

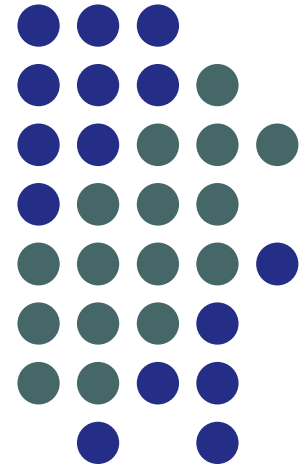
# Applying Traffic Flow Theory in Assessing Detector Performance



NWTC 2024, March 5<sup>th</sup>, 2024

Katherine Riffle, **Edward Smaglik**, Steven Procaccio,  
Steven Gehrke, and Brendan Russo  
Northern Arizona University

David Hurwitz, Oregon State University



Funded by



# Motivation

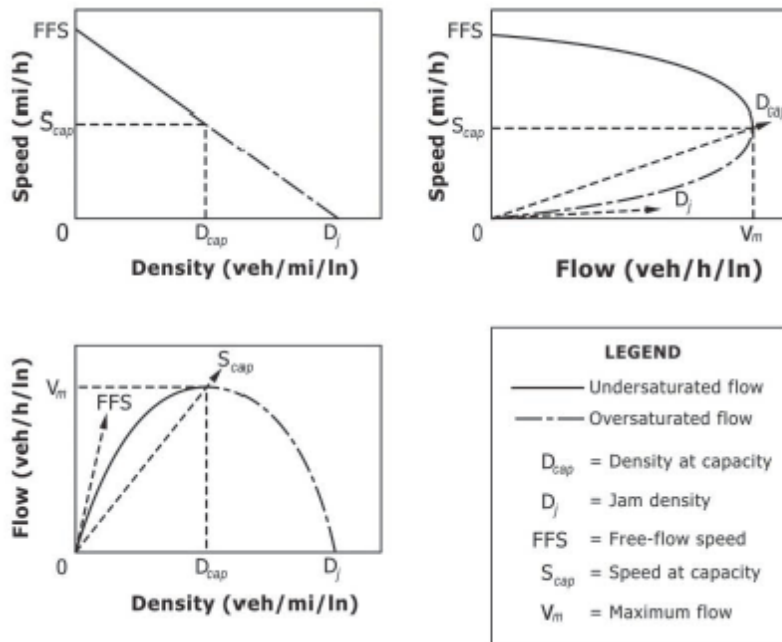
- Current methods of detector health monitoring commonly do not capture:
  - Latency issues
    - Detector 'sticks' temporarily, holding the call longer than it should
    - Detector drops call early
  - Shifting traffic patterns, and vehicles are not passing over detection zone
  - Detector flickering (i.e. spotty detection) below threshold of erratic count
  - Erratic detector performance (detector fails for several minutes, then operates normally before failing again)



# Project Objectives



- *Develop a reliable and robust method of determining poor performance of a traffic detector based solely on historical data and traffic flow theory.*
- *It is proposed that this method will work at isolated signalized intersections, using data only from that intersection's detectors for evaluation.*
- *Additionally, a system design of this method will be developed to assist ODOT with implementation of the method.*

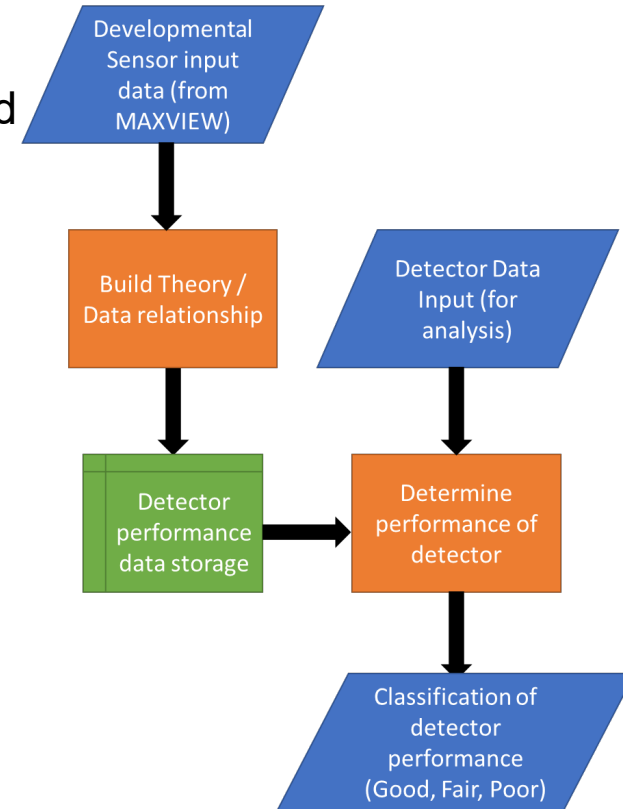
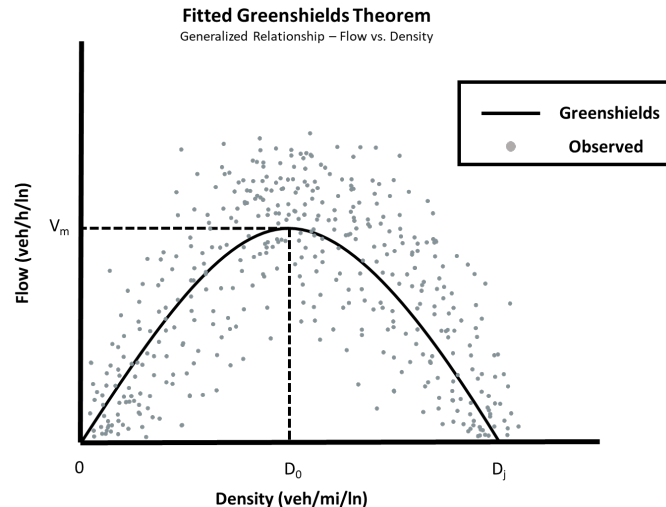


**Exhibit 4-2**  
Generalized Relationships  
Among Speed, Density, and  
Flow Rate on Uninterrupted-  
Flow Facilities

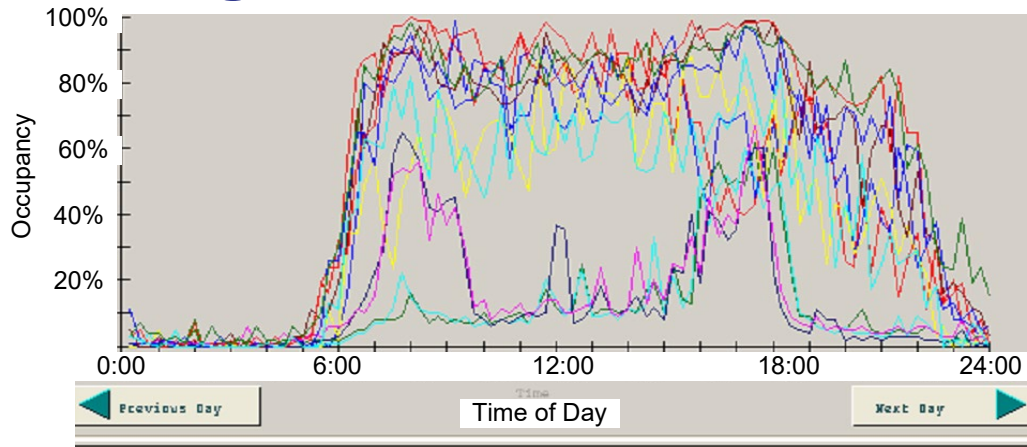
# Research Approach



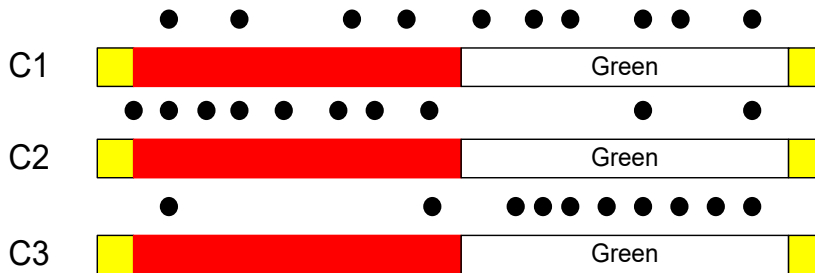
- Generalized Process:
  - Collect data from representative sites
  - Approximate uninterrupted flow from event-based data
  - Develop mathematical relationships for empirical data (Volume vs. Density curve)
  - Develop Volume vs. Density prediction model from empirical data
  - Develop performance datasets for algorithm comparisons



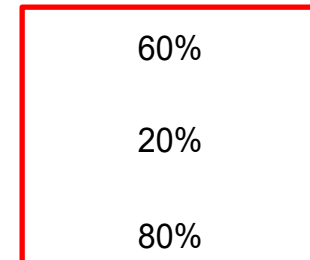
# Importance of Event Based High Resolution Data (Building blocks of ATSPM)



- 4/12/2006 Zone 11 Intersection 6 Detector 1 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 2 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 3 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 4 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 5 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 6 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 7 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 8 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 9 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 10 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 11 Occupancy Data
- 4/12/2006 Zone 11 Intersection 6 Detector 12 Occupancy Data



## Percent Arrival on Green



Average =  
53.33%

# Site Identification

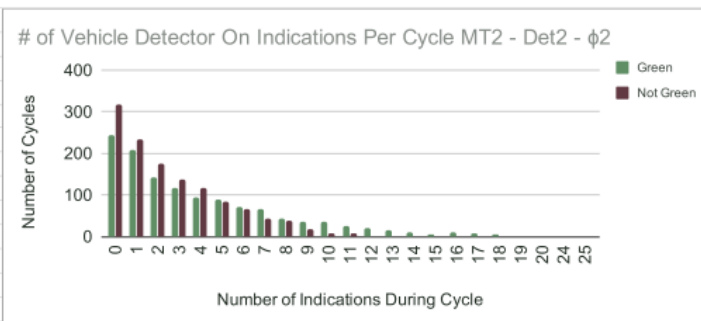


- Rudimentary check of detection performance
  - Are we seeing activations?
  - Do they take the expected shape?
  - Are they within a plausible range?

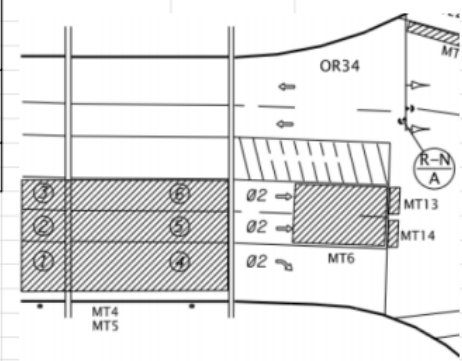
9: OR34\_1-5SB Histograms 8-3-2020

MT2 - Det2 - φ2

max	25	max	18
mode	0	mode	0
# of mode	243	# of mode	318
Outliers	None	Outliers	None
<b>Totals</b>		<b>Totals</b>	
0	243	0	318
1	208	1	233
2	143	2	175
3	117	3	137
4	94	4	118
5	89	5	85
6	71	6	66
7	66	7	42
8	44	8	38
9	36	9	18
10	35	10	7
11	26	11	8
12	20	12	1
13	15	16	1
14	11	17	1
15	6	18	1
16	10		
17	7		
18	4		
19	1		
20	1		
24	1		
25	1		



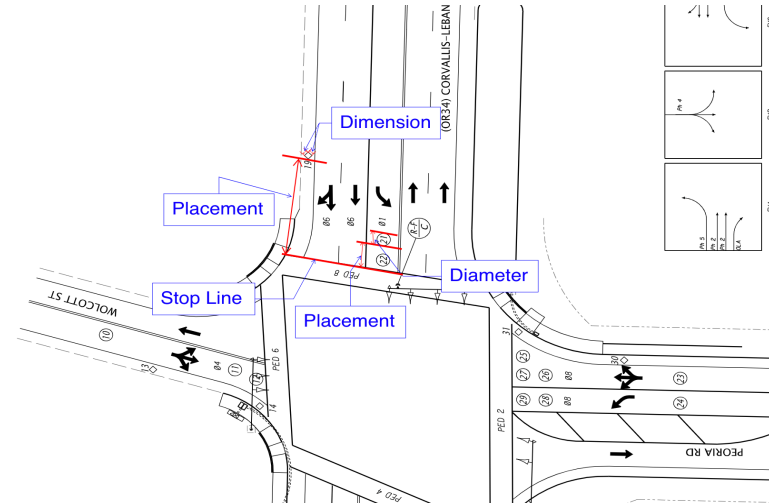
<b>81 Repeats</b>	0
	0%
<b>82 Repeats</b>	0
	0%
<b>Total Rows</b>	16484



