294327	0.0936146677236058	0.03389456739974154
170684028	6.099290780141844	6	0.03975776190884689	0.0936146677236058	0.03389456739974154
170972035	6.233576642335766	6	0.03971924703465229	0.0936146677236058	0.03389456739974154
171453472	6.2388059701492535	6	0.039762912732833625	0.0936146677236058	0.03389456739974154
171226796	6.318181818181818	60	0.040892009402815184	0.17028464015583014	0.040124873466136676
170612966	6.4144736842105265	6	0.039751089658018476	0.0936146677236058	0.03389456739974154
171453579	6.486486486486487	6	0.03934347341047446	0.0936146677236058	0.03389456739974154
171122635	6.49444444444445	60	0.04102605440448915	0.17028464015583014	0.040124873466136676
171453459	6.5225225225225225	6	0.03938004499744239	0.0936146677236058	0.03389456739974154
171452929	6.544776119402985	6	0.039719769309490366	0.0936146677236058	0.03389456739974154
170716771	6.598214285714286	6	0.0394041425360303	0.0936146677236058	0.03389456739974154
170880147	6.612903225806452	6	0.03972066376584783	0.0936146677236058	0.03389456739974154
170684140	6.62962962962963	6	0.03937365044035934	0.0936146677236058	0.03389456739974154
170684016	6.636363636363637	6	0.039366031715182076	0.0936146677236058	0.03389456739974154
171332096	6.724770642201835	6	0.03935969472696099	0.0936146677236058	0.03389456739974154
170684089	6.738095238095238	6	0.039751963787973965	0.0936146677236058	0.03389456739974154
170795828	6.763285024154589	19	0.05224671037491292	0.08867950993323866	0.051085317247486536
170879715	6.770642201834862	6	0.039380877593065904	0.0936146677236058	0.03389456739974154
170880135	6.773584905660377	6	0.039315969325444136	0.0936146677236058	0.03389456739974154
171250837	6.776923076923077	6	0.03973812976221975	0.0936146677236058	0.03389456739974154
170781886	6.79047619047619	6	0.03936851083035415	0.0936146677236058	0.03389456739974154
170879658 171331978	6.79090909090909091 6.803738317757009	6     6	0.03935176166323295 0.039360980678841945	0.0936146677236058 0.0936146677236058	0.03389456739974154 0.03389456739974154
170972633	6.84166666666666	6	0.03977123046877937	0.0936146677236058	0.03389456739974154
171453042	6.869158878504673	6	0.039346837357035765	0.0936146677236058	0.03389456739974154
170781180	6.88785046728972	6	0.039362226982219264	0.0936146677236058	0.03389456739974154
170701100	6.895161290322581	6	0.03973975523326968	0.0936146677236058	0.03389456739974154
170683490	6.902912621359223	6	0.039364709385436035	0.0936146677236058	0.03389456739974154
171332049	6.903225806451613	6	0.039759679639048376	0.0936146677236058	0.03389456739974154
171250893	6.9105691056910565	6	0.03970971575068446	0.0936146677236058	0.03389456739974154
171617798	6.9245283018867925	6	0.039427110723462076	0.0936146677236058	0.03389456739974154
170880199	6.951456310679611	6	0.03932570366820631	0.0936146677236058	0.03389456739974154
170781311	7	6	0.03976439800876713	0.0936146677236058	0.03389456739974154
171356667	7.008064516129032	6	0.05356616323763055	0.0936146677236058	0.03389456739974154
170972684	7.009803921568627	6	0.0393609695129587	0.0936146677236058	0.03389456739974154
171269568	7.01	6	0.03939009678841408	0.0936146677236058	0.03389456739974154
171617327	7.024390243902439	6	0.039758134689646445	0.0936146677236058	0.03389456739974154
171437179	7.04	6	0.03935641229837957	0.0936146677236058	0.03389456739974154
171332152	7.049019607843137	6	0.03934743540563274	0.0936146677236058	0.03389456739974154
171617682	7.058333333333334	6	0.03972776339035063	0.0936146677236058	0.03389456739974154
171123269	7.076335877862595	60	0.04092922899346972	0.17028464015583014	0.040124873466136676
170972741	7.076923076923077	6	0.03934681732998686	0.0936146677236058	0.03389456739974154
171357131	7.079207920792079	6	0.0393681735669907	0.0936146677236058	0.03389456739974154
171269824	7.125	6	0.03975122117620888	0.0936146677236058	0.03389456739974154
170781949	7.137254901960785	6	0.039343626332615164	0.0936146677236058	0.03389456739974154
171162273	7.138613861386139	6	0.039458683632383626	0.0936146677236058	0.03389456739974154
171269704	7.142857142857143	6	0.039746454684672854	0.0936146677236058	0.03389456739974154
171269753	7.15	6	0.039379949123901484	0.0936146677236058	0.03389456739974154

