Caltrans PeMS Workshop

presented to Caltrans District 5

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Think > Forward

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Workshop Objectives

- Provide guidance such that attendees feel comfortable using the PeMS platform and its data.
- Describe general usage, tips, and identify resources and materials for future consultation.
- Give attendees real examples to use for the development of a corridor analysis study.



Content

- Introduction to PeMS
 - » Introduction
 - » How Does PeMS Work?
 - » Data Available
 - » System Overview
 - » Help & References
- Exercise 1 Familiarizing with Dashboard
- Exercise 2 Evaluate Data Quality on Corridor
- Exercise 3 Evaluate Traffic Counts on Corridor
- Exercise 4 Evaluate Typical Speeds on Corridor
- Exercise 5 Downloading Raw Data



INTRODUCTION TO PEMS



Introduction

What is PeMS?

- » PeMS stands for Performance Measurement System, it is Caltrans depository for real-time traffic data.
- » PeMS started in 1999 as a UC PATH research project.
- » Processes data of over 35,000 detectors, every 30 seconds.
- » Data is stored from inception (detector added) and never deleted, it has now over 12 Tb of data.

How can I access it?

- » Go to http://pems.dot.ca.gov/
- » Create User Profile (User Name and Password).



How Does PeMS Work?





Data Sources

- Intelligent Transportation System (ITS) Vehicle Detector Stations (VDS)
- Traffic Counters
 - » Traffic Census Stations
 - » Weight-In-Motion (WIM) Sensors

Other Data Sets

- » California Highway Patrol (CHP) Incident data
- The Caltrans Traffic Accident Surveillance and Analysis System (TASAS) accident data (for Caltrans users only)
- » Lane Closure information from the Caltrans Lane Closure System
- » Electronic Toll Collection (ETC) Reader data (Bay Area only)
- » Changeable Message Signs (real-time information only)
- » Arterial Detector data and Timing Plans (limited data in District 11)
- Transit data such as routes and schedules, Automated Vehicle Location (AVL) and Automated Passenger Count (APC) data (limited data in District 11)



Data Available

- Computes standard transportation performance measures, such as VMT, VHT, Delay (expressed in vehicle-hours), and Level of Service (LOS)
- Calculates travel time and travel time reliability measures, such as the Buffer Time Index, Travel Time Index, and other descriptive statistics
- Produces summary reports, such as locations with low traffic flow or high VMT over several years
- Imputes data for missing or bad detector data in real-time.
- Provides speed as reported by detectors, or computed speed based on flow and occupancy if the detector does not report speed.



System Overview (1)

- The primary data source is the vehicle detector stations (VDS).
- PeMS compiles 30 second data of vehicle flow and occupancy from VDS.
- VDS data might have gaps (missing data sets, errors, etc). PeMS conducts diagnostic tests to determine quality of data.
- PeMS calculates missing data using data imputation methods.
- Once 30-second dataset is complete, PeMS aggregates these into 5-minute datapoints.
- PeMS uses 5-minute data to calculate performance measures and saves it on servers for user access.



System Overview (2)



10

Help & Resources

PeMS User Manual:

http://pems.dot.ca.gov/PeMS_I ntro_User_Guide_v5.pdf

- > PeMS Help Page →
- PeMS FAQ:

http://pems.dot.ca.gov/?directo ry=Help&dnode=Help&content =var_faq





EXERCISE 1: FAMILIARIZING WITH DASHBOARD.



Dashboard





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Finding data



EXERCISE 2: EVALUATE DATA QUALITY ON CORRIDOR





- We want to assess the data quality for the US101 corridor in the San Luis Obispo County.
- We are interested in the Southbound direction only.
- We are interested in seeing the data quality of the corridor in the month of September.
- We want to assess the mainline and ramps separately.



Process

- 1. Select the corridor and geographic boundary of interest
- 2. Select data only for San Luis Obispo County
- 3. Navigate to Data Quality \rightarrow Time Series
- 4. Modify dates for data



Output





Let's try new queries!

- Can we develop the same graph for on and off ramps?
- Can we take a look at specific data by day?
- What types of reports can be developed?



