1	Large Scale Intelligent Transportation System Traffic Detector Data Archiving
2	
3	
4	
5 6 7	Tao Qu, Graduate Research Assistant, Department of Civil and Environment Engineering, University of Wisconsin-Madison 1415 Engineering Drive, Room 1241, Madison, WI, 53706
8 9	Phone number: (608)609-3375, E-Mail: <u>tqu3@wisc.edu</u>
10	
11	Steven T. Parker, Ph.D, IT Program Manager,
12 13 14	Engineering Hall, 1415 Engineering Drive, Madison, WI, USA 53706, Phone: (608) 265-4921 Eav: (608) 262-5199 Email: sparker@engr.wisc.edu
15	Thone. (000) 203-4721, 1 dx. (000) 202-5177, Elitan. Sparker@eligi.wise.edu
16	
17	Yang Cheng, PhD, Research Associate,
18	Traffic Operations and Safety (TOPS) Laboratory
19	University of Wissonsin Medison
20	1241 Engineering Hall 1415 Engineering Drive Madison WI USA 53706
22 23 24	Phone: (608) 262-2524 Email: cheng8@wisc.edu
25	Dr. Bin Ran. Ph.D., Professor
26	Department of Civil & Environmental Engineering, University of Wisconsin-Madison,
27	1415 Engineering Drive, Madison, WI 53706, USA
28	Phone: 1-608-262-0052 Fax: 1-608-262-5199
29	Email: bran@wisc.edu
30 21	and School of Transportation Southoast University
32	No 2 Si Pai Lou Naniing 210096 China
33	10.2 511 at 100, 11 angling 210090, China
34	
35	David A. Noyce, Ph,D, P.E., Professor
36	Director, TOPS Lab
37	Department of Civil & Environmental Engineering, University of Wisconsin-Madison,
38 20	Madison, WI 53/06, USA Dhone: 1.608.265.1882 Eav: 1.608.262.5100
40	Email: novce@engr wisc edu
41	Linuir. noyoodongi. wiso.odu
42	
43	
44	
45	Submission data 0/1/2012
40 47	Submission date: $\delta/1/2013$ Word count: $A 372 + 8$ Figure + A Tables = 7.372 words
48	word count. $4,3/2 + 0$ Figure + 4 fables = $7,3/2$ words

1 ABSTRACT

2 Archived traffic data can be used in transportation planning, administration, and research by various 3 entities and agencies. During the past two decades, considerable effort has been dedicated to developing 4 and implementing large-scale traffic data archives. The Wisconsin Traffic Operation and Safety (TOPS) 5 Laboratory at the University of Wisconsin – Madison maintains a statewide traffic detector data archiving 6 and retrieving system, which is developed to enable centralized management of statewide ITS detector 7 and configuration data, optimizing the utilization of massive data on a systematic level, and improving the 8 interactivity and accessibility for integration with other transportation data sources such as lane closure 9 data or incident data. This data archive is currently being enhanced to incorporate higher resolution traffic 10 data by migrating from 5-minute to 1-minute and even 20-second sampling intervals. At the same time, 11 there is a desire to generate aggregated datasets such as hourly, monthly, and annual average values from 12 the raw data. As the traffic data requirements continue to grow, the management of the traffic data archive 13 becomes a complex big data problem. This paper describes a proposed redesign of the TOPS Lab traffic 14 detector archived data management system to improve storage, performance, access, and integration 15 capabilities. Particular detail is given to the data archiving process, including data validation, and support 16 for spatial attributes and GIS data integration.

