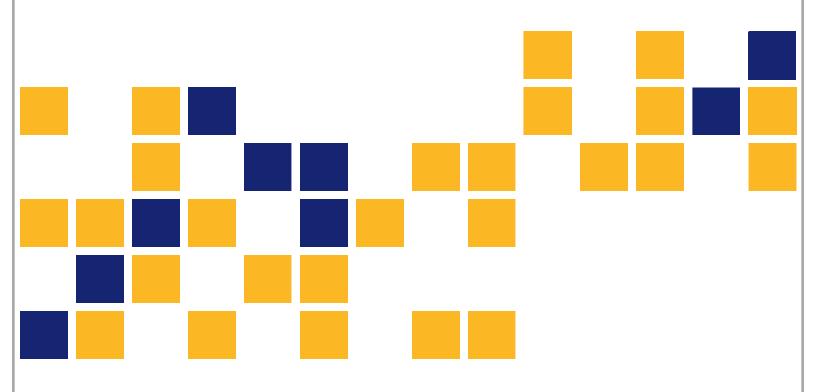
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Improving the Accuracy and Applicability of Kansas Traffic Data

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The University of Kansas





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For more information write to address in block 9.

Data quality example spreadsheet is available separately upon request to KDOT#Research.Library@ks.gov.

16 Abstract

This research investigated the accuracy and reliability of KC Scout traffic sensors in the Kansas City metropolitan area. The locations and sensors under investigation are of particular importance to the Kansas Department of Transportation (KDOT) because they regularly report accurate traffic counts to the Federal Highway Administration (FHWA). The research team used dual-directional video recorders at six locations along I-35, I-70, I-435, and I-635 to collect field counts during two phases for a total of 9 hours. Comparison of the manual field counts and KC Scout records showed acceptable accuracy (less than 5% difference compared to field counts) if KC Scout verified that the subject sensors were recently checked and calibrated. Reliability assessment of the subject sensors revealed excellent year-long quality of data for two pairs of detectors (about 98% good data), while the other four pairs provided approximately 85%, 79%, 75%, and 68% good-quality data, respectively. Sources of error that resulted in bad-quality data were duplicate records, zero traffic counts when vehicle speed was non-zero, extremely high traffic counts, or missing intervals. Investigating the temporal distribution of each error type provided insight on their probable causes. Finally, an assessment of the automated quality checks process of the KC Scout data portal identified errors and inconsistencies, which hinder the use of aggregate data by KDOT. Strategies that can mitigate the above issues were suggested.

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Final Report

Prepared by

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The University of Kansas

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PREFACE

The Kansas Department of Transportation's (KDOT) Kansas Transportation Research and New-Developments (K-TRAN) Research Program funded this research project. It is an ongoing, cooperative and comprehensive research program addressing transportation needs of the state of Kansas utilizing academic and research resources from KDOT, Kansas State University and the University of Kansas. Transportation professionals in KDOT and the universities jointly develop the projects included in the research program.

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Abstract

This research investigated the accuracy and reliability of KC Scout traffic sensors in the Kansas City metropolitan area. The locations and sensors under investigation are of particular importance to the Kansas Department of Transportation (KDOT) because they regularly report accurate traffic counts to the Federal Highway Administration (FHWA). The research team used dual-directional video recorders at six locations along I-35, I-70, I-435, and I-635 to collect field counts during two phases for a total of 9 hours. Comparison of the manual field counts and KC Scout records showed acceptable accuracy (less than 5% difference compared to field counts) if KC Scout verified that the subject sensors were recently checked and calibrated. Reliability assessment of the subject sensors revealed excellent year-long quality of data for two pairs of detectors (about 98% good data), while the other four pairs provided approximately 85%, 79%, 75%, and 68% good-quality data, respectively. Sources of error that resulted in bad-quality data were duplicate records, zero traffic counts when vehicle speed was non-zero, extremely high traffic counts, or missing intervals. Investigating the temporal distribution of each error type provided insight on their probable causes. Finally, an assessment of the automated quality checks process of the KC Scout data portal identified errors and inconsistencies, which hinder the use of aggregate data by KDOT. Strategies that can mitigate the above issues were suggested.