10 MINUTE BREAK!



EXERCISE 3 - EVALUATE TRAFFIC COUNTS ON CORRIDOR





- We want to assess traffic volumes for the US101 corridor.
 - » We want to see the VMT profile for the month of September
 - » We want to select traffic counts for a specific day in September
- We want to reduce the corridor section to only San Luis Obispo to Santa Maria
- We are interested in the SB direction



Process for VMT analysis

- 1. Select the corridor and geographic boundary of interest and select the 'Stations' report
- 2. Identify the section of interest mileposts
- 3. Navigate to Performance \rightarrow Aggregates \rightarrow Time Series
- 4. Modify dates for data and other parameters



VMT Output





Process for Day Counts

- Select the corridor and geographic boundary of interest and select the 'Stations' report
- 2. Identify the section of interest mileposts
- Navigate to Performance → Spatial Analysis → Multistation
- Modify dates for data and other parameters to get the hourly counts for all stations in the area, for September 14.



Day Counts Output



		2	u								Data Q	uality
Hour	501014092 Mainline 89.834 (172.471)	501014101 Mainline 90.953 (173.590)	501015143 Mainline 14.705 (188.240)	501016053 Mainline 17.916 (191.451)	501016071 Mainline 19.797 (193.322)	501016082 Mainline 20.938 (194.463)	501016091 Mainline 21.995 (195.520)	501016102 Mainline 24.268 (197.793)	501016113 Mainline 24.806 (198.331)	501016122 Mainline 25.849 (199.366)	# Lane Points	% Observed
09/14/2018 00:00	294	344	241	287	271	301	260	259	250	221	276	75.0
09/14/2018 01:00	124	138	118	177	158	151	158	156	152	137	276	100.0
09/14/2018 02:00	116	133	111	138	134	138	144	142	140	115	276	100.0
09/14/2018 03:00	170	155	89	121	121	112	114	114	111	96	276	100.0
09/14/2018 04:00	292	261	119	127	137	129	136	138	135	116	276	100.0
09/14/2018 05:00	798	632	276	348	312	335	352	402	395	330	276	100.0
09/14/2018 06:00	1,724	1,539	752	934	881	898	918	980	965	759	276	100.0
09/14/2018 07:00	2,735	2,762	1,248	1,573	1,378	1,365	1,392	1,375	1,380	1,101	276	100.0
09/14/2018 08:00	2,384	2,287	1,282	1,779	1,473	1,487	1,522	1,590	1,574	1,184	276	100.0
09/14/2018 09:00	2,221	2,229	1,420	1,923	1,660	1,661	1,723	1,713	1,685	1,267	276	100.0
09/14/2018 10:00	2,284	2,324	1,555	2,198	1,956	1,921	1,976	1,963	1,962	1,491	276	100.0
09/14/2018 11:00	2,278	2,358	1,495	2,350	2,071	2,099	2,187	2,229	2,207	1,594	276	100.0
09/14/2018 12:00	2,316	2,469	1,465	2,653	2,414	2,424	2,495	2,503	2,478	1,918	276	100.0
09/14/2018 13:00	2,353	2,563	1,562	2,816	2,492	2,514	2,613	2,668	2,650	2,017	276	100.0
09/14/2018 14:00	2,656	2,998	1,862	3,313	3,016	3,035	3,129	3,099	3,051	2,418	276	100.0
09/14/2018 15:00	2,810	3,351	1,876	3,282	2,942	2,982	3,296	3,215	3,206	2,526	276	100.0
09/14/2018 16:00	2,839	3,571	2,340	3,281	2,877	2,775	3,352	3,346	3,349	2,681	276	100.0
09/14/2018 17:00	2,961	3,796	2,390	3,403	2,959	2,773	3,254	3,239	3,195	2,534	276	100.0
09/14/2018 18:00	2,955	3,476	1,559	2,899	2,569	2,436	2,512	2,577	2,546	1,979	276	100.0
09/14/2018 19:00	1,875	2,193	1,357	2,385	2,107	2,040	2,078	2,058	2,041	1,660	276	100.0
09/14/2018 20:00	1,496	1,701	1,147	1,844	1,706	1,641	1,653	1,705	1,683	1,392	276	100.0
09/14/2018 21:00	1,231	1,395	968	1,618	1,505	1,462	1,485	1,547	1,508	1,317	276	100.0
09/14/2018 22:00	998	1,127	915	1,424	1,304	1,298	1,348	1,339	1,316	1,150	276	100.0
09/14/2018 23:00	620	699	568	832	747	735	739	730	732	643	276	100.0
Total											6,624	99.0

NOTE: Showing first 10 of 19 stations in postmile range.