1 INTRODUCTION

2 Traffic data archiving for Intelligent Transportation Systems (ITS) refers to the systematic retention and 3 reuse of operational ITS data, and is required for many application. In the mid-1990s, real-time data from 4 traffic operations was archived and used for purposes beyond traffic control strategies. Archiving these 5 otherwise discarded data provides a rich source of information for evaluating traffic flow characteristics 6 and transportation system performance on a continuing basis (1). To encourage the retention and reuse of 7 ITS-generated data, the archived data user service (ADUS) element of the National ITS Architecture 8 requires that data from ITS systems be collected and archived for historical, secondary and non-real-time 9 uses and that these data be made readily available to users (2). It also provides a general framework for 10 collecting, processing, retaining, and distributing these data. As a result, during the past two decades, many data archiving activities have been conducted by different transportation agencies and considerable 11 12 effort has been dedicated to developing and implementing large-scale traffic data archives (3, 4, 5). As a 13 supplement or replacement of conventional data sources, the cost-effectiveness of data collection 14 infrastructure is maximized, sampling bias is minimized due to the continuous collection of data, and a 15 better understanding of variability in system performance can be accomplished (6). Once these data are 16 archived, the vast amount of data can be used in transportation planning, administration, and research by 17 various entities and agencies including metropolitan planning organizations (MPOs), state transportation 18 planners, traffic management operators, transit operators, and transportation researchers (6).

19 The Wisconsin Department of Transportation (WisDOT) has invested heavily over the past two 20 decades in ITS infrastructure. This includes the emergence of a Statewide Traffic Operations Center 21 (STOC) in Milwaukee and the deployment of Advanced Transportation Management Systems (ATMS) 22 software at the STOC and other regional offices. The STOC gathers data from approximately 4,800 traffic 23 detectors that compose the ATMS. A variety of point detection technologies are implemented on the state 24 freeway system including: inductive loop detectors, radar detection, microwave detection, and more 25 recently Bluetooth detection. Generally, these detection systems provide traffic flow data for freeway 26 surveillance and real-time freeway management.

Traffic detector data from the STOC ATMS is archived on a continual basis in the WisTransPortal system, located at the Wisconsin Traffic Operations and Safety (TOPS) Laboratory at the University of Wisconsin-Madison (7,8). The ATMS detector data is available for online query and retrieval through the WisTransPortal VSPOC system (9). VSPOC serves as the primary source of archived Wisconsin ITS traffic detector data and is used by WisDOT, local governments, consulting firms and university researchers for a variety of traffic operations, planning and research purposes.

33 Since deployment of the VSPOC system in 2007, several significant challenges to the effective 34 use of the WisTransPortal ATMS traffic detector data have been identified. The primary challenges relate 35 to a lack of geo-spatial (GIS) location attributes, ongoing data quality issues, data frequency, and 36 documentation. In addition, the sheer volume of data received from the STOC (over 5 million records per 37 day) presents ongoing data management considerations. This paper will provide a overview of current 38 development efforts by TOPS Lab to upgrade the WisTransPortal ATMS detector data archive and VSPOC system to address these challenges. A specific focus on large scale data management and GIS 39 40 integration will be discussed, along with implications for improved query capabilities and integration with 41 other WisTransPortal transportation data.

42

43 WISCONSIN ITS TRAFFIC DETECTOR DATA

44

45 Wisconsin Traffic Data Sources

46 As in other states, there are several sources of highway traffic detector data in Wisconsin: real-time traffic

47 ITS detector data from the STOC control room ATMS, 511 Traveler Information link speeds and travel

48 times (derived from the ATMS detector data), continuous and short-term traffic counts from the WisDOT

- 49 Bureau of State Highways (BSHP) planning area, and more recently Bluetooth sensor data. In addition,
- 50 third party traffic data is available from a variety of sources.

The STOC ATMS monitors real-time traffic volume, speed, and occupancy data from approximately 4,800 freeway detectors in five transportation regions (Table 1). These data are used for real-time management of the transportation system to monitor the traffic state and identify congested area and incidents. At 20-second intervals, each detector records vehicle counts, average speed, and occupancy (i.e., the percentage of the sample period when a vehicle was over the detector). A roadside controller is then polled at that same time interval by the central traffic management software. The ATMS aggregates 20-second data to 1-minute intervals for control room monitoring and traveler information purposes.