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Chapter 1: Introduction

1.1 Background

Highway agencies must collect accurate, reliable traffic data to efficiently operate roadway networks and plan for future growth. These agencies must also submit annual traffic reports to the Federal Highway Administration (FHWA, 2016a) for performance measurements and resource allocation as part of the Highway Performance Monitoring System (HPMS). In addition, monthly traffic counts, in the form of hourly traffic by lane, must be submitted for the monthly Traffic Volume Trends (TVT) report (FHWA, 2016b). The Kansas Department of Transportation (KDOT) collects traffic data at selected permanent count locations across the state and at four locations in the Kansas City metropolitan area.

According to FHWA (2016b), permanent count location selection should consider:

- Quality of traffic data: sensor downtimes resulting in missing data and data imputations may negatively impact the quality of collected data;
- Quality of continuous count equipment: outdated or malfunctioning equipment should be avoided;
- Existing locations: available locations from other programs may be beneficially utilized;
- Locations used by HPMS;
- Distribution over geographical areas of the state and by functional class system; and
- Bias reduction: new locations should be randomly selected.

Although KDOT has access to traffic data from Kansas City's traffic management system, KC Scout, KDOT has questioned the accuracy of raw traffic data obtained from KC Scout sensors (Wavetronix) as well as the accuracy and quality of aggregate data provided by the KC Scout data portal. As such, KDOT employs portable traffic counters for data collection, resulting in excess work and missed opportunities to advantageously utilize current automatic data collection.

1.2 Objectives

The main objectives of this project included evaluation of the reliability of traffic data KC Scout uses to report performance measures and determination of more efficient use of available traffic data for monitoring. This research provides procedures for KDOT to effectively utilize KC Scout data for planning and operations. Research results will benefit the state of Kansas because data evaluation will identify strengths and opportunities for improvement in data accuracy and reliability, potentially reducing the time and effort required by KDOT personnel to analyze KC Scout data.

Chapter 2: Review of Current Practice

This chapter reviews KC Scout's current data cleaning, quality assessment, and aggregation practices and summarizes previous research findings that investigated the accuracy of nonintrusive radar sensors, such as Wavetronix sensors used within the Kansas City area freeway network. Because these data are essential for reporting purposes to the FHWA, this chapter also reviews the requirements of the HPMS.

2.1 KC Scout Data Aggregation and Quality Checks

KC Scout's detectors produce 30-second records (raw data) that are automatically aggregated into 5-minute records (TransCore ITS, 2016). Data quality checks are performed during the 30-second to 5-minute aggregation process and are included in the 5-minute records. 15-minute, 30-minute, hourly, and daily records can then be derived from the 5-minute records according to user-defined parameters when a report is run in the TransSuite Data Portal. This 5-minute to higher-level aggregation is performed by adding or averaging the corresponding values, such as vehicle count, average speed, average occupancy, and average data quality.

Table 2.1 shows the data quality checks performed on each 30-second record as it is aggregated into the 5-minute records. Minimum and maximum thresholds for volume, speed, occupancy, and density are configurable by TransCore and KC Scout system administrators; however, threshold values are not publicly available. If a quality check fails, equivalent action presented in Table 2.1 is taken. The worst (lowest) status value prevails for each lane and station in which multiple quality checks fail in the same interval. Quality statistics are then gathered for all 10 of the 30-second records and summarized in the 5-minute record. The percentages of valid volume, speed, and occupancy values for lanes and stations are each represented by a completeness factor. If all records are good (100% percentage of valid values), the completeness factor is 100, while a completeness factor between 0 and 100 indicates bad or missing records. For example, if 20% of the volume values, 10% of the speed values, and 40% of the occupancy values are invalid, the volume quality completeness factor will be 80, the speed quality completeness factor will be 90, and the occupancy quality completeness factor will be 60.