NOTE: To see data for all stations use 'Export to XLS'.



Let's try new queries!

Can we get the average for all weekdays on a week?



EXERCISE 4 – EVALUATE TYPICAL SPEEDS ON CORRIDOR





- We want to assess speeds for the US101 corridor.
 - » We want to see speed contours and assess where are queues being formed on a particular day
 - » We want to see average speeds and assess where are queues being formed on an average weekday
- We want to reduce the corridor section to only San Luis Obispo to Santa Maria
- We are interested in the SB direction



Procedure for Speeds Contours on a Particular Day

- Select the corridor and geographic boundary of interest and select the 'Stations' report
- 2. Identify the section of interest mileposts
- Navigate to Performance → Spatial Analysis → Time Series Contours
- 4. Modify dates for data and other parameters to get the speeds for all stations in the area, for September 14.



Speed Contours for a Particular Day Outputs





Procedure for Speeds Contours on a an Average Weekday

- Select the corridor and geographic boundary of interest and select the 'Stations' report
- 2. Identify the section of interest mileposts
- Navigate to Performance → Spatial Analysis → Long Contours
- 4. Modify dates for data and other parameters to get the speeds for all stations in the area, for September 14.



Speeds Contours on a an Average Weekday Outputs

District: 5, Segment Type: Freeway, Segment Name: US101-S Traffic Flows from Bottom to Top 00 01 02 03 04 05 06 07 08 09 10 11 12 13 14 15 16 17 18 19 20 21 22 23 Time

Aggregated avg Weekday Speed (mph) for Sep 2018 (87% Observed)

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EXERCISE 5 – DOWNLOADING RAW DATA



PeMS Data Clearinghouse





Downloading Data

- eMS Data Clearinghouse provides a single access point for downloading PeMS data sets.
- Data is available at 5-minutes, Hour, Day intervals.
- Station data for 5-minute intervals include:
 - » Timestamp
 - » Station ID
 - » District #
 - » Freeway #
 - » Direction of Travel
 - » Lane Type
 - » Station Length
 - » % of Observed Data
 - » Flow (by lane and total)
 - » Speed (by lane and total)
 - » Occupancy (by lane and total)
 - » Number of Data Samples (by lane)

23	pe-								Distric						
-	Stati	on	5-h	linut	e			•	Distri	ict 7	•	Su	bmit		
7	20)1	8 :	Stat	tion	5-	Min	ute	e						Data
8	J		F	м	A	м	J	J	A	S	0	Ν	D	^	This data.
7	-	-	-	-	-	-	-	-		-	-	-	_		descr
6	-	-	_	-	-	-	-	-		-	_	_	_		Month
5	-	-	-	-	-	-	-			-	-	-	-		rectar
4	-	-	_	-	-	-	_	-		-	_	-	_		
3	-		-	-	-	-	-	-	_	-	-	-	-		
2	-	-	_	-	-	-	-	-	_	-	-	-	_		
1	-	-	-	-	-	-	-		-	-	-		_		
n	-	-	-	-	_		_		-		_	-	_		