As described, traffic detector data from the STOC ATMS in the TOPS Lab WisTransPortal system. The basic objective of the WisTransPortal is to develop capabilities for a statewide ITS data hub to support multiple applications in traffic operations and safety. Those capabilities include integration, management, analysis, and dissemination of real-time and historical ITS operations data through a centralized database and communications infrastructure (7). The data archiving component of the WisTransPortal consists of a collection of automated services that connect to various WisDOT and other ITS data sources and prepare the data for archiving in a common relational database.

15

WisDOT Region	Online Date	Controllers	Detectors	
SE Region	1996	352	3821	
SW Region	2003	107	732	
NC Region	2006	48	194	
NE Region	2010	23	95	
NW Region	2011	1	5	

16 TABLE 1 Wisconsin Freeway Detector Distribution

17

21

22

23

27

18 The WisTransPortal traffic detector database is updated every 24 hours with WisDOT ATMS 19 detector data from the previous day. There are three major files are sent from the WisDOT ATMS to 20 TOPS lab for archiving via the WisDOT "ITSNET" fiber network:

- ATMS Detector Configuration Inventory
- ATMS Controller Configuration Inventory
- ATMS One Minute Detector Volume, Speed, And Occupancy Data

The design of the WisTransPortal detector database incorporated elements form the Traffic Management Data Dictionary (TMDD) standard *(10)* whenever possible. Hence, as the guiding principle, the WisTransPortal detector database is structured to support TMDD requirements.

28 VSPOC Online Tool

29 The V-SPOC web-interface includes a complete detector database query selection tool, data visualization 30 and export capabilities, data quality reporting, and integration with other ITS data sets in the 31 WisTransPortal database. In order to facilitate the use of this data, the current VSPOC application suite 32 provides mechanisms to organize detector data into spatial (corridors, count locations and controllers) and 33 temporal (time interval) groupings. Besides that, VSPOC was designed as a set of customized modules 34 that take advantage of a common database backend and web-based application platform to provide an 35 integrated system for transportation operations engineering, analysis, research, and reporting functions. 36 Several specialized modules are available for various needs of users and suitable presentation of data 37 including corridor analysis, monthly data retrieval, ramp metering retiming, etc. Figure 1 presents an 38 example of an archive volume plot for sample detector location on I-43 in Milwaukee County. 39



1 2 3 4 5 6

Figure 1 Example of VSPOC modular.

VSPOC ETL

5 Due to the complexity and distinct set of requirements, it is common to separate the implementation of 6 real-time traffic management system software from the archived data management component. The 7 process of populating the traffic data archive, or moving data from the operation center's database to the 8 traffic data archive, is known as extraction, transformation, and loading (ETL). Incorporating effective 9 ETL process and archiving algorithm for high resolution loop detector data is complex and requires 10 significant attention in design. The current extraction and transformation process used to populate the 11 VSPOC database system is presented in Figure 2

11 VSPOC database system is presented in Figure 2.



12 13

13 FIGURE 2 WisTransPortal VSPOC detector data architecture.

1 **VSPOC Database Future Trends**

2 The STOC has recently starting providing ATMS detector data to the WisTransPortal in terms of 1-3 minute intervals. Converting from the previous 5-minute resolution to 1-minute resolution introduces a 4 number of data management challenges. As of 2012, the cumulative record count of traffic detector data 5 in the WisTransPortal had already exceeded four billion. In addition, as the continuous development and 6 investment on ITS devices, the scale of traffic monitoring operations will also grow. As presented in 7 Figure 3, the cumulative record count in 2014 is predicted to be nine billion, which means the amount of 8 two years data are larger than that of past 15 years. The linear trend of data size growth will be five times 9 than before. Consequently, traffic data archiving is becoming a big data challenge which requires a mass 10 data storage solution with high fault tolerance and throughput and sophisticated data management 11 techniques.



12 13

FIGURE 3 VSPOC database cumulative record count.