# Site Verification



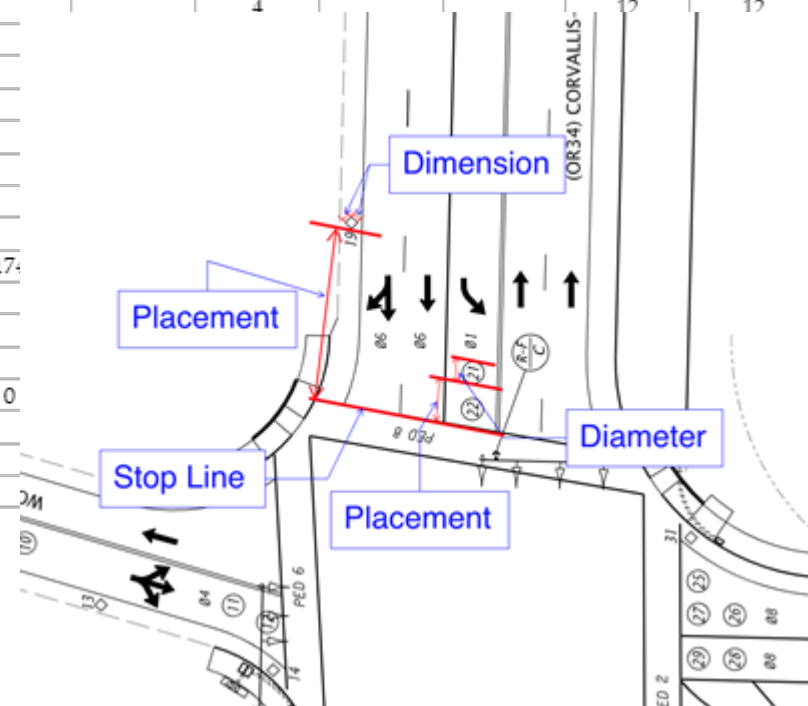
- Log site characteristics
- Record operations with drones
  - Drone Video Log Transcription
- Process and reduce event log data
- Validate detectors
  - Comparing drone video logs to event logs
  - Number of activations
  - Detector on duration
- Outcome
  - List of provided detectors that passed the performance metrics, for use in algorithm development



# Log Site Characteristics



Intersection	Urban / Rural	Detector	Technology	Approach	Approach Speed	Location	Distance To Stop Bar (ft)			Size (ft)		Lane Usage and Width		
							1st Det	2nd Det	3rd Det	Length	Width	Left	Thru	Right
OR22 @ I-5	HWY Ramp	1	Loop	EB	50	Advanced	365			6			12	
OR22 @ I-5	HWY Ramp	2	Loop	EB	50	Advanced	365			6			12	
OR22 @ I-5	HWY Ramp	4-6	Loop	EB	50	Advanced	164	168	168	6			12	
OR22 @ I-5	HWY Ramp	7	Loop	SB	45	Advanced	130			6		12		
OR22 @ I-5	HWY Ramp	8	Loop	SB	45	Advanced	129			6		12		
OR22 @ I-5	HWY Ramp	9-10	Loop	SB	45	Advanced	57.5	57.5		6		12		
OR22 @ I-5	HWY Ramp	17-18	Loop	WB	50	Advanced	202.5	202.5		6			12	
OR34 @ I-5	Rural	2	Loop	EB	40	Advanced	377.7			4.0833			12	
OR34 @ I-5	Rural	7	Loop	SB	30	Advanced	128			4				12
OR34 @ I-5	Rural	8	Loop	SB	30	Advanced	130			4				12
OR34 @ I-5	Rural	9	Loop	SB	30	Advanced	132							
OR34 @ I-5	Rural	13	Radar	EB	40	Stop Bar	0							
OR34 @ I-5	Rural	14	Radar	EB	40	Stop Bar	0							
OR34 @ I-5	Rural	23	Radar	SB	30	Stop Bar	12							
OR34 @ I-5	Rural	25	Radar	SB	30	Stop Bar	12							
OR34 @ I-5	Rural	27	Radar	WB	40	Stop Bar	11							
OR34 @ I-5	Rural	28	Radar	WB	40	Stop Bar	11							
OR34 @ Peoria	Rural	3-4	Loop	EB	55	Advanced	174	174						
OR34 @ Peoria	Rural	10	Loop	SB	25	Advanced	70							
OR34 @ Peoria	Rural	16	Loop	WB	55	Advanced	379							
OR34 @ Peoria	Rural	20	Loop	WB	55	Advanced	69							
OR34 @ Peoria	Rural	21-22	Loop	WB	55	Stop Bar	9	0						
OR34 @ Peoria	Rural	23	Loop	NB	45	Advanced	79							
OR34 @ Peoria	Rural	24	Loop	NB	45	Advanced	79							
US20 @ 15th	Rural	1	Loop	EB	45	Advanced	319.8							





# Drone Video Recordings and Video Log Transcription



Site		US20@15th St														
Date		11/20/2020														
Direction		NB														
Video	Vehicle	Time*										Traffic Signal Status**			Comment(s)	
		Arrival	Depart	Calculation								Duration (Decimal) (second)	Red	Yellow		Green
				Arrival (Degree)				Depart (Degree)								
				h	m	s	sss	h	m	s	sss					
NB #17-19	Detector	19														
	1	13:07:02	13:07:03	13	7	2	6	13	7	3	4	0.93	x			
	2	13:07:29	13:07:30	13	7	29	10	13	7	30	27	1.57	x			
	3	13:08:47	13:08:48	13	8	47	23	13	8	48	21	0.93	x			
	4	13:08:59	13:09:00	13	8	59	21	13	9	0	25	1.13	x			
	5	13:10:19	13:10:20	13	10	19	10	13	10	20	12	1.07	x			
	6	13:10:41	13:10:42	13	10	41	7	13	10	42	8	1.03	x			

# Detector Verification Outcome Overview

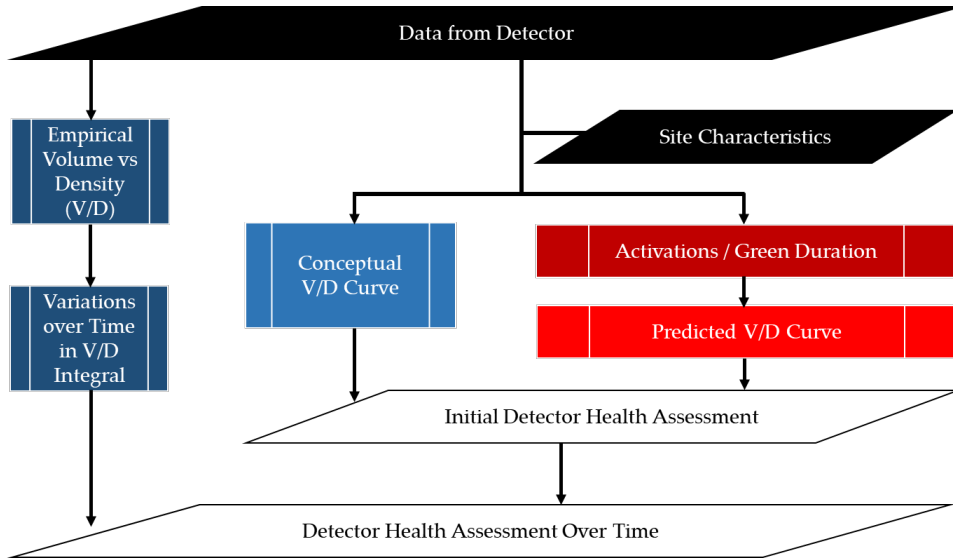


Usable Detectors from Each Study Intersection

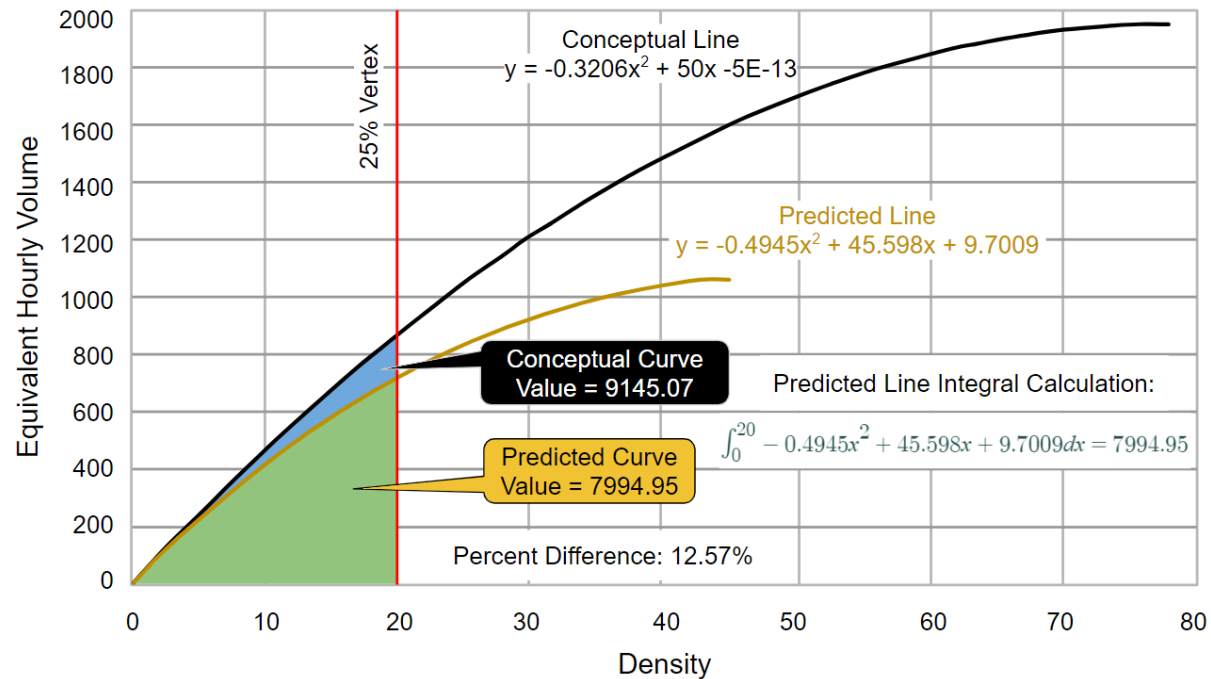
Intersection	Det#	MT#		Lanes	Location	Intersection	Det#		MT#	Lanes	Location
OR22 at I-5	1	2	Loop	1	Advanced	US20 at 15 <sup>th</sup>	1	Loop	2	1	Advanced
	2	3		1	Advanced		2		1	Advanced	
	4-6	5		3	Advanced		3		15	1	Advanced
	7	8		1	Advanced		4-5		27	1	Stop Bar
	8	9		1	Advanced		8		8	1	Advanced
	9-10	10		2	Advanced		9-10		9	1	Stop Bar
	17-18	18		2	Advanced		13		1	1	Advanced
OR34 at I-5	2	2	Loop	1	Advanced	US26 at Meinig	4	Loop	8	1	Advanced
	7	8		1	Advanced		5-6		9	1	Stop Bar
	8	9		1	Advanced		7		21	1	Advanced
	9	12		1	Advanced		US101 at 22 <sup>nd</sup>		3-4	Loop	4
	13	13	Radar	1	Stop Bar	5-6		5	1		Stop Bar
	14	14		1	Stop Bar	7		15	1		Advanced
	23	23		1	Stop Bar	8-9		27	1		Stop Bar
	25	25		1	Stop Bar	17-18		18	1		Stop Bar
	27	27		1	Stop Bar	19-20		19	1		Stop Bar
	28	28		1	Stop Bar	21	1	1	Advanced		
OR34 at Peoria	3-4	6	Loop	2	Advanced	24	22	1	Advanced		
	10	7		1	Advanced	25-26	23	1	Stop Bar		
	16	17		1	Advanced						
	20	1		1	Advanced						
	21-22	13		1	Stop Bar						
	23	22		1	Advanced						
	24	23		1	Advanced						

- 79 detection zones underwent comparative analysis (70 inductive loop and 9 radar).
- 39 inductive loop and 6 radar zones passed the analysis

# General Form of Comparative Process



$$\frac{| \text{Predicted Integral} - \text{Conceptual Integral} |}{\text{Conceptual Integral}} = \text{Percent Difference}$$