Field Specification

File Name Comment Units Bytes Name Timestamp The date and time of the beginning of the d07_text_station_Smin_2018_01_01.txt.gz 29,746,960 summary interval. For example, a time of d07_text_station_Smin_2018_01_02.txt.gz 30,407,709 08:00:00 indicates that the aggregate(s) d07_text_station_5min_2018_01_03.txt.gz 30,085,444 contain measurements collected between 08:00:00 and 08:04:59. Note that second d07_text_station_5min_2018_01_04.txt.gz 29,034,393 values are always 0 for five-minute d07_text_station_5min_2018_01_05.txt.gz 30,545,474 aggregations. The format is MM/DD/YYYY HH24:MI:SS. d07_text_station_5min_2018_01_06.txt.gz 30,031,755 Unique station identifier. Use this value to Station d07_text_station_Smin_2018_01_07.txt.gz 28,880,544 cross-reference with Metadata files. d07_text_station_5min_2018_01_08.txt.gz 30,235,207 District # District d07_text_station_5min_2018_01_09.txt.gz 29,396,188 Freeway # Freeway # d07_text_station_5min_2018_01_10.txt.gz 30,540,067 Direction N | S | E | W d07_text_station_5min_2018_01_11.txt.gz 30,779,357 of Travel d07_text_station_5min_2018_01_12.txt.gz 30,776,595 Lane Type A string indicating the type of lane. Possible d07_text_station_Smin_2018_01_13.txt.gz 30,194,909 values (and their meaning are: d07_text_station_5min_2018_01_14.txt.gz 29,612,702 · CD (Coll/Dist) d07_text_station_5min_2018_01_15.txt.gz 30,337,947 CH (Conventional Highway) FF (Fwy-Fwy connector) d07_text_station_5min_2018_01_16.txt.gz 30,560,173 FR (Off Ramp) d07_text_station_5min_2018_01_17.txt.gz 30,519,709 . HV (HOV) d07_text_station_Smin_2018_01_18.txt.gz 30,637,635 · ML (Mainline) · OR (On Ramp) d07_text_station_Smin_2018_01_19.txt.gz 30,579,904 d07_text_station_5min_2018_01_20.txt.gz 30.007.286 Segment length covered by the station in Station d07_text_station_5min_2018_01_21.txt.gz 28,598,486 miles/km. Length 29,598,423 d07_text_station_5min_2018_01_22.txt.gz Total number of samples received for all Samples d07_text_station_5min_2018_01_23.txt.gz 29,486,038 lanes

% Percentage of individual lane points at this %

Data Summary

This dataset contains the standard PeMS rollup of raw detector data. The algorithms used to process raw detector data are described in the System Help.

Months with data are indicated by a gray rectangle. Click a rectangle to view a listing of files available for download.