14 **ARCHIVING PROCESS**

15 The archiving process refers to steps taken for processing and archiving the traffic detector data and system configuration data. To solve the aforementioned big data challenge and support the VSPOC 16 17 frontend web application, it is necessary to continue improving the effectiveness of the archiving system 18 and data performance in terms of completeness, timeliness, accuracy, and interactivity. Redesigning the 19 archiving process provides a unique opportunity to rethink how to better shape the VSPOC traffic data 20 archive. Hence, the following three objectives are identified: 21

- 1. Automation: Increase and refine the automation capabilities of the archiving process
- 2. Data Validation: Implement front-end data validation steps and report exceptions that occur in archiving process
- 3. Aggregation: Transform the temporal and spatial grain of raw data to desired temporal and spatial grain of archived data

26 The proposed archiving process is presented in flowchart in Figure 4. Included discussion is how these 27 objectives are taken into account within the archiving process and how to address identified issues.

28

22

23

24



FIGURE 4 Proposed VSPOC archiving process

1 Automation

2 A Java program is developed to implement the archiving process including retrieving source data from 3 the STOC, importing the raw data into a temporary loader table, and processing the loader data to the 4 target database. Once deployed, it can be used for centralized management. This process is completely 5 automated – it runs as a scheduled "cron" job on a separate virtual server assigned for data acquisition and 6 writes a log of its activity. In the current VSPOC system, only the detector data import process is 7 automated. The process for updating the detector and controller configuration data is a manual procedure. 8 Moreover, the automated detector data archiving component does not incorporate a full loader process 9 and is therefore limited in its post-processing and data validation capabilities, as described below.

10

22

11 Data Validation

12 Structural errors in the detector data files arise from system faults in the ATMS itself, differences in how 13 detector data is represented in the ATMS compared to the WisTransPortal, and in the packaging and data 14 transmission process. The Java archiving program handles structural errors in the input data to support 15 high quality of data acquisition. In each step, specific constraints have been set for data validation. These constraints are used to automate the process of identifying and loading the qualifying data into the archive 16 17 system. Rules are implemented to handle conflicts, where possible, in order to capture as much data as 18 possible without compromising the archive. Moreover, all exceptions are caught and reported by email. 19 Checking and analyzing the reported errors enables developer to resolve them at first time, which aims at 20 dynamic data maintenance and continuous improvement on VSPOC. Once in the archive system, data 21 remains online and accessible.

23 Aggregation

24 Data aggregation can be used to reduce storage requirements on large datasets and to improve the 25 performance of analytic processing over vast amounts of fine grain data. Whereas the temporal and spatial 26 granularity at the traffic operations center is generally limited to point detections and travel time routes 27 with respect to 1-minute time intervals, it is desirable for the VSPOC archive to supports a range of 28 aggregation levels. The frontend of VSOPC suite is a web user interface for data query, data visualization, 29 data exporting, quality reporting, and corridor analysis. By using physical tables to store traffic data at 30 desired aggregation levels, the underlying database system can better support the various needs of 31 VSPOC users such as providing monthly or annual averages of daily traffic patterns. In addition, data 32 aggregation can smooth out irregular data values and eliminate noise that may report occasionally because 33 of detector or communication failures. Pre-processing aggregate data and storing it physically in the 34 database improves performance but increases data management requirements. A description of typical 35 temporal and spatial granularity requirements in an operation center and a traffic archive with 36 Wisconsin's practice is provided in Table 2.

37

Aggregation Level	Operation Center's Database	Traffic Data Archive	
Temporal	Intervals between two successive	Intervals between two successive	
	polling operations of same	database records for the same	
	detector by a controller.	detector location.	
	STOC: 20 seconds	VSPOC: 1-minute, 5-miunte,	
	Travel times and link speeds for	15-minute, 60-minutes, daily,	
	control room and traveler	monthly.	
	information: 1 minutes		
Spatial	Geographic area served by a	Transverse section of a lane,	
	detector.	detector location, roadway	
	STOC: a transverse section of a	segments such as link or corridor.	
		-	

