Item #4

# Initial analysis of AirSage O-D cellular data for the TPB modeled area

Presentation to the Travel Forecasting Subcommittee July 18, 2014

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# Exogenous travel demand inputs were reviewed with the TFS in March

- These are special demand markets that are not modeled but rather are prepared as model inputs
- The existing exogenous markets include:
  - External and through trips (autos, trucks)
  - Visitor/tourist, taxi and school trips (auto driver)
  - Airport passenger trips (auto driver)

About 12% of the regional trips loaded to network



# Issues identified

Surveys associated with exogenous travel are:

- Difficult to conduct regularly
- Expensive
- Prone to low response rates
- Much of the observed data supporting exogenous travel markets are dated:
  - The last auto external roadside survey: 1994
  - The last visitor/tourist, taxi, school surveys: 1968



# A considered solution: AirSage (AS)

- Atlanta based software development and applications firm
- Has refined the technology for converting cellular data from cell phones, tablets, and other devices into aggregate O-D flows
- Has exclusive agreement with major cellular providers to access signal data from mobile devices
- Hold 2 patents for converting cellular data into O/D data

# TPB staff aggressively pursued this opportunity during June



### AirSage Technology

- AirSage's Wireless Signal Extraction (WiSE) extracts data from wireless carrier networks in real time
- The signal data stream is securely captured; anonymity is ensured
- Includes access to over 100 million mobile devices
- Multiple stages of analysis are performed to monitor the location and movement of the mobile devices
- The analysis results in a highly sampled archive of O/D movements throughout the U.S.

The data is increasingly being used for planning and marketing purposes



### AS Methodology: Five Steps

- 1. Device location processing: Time stamped locations coordinates from devices are continuously accessed and recorded. Trip movements identified by time & distance criteria.
  - Trip O-Ds must be at least 1.2-1.5 km (0.75-0.93 miles) in distance
  - If device movement stops for 5+ minutes, a destination is assumed
- 2. Activity pattern analysis/point generation: Assumed home and work locations are imputed based on 4 to 6 weeks of recorded data. Statistical *clustering* algorithms are used to identify home, work and intermediate stop locations.
  - Home location: where mobile user clusters between 9PM-6AM
  - Work location: where mobile user clusters between 9AM-5PM
  - "Trip Legs" are formulated around home & work locations to arrive at a daily trip pattern



## AS Methodology: Five steps (cont'd)

- 3. Population Synthesis: Trip movements from the observed sample devices are expanded based on the ratio of observed devices to the 2010 Census population at the *Census tract level*
- 4. Trip Analysis: Trips are distinguished by traveler type, trip purpose, time of day and day of week
- 5. Data Aggregation and Packaging: Trip O/Ds are summarized by geography, typically zip codes or TAZs



# O-D matrix features

- □ Geography
- □ Time frame (selected days, weeks, months, year)
- Resident class (resident vs. visitor)
- Trip purpose
- Time of day
- Day of week
- External analysis
  - the use of "external shed" areas to study external and through trips



# TPB staff developments in June

- TPB staff engaged AirSage in a series of teleconferences
- TPB staff's data needs were articulated
- AirSage data product options were discussed
- Staff contacted previous AS data users in others areas
- Contract terms were negotiated
- Sole source purchase justification was drawn up
- □ A final cost figure was negotiated (\$200K)
- Data product was delivered on June 28



# AirSage data applications

- Immediate purpose:
  - To examine external and through trip patterns
  - To examine visitor/tourist trip patterns
- Additional uses
  - Special generator analysis of various locations
  - Checks on the regional model



## Specifications of AirSage data purchase

Parameter	Specification	Notes / Details
# Zones	3722	Zone level
Month(s) Analyzed	1	April 2014 (a representative month)
External TAZs included	Yes	External areas to be included
Day of Week Type	Avg. Weekdays	Tuesday, Wednesday, Thursday only
Time of Day Periods	Early AM / 12mid -6AM	Time periods consistent with model conventions
	AM Peak/ 6-9AM	
	Midday/ 9AM- 3PM	
	PM Peak / 3PM-7PM	
	Night/ 7PM-12mid	



# Specifications, continued

Parameter	Specification	Notes / Details
Trip Purpose Attributes	9	H-W, H-O, H-H, W-H, W-O, W-W, O-H, O-W, O-O
<b>Resident Class Attributes</b>	6	Resident Worker – Resident that works in study area
		Home Worker – Resident, similar day/night clusters
		Inbound Commuter- Non-Resident, works inside study area
		Outbound Commuter – Resident, works outside study area
		Short Term Visitor – Non-resident, in area 2 weeks or less
		Long Term Visitor- Non-resident, in area > 2 weeks