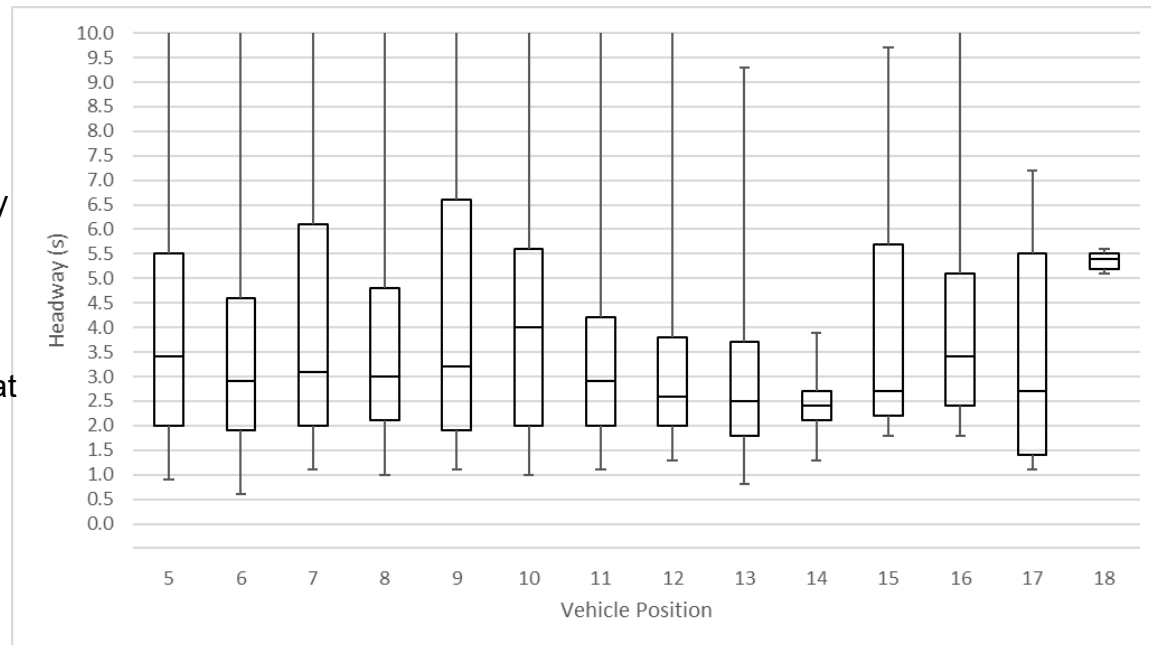
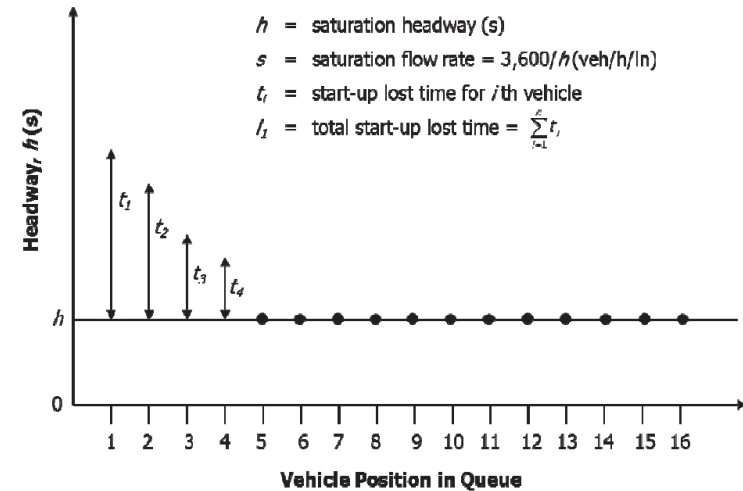


# Approximation of Uninterrupted Flow



- Peak Period Selection
  - High volume desired
  - Tu, Wed, Thu: 6a-9a; 4p-7p
- Start-Up Lost Time
  - Remove first four activations
- Saturated Headway
  - Various approaches attempted
    - Remove top quartile
    - Remove points that are more than 2x or 3x median
    - Remove activations detected during the last six seconds of green
    - Remove all data if first headway over 8 seconds
  - In the end, limited headways to those at or below 3.0s
    - Common value for gap setting at signalized intersections
    - Easy from a calculation standpoint

**Exhibit 4-8**  
Concept of Saturation Flow Rate and Lost Time



# Calculation of Equivalent Hourly Volume (EHV) and Density



- EHV = surrogate for volume
  - Volume for one green duration scaled to an hourly volume

$$EHV = 3600 / (3600 \times 24 \times C)(A)$$

Where:  $EHV$  = Equivalent Hourly Volume  
 $C$  = Cycle Duration  
 $A$  = Number of Filtered Activations per Green Duration

- Density
  - Approximated from Occupancy

$$D = O \times 5280 / (L_{Veh} + L_{Det})$$

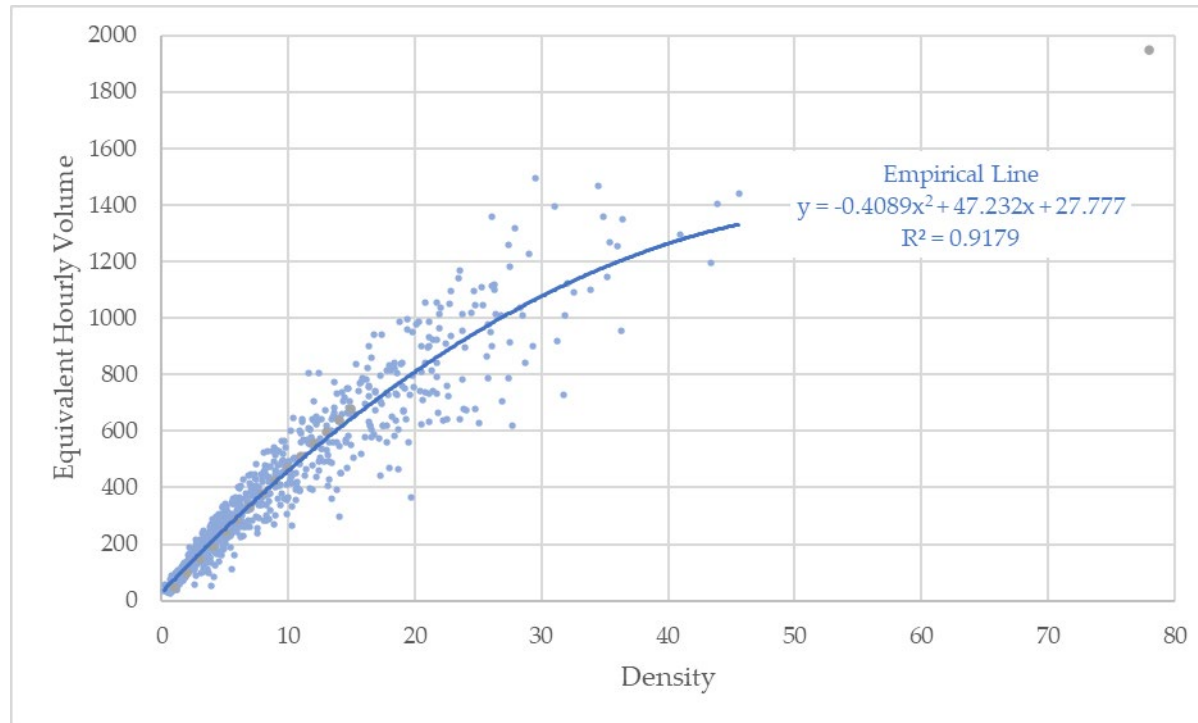
Where:  $D$  = Density  
 $O$  = Occupancy  
 $L_{Veh}$  = Average Vehicle Length  
 $L_{Det}$  = Detector Length

$$Occupancy = \frac{\text{Filtered Detector On During Green Duration}}{\text{Green Duration}}$$

# Plot Data Points and Generate Empirical Curve



- Plot values of EHV and Density for one week of data (18 hours); 50 points/week required to plot
- Generate second order trendline



# Calculation Conceptual Volume vs. Density Curve



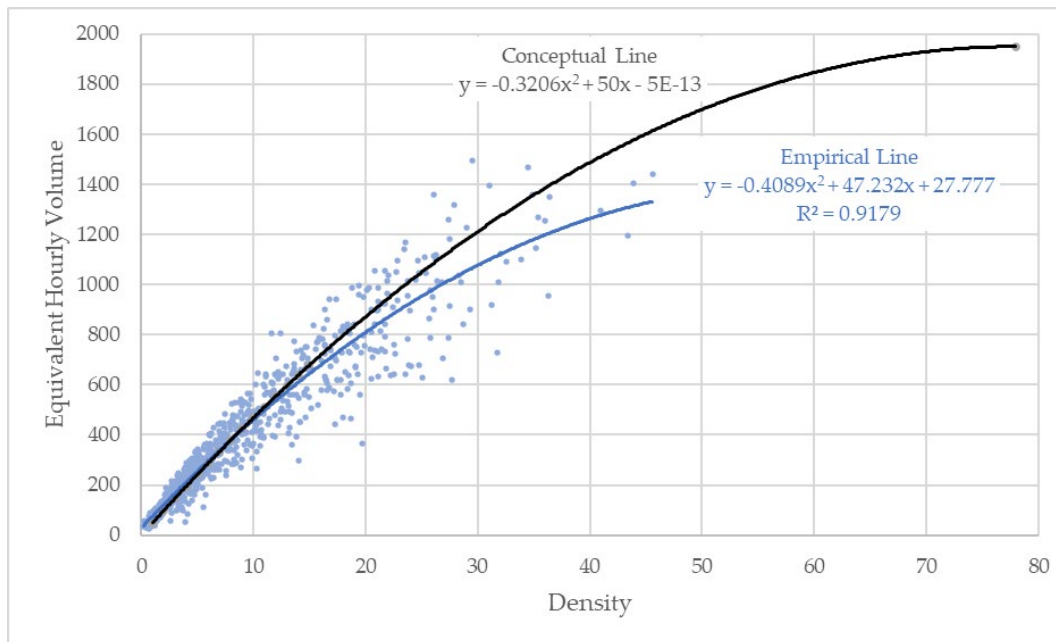
- Vertex of Conceptual curve calculated directly from Greenshields relationship

$$S_0 = \frac{1}{2} \text{ Speed Limit}$$

$$\text{Maximum Volume} = V_{MAX} = 3600 / \text{Average Headway}$$

$$\text{Optimum Density} = D_0 = V_{MAX} / S_0$$

- Create quadratic line with vertex and origin

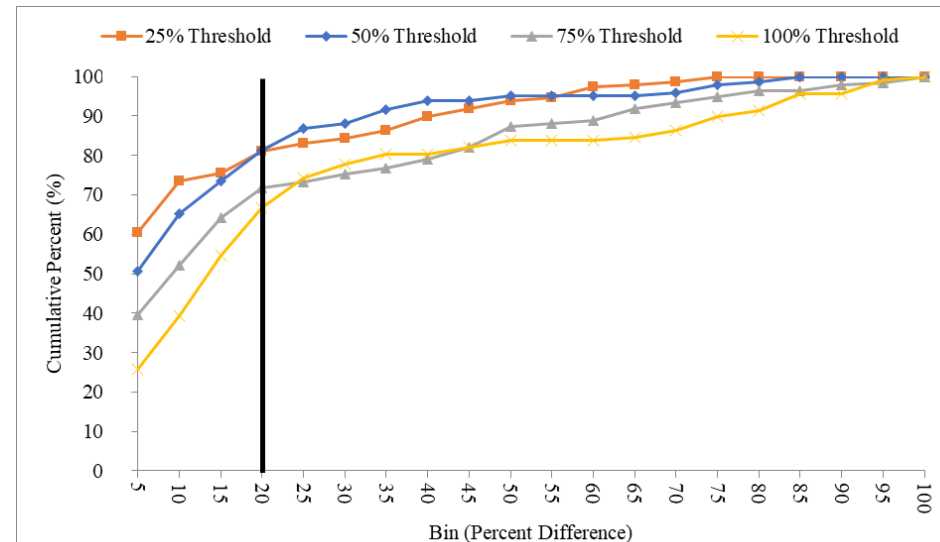
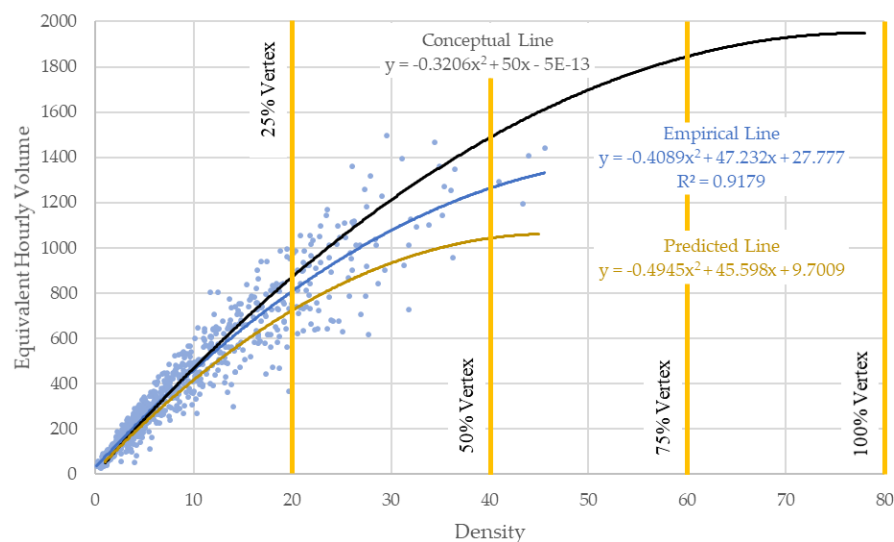