38 **TABLE 2 Grain Description**

1 DATABASE DESIGN

2 The new database design targets the VSPOC backend to address the identified issues in current archiving 3 process and disadvantages of underlying database, as well as targets data product in terms of necessary 4 improvement on data quality and data coverage. In particular, the following four objectives are the 5 primary concerns during the redesign of database: 1) Establish historical archives of system configuration 6 data; 2) Accomplish densification of traffic data of current online detectors; 3) Synchronize internal ID 7 and external ID for each detector (internal ID refers to an individual detector, external ID points to a 8 physical detector location); and 4) Enhance GIS attributes of detector. The proposed design makes sure 9 the archived data are accurate, sufficient, and easily accessible through a high performance database 10 system. The database environment for VSPOC is the WisTransPortal Oracle Database 11g Enterprise 11 Edition, which can improve database performance and reliability.

12

13 **Table Design for Configuration Data**

14 The table design for configuration data primarily address the challenge of management on historical

- 15 configuration data and synchronization and transformation between internal ID and external ID. Figure 5
- 16 shows the data flow of system configuration data and relationship among each functional table. The
- 17 archiving process leverages this design to automate data processing on system configuration data and to
- 18 generate current snapshot of online detector.





20 21



22 Staging Loader table

23 Two intermediate staging databases (DETECTOR LOADER and CONTROLLER LOADER) serve as 24 loaders to import detector system configuration data. The primary purpose of staging loader table is to 25 accommodate the significant real-time process requirement when populating vast amount of data, 26 providing maximum availability and stability during archiving process. As shown in the flowchart of archiving process, each night, the Java archiving program retrieves the system configuration data and then 27 28 loads the data to specific loader table for the previous 24-hour period. As a buffer, the staging loader 29 tables can process and validate the received data before it goes to archive, and prevent duplicate recorder 30 in historical table. It ensures the further process operates on clean, correct and useful data. After inserting 31 the data with timestamp into historical table, the loader tables will be emptied to recycle databases.

- 32
- 33
- 34

1 *Historical table*

2 The VSPOC database system accumulates new configuration information but still needs to retain older 3 information to preserve point in time snapshots of the ATMS system configuration. Two historical 4 (DETECTOR HISTORY and CONTROLLER HISTORY) tables are then designed to keep historical 5 information of system configuration to date. It provides an efficient way to update system configuration 6 data on regular basis, and allows original data to be preserved to ensure complete, reliable integrity for the 7 life of archived data. In addition, it prevents the potential risk from system crash or failure of Java 8 archiving program. Backup and recovery runs faster based on historical table, disaster recovery therefore 9 is less costly. Moreover, the historical tables enables further development upon raw data, facilitating 10 diagnosis algorithm for detector health and data availability. After the data is inserted into historical table, qualified raw data is archived exactly as it is received in real time. The entire current day's data are then 11 12 populated to the VSPOC database backbend's historical table in a nightly batch after the end of day.

13 14 *Timeline table*

15 The detector and controller timeline table (DETECTOR TIMELINE and CONTROLLER TIMELINE) 16 present a timeline for each individual detector and controller. The need of timeline table stems from the 17 detector management strategies. For each detector, it either can be identified by INTERNALID which is 18 unique lifetime identifier for an individual detector, or the pair of REGIONID and EXTERNALID, a 19 unique identifier for an individual detector within a given WisDOT transportation region (REGIONID) 20 field detector data collection system. For example, if a detector is broken, a new detector with a different 21 INTERNALID will be installed to replace the previous one. However, the EXTERNALID for this 22 detector location remains the same. Figure 6 concludes three types of detector ID conflicts.

23 By grouping data by detector internal ID then ordering by timestamp, two new attributes are 24 created, which are Start Date and End Date indicating online and offline date for a certain detector or 25 controller (identified by INTELNALID or CONTROLLERID). By matching the online and offline date of each detector or controller to their corresponding EXTERNALID, traffic data can be precisely 26 27 retrieved by locating the online detector for specific time and location. Table 3 is an example of how 28 timeline table solve conflict detector issue.