Table 2.1: KC Scout Data Quality Checks and Actions

| Quality Control Test | Action | | | | |
|---|--|--|--|--|--|
| System error (special codes in the raw data indicate that the controller has detected an error or a function has been disabled) | Set values with error codes to null. Set LANE_STATUS of the appropriate lane to -9. | | | | |
| Erroneous timestamps and location IDs | Ignore records with invalid date, time, or location values. Set LANE_STATUS to -8. | | | | |
| Inconsistent elapsed time between records (polling period length drifting, polling cycle missing, controller accumulating data) | If polling period length is inconsistent, volume-based quality check rules should use volume flow rate instead of absolute count. Set LANE_STATUS to -7. | | | | |
| Duplicate records (caused by errors in data archiving logic or software process) | Ignore duplicate records. Set LANE_STATUS to -7. | | | | |
| Consecutive identical volume, occupancy, speed values (caused by hardware failure) | Set VOLUME, OCCUPANCY, SPEED to null. Set LANE_STATUS to -7. | | | | |
| No vehicles present | Set SPEED to null. Set LANE_STATUS to -6. | | | | |
| Extremely high-traffic volume | Set VOLUME to null. Set LANE_STATUS to -5. | | | | |
| Extremely high-occupancy value | Set VOLUME, OCCUPANCY, SPEED to null. Set LANE_STATUS to -5. | | | | |
| Extremely low or extremely high speed | Set SPEED to null. | | | | |
| Zero speed (when volume and occupancy are non-zero) | Set LANE_STATUS to -5. | | | | |
| Zero volume (when speed is non-zero) | Set VOLUME, OCCUPANCY, SPEED to | | | | |
| Extremely high density (improbable combination of volume and speed) | null. Set LANE_STATUS to -5. | | | | |

The data quality procedure during the 30-second to 5-minute aggregation also attempts to impute bad or missing data and then recalculate aggregate values using the imputed data. Interpolation is initially attempted using upstream and/or downstream data. For example, if upstream and downstream data are of good quality, an average of the two is used for the imputed values. If no good downstream data are present but good upstream and next downstream are available or if no good upstream data are present but good downstream and previous upstream data are available, an average of the two is used for the imputed values. If only downstream (or upstream) data of good quality are available, the imputed values are set to equal these data. If interpolation is not possible or does not yield good data, the flagged data are set to a 2-year historical average, assuming the data are good; otherwise, the data require manual adjustment. The

best values for each lane, whether originally measured, interpolated, historical, or manual, are used to recalculate aggregate station values. Records that include data imputed via the procedure described above are still flagged for bad data quality. However, it is not known how many of the bad-quality records correspond to manual entries, entries adjusted by interpolation, or historical data. Only the total number of imputed entries is available via the data portal.

2.2 Accuracy of Wavetronix Radar Sensors

KC Scout employs roadside-mounted microwave radar sensors to collect lane-specific traffic volume, speed, and vehicle classification data along the Kansas City area freeway network. Microwave radar sensors are advantageous because they are nonintrusive, can gather traffic flow data on multiple lanes, measure speed directly, and are not sensitive to lighting conditions or inclement weather such as rain, snow, and fog (Mimbela & Klein, 2007).

Several previous studies have evaluated the accuracy of microwave radar sensors. Coifman (2005) compared the performance of a side-fire traffic microwave sensor to loop detectors on I-80, north of Oakland, California. The study calculated the average absolute percent error in aggregated flow, occupancy, and speed for each of five eastbound lanes at 30-second and 5-minute aggregation levels. Results showed that microwave sensor flow measurements overestimated flow but were within 10% of loops for every lane except the lane nearest the median. Overcounting on that lane was attributed to "echoes off the concrete barrier." In addition, aggregate sampling intervals (e.g., 5-minute intervals) generally produced a smaller percent error than disaggregate 30-second sampling intervals.

A subsequent study by the same researcher (Coifman, 2006) found 4.8% missed vehicle detections and 5.6% false vehicle detections, primarily due to occlusion and reflections, respectively. Lane-to-lane variation in count accuracy was also observed.

Klein and Kelley (1996) performed a comprehensive comparison of various traffic detection technologies for the Intelligent Vehicle Highway Systems (IVHS) study funded by FHWA. A total of 19 detectors were evaluated, including five microwave radars, three ultrasonic, two infrared, five video image processing (VIP), one acoustic, one inductive loop, and one magnetometer. Field testing sites in three states with diverse climates (Arizona, Florida, and

Minnesota) were selected to test detector performance under a variety of environmental conditions. Inductive loops produced the most accurate vehicle count results, with a 99% accuracy under both low- and high-volume conditions, but microwave radar sensors performed the best for nonintrusive methods. Microwave radars were also most impervious to inclement weather conditions, showing no difference in performance during rain, snow, high wind, and extreme cold or heat.