# Develop Performance Datasets for Algorithm Comparisons



- Empirical Performance Dataset (EPD)
  - Using filtered dataset, develop set of percent difference values for each detector (50+ pts per week,  $r^2 > 0.7$ ,  $-a$  coefficient, positive integral)
  - Processed four weeks data to yield six percent difference values (interested in week-to-week variability)
    - Week 2 compared to Week 1
    - Week 3 compared to Week 1
    - Week 4 compared to Week 1
    - Week 3 compared to Week 2
    - Week 4 compared to Week 2

	25%	50%	75%	100%
Mean	10.64	13.51	24.54	142.55
Std Dev	16.69	24.81	36.36	386.77





# Develop Volume vs. Density Prediction Model from Empirical Data



- Predict  $a$ ,  $b$ , and  $c$  coefficients ( $ax^2 + bx + c$ ) of Volume vs. Density curve based upon site characteristics

Predictor Variable	$a$			$b$			$c$		
	Beta	Std. Error	p-value	Beta	Std. Error	p-value	Beta	Std. Error	p-value
(intercept)	0.629	0.338	0.066	6.337	8.624	0.464	-10.341	27.478	0.707
Tech Loop	-0.267	0.136	0.052	3.773	3.472	0.280	9.171	11.062	0.409
Detect Advance	-0.180	0.100	0.074	6.754	2.542	0.009	21.385	8.098	0.010
Single Lane	-0.171	0.120	0.157	4.700	3.062	0.128	-29.725	9.758	0.003
Activations	-0.001	<0.001	0.022	0.064	0.007	<0.001	-0.047	0.024	0.051
Indications	-0.008	0.006	0.162	-0.136	0.145	0.348	1.458	0.461	0.002
<i>Model Summary</i>									
Adjusted R <sup>2</sup>	0.172			0.661			0.154		

- Number of activations/hour is all activations during green (unfiltered), averaged for the week
- Number of green indications/hour is averaged for the week

$$\hat{y}_a = 0.629 - 0.267(x_{tech\_loop}) - 0.180(x_{detect\_adv}) - 0.171(x_{lane\_single}) - 0.001(x_{wk\_act\ hour}) - 0.008(x_{wk\_grn\ hr})$$

$$\hat{y}_b = 6.337 + 3.773(x_{tech\_loop}) + 6.754(x_{detect\_adv}) + 4.700(x_{lane\_single}) + 0.064(x_{wk\_act\ hour}) - 0.136(x_{wk\_grn\ hr})$$

$$\hat{y}_c = -10.341 + 9.171(x_{tech\_loop}) + 21.385(x_{detect\_adv}) - 29.725(x_{lane\_single}) - 0.047(x_{wk\_act\ hour}) + 1.458(x_{wk\_grn\ hr})$$

Where:

$\hat{y}_a, \hat{y}_b, \hat{y}_c$  equals the predicted values of  $a, b$ , and  $c$

$x_{tech\_loop}$  equals the presence of a loop detector (binary)

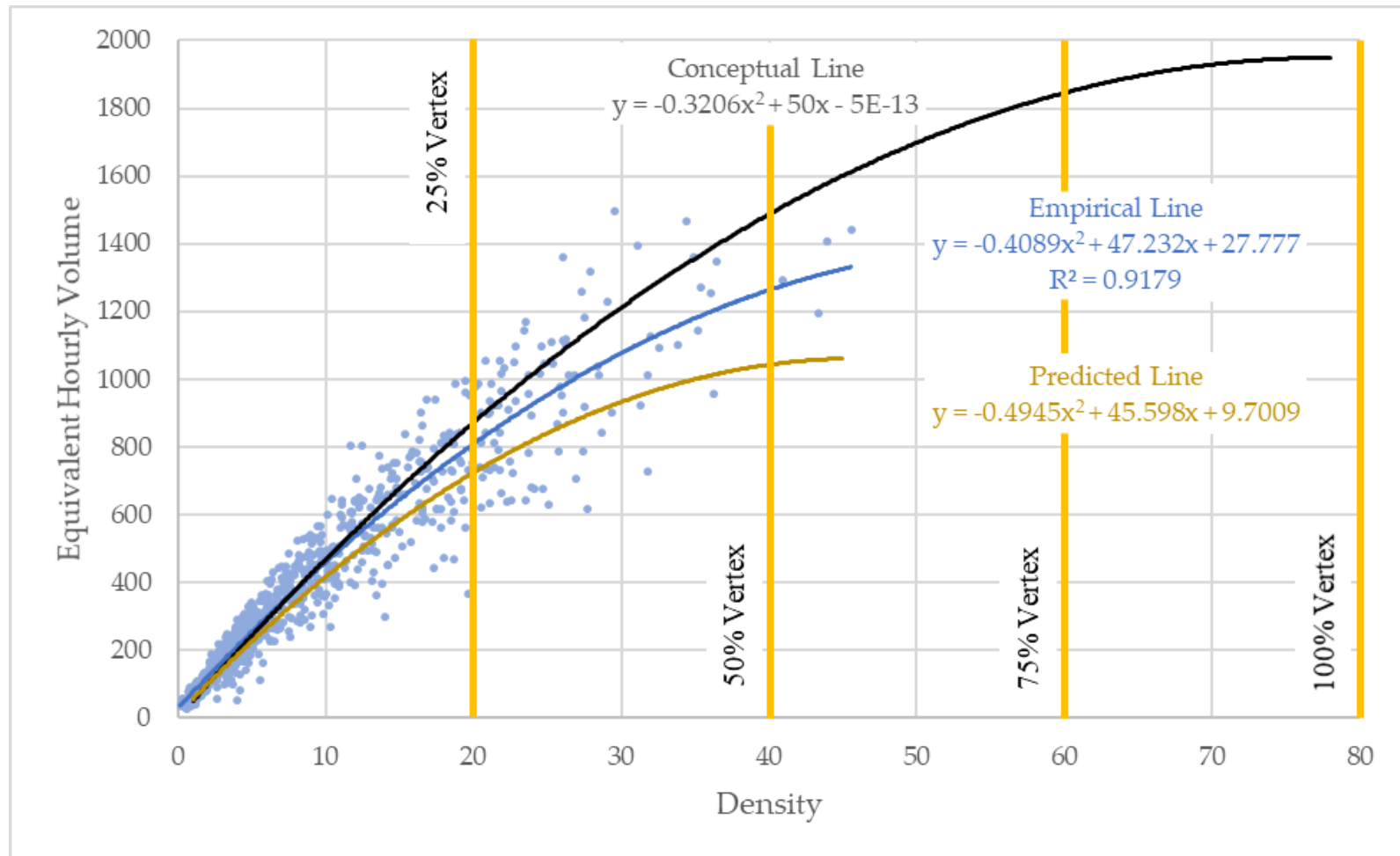
$x_{detect\_adv}$  equals the presence of advanced detector technology (binary)

$x_{lane\_single}$  equals site location within a single lane roadway (binary)

$x_{wk\_act\ hour}$  equals the number of activations per hour (continuous)

$x_{wk\_grn\ hr}$  equals the number of indications per hour (continuous)

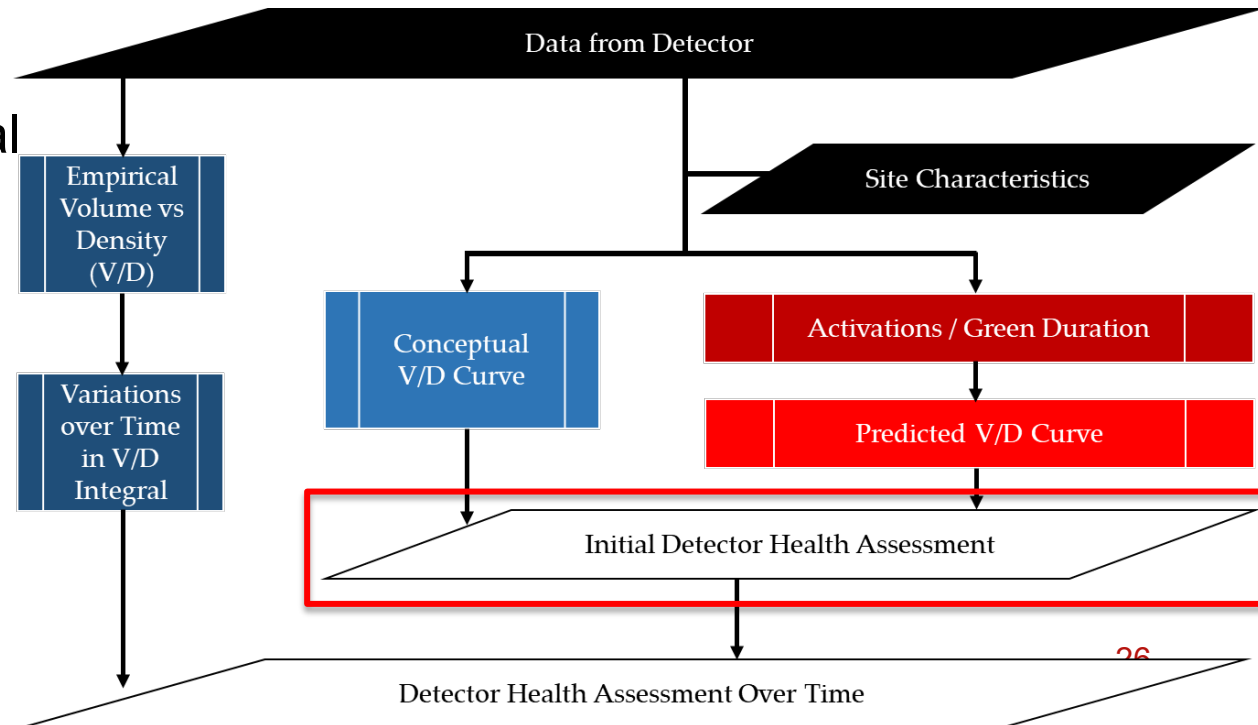
# Developed lines for comparison



# Algorithm: Initial Detector Health Assessment



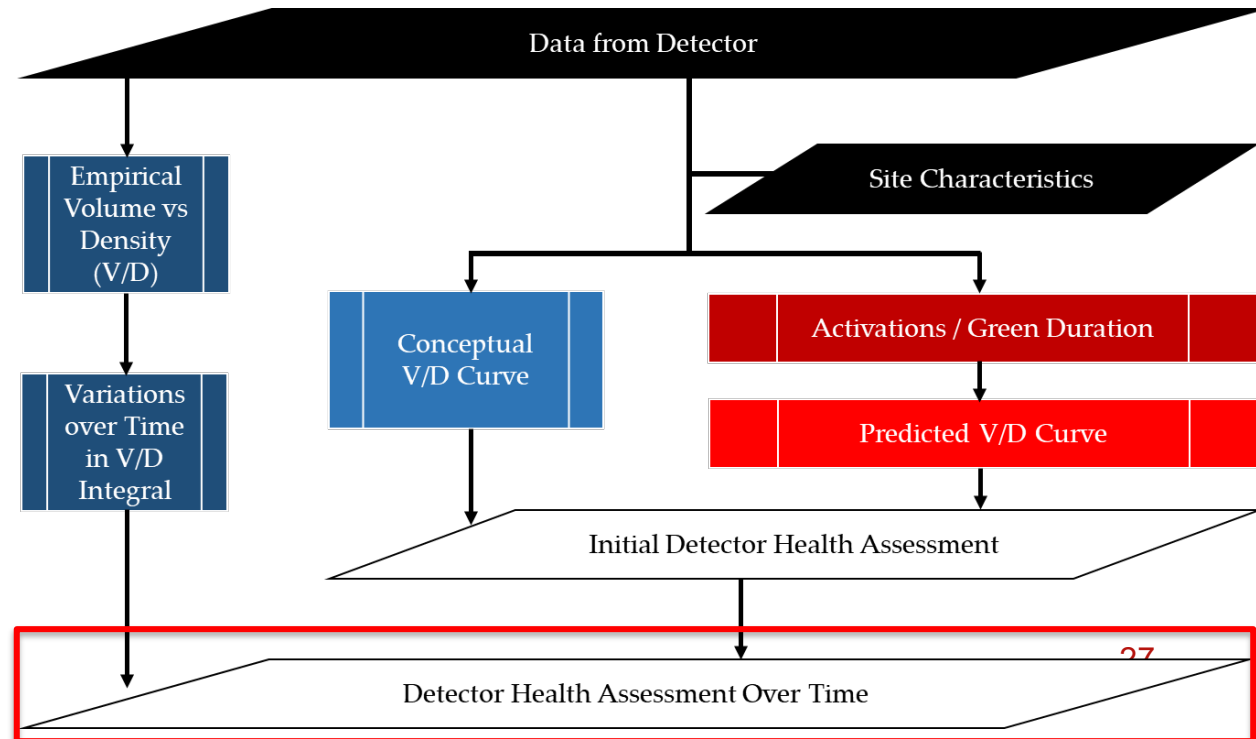
- Two comparison points:
  - Compare integrated percent difference between predicted vs. conceptual line against Predicted Performance Dataset
  - Compare percent differences between four weeks of empirical data against Empirical Performance Dataset