Available Files

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29,348,853

d07_text_station_5min_2018_01_24.txt.gz

Example Sample

File Edit Search Vie	w Encoding Language Settings loois macro kun vlugins window r
	$ \bigcirc \checkmark @ [n] \Rightarrow < @ \% @ \% @ \% @ @ [m 1] \blacksquare @ @ [P] = @ [P] @ [m] @$
d07_text_station_5min_	2018_09_15 tot 🖸
1 09/15/2018	00:00:00,715898,7,5,5,ML,.43,0,0,150,.0205,69.5,0,40,.0146,73.3,0,0,65,.0258,71,0,0,45,.0211,63.9,0,,,,,0,,,,,0,,,,,0,,,,,0,,,,0,,,,0,
2 09/15/2018	00:00:00,715900,7,5,S,OR,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,
3 09/15/2018	00:00:00,715901,7,5,N,OR,0,0,,.,0,.,.0,,0,,0,,0,,0,
4 09/15/2018	00:00:00,715903,7,5,N,OR,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,
5 09/15/2018	00:00:00,715906,7,5,S,OR,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,
6 09/15/2018	00:00:00,715907,7,5,S,OR,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,
7 09/15/2018	00:00:00,715908,7,5,5,0R,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,
8 09/15/2018	00:00:00,715910,7,5,N,OR,,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0
9 09/15/2018	00:00:00,715913,7,5,S,FR,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,
10 09/15/2018	00:00:00,715918,7,5,N,ML,1.075,0,0,154,.0275,69.5,0,41,.0196,73.3,0,0,66,.0346,71,0,0,47,.0283,63.9,0,,,,,0,,,,,0,,,,,0,,,,,0,,,,,0
11 09/15/2018	00:00:00,715920,7,5,S,ML,1.29,0,0,279,.0563,65,0,73,.0509,70.6,0,0,77,.0546,67.3,0,0,68,.059,62.1,0,0,61,.0606,58.9,0,,,,,0,,,,0,,,,0,,,,0,0,0,0,0,0,0,0,
12 09/15/2018	00:00:00,715923,7,5,S,OR,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,
13 09/15/2018	00:00:00,715924,7,5,N,OR,,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0
14 09/15/2018	00:00:00,715925,7,5,S,OR,8,100,6,.0109,8,6,.0109,1,,,,,0,,,,0,,,,0,,,,0,,,,,0,,,,,0,,,,,0
15 09/15/2018	00:00:00,715926,7,5,N,OR,8,100,4,.0044,8,4,.0044,1,1,,,,0,,,,0,,,,0,,,,0,,,,0,,,
16 09/15/2018	00:00:00,715927,7,5,N,OR,8,100,10,.0162,,8,10,.0162,,1,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,
17 09/15/2018	00:00:00,715928,7,5,5,0R,8,0,,,8,,,0,,,,0,,,,0,,,,0,,,,0,
18 09/15/2018	00:00:00,715929,7,5,S,ML, 47,32,100,338,.0814,68.7,8,84,.0607,73.8,1,8,106,.1242,66.7,1,8,89,.0842,68.3,1,8,59,.0567,65.8,1,,,,,0,,,,,0,,,,,0,,,,0,
19 09/15/2018	00:00:00,715930,7,5,N,ML, 505,32,100,327,.074,71.7,8,100,.0872,74.1,1,8,101,.0842,67.3,1,8,71,.0677,77.4,1,8,55,.0571,68.3,1,,,,0,,,,0,,,,0,,,,0,0,0,0,0,0,0,0,0,
20 09/15/2018	00:00:00,715932,7,5,S,OR,8,100,15,.0194,,8,15,.0194,,1,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,