29

1. Overlap					
1	The new detector becomes or	line before the current one becom	ne offline. There is an o	verlapping period.	
2. Gap					
	The new detector becomes or	line after the current one become	e offline. There is a gap l	between the offline	
	date of the current detector ar	nd the online date of the new deter	ector.		
3. Return	T 1 1				
	The current detector become	offline, after a period of time, it i	returns back and become	s online.	
	Overlap	Gap		Return	n
Detecto	or 1	Detector 1		Detector 1	Detector 1
	Detector 2	Detector 2			
	Detector 3		Detector 3	Detector 2	
	→		►		
	TIME		TIME		T

32 FIGURE 6 Illustration of three

33

30 31

INTID	REGIONID	EXTID	FIRST REPORTED	START_DATE	END_DATE
1001	1	100	01-01-2012	01-01-2012	03-03-2012
1002	1	100	03-01-2012	03-04-2012	06-06-2012
1003	1	100	02-06-2012	06-07-2012	

1 TABLE 3 Example of How Timeline Table Solves	Conflicting Detectors
---	------------------------------

2

The design of the timeline table can also support the systematic retention of data generated from detectors over time. If any unexpected problems found in historical data, it can allow user easy to access the data and locate the problem.

Other tables and views

8 The database system also involves additional tables (views) in the database to maximum flexibility and 9 availability. Two important tables are defined as:

10 ATMS DETECTORS: Current snapshot for detector configuration information by STOC. A status flag indicate whether the detector is current or historical. The value is either "C" for current or "H" 11 12 for historic.

13 VSPOC DETETCORS: Additional detector configuration information including location 14 information entered through VSPOC configuration interface.

16 **Table Design for Traffic Data**

17 The database design for traffic data ensures quality and availability of traffic detector data. As the same

18 logic of configuration data processing, a loader table (ATMSREPORTS LOADER) is used to filter bad

19 record in the raw data, while ATMSREPORTS 1MIN serves as historical table for traffic detector data.

20 Figure 7 shows the data flow of traffic detector data, procedures for handling conflicting detectors, and 21 densification.

22

15



23 24 FIGURE 7 Database design and data flow for traffic detector data.

1 Densification

2 It is common for the detector logs to exhibit short-term and long-term break in data availability in terms 3 of discontinued time series. In order to provide accurate reporting and analysis functions through VSPOC, 4 it is desirable to work with a dataset that has a uniform sample space. To generate a complete set of 5 records for all time periods, a pre-defined template table consisting of 1-minute timestamps was created to 6 join with the source detector data. To screen out offline detectors, the raw data join the 7 DETECTOR TIMELINE table first. Then by joining the timestamp table, a database view 8 (ATMSREPORTS 1MIN) is generated which provides a dense presentation of traffic data of current 9 online detector by filling in NULL values at timestamps where archived data is missing. All detector 10 reports table must be uniform in its representation of time, by doing this, data densification is pushed 11 down to the database level where it most efficiently solved. 12

13 GIS Attributes

As described, the WisTransPortal design incorporates two functions: ITS data archiving and ITS data dissemination. The current data archiving capabilities are primarily focused on integrating and correlating six existing WisDOT and regional data sources: traffic detector data, lane and ramp closure data, traffic incident data, historical crash reports, freeway traffic video, and road weather condition. Each subsystem is designed according to high level architecture to be a component of a highly-integrated, highlyinteractive traffic management database system.