# Algorithm: Detector Health Assessment Over Time



- Plot percent difference values over time
  - Compute integral percent differences from empirical data in rolling four-week increments
  - Plot calculated differences on a control chart; compare with PPD
  - Adjust control chart limits over time



# Limitations and Future Work

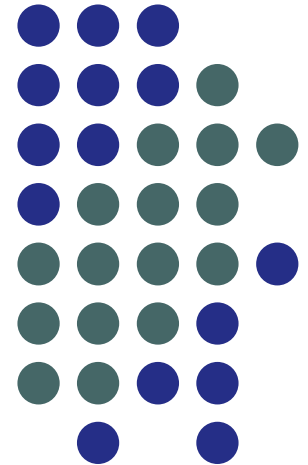


- Algorithm was developed with a finite number of detectors, and as such, dataset might not be a universally representative sample of ODOT system
- Long term testing and validation not conducted due to time constraints
- Investigate different control chart limits as system is deployed
- Develop percent difference datasets for detectors of various technologies and configurations
  - Can allow for tighter control chart limits

# Thank You. Questions/Discussion?

Edward Smaglik – [edward.smaglik@nau.edu](mailto:edward.smaglik@nau.edu)

Full Project Report:  
ODOT SPR837 “Automated Identification of Traffic  
Detector Malfunctions”  
<https://www.oregon.gov/odot/Programs/ResearchDocuments/SPR837DetectorMalfunctionFinalReport.pdf>



# Extra



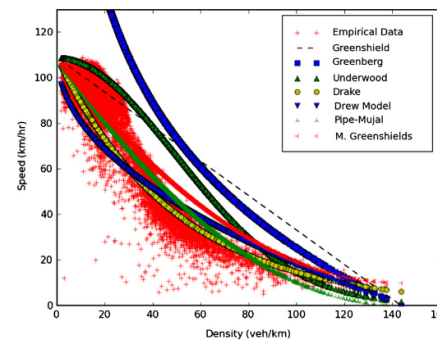
# Literature Review

- Topics Covered

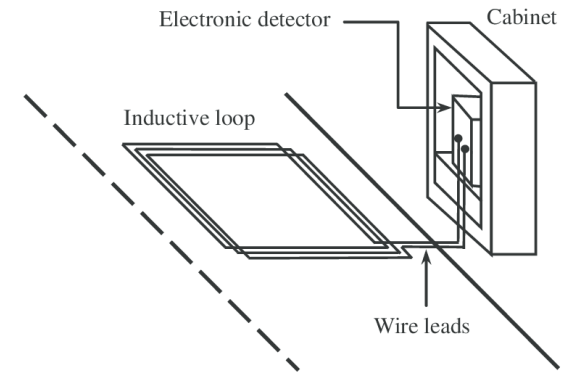
- Detection Technology
- Traffic Flow Theory and Fundamental Diagrams
- Existing processes for monitoring detector health

- Key Points:

- Three methods of monitoring health:
  - Traffic products and software
  - Algorithms / Post Processing
  - On-site monitoring
- One existing project in a related area
- Application of Fundamental Diagrams and headways to detector health untried



Real world Speed-Density plot (Wang et al., 2011)



Wire Inductive Loop Setup (Lamas et al., 2016)



Wavetronix Radar Detection (Huotari, 2015)



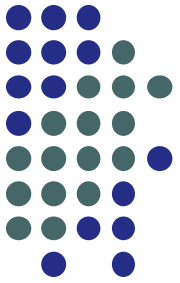
# Site Identification and Verification



- Site verification process
  - Event-based data used to evaluate detector sufficiency
  - For each detector
    - EventID outputs, corresponding:
      - MaxTime Number (1-28)
      - Detector Number(s) (Detector Number(s) or RAD Number)
      - Phase ( $\phi 1-\phi 8$ )
    - Number of "Vehicle Detector On" indications for each green and each non-green interval in a day
      - Repeating "Vehicle Detector On" indications were reported
  - Other items
    - Varying outputs of radar zones
    - Removal of extend / delay on detection zones

Event ID	Name	Description	Parameter Description
1	Phase Begin Green	Set when either solid or flashing green indication has begun.	Phase #
8	Phase Begin Yellow Clearance	Set when phase yellow indication becomes active and clearance timer begins.	Phase #
81	Vehicle Detector Off	Vehicle detector has turned off. Detector on and off events are triggered post any detector delay/extension processing.	Vehicle detector #
82	Vehicle Detector On	Vehicle detector has turned on. Detector on and off events are triggered post any detector delay/extension processing.	Vehicle detector #

# Site Identification



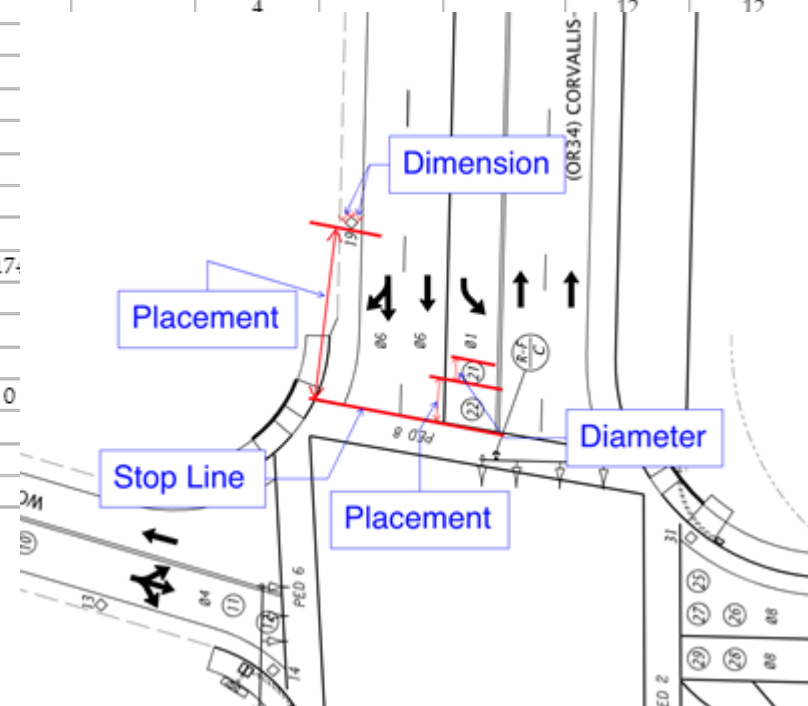
- Rudimentary check of detection performance
  - Are we seeing activations?
  - Do they take the expected shape?
  - Are they within a plausible range?

Number	Site	Location	Added	Deleted	Notes	Reason for Inclusion / Exclusion
1	Technology Loop	Corvallis	June 30	August 13	–	Some loops ground out
2	<b>US101@N22nd</b>	<b>Lincoln City</b>	<b>June 30</b>		<b>Has extend/delay on detectors (removed 8/25)</b>	<b>Has extend/delay on detectors (removed 8/25)</b>
3	<b>OR34@Peoria</b>	<b>Corvallis</b>	<b>June 30</b>		<b>Loops and radar, has extend/delay on detectors (removed 8/24)</b>	<b>Loops and radar, has extend/delay on detectors (removed 8/24)</b>
4	OR212@135th	Happy Valley	July 16	August 4	Replaces OR99W@Tualatin-Sherwood-RD	Too much broken data
5	OR51@16th	Independence	July 16th	August 4	–	Replaces OR34@I-5NBRamp; PreCovid data not available
6	OR99W@OR18	Dundee	June 30	August 4	–	PreCovid data not available; No detector event data
7	<b>OR22@I-5SBOfframp</b>	<b>Salem</b>	<b>July 16</b>		<b>Has extend/delay on detectors (removed 8/24)</b>	<b>Added as an option</b>
8	<b>US20@15th</b>	<b>Corvallis</b>	<b>August 13</b>		<b>Extend/delay on detectors removed.</b>	<b>--</b>
9	<b>OR34@I-5SBRamp</b>	<b>Albany</b>	<b>August 12</b>		<b>Has loops and radar and no stretch or delay time on loops (verified August 17)</b>	<b>--</b>
10	<b>US26@Meinig-Pioneer</b>	<b>Sandy</b>	<b>August 25</b>		<b>Delay/extend removed from detectors</b>	<b>Replaces OR34@I-5NBRamp for something closer to Portland and isn't an on/off ramp</b>
–	OR99W@Tualatin-Sherwood-RD	Sherwood	June 30	July 16	–	--
–	OR34@I-5NBRamp	Albany	August 12	August 19	Has loops and radar and no stretch or delay time on loops (verified August 17)	Removing to replace with oversaturated location

# Log Site Characteristics



Intersection	Urban / Rural	Detector	Technology	Approach	Approach Speed	Location	Distance To Stop Bar (ft)			Size (ft)		Lane Usage and Width		
							1st Det	2nd Det	3rd Det	Length	Width	Left	Thru	Right
OR22 @ I-5	HWY Ramp	1	Loop	EB	50	Advanced	365			6			12	
OR22 @ I-5	HWY Ramp	2	Loop	EB	50	Advanced	365			6			12	
OR22 @ I-5	HWY Ramp	4-6	Loop	EB	50	Advanced	164	168	168	6			12	
OR22 @ I-5	HWY Ramp	7	Loop	SB	45	Advanced	130			6		12		
OR22 @ I-5	HWY Ramp	8	Loop	SB	45	Advanced	129			6		12		
OR22 @ I-5	HWY Ramp	9-10	Loop	SB	45	Advanced	57.5	57.5		6		12		
OR22 @ I-5	HWY Ramp	17-18	Loop	WB	50	Advanced	202.5	202.5		6			12	
OR34 @ I-5	Rural	2	Loop	EB	40	Advanced	377.7			4.0833			12	
OR34 @ I-5	Rural	7	Loop	SB	30	Advanced	128			4				12
OR34 @ I-5	Rural	8	Loop	SB	30	Advanced	130			4				12
OR34 @ I-5	Rural	9	Loop	SB	30	Advanced	132							
OR34 @ I-5	Rural	13	Radar	EB	40	Stop Bar	0							
OR34 @ I-5	Rural	14	Radar	EB	40	Stop Bar	0							
OR34 @ I-5	Rural	23	Radar	SB	30	Stop Bar	12							
OR34 @ I-5	Rural	25	Radar	SB	30	Stop Bar	12							
OR34 @ I-5	Rural	27	Radar	WB	40	Stop Bar	11							
OR34 @ I-5	Rural	28	Radar	WB	40	Stop Bar	11							
OR34 @ Peoria	Rural	3-4	Loop	EB	55	Advanced	174	174						
OR34 @ Peoria	Rural	10	Loop	SB	25	Advanced	70							
OR34 @ Peoria	Rural	16	Loop	WB	55	Advanced	379							
OR34 @ Peoria	Rural	20	Loop	WB	55	Advanced	69							
OR34 @ Peoria	Rural	21-22	Loop	WB	55	Stop Bar	9	0						
OR34 @ Peoria	Rural	23	Loop	NB	45	Advanced	79							
OR34 @ Peoria	Rural	24	Loop	NB	45	Advanced	79							
US20 @ 15th	Rural	1	Loop	EB	45	Advanced	319.8							



# Drone Video Recordings and Video Log Transcription



Site		US20@15th St														
Date		11/20/2020														
Direction		NB														
Video	Vehicle	Time*										Traffic Signal Status**			Comment(s)	
		Arrival	Depart	Calculation								Duration (Decimal) (second)	Red	Yellow		Green
				Arrival (Degree)				Depart (Degree)								
				h	m	s	sss	h	m	s	sss					
NB #17-19	Detector	19														
	1	13:07:02	13:07:03	13	7	2	6	13	7	3	4	0.93	x			
	2	13:07:29	13:07:30	13	7	29	10	13	7	30	27	1.57	x			
	3	13:08:47	13:08:48	13	8	47	23	13	8	48	21	0.93	x			
	4	13:08:59	13:09:00	13	8	59	21	13	9	0	25	1.13	x			
	5	13:10:19	13:10:20	13	10	19	10	13	10	20	12	1.07	x			
	6	13:10:41	13:10:42	13	10	41	7	13	10	42	8	1.03	x			