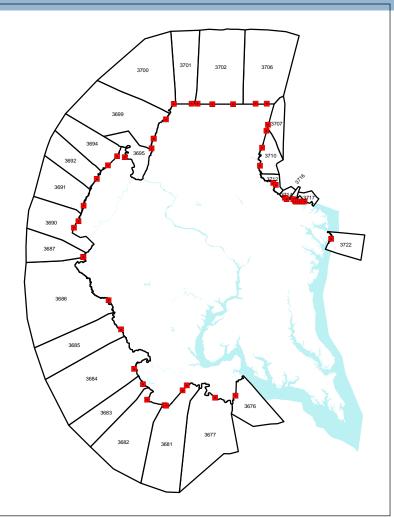


# Level of AirSage O/D geography:

- Internal geography Existing internal TAZs of the 3722 TAZ system (3675 TAZs)
- External geography- AirSage requires external stations to be expressed as external TAZs or "capture areas".
  - TPB staff developed 26 external TAZs
    - Developed around the existing 47 external stations
    - Numbered 3676 to 3722 (with gaps)



## External TAZ Sheds used in AS analysis



- Devices moving outside of the study area are "detected" in these external sheds so that E-I, I-E and E-E trips are developed
- AirSage detects E-E trip movements that are irrelevant to the TPB study area, such as:
  - Trips within external sheds
  - E-E trips that likely do not pass through the modeled region
- These types of trips must be removed

### Cell phone movements vs. modeled trips

- We assume AS trips are equivalent to person trips in any mode (walk, bike, autos, trucks, buses, rail, skateboard,...)
- AS trips may not be "linked" as they would be for modeling
- AS flows are not distinguished by vehicle class
- AS flows are not distinguished by mode
- O/D locations are *inferred* based on statistical location clusters of device, not *reported* purposes
- Some trips will not be germane to the scale of regional travel model (dog-walking around the neighborhood, for example)

Direct comparisons with modeled outputs will therefore likely be a challenge.



# Data delivered: Two text files

#### Daily File

- Total O/D records:
- Initial weighted trips:
- Final weighted trips:
- 4,695,825 23,075,600 ("raw" file total) 21,304,800 (irrelevant E-E trips removed)

#### Period File

Total O/D records: 6,710,419
Total weighted trips: 23,075,500

#### Variables:

O-Zone/ D-Zone/ Start date/ End date, Aggregation Code/ Subscriber class/ Trip purpose/ Time of Day/ Count



#### Cross-tabulations of AirSage Trips are under examination

Observations:

- 86% of I-I trips made by internal residents working in the region or working at home (reasonable)
- 6% of all I-I travel made by long-term visitors (reasonable)
- 28% of I-I trips are HBW trips (appears too high)