In a study for the Minnesota Department of Transportation (MnDOT), Kotzenmacher, Minge, and Hao (2005) evaluated three portable, side-fire, nonintrusive detectors: the SmartSensor by Wavetronix, the Remote Traffic Microwave Sensor (RTMS) by Electronic Integrated Systems (EIS), and the SAS-1 by SmarTek. Although all three detectors had similar, multiple-lane detection capabilities for volume, speed, and length-based vehicle classification, they were based on different technologies: digital radar for the SmartSensor, analog radar for the RTMS, and passive acoustic for the SAS-1. The Wavetronix SmartSensor exhibited the highest accuracy, with a perlane volume detection error ranging from 1.4% to 4.9%.

Minge, Kotzenmacher, and Peterson (2010) conducted another detector accuracy study for MnDOT, testing five detector technologies: Wavetronix SmartSensor HD (microwave radar), Global Traffic Technologies (GTT) Canoga Microloops (magnetometer), PEEK AxleLight (laser), TIRTL (infrared; "The Infra-Red Traffic Logger"), and Miovision (video). The study found that the Wavetronix SmartSensor had a volume absolute percent error of less than 1.6% during free flow and congested conditions, as well as during extreme cold, rain, and snow. Fog conditions resulted in a greater volume error, although the error was still less than 5%. A per-vehicle analysis revealed occlusion when slow-moving trucks in the lane nearest the sensor blocked subsequent lanes, especially in periods of heavy congestion.

Performance of the Wavetronix SmartSensor microwave radar detector was also investigated by researchers at the University of Nebraska-Lincoln. Zhang (2006) found a 1.4% mean volume error and a 3.2% mean absolute volume error for 15-minute aggregation periods, while Grone (2012) reported a -5.1% mean volume error and an 8.2% absolute volume error for more disaggregate 1-minute periods. Lighting conditions or rain did not affect sensor accuracy in either study.

2.3 FHWA Highway Performance Monitoring System (HPMS) Data Requirements

The Highway Performance Monitoring System (HPMS) is a national information system that provides data that reflect "the extent, condition, performance, use, and operating characteristics of the nation's highways" (FHWA, 2016a). HPMS data are used to evaluate highway system performance according to FHWA's strategic planning process and to allocate federal funds to the states. HPMS data are also included in annual highway statistics publications and utilized by state agencies, Metropolitan Planning Organizations (MPOs), and transportation professionals.

States are required to annually collect and report the following data according to HPMS requirements:

- Full extent: limited data on all public roads, including data in the federalaid system;
- Sample panel: detailed data for designated sections of the federal-aid system; and
- Statewide summary: information on travel, system length, and vehicle classification by functional system and area type.

Table 2.2 lists all traffic data required for the full extent or sample panel sections. Summary data include system length, vehicle miles traveled (VMT), and vehicle classification by functional system and area type (rural, small urban, and individual urbanized, non-attainment, and maintenance areas).

Table 2.2: Traffic Data Items Reported for HPMS

| Data Item | Extent | | | | |
|---|---|----------------------------|--|--|--|
| Annual Average Daily Traffic | Full Extent including ramps | | | | |
| Single-Unit Truck & Bus AADT | Full Extent for some functional systems | Some Sample Panel Sections | | | |
| Percent Peak Single-Unit Trucks and Buses | | All Sample Panel Sections | | | |
| Combination Truck AADT | Full Extent for some functional systems | Some Sample Panel Sections | | | |
| Percent Peak Combination Trucks | | All Sample Panel Sections | | | |
| K-Factor | | All Sample Panel Sections | | | |
| Directional Factor | | All Sample Panel Sections | | | |
| Future AADT | | All Sample Panel Sections | | | |
| Capacity | | All Sample Panel Sections | | | |

Source: FHWA (2016a)

2.4 FHWA Traffic Volume Trends (TVT) Data Requirements

In addition to annual HPMS reports, KDOT must submit a monthly Traffic Volume Trends (TVT) report to FHWA. Based on per-lane hourly traffic count data collected at more than 4,000 continuous traffic counting locations nationwide and the annual average daily traffic (AADT) by road segment from HPMS (FHWA, 2016b), TVT reports VMT on all public roads and estimates the percent change in traffic between the current month and the same month in the previous year for each functional roadway classification (FHWA, 2017). To collect data for the TVT reports, KDOT utilizes select permanent count locations across the state and four locations in the Kansas City area, as shown in Figure 2.1 (KDOT, 2017).