20 As mentioned, the VSPOC DETECTOR table contains location information for detectors. 21 Besides using a latitude and longitude pair to represent a detector location, it can be modeled by a single 22 control point implemented by a system of fixed landmarks. A landmark is defined as a physical, 23 identifiable point on a highway, such as an intersection, milepost, bridge, or a virtual point, such as a 24 county boundary line over a highway. In VSPOC, landmark and corresponding offset, which comprise a 25 direction and a distance, can be used to provide highly accurate location for detectors on Wisconsin State 26 Trunk Network (STN), the WisDOT GIS-based linear referencing system for state and federal highway in 27 Wisconsin. These processes enable the new VSPOC system to incorporate data from internal WisDOT 28 data systems and applications with minimal user interaction. The integration of data is the key to next 29 generation data archived and management system as a single data source correlated with other related 30 data sources. In addition, TOPS lab is on progress to visualize traffic detectors location by mapping all 31 the detectors on STN linear referencing system. Figure 6 shows the mapped detector location on STN

32 linear referencing system.



FIGURE 8 Mapped detector on stn linear referencing system.

3 CONCLUSION

4 This study describes experience and implementation on large-scale ITS traffic detector data archiving. 5 The identified issues and potential solutions are universal and therefore other regions around the country 6 can be benefit from this experience. Towards a next generation of traffic data archive, the VSPOC system 7 will continue dedicating on data availability and accessibility for research and decision support. Future 8 work of this study may include following directions. First, a comprehensive algorithm is needed to 9 optimize system performance. Second, by identifying attributes of data quality that are relevant to ITS 10 data archiving, data quality assessment and statistical techniques are desirable to improve data quality. 11 Third, continuous improvements are needed on GIS network, data modeling, and high level system 12 integration to leverage other data sources such as lane closure data or incident data to support decision 13 making.

14

15 16 ACKNOWLEDGMENT

The WisTransPortal system and VSPOC traffic detector data archive were developed through sponsorship of the Wisconsin Department of Transportation Bureau of Traffic Operations (BTO). Ongoing data archiving and system enhancement activities with respect to the ITS traffic detector data are conducted by TOPS Lab in coordination with the BTO Statewide Traffic Operations Center.

21

- 22
- 23 24
- 25
- 26
- 27
- 28

29 **REFERENCES**

- 1 1. Turner, S. M. Guidelines for Developing ITS Data Archiving Systems. Report 2127-3. Texas Transportation Institute, Texas A&M University
- 2. System, 2001. Archived Data User Service (ADUS): An Addendum to the ITS Program Plan. ADUS Program. U.S. Department of Transportation, Sept. 1998.
- 2 3 4 5 6 Brian L. Smith and Simona Babiceanu, Investigation of Extraction, Transformation, and 3. Loading Techniques for Traffic Data WarehousesFederal Highway Administration. In 7 Transportation Research Record: Journal of the Transportation Research Board, No. 1879, 8 TRB, National Research Council, Washington, D.C., 2004, pp. 9–16.
- 9 Robert L. Bertini, Steve Hansen, Andrew Byrd, and Thareth Yin. Experience Implementing a 4. 10 User Service for Archived Intelligent Transportation Systems Data. In Transportation Research 11 Record: Journal of the Transportation Research Board, No. 1917, Transportation Research 12 Board of the National Academies, Washington, D.C., 2005, pp. 90–99.
- 13 5. Dilruba Ozmen-Ertekin, Kaan Ozbay. Dynamic Data Maintenance for Quality Data, Quality 14 Research. OECD. Presented at 90th Annual Meeting of the Transportation Research Board, 15 Washington, D.C., 2011.
- 16 ITS Data Archiving: Five-Year Program Description. ADUS Program. U.S. Department of 6. 17 Transportation, March 2000.
- 18 Parker, Steven. and Tao, Yang .WisTransPortal: A Wisconsin Traffic Operations Data Hub. 7. 19 Applications of Advanced Technology in Transportation (2006): pp. 611-616.
- 20 8. Wisconsin DOT, TOPS Laboratory UW-Madison. V-SPOC Traffic Detector Database Tools. 21 http://transportal.cee.wisc.edu/applications/vspoc.html.
- 22 9. TOPS, Wisconsin Traffic Operations and Safety Laboratory The Wistransportal Project 23 http://transportal.cee.wisc.edu/.
- 24 Institute for Traffic Engineers (2004). Traffic Management Data Dictionary (TMDD), Version 10. 25 2.1.