Veighted Trips by Subscriber Class and Movement Type						
Res_Work:	13,001,829	71,342	69,061	190	13,142,42	
Hom_Work:	5,239,680	52,880	51,920	126	5,344,60	
Inb_Comm:	17,778	32,485	33,006	456	83,72	
Oub_Comm:	860,869	61,138	59,663	355	982,02	
Sht_Visi:	246,696	99,292	100,731	16,247	462,96	
Lng_Visi:	1,205,325	41,568	39,648	2,555	1,289,09	
SUM	20,572,177	358,705	354,029	19,929	21,304,84	
Weighted Tri	ps by Purpo	se and Mo	ovement Ty	уре		
Weighted Tri	ps by Purpo I-I	se and Mo I-E	ovement Ty E-I	ype E-E	Total	
Weighted Tri H_H:		I-E	E-I	E-E	Total 3,889,35	
	1-1	I-E 5,050	E-I 4,875	E-E 11	3,889,35	
H_H:	I-I 3,879,416	I-E 5,050 92,662	E-I 4,875 57,847	E-E 11 2,204	3,889,35 3,234,86	
H_H: H_O:	I-I 3,879,416 3,082,152	I-E 5,050 92,662 43,514	E-I 4,875 57,847	E-E 11 2,204	3,889,35 3,234,86	
H_H: H_O: H_W:	I-I 3,879,416 3,082,152 3,086,652	I-E 5,050 92,662 43,514 537	E-I 4,875 57,847 26,368 483	E-E 11 2,204 1,641	3,889,35 3,234,86 3,158,17 424,61	
H_H: H_O: H_W: W_W:	I-I 3,879,416 3,082,152 3,086,652 423,593	I-E 5,050 92,662 43,514 537 21,975	E-I 4,875 57,847 26,368 483 37,736	E-E 11 2,204 1,641 0	3,889,35 3,234,86 3,158,17 424,61	
H_H: H_O: H_W: W_W: W_H:	I-I 3,879,416 3,082,152 3,086,652 423,593 2,584,718	I-E 5,050 92,662 43,514 537 21,975 17,025	E-I 4,875 57,847 26,368 483 37,736 10,973	E-E 11 2,204 1,641 0 1,453	3,889,35 3,234,86 3,158,17 424,61 2,645,88 821,76	
H_H: H_O: H_W: W_W: W_H: W_O:	I-I 3,879,416 3,082,152 3,086,652 423,593 2,584,718 793,376	I-E 5,050 92,662 43,514 537 21,975 17,025 113,196	E-I 4,875 57,847 26,368 483 37,736 10,973	E-E 11 2,204 1,641 0 1,453 392 11,727	3,889,35 3,234,86 3,158,17 424,61 2,645,88 821,76 3,147,58	
H_H: H_O: H_W: W_W: W_H: W_O: O_O:	I-I 3,879,416 3,082,152 3,086,652 423,593 2,584,718 793,376 2,915,326	I-E 5,050 92,662 43,514 537 21,975 17,025 113,196	E-I 4,875 57,847 26,368 483 37,736 10,973 107,333	E-E 11 2,204 1,641 0 1,453 392 11,727	3,889,35 3,234,86 3,158,17 424,61 2,645,88 821,76 3,147,58 3,624,95	
H_H: H_O: H_W: W_W: W_H: W_O: O_O: O_H:	I-I 3,879,416 3,082,152 3,086,652 423,593 2,584,718 793,376 2,915,326 3,462,345	I-E 5,050 92,662 43,514 537 21,975 17,025 113,196 58,531	E-I 4,875 57,847 26,368 483 37,736 10,973 107,333 101,810	E-E 11 2,204 1,641 0 1,453 392 11,727 2,266	3,889,35 3,234,86 3,158,17 424,61 2,645,88 821,76 3,147,58	

## Initial comparison with regional model

Comparison of trips by movement type: AirSage vs. TPB Modeled Person Trips

(Modeled trips include motorized and non-motorized modes)

	Internal	External	Through	Total
2014 AirSage Trips	20,572,177	712,734	19,929	21,304,840
2015 TPB Modeled Person Trips	21,601,746	1,434,969	45,321	23,082,036
Ratio: AirSage to TPB Model	0.95	0.50	0.44	0.92

Comparison of trip purpose distribution: AirSage vs. TPB Modeled Person Trips (Internal / motorized and non-motorized)

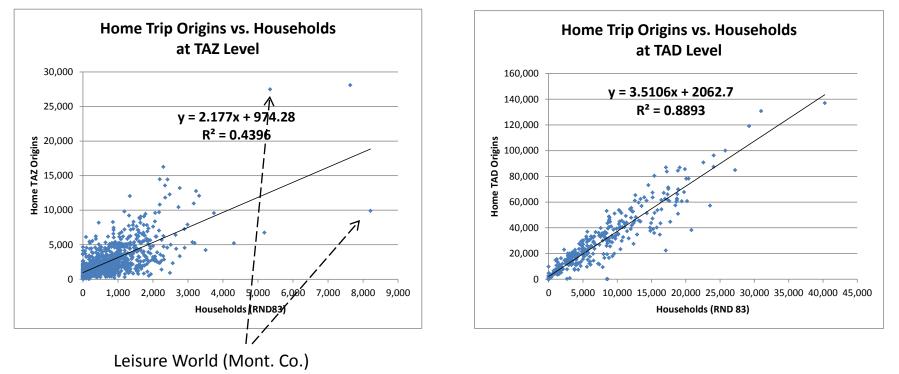
	AirSage	TPB Model
HBW	27.6%	19.2%
HBS/O	50.7%	53.7%
NHW	7.6%	10.0%
NHO	14.2%	17.2%
All	100.0%	100.0%



# Correlation between AS "home" trip origins and Round 8.3 HHs

**District** Level of Analysis

**Zone** Level of Analysis



Observation: Location "noise" in the travel data is reduced at higher levels of aggregation

# Correlation between AS "work" trip origins and Round 8.3 jobs

**Zone** Level of Analysis **District** Level of Analysis Work Trip Origins vs. Jobs Work Trip Origins vs. Jobs at TAD Level at TAZ Level 70,000 30,000 y = 0.4926x + 487.93 $R^2 = 0.5135$ 60,000 25,000 y = 0.7205x + 1986.2 $R^2 = 0.8603$ 50,000 Xork TAZ Origins 15,000 10,000 Work TAD Origins 40,000 30,000 20,000 5,000 10.000 ∕∖ 10,000 20,000 30,000 40,000 50,000 60,000 70,000 80,000 90,000 10,000 20,000 3**0**,000 40,000 50,000 60,000 0 Jobs/(RND 83) Jobs (RND 83) Washington Hospital Center (DC) Fort Meade (Anne Arundel Co.)