21 09/15/2018	00:00:00,715933,7,5,N,ML, 425,32,100,286,.0544,70.9,8,106,.0722,72.6,1,8,86,.061,73.1,1,8,63,.0568,69,1,8,31,.0274,62.8,1,,,,0,,,,0,,,,0,,,,0
22 09/15/2018	00:00:00,715935,7,5,S,OR,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,
23 09/15/2018	00:00:00,715937,7,5,S,OR,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,
24 09/15/2018	00:00:00,715938,7,5,N,ML, 545,32,100,349,.0775,65.7,8,109,.1076,67.3,1,8,118,.104,67.3,1,8,79,.0612,62.7,1,8,43,.0372,62.8,1,,,,0,,,,0,,,,0,,,,0,0,0,0,0,0,0,0,0,
25 09/15/2018	00:00:00,715941,7,5,S,OR,8,100,5,.0209,8,5,.0209,1,,,,,0,,,,0,,,,0,,,,0,,,,,0,,,,,0,,,,0
26 09/15/2018	00:00:00,715944,7,5,N,ML, .323,32,100,272,.0662,70.2,8,81,.0688,76.4,1,8,89,.0846,70,1,8,71,.0797,66.6,1,8,31,.0319,62.8,1,,,,0,,,,0,,,,0,,,,0
27 09/15/2018	00:00:00,715947,7,5,5,ML,.495,24,100,300,.0714,66.7,8,109,.0643,71.2,1,8,103,.0754,63.9,1,8,88,.0744,64.3,1,,,,0,,,,,0,,,,,0,,,,,0,,,,,0,,,,0,0,0,0
28 09/15/2018	00:00:00,715949,7,5,N,OR,,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0
29 09/15/2018	00:00:00,715950,7,5,5,0R,,8,0,,,,8,,,,0,,,,,0,,,,,0,,,,,0,,,,,0,,,,,0
30 09/15/2018	00:00:00,715952,7,5,5,0R,,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,
31 09/15/2018	00:00:00,715953,7,5,N,OR,,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0
32 09/15/2018	00:00:00,715957,7,5,5,0R,,0,0,,,,0,,,,0,,,,0,,,,0,,,,
33 09/15/2018	00:00:00,715958,7,5,5,0R,,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,
34 09/15/2018	00:00:00,715959,7,5,8,0R,,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,
35 09/15/2018	00:00:00,715961,7,5,S,OR,10,100,16,.0253,10,16,.0253,1,,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0
36 09/15/2018	00:00:00,715963,7,5,5,0R,,0,0,,,,0,,,,0,,,,0,,,,0,,,,0,
37 09/15/2018	00:00:00,715964,7,5,S,OR,10,100,12,0211,10,12,0211,1,,,,0,,,,0,
38 09/15/2018	UU:UU:UU:UU,II:5966,/,5,S,50R,,1U,IUU,Z,UU23,,10,2,.0023,,1,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,
39 09/15/2018	00:00:00;115967,7,5,N,0R,,0,0,,,,0,0,,,,0,0,,,,0,0,,,,0,,,
40 09/15/2018	00:00:00,715968,7,5,S,0R,,10,100,18,.0176,,10,18,.0176,,1,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,,,
41 09/15/2018	00:00:00;15969,/,5,N,0R,,10,100,Z,.0021,,10,Z,.0021,,1,,,,0,,,,0,,,,0,,,,0,,,,0,,,,0,
42 09/15/2018	00:00:00;159/0;1,5,N;0K;,0;0;,,0,,0,,0,,0,,0,,0,,0,,0,,0
43 09/15/2018	00:00:00;715971,7,5,5,0R,0,0,7,7,0,7,7,0,7,7,0,7,7,0,7,7,0,7,7,0,7,7,0
44 09/15/2018	00:00:00,12312,1,210,80,00,10,00,00,00,00,00,00,00,00,00,00,00