# Process and Reduce Event Log Data



timestamp	eventID
6:00:09.4	8
6:00:26.4	1
6:01:20.2	8
6:01:37.2	1
6:02:07.6	8
6:02:24.6	1
6:02:36.2	82
6:02:36.9	81
6:02:44.6	8
6:03:07.9	1
6:03:32.7	82
6:03:33.4	81
6:03:33.9	8
6:03:52.9	1
6:04:26.2	82
6:04:26.9	81
6:04:38.8	82
6:04:39.6	81
6:04:54.6	8

## ● Processing and Reduction

Event ID	Name	Description	Parameter Description
1	Phase Begin Green	Set when either solid or flashing green indication has begun.	Phase #
8	Phase Begin Yellow Clearance	Set when phase yellow indication becomes active and clearance timer begins.	Phase #
81	Vehicle Detector Off	Vehicle detector has turned off. Detector on and off events are triggered post any detector delay/extension processing.	Vehicle detector #
82	Vehicle Detector On	Vehicle detector has turned on. Detector on and off events are triggered post any detector delay/extension processing.	Vehicle detector #

- Number of Activations
- Detector On Duration
- Cycle Duration
- Occupancy = Detector On Duration / Cycle Duration

# Detector Validation



- Compare drone video logs to event logs
  - Detector On Duration
    - Compare means of each distribution

Detector On Duration: t-Test: Paired Two Sample for Means			Detector Indication (minutes:seconds.00)				Detector On Duration	
			Video Log		Event Log		Video Log	Event Log
	Variable 1	Variable 2	On	Off	On	Off	= Off - On	= Off - On
			43:29.67	43:31.13	43:30.10	43:31.70	0:00:01.46	0:00:01.60
Mean	8.025	8.325	43:32.13	43:33.27	43:32.60	43:33.80	0:00:01.14	0:00:01.20
Variance	17.0071	17.70916667	43:37.80	43:38.67	43:38.20	43:39.10	0:00:00.87	0:00:00.90
Observations	4	4	43:44.37	43:44.90	43:44.90	43:45.40	0:00:00.53	0:00:00.50
Pearson Correlation	0.969743814		43:46.53	43:47.10	43:47.00	43:47.60	0:00:00.57	0:00:00.60
Hypothesized Mean Difference	0		43:59.33	43:59.90	43:59.70	44:00.40	0:00:00.57	0:00:00.70
df	3		44:07.23	44:08.40	44:07.80	44:09.00	0:00:01.17	0:00:01.20
t Stat	-0.583524346		44:12.43	45:24.77	44:12.90	45:25.40	0:01:12.34	0:01:12.50
P(T<=t) one-tail	0.300256457		45:28.30	45:29.60	45:28.80	45:30.30	0:00:01.30	0:00:01.50
t Critical one-tail	2.353363435		45:31.00	45:32.23	45:31.70	45:32.80	0:00:01.23	0:00:01.10
P(T<=t) two-tail	0.600512915		45:34.87	45:36.03	45:35.50	45:36.70	0:00:01.16	0:00:01.20
t Critical two-tail	3.182446305		45:47.63	45:47.93	45:48.20	45:48.50	0:00:00.30	0:00:00.30

- Number of activations

$$\frac{\text{Total Observation Event Log Activations} - \text{Total Observation Video Log Activations}}{\text{Total Observation Video Log Observations}}$$

# Detector Validation



- If either test is out of range, do not use detector for algorithm development
  - Activations, within 10%
  - Detector On Duration, statistically significant difference

Det	Activations			Detector On Duration Mean			Usable?
	Manual	Event Log	Difference	Manual	Event Log	Difference	
1	100	95	-5*	00:00.3	00:00.4	00:00.0	Y
2	105	103	-2	00:00.3	00:00.4	00:00.0	Y
3	72	72	0	00:00.3	00:00.3	00:00.05**	N
4-6	100	90	-10	00:00.4	00:00.5	00:00.1	Y
7	58	58	0	00:03.7	00:03.7	00:00.0	Y
8	75	75	0	00:02.4	00:02.6	00:00.2	Y
9-10	103	98	-5	00:03.8	00:04.9	00:01.1	Y
11-12	59	76	17*	00:09.4	00:08.0	-00:01.40	N
13-14	78	59	-19*	00:07.8	00:09.3	00:01.6	N
15	100	48	-52*	00:00.2	00:00.6	00:00.34**	N
16	100	58	-42*	00:00.3	00:00.9	00:00.59**	N
17-18	100	93	-7	00:01.0	00:01.0	00:00.1	Y

\* indicates a difference of >10% between the Manually reported and Event Log activations

\*\* indicates Significant Difference in the Detector On Durations as reported by the t-Test

# Detector Verification Outcome Overview



Usable Detectors from Each Study Intersection

Intersection	Det#	MT#		Lanes	Location	Intersection	Det#		MT#	Lanes	Location
OR22 at I-5	1	2	Loop	1	Advanced	US20 at 15 <sup>th</sup>	1	Loop	2	1	Advanced
	2	3		1	Advanced		2		3	1	Advanced
	4-6	5		3	Advanced		3		15	1	Advanced
	7	8		1	Advanced		4-5		27	1	Stop Bar
	8	9		1	Advanced		8		8	1	Advanced
	9-10	10		2	Advanced		9-10		9	1	Stop Bar
	17-18	18		2	Advanced		13		1	1	Advanced
OR34 at I-5	2	2	Loop	1	Advanced	US26 at Meinig	4	Loop	8	1	Advanced
	7	8		1	Advanced		5-6		9	1	Stop Bar
	8	9		1	Advanced		7		21	1	Advanced
	9	12		1	Advanced		US101 at 22 <sup>nd</sup>		3-4	Loop	4
	13	13	1	Stop Bar	5-6	5		1	Stop Bar		
	14	14	1	Stop Bar	7	15		1	Advanced		
	23	23	1	Stop Bar	8-9	27		1	Stop Bar		
	25	25	1	Stop Bar	17-18	18		1	Stop Bar		
	27	27	1	Stop Bar	19-20	19	1	Stop Bar			
28	28	1	Stop Bar	21	1	1	Advanced				
OR34 at Peoria	3-4	6	Loop	2	Advanced	24	22	1	Advanced		
	10	7		1	Advanced	25-26	23	1	Stop Bar		
	16	17		1	Advanced						
	20	1		1	Advanced						
	21-22	13		1	Stop Bar						
	23	22		1	Advanced						
	24	23		1	Advanced						

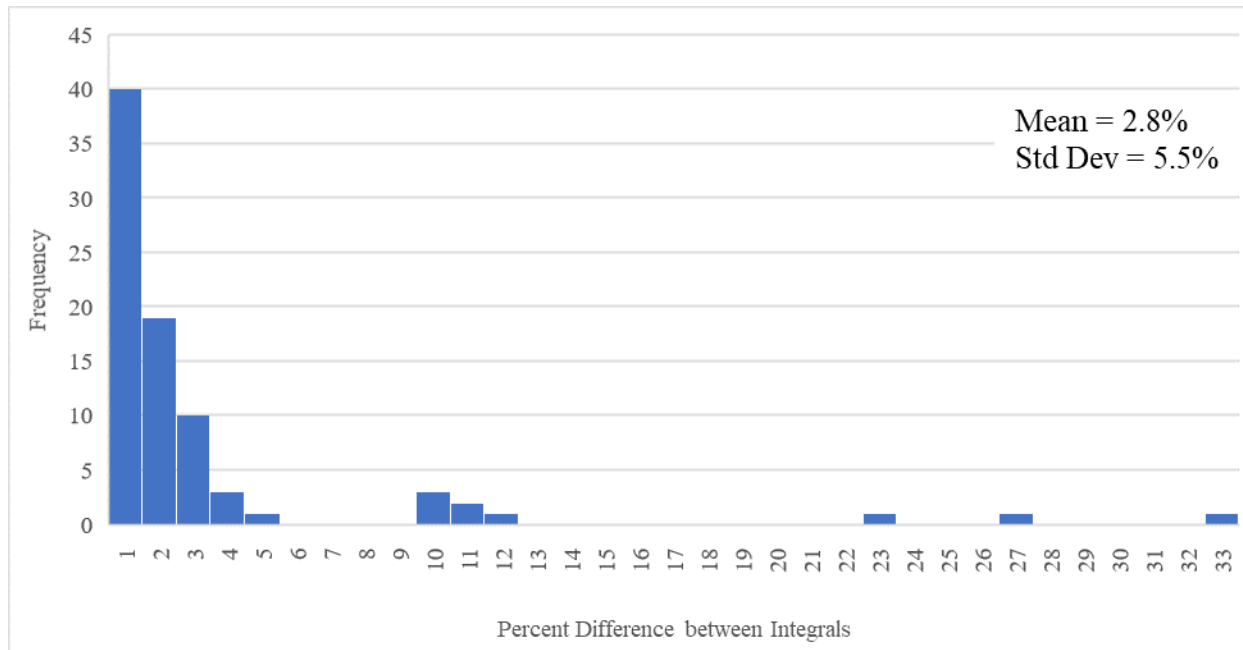
- 79 detection zones underwent comparative analysis (70 inductive loop and 9 radar).
- 39 inductive loop and 6 radar zones passed the analysis



# Develop Performance Datasets for Algorithm Comparisons



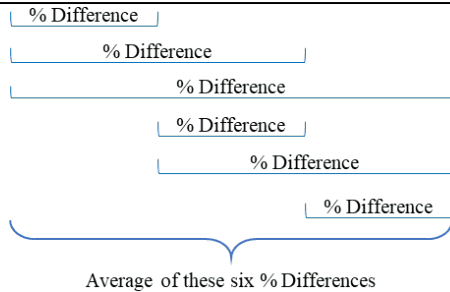
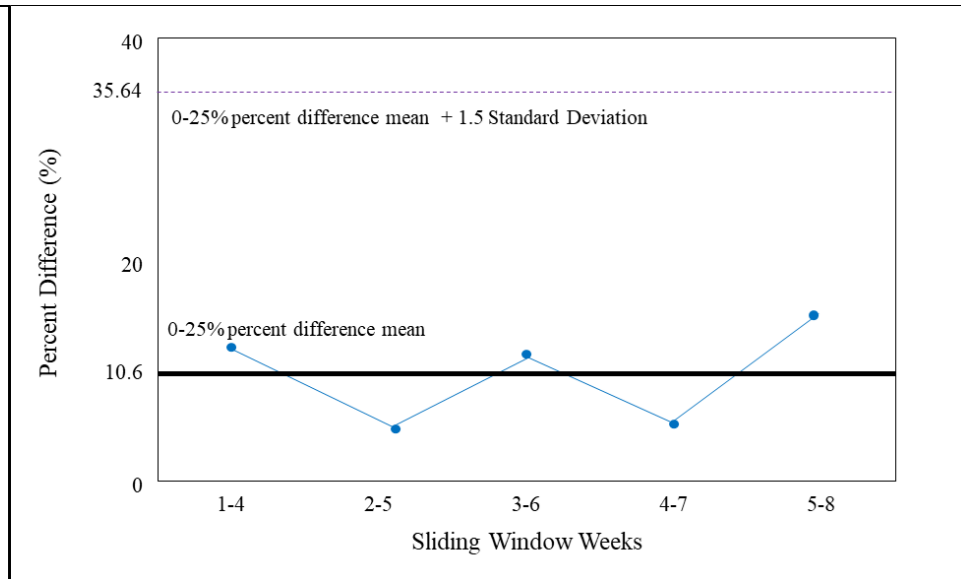
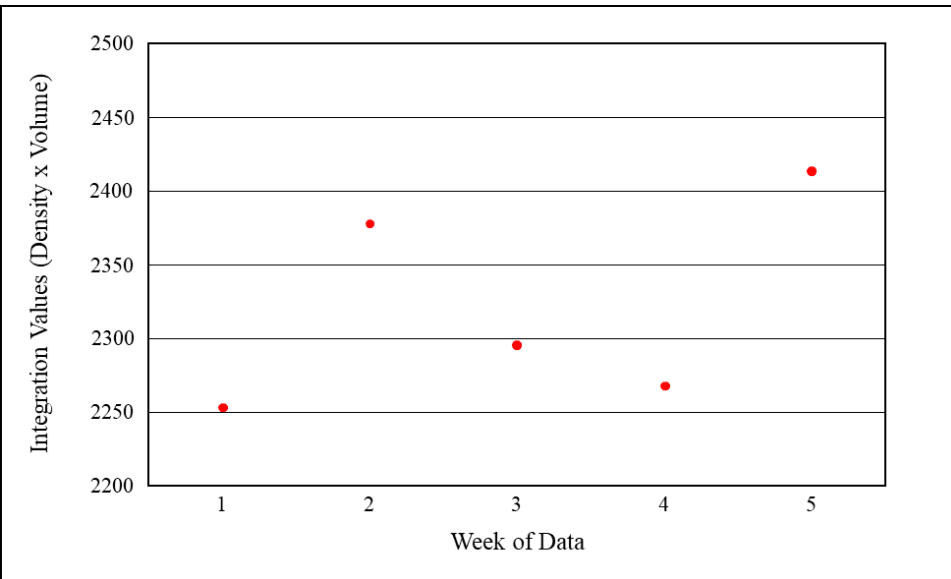
- Predicted Performance Dataset (EPD)
  - Similar process to EPD development
  - Integrated to 25% of Vertex