#### **Crossings at External Stations**

#### Initial analysis of AS trips with highway person counts

AirSage			AirSage Trips	Vehicle counts	(assuming 1.3	Difference	Ratio
Station	Facility (or Facilities)	TPBTAZ	(a)	(2012)	auto occ.)	(a - c)	(a / c)
3676	VA 3	3676	17,539	5,000	6,500	11,039	2.70
3677	US 301	3677	12,457	11,000	14,300	-1,843	0.87
3681	US 17, VA 2, I-95, and US 1	3678-3681	65,169	104,600	135,980	-70,811	0.48
3682	VA 208/606	3682	21,134	3,500	4,550	16,584	4.64
3683	VA 612	3683	6,350	3,500	4,550	1,800	1.40
3684	VA 3	3684	36,217	23,400	30,420	5,797	1.19
3685	US 15/29	3685	32,601	26,600	34,580	-1,979	0.94
3686	US 211	3686	14,444	16,000	20,800	-6,356	0.69
3687	I-66 and VA 55	3687-3688	24,395	38,500	50,050	-25,655	0.49
3690	US 340 and US 17/50	3689-3690	22,247	28,400	36,920	-14,673	0.60
3691	VA 7	3691	28,556	26,500	34,450	-5,894	0.83
3692	WVA 51	3692	993	8,500	11,050	-10,057	0.09
3694	WVA 9 and WVA 45	3693-3694	59	26,800	34,840	-34,781	0.00
3695	WVA 480 (MD 34)	3695	6,804	5,800	7,540	-736	0.90
3699	US 40 (Alt), I-70, US 40, and MD 77	3696-3699	855	85,400	111,020	-110,165	0.01
3700	MD 550	3700	11,913	2,000	2,600	9,313	4.58
3701	PA 16/MD 140	3701	7,292	8,700	11,310	-4,018	0.64
3702	US 15, MD 194, and MD 97	3702-3704	28,972	35,100	45,630	-16,658	0.63
3706	MD 30 and MD 86	3705-3706	37,523	18,800	24,440	13,083	1.54
3707	MD 88/833	3707	9,956	4,400	5,720	4,236	1.74
3710	MD 30, MD 140 /91, and MD 26	3708-3710	86,066	95,000	123,500	-37,434	0.70
3712	I-70 East and US 40 East/MD144	3711-3712	66,211	157,300	204,490	-138,279	0.32
3714	I-95 and US 1/I-195	3713-3714	92,689	274,600	356,980	-264,291	0.26
3716	MD-295 /BWPkwy and MD 170	3715-3716	52,356	112,800	146,640	-94,284	0.36
3717	MD 648, MD 3/I-97, MD 2, and MD 710	3717-3721	30,006	263,700	342,810	-312,804	0.09
3722	US 50/301	3722	39,783	73,400	95,420	-55,637	0.42
			752,585	1,459,300	1,897,090	-1,144,505	0.40

#### Potomac River Crossings Initial analysis of AS trips with highway/Metrorail person trips

(a)	2014 AirSage Person Trips		1,817,100	
(b)	2013 Highway Person& 2012 Me	trorail Trips	1,507,870	
(a) - (b)			309,230	
(a)/(b)			1.21	
2013 Grou	nd Counts: on bridges (MD 340 to M	D 301): 973,900		
2013 Comp	outed hwy. psn. trips (1.30 avg. occ. A	ssumed):		1,266,070
Metrorail t	rips from the 2012 Metrorail Survey	:		241,800
2012/2013	Total Highway Metrorail Person Tri	ps Counts:		1,507,870

Note: AirSage data likely includes bike/walk trips and commuter rail trips that are not accounted for in the above comparison.

# What's next?

- Analysis of AirSage data is underway and is being investigated as a basis for updating exogenous trip inputs
- Direct comparisons with modeled data are problematic, given that AirSage trips reflect cellular movements, not linked trips
- There is clearly geographic noise associated with AirSage data at the TAZ level based on a comparison of trip origins and land activity
- Initial analysis indicates some inconsistencies between AirSage trips and observed data.
  - AirSage person trips at the external cordon are **lower** than the traffic counts would suggest.
  - AirSage person trips crossing the Potomac River are higher than the observed highway and transit counts would suggest
- Staff will convey these findings to AirSage for their input
- Staff analysis will continue