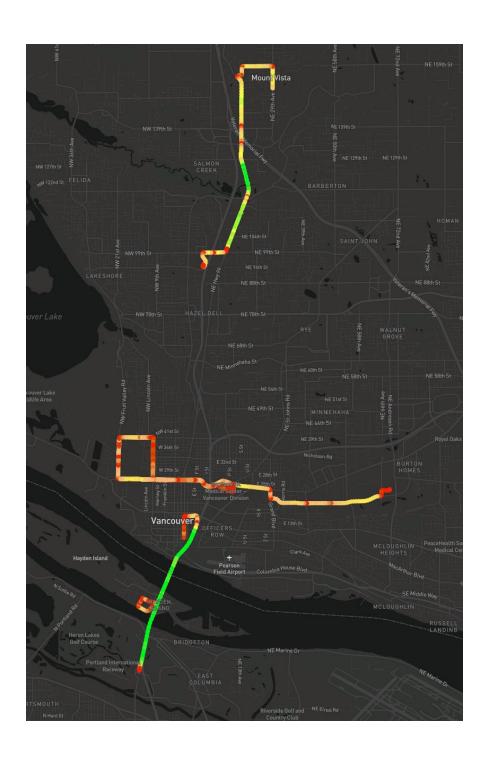
Next I did a simple query of the breadcrumb data for the first 50 trips in that list, as seen below. Alternatively you could use the previous query as the in-list, and only select the trip ID out of that subquery. But I liked taking that intermediate step, so I can visually validate results as seen above.

### **Data Generating Query:**

select longitude, latitude, speed from breadcrumb where trip\_id in (171525855, 171269108, 170879378, 171357318, 171180798, 171161934, 170684028, 170972035, 171453472, 171226796, 170612966, 171453579, 171122635, 171453459,

171452929, 170716771, 170880147, 170684140, 170684016, 171332096, 170684089, 170795828, 170879715, 170880135, 171250837, 170781886, 170879658, 171331978, 170972633, 171453042, 170781180, 170880210, 170683490, 171332049, 171250893, 171617798, 170880199, 170781311, 171356667, 170972684, 171269568, 171617327, 171437179, 171332152, 171617682, 171123269, 170972741, 171357131, 171269824, 170781949)

#### Map:



#### **SQL Performance**

I was interested to find that there was a significant performance difference between these 2 CTE below. I ran them on their own as a debugging step before running the full query above. The first one hangs because it takes so long. I thought I would be improving results, by selecting fewer columns so the project is not as large, and not nesting things as much, which was making it easier for me to think of this conceptually. However it seems operating on just one table at a time to pull the trip ids and calculate their length, and subsequently pulling data for those, is a much better plan.

# This was very very not performant, it hung.

```
with this_trip_cte as
 select
 b.trip id,
 max(route_id),
 sqrt((max(latitude) - min(latitude))^2 + (max(longitude) - min(longitude))^2) as length_est
 from breadcrumb b
 inner join trip t
 on b.trip_id = b.trip_id
 where route id > 0
 group by b.trip_id
select * from this_trip_cte limit 1
# This was very fast, comparatively.
with this_trip_cte as
       select t.*, ib.*
       from trip t inner join (
       select
       sqrt((max(latitude) - min(latitude))^2 + (max(longitude) - min(longitude))^2) as
length_est,
       trip id
       from breadcrumb
       group by trip_id
       ) ib
       on t.trip_id = ib.trip_id
       where route id > 0
select * from this_trip_cte limit 1
```

# Your Code

Provide a reference to the repository where you store your code. If you are keeping it private then share it with Bruce (<a href="mailto:bruce.irvin@gmail.com">bruce.irvin@gmail.com</a>), David and Aman (github references TBD).

https://github.com/coding-gen/dataeng/tree/main/project/4\_final