# Health Assessment Over Time



- Sliding Window Technique and Control Chart
- Mean + 1.5 Std Dev from EPD



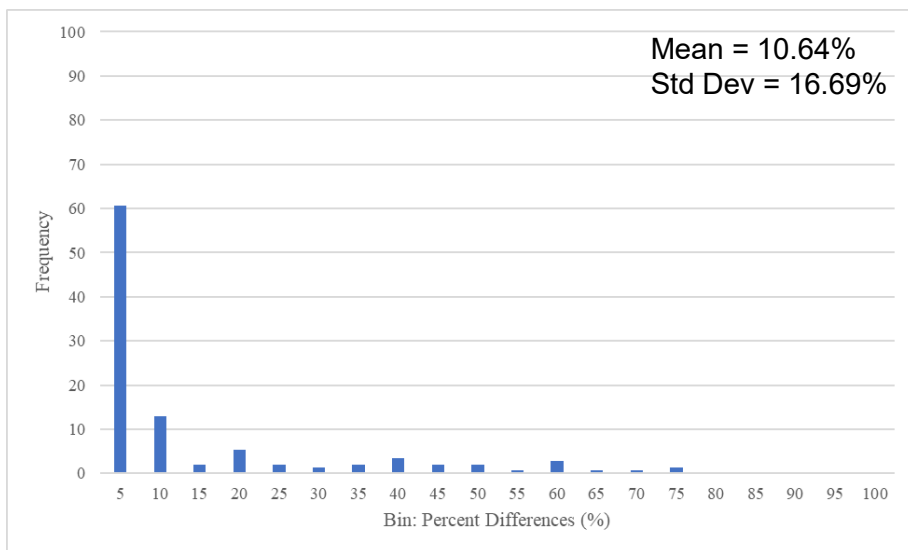
	25%	50%	75%	100%
<b>Mean</b>	10.64	13.51	24.54	142.55
<b>Std Dev</b>	16.69	24.81	36.36	386.77

# Performance Dataset Verification

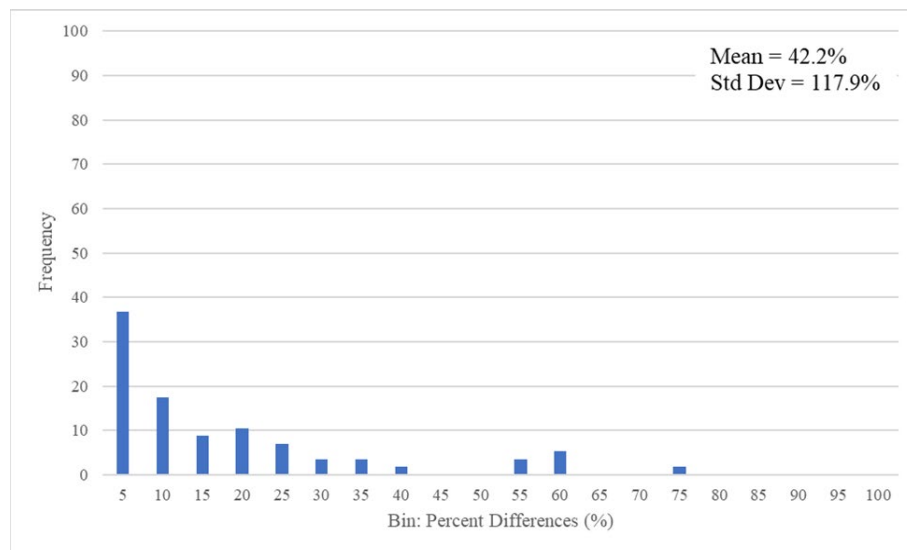


## Verification

- Compare validated detectors with underperforming detectors from Task 6



Validated Detectors



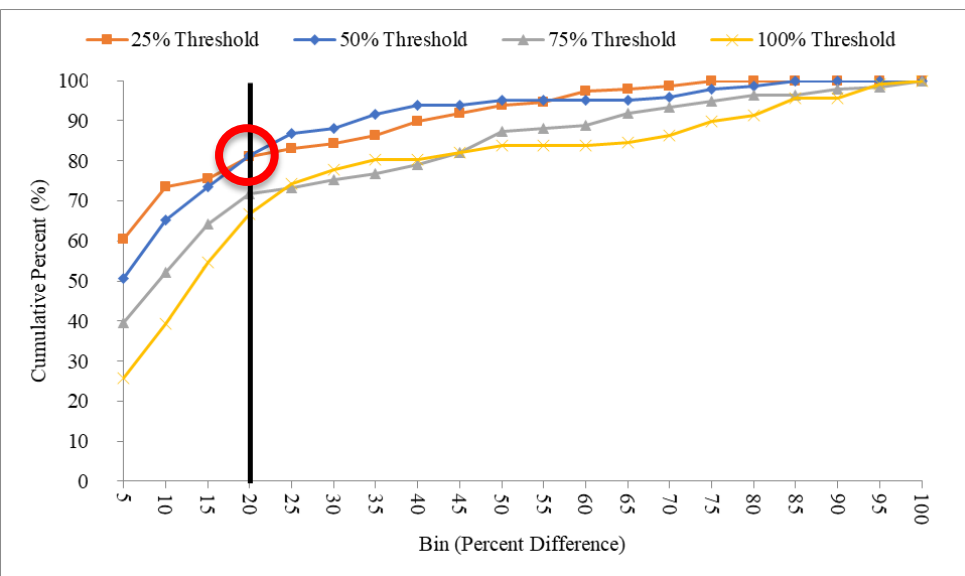
Underperforming Detectors

# Performance Dataset Verification

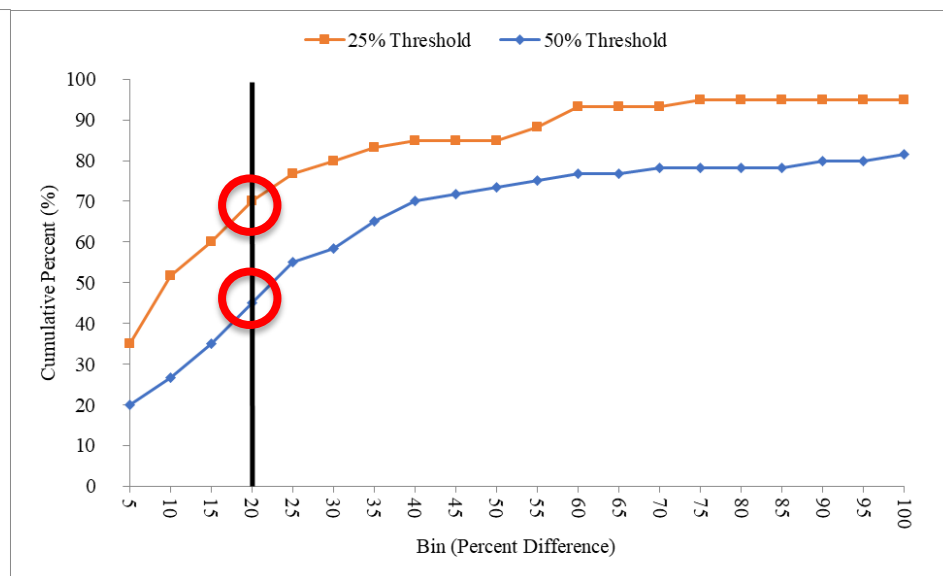


## Verification

- Compare validated detectors with underperforming detectors from Task 6



Validated Detectors



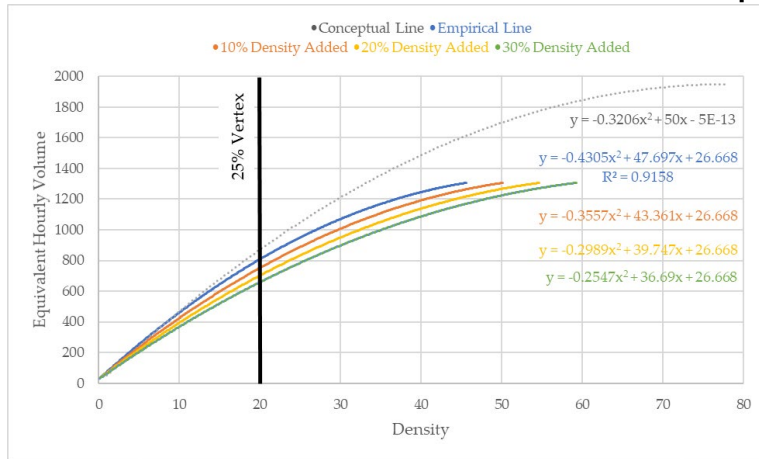
Underperforming Detectors

# Performance Dataset Verification

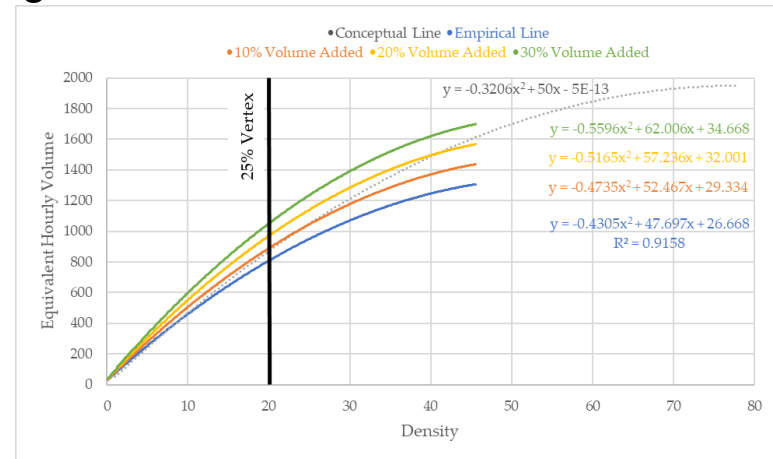


## Verification

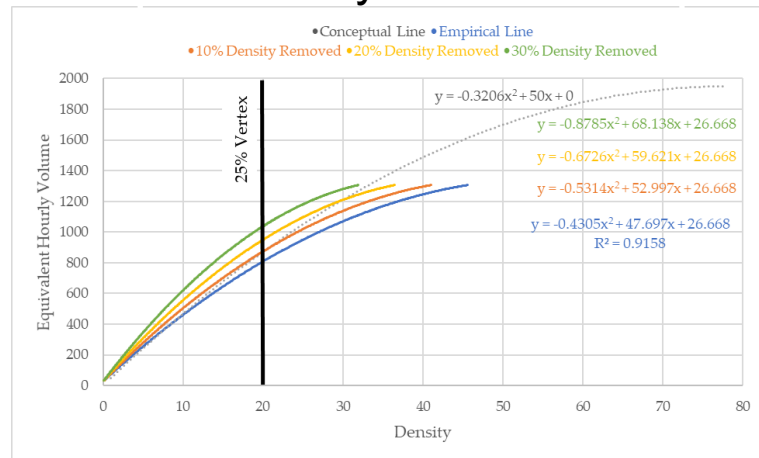
- Increase / Decrease volume and density values by 10%, 20%, and 30% and compare integral differences