Processing Raw Data

- Desired data is downloaded from the Clearinghouse, selecting District, interval (5min, hour, or daily data), and the specific days.
- A Python script is used to read the Comma Separated Value data, and extract only the PeMS stations of interest.
- The script outputs an excel file with the desired data for further analysis.

1	import matplotlib.pyplot as plt															
1	import numpy as np															
P	matplotlib d.options.d	inline isplay.ma	x_colum	ns = 50	9											
2]: #	We start by tations = p	reading	the PeM cel('pe	stat	ions we w tions.xls	ant t	to analy sheet_na	vze ame= "PeM	5*)							
i]: #	We now crea	te a data estamp','	frame w Station	th all, Dist	the spe trict', 'R	loute	,'Dire	tion','	Type', 'Leng	th','Samp	les','%	Observed'	,'TotalF	10w','A	vgOCc',	AvgSpee
P	patn = speeds/															
d	<pre>df = pd.DataFrame()</pre>															
	for file in os listdir(path):															
4	<pre>for file in os.listdir(path): filename = path+file</pre>															
4	filename	<pre>os.listdi path+f</pre>	r(path) ile													
4	filename temp = p	<pre>os.listdi path+f d.read_cs annend(te</pre>	r(path) ile v(filen en ign	: ame, hi	eader=Nor	ie, na	ames=hea	ad, parse	e_dates=[']	imestamp], infe	r_datetim	e_format	=True)		
*	file in filename temp = p df = df.	os.listdi path+f d.read_cs append(te	r(path) ile v(filen mp, ign	ame, h pre_in	eader=Nor dex=True)	ie, na	ames=hea	ad, pars	e_dates=['1	imestamp], infe	r_datetim	e_format	=True)		
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f (]: d (]: -	or file in filename temp = p df = df. If.head(10) Timestamp 0 2017-01-01	os.listdi = path+f: d.read_cs append(ter Station 500010011	r(path) ile v(filen. mp, ign District	: ame, hi ore_ind Route	eader=Nor dex=True) Direction N	Type ML	Length	ad, parso Samples 117	e_dates=['1 %Observed 100	imestamp TotalFlow 108.0], infe AvgOCc 0.0115	r_datetim AvgSpeed 64.2	e_format Delay35 0.0	=True) Delay40 0.0	Delay45 0.0	Delay50 0.0
f (): d (): ():	or file in filename temp = p df = df. If.head(10) Timestamp 0 2017-01-01 1 2017-01-01	os.listdi = path+f: d.read_cs append(ter Station 500010011 500010012	r(path) ile v(filen.mp, igno District 5 5	Route	eader=Nor dex=True) Direction N S	Type ML	ames=hea Length 2.713 2.714	Samples	e_dates=['1 %Observed 100 100	TotalFlow 108.0 41.0], infe AvgOCc 0.0115 0.0043	r_datetim AvgSpeed 64.2 64.8	e_format Delay35 0.0 0.0	=True) Delay40 0.0 0.0	Delay45 0.0 0.0	Delay50 0.0 0.0
f]: d]: -	or file in filename temp = p df = df. Timestamp 0 2017-01-01 1 2017-01-01 2 2017-01-01	os.listdi = path+f; d.read_cs; append(ter 500010011 500010011 500010012	r(path) ile v(filen. mp, ign District 5 5 5 5	Route	eader=Nor dex=True) Direction N S N	Type ML ML	Length 2.713 2.714 0.697	Samples 117 109	e_dates=['1 %Observed 100 100 0	TotalFlow 108.0 41.0 266.0], infe AvgOCc 0.0115 0.0043 0.0226	r_datetim AvgSpeed 64.2 64.8 66.9	e_format Delay35 0.0 0.0 0.0	=True) Delay40 0.0 0.0 0.0	Delay45 0.0 0.0 0.0	Delay50 0.0 0.0 0.0
f]: d]: - ;	or file in filename temp = p df = df. If.head(10) Z017-01-01 2 2017-01-01 2 2017-01-01 3 2017-01-01	s.listdi = path+f d.read_cs append(ter 500010011 500010012 500010021	r(path) ile v(filen. mp, ign District 5 5 5 5 5	Route	eader=Nor dex=True) Direction N S N S	Type ML ML ML	Length 2.713 2.714 0.697 0.698	Samples 117 109 109	e_dates=['1 %Observed 100 100 0	TotalFlow 108.0 41.0 266.0 171.0	AvgOCc 0.0115 0.0043 0.0226 0.0123	r_datetim AvgSpeed 64.2 64.8 66.9 67.7	E_format Delay35 0.0 0.0 0.0 0.0	=True) Delay40 0.0 0.0 0.0 0.0	Delay45 0.0 0.0 0.0 0.0	Delay50 0.0 0.0 0.0 0.0
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f]: d]: - - - - - - - - - - - - - - - - - - -	<pre>for file in filename temp = p df = df.</pre> If.head(10) Timestamp 0 2017-01-01 1 2017-01-01 2 2017-01-01 3 2017-01-01 4 2017-01-01 5 2017-01-01	05.113101 • path+f d.read_cs: append(ter Station 500010011 500010012 500010022 500010021 500010022	r(path) ile v(filen. mp, ign District 5 5 5 5 5 5 5	Route	Direction N S N S N S N S S N	Type ML ML ML ML ML ML	Length 2.713 2.714 0.697 0.698 0.831 0.831	Samples 5117 117 109 109 228 114	e_dates=['1 %Observed 100 0 0 100	TotalFlow 108.0 41.0 266.0 171.0 233.0 202.0	AvgOCc 0.0115 0.0043 0.0226 0.0123 0.0134 0.0212	AvgSpeed 642 648 669 67.7 68.1 63.9	e_format Delay35 0.0 0.0 0.0 0.0 0.0 0.0 0.0	=True) Delay40 0.0 0.0 0.0 0.0 0.0 0.0	Delay45 0.0 0.0 0.0 0.0 0.0 0.0	Delay50 0.0 0.0 0.0 0.0 0.0 0.0
f (<]: d]:	or file in filename temp = p df = df. if.head(10) Timestamp 0 2017-01-01 1 2017-01-01 2 2017-01-01 3 2017-01-01 5 2017-01-01 5 2017-01-01	05.113101 • path+f d.read_cs: append(ter Station 500010011 500010012 500010022 500010022 500010032 500010032	r(path) ile v(filen. mp, ign District 5 5 5 5 5 5 5 5 5 5 5	Route	Direction N S N S N S N S N N S N N	Type ML ML ML ML ML ML ML	Length 2.713 2.714 0.697 0.698 0.831 0.831 1.242	Samples 117 117 109 109 228 114 240	e_dates=['1 %Observed 100 100 0 100 100	TotalFlow 108.0 41.0 266.0 171.0 233.0 202.0 361.0	AvgOCc 0.0115 0.0043 0.0226 0.0123 0.0134 0.0212 0.0182	AvgSpeed 642 648 669 67.7 68.1 63.9 68.0	e_format Delay35 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0	Delay40 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0	Delay45 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0	Delay50 0.0 0.0 0.0 0.0 0.0 0.0 0.0
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Analyzing Raw Data

Once data is selected for the region and time of interest, heat maps can be developed to visualize speeds, congestion, flows, and quality of data for a specific time period.