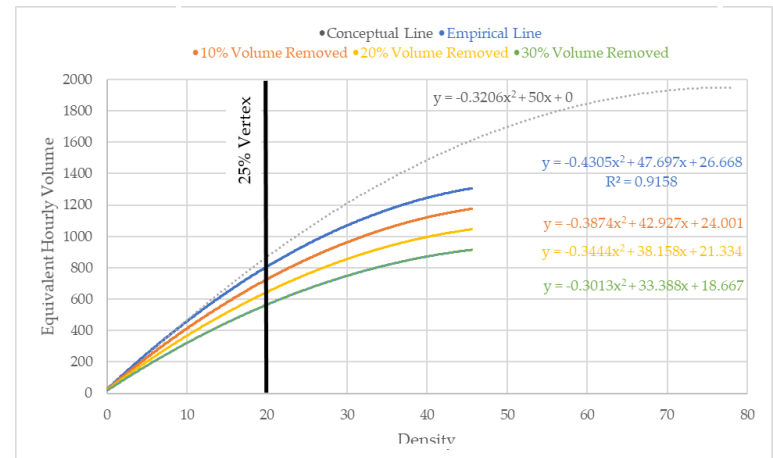
Density Increased



Volume Increased



Density Decreased



Volume Decreased

# Performance Dataset Verification

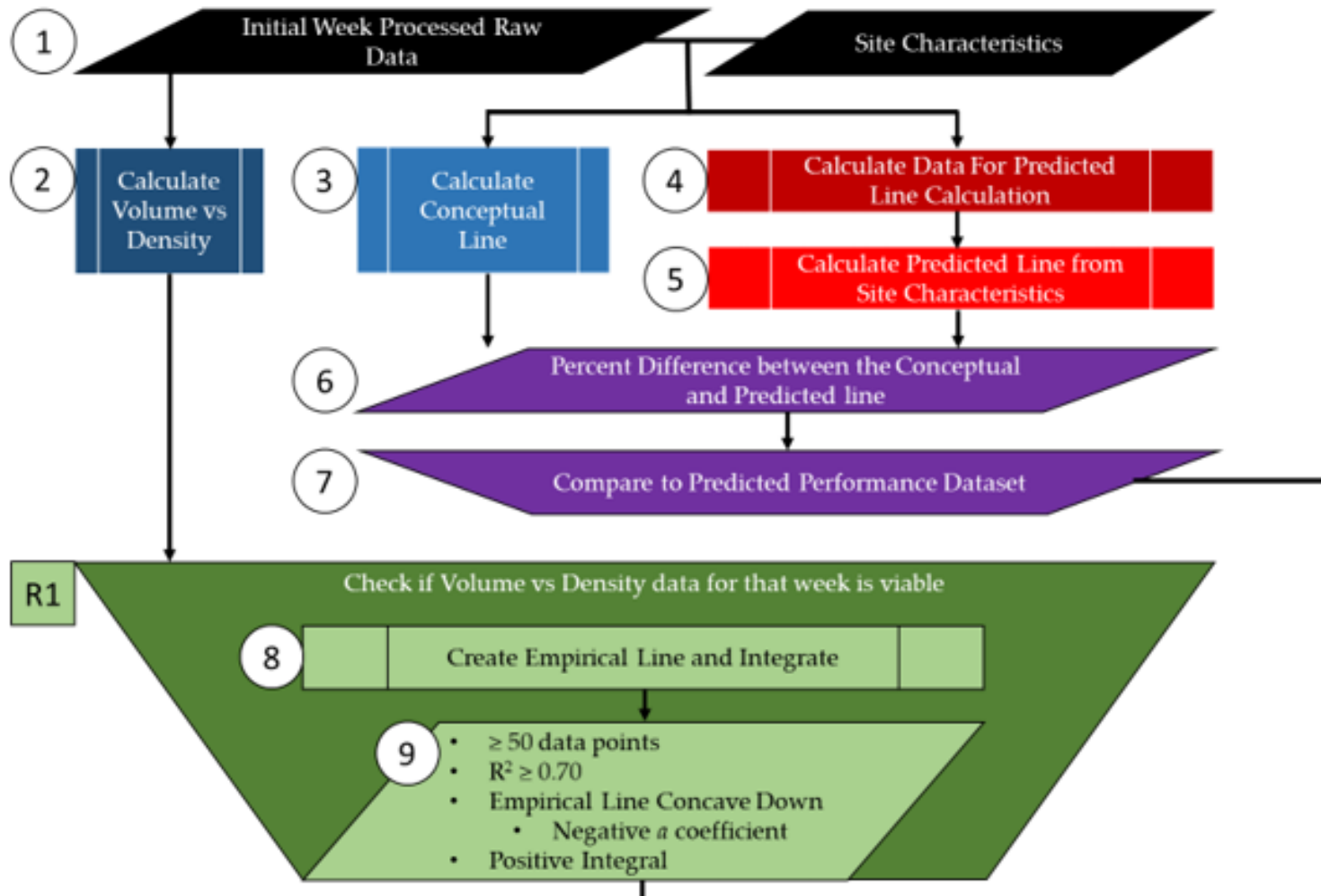


## Verification

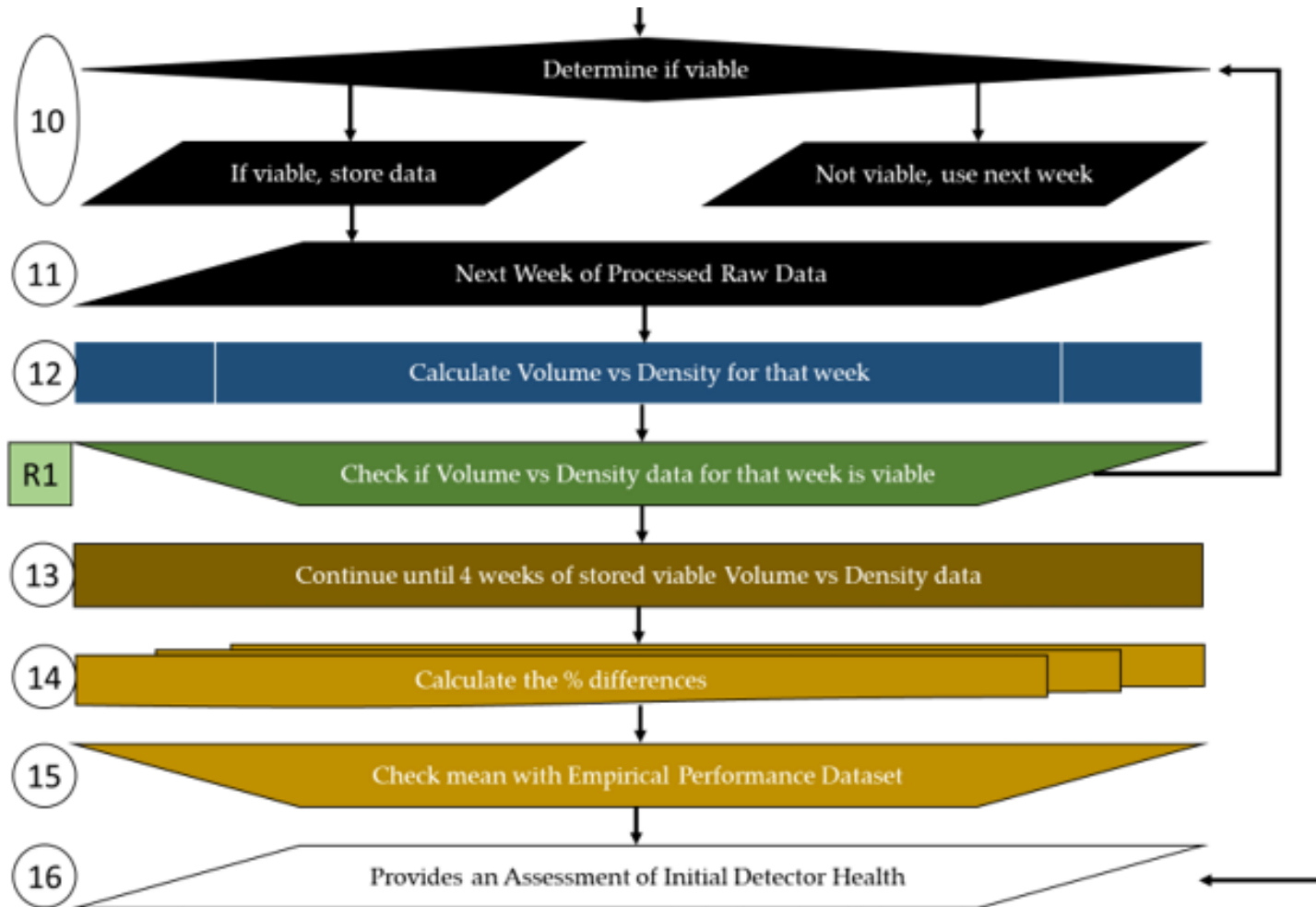
- Mean and Std Dev of the percent differences between empirical and conceptual lines for healthy detectors is 10.64% and 16.69% respectively
- Using 1.5 Std Dev from the mean, threshold of 35.68% difference indicates this may not be sensitive enough to identify most malfunctions (note this is just one detector compared)

% Difference from Conceptual Integral (Conceptual - x) / Conceptual Integral from 0 to 25% of Conceptual Vertex		
Empirical		2.2%
Density Added	10% Added	9.5%
	20% Added	15.8%
	30% Added	21.2%
Volume Added	10% Added	7.6%
	20% Added	17.4%
	30% Added	27.2%
Density Removed	10% Removed	6.5%
	20% Removed	17.0%
	30% Removed	29.7%
Volume Removed	10% Removed	12.0%
	20% Removed	21.7%
	30% Removed	31.5%

# Initial Detector Health Assessment

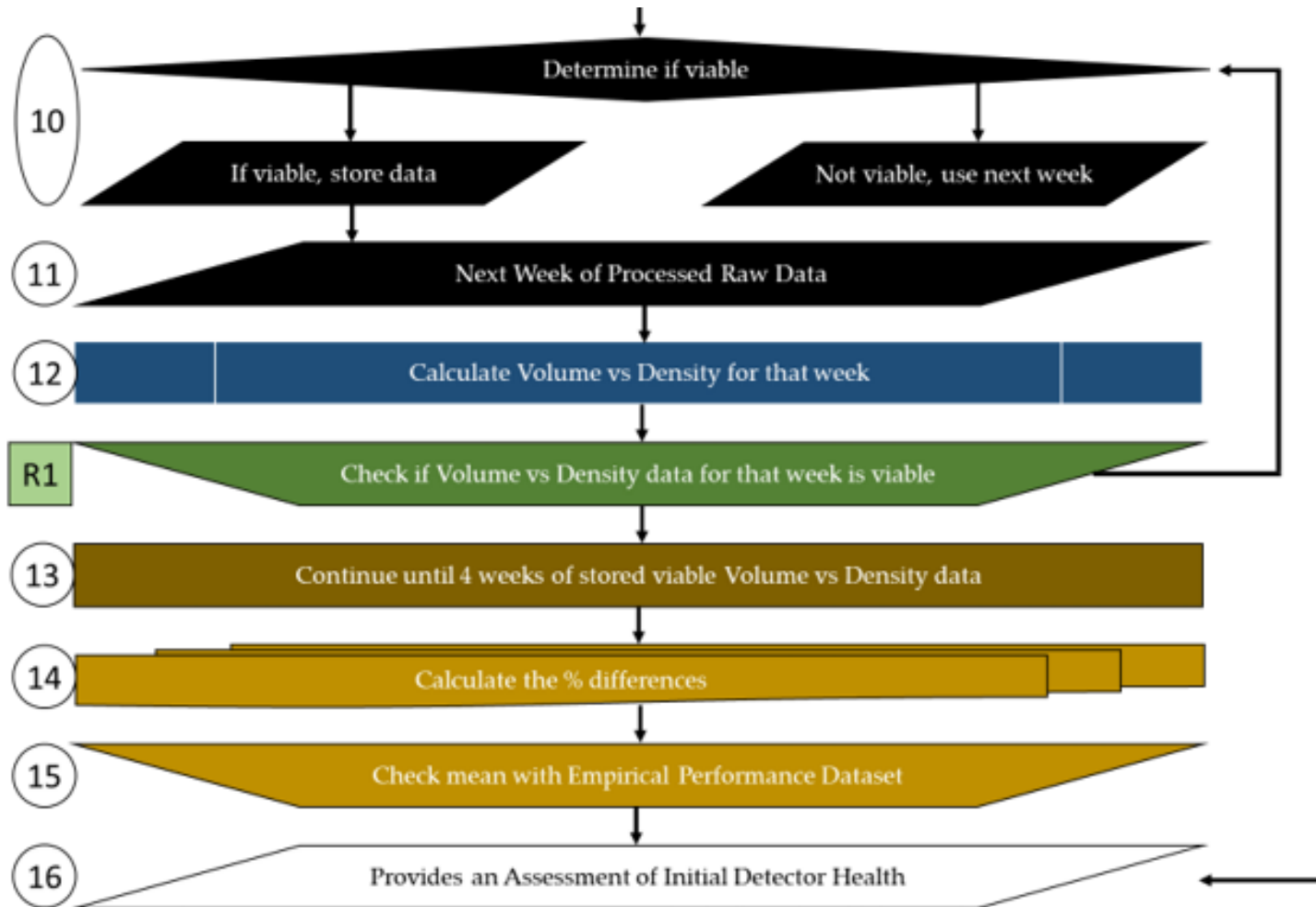


# Initial Detector Health Assessment





# Initial Detector Health Assessment



# Health Assessment Over Time