												Но	Jr														Arroyo
Name	0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	/		Grande
BROADWAY HWY 135 101 SB VDS MLSB	67	67	67	67	67	67	67	66	66	65	65	65	65	65	64	63	63	62	64	67	67	67	67	67			-
OAK PARK BLVD 101 NB VDS MLSB SB	66	66	66	66	66	66	65	63	62	63	63	63	63	63	63	63	60	57	61	62	64	65	66	66			
SHELL BEACH RD 101 NB VDS MLSB S	65	65	65	65	65	65	65	65	64	64	64	63	63	63	62	59	56	56	61	64	64	65	65	65			Price St
SPYGLASS DR 101 SB VDS MLSB SB	69	69	69	69	69	69	68	67	67	66	65	65	64	64	61	51	38	35	55	66	67	67	68	68			= Plice Ot
AVILA BEACH DR 101 NB VDS MLSB S	70	70	70	69	70	70	70	70	70	69	69	67	67	67	65	59	44	38	60	69	69	69	70	70			Pismo Beach
SAN LUIS BAY DR 101 SB VDS MLSB	69	69	69	69	69	69	68	67	67	66	65	65	64	64	63	61	59	58	64	67	67	68	68	69			
SO HIGUERA ST EXIT 101 NB VDS ML	67	67	67	67	67	67	67	67	66	65	64	64	63	63	62	58	54	55	64	66	66	67	67	67			Avila
SO HIGUERA ST ON RAMP ST 101 NB	67	67	66	66	67	67	67	67	67	66	65	65	64	64	63	59	53	56	64	67	66	66	67	67			Beach
LOS OSOS VALLEY RD 101 SB VDS ML	69	69	69	69	69	68	67	67	67	67	66	66	66	65	64	61	55	60	65	67	67	67	68	68			Dr
PRADO RD CMS 101 NB VDS MLSB SB	67	66	66	66	66	67	67	66	65	65	65	64	63	62	61	59	55	58	65	67	67	67	67	67	///		
PRADO RD 101 NB VDS MLSB SB	67	66	66	66	66	67	67	67	66	66	66	65	64	63	63	59	55	57	66	67	67	67	67	67	////		
MADONNA RD 101 SB VDS MLSB SB	69	69	69	69	69	68	67	67	66	66	66	65	64	64	63	61	59	61	66	67	67	67	68	68	////		Los Osos
MARSH ST 101 SB VDS MLSB SB	69	69	69	69	69	68	67	66	65	65	64	64	63	63	62	61	61	61	65	67	67	68	68	68			Valley Rd
BROAD ST 101 SB VDS MLSB SB	69	70	70	70	69	69	68	66	65	64	64	63	63	63	62	60	60	60	64	66	67	68	69	69	///-		
TORO ST 101 NB VDS MLSB SB	66	66	66	66	67	67	67	65	65	66	66	65	65	65	65	63	63	63	66	67	67	67	67	67	///-		Con
GRAND AVE IN SLO AT 101 SB VDS M	69	69	68	69	68	69	67	65	65	66	67	67	66	66	65	65	66	66	67	68	68	68	68	69		111	San
MONTEREY ST 101 NB VDS MLSB SB	66	65	65	65	66	66	66	65	65	66	66	66	66	66	65	65	66	66	67	67	66	66	66	66		-10	Luis
FOX HOLLOW RD 101 NB VDS MLSB SB	67	66	66	66	67	67	66	65	65	65	65	65	65	64	64	64	64	64	66	67	67	67	67	67	1		Obispo
																											·

THANK YOU!

For further questions and comments you can email:

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