| | Kansas Department of Transpor | tation | Significar | nt Fact | s and | Trend | ds Rep | ort | Bureau | of Tran | spo | rtation Plann | ing | | Pa | ge: 3 |
|-------------------------------------|--|---|--------------------------------------|--------------------------------------|--------------------------------------|--------------------------------|------------------------------|----------------------------------|--|-------------|---------------------|--|---------------------|--------------------------------------|--------------------------------------|-------------------------|
| D-4-: 44 NG | 21/ 2017 | | Mon | th of (| Octobe | er, 201 | 17 | | Spa | arse Ma | trix | Model | | | | |
| Date: 14-NC | | | | ge Daily Tr for the Mon | | | t Change onth | N Volume | laximum H Hour | lour DOW | | Maximum Da Volume DOW | • | 7 Day Avg | 5 Day Avg | 7 Day / 5 Day Avg |
| Route Descript | tion Location Description | County | 2015 | 2016 | 2017 | 2015 | 2016 | | | | | | | | | Avy |
| | | | Kan | sas (| City | Stati | ons | | | | | | | | | |
| US-69 135TH BLACKBOB I 435 | 0.4 MILES S. OF 135TH ST. 135TH E. OF MUR-LEN BLACKBOB RD. S. OF 139TH 0.8 MILES S. OF I - 70 | JOHNSON JOHNSON JOHNSON WYANDOTT | 56,911 33,659 22,093 71,507 | 58,495 35,997 21,844 72,538 | 61,377 34,341 21,606 73.000 | 7.8 2.0 - - 2.2 - 2.1 | 4.9 - 4.6 - 1.1 0.6 | 6.227 3.255 2.131 8.516 | 4- 5 pm 4- 5 pm 5- 6 pm 5- 6 pm | FRI | 31 27 6 19 | 72,683 FRI 39,415 FRI 23,781 FRI 88,945 FRI | 13 13 6 20 | 61.377 34.341 21.606 73.000 | 65.646 35.944 22.144 77.233 | .96 .98 |
| Percent of | of Change for Kansas City Stati | ions | | | | 3.3 | .8 | | | | | | | | | |

Figure 2.1: KDOT October 2017 Fact and Trends Report, Kansas City Area Permanent Count Stations

Source: KDOT (2017)

Chapter 3: Data Collection

3.1 Location Selection

After consulting with KDOT, six locations of interest for obtaining data in the Kansas City metropolitan area were identified. Table 3.1 presents each location's description and coordinates, as well as the name and identification numbers of corresponding KC Scout detectors.

Table 3.1: Study Sites

| Location Description | Coordinates | Detector ID | Location Reference | Detector Name |
|-------------------------|-----------------------|----------------|-----------------------|-------------------------------|
| I-70 West of N 72nd St | 39.106192, -94.748603 | 8277 | K070EBVR-17 | I-70 E @ 72nd Street |
| 1-70 West of N 72IId St | 39.100192, -94.748003 | 8278 | K070WBVR-17 | I-70 W @ 72nd Street |
| I-435 North of Kansas | 39.094402, -94.808634 | 8307 | K435SBVR-31 | I-435 S @ North of Kansas Ave |
| Ave | 39.094402, -94.000034 | 8308 | K435NBVR-31 | I-435 N @ North of Kansas Ave |
| I-635 North of Shawnee | 39.055389, -94.679583 | 7619 | K635NBVR-03 | I-635 N @ Shawnee Dr |
| Dr | 39.003369, -94.079363 | 7620 | K635SBVR-03 | I-635 S @ Shawnee Dr |
| I-35 West of Cambridge | 39.075145, -94.611071 | 7726 | K035NBV-57 | I-35 N @ Cambridge Circle |
| Circle | 39.073143, -94.011071 | 7732 | K035SBV-57 | I-35 S @ Cambridge Circle |
| I-35 at W 95th St | 38.956160, -94.733229 | 7478 | K035NBVR-05 | I-35 N @ 95th St |
| 1-33 at W 93til 3t | 30.930100, -94.733229 | 7672 | K035SBVR-05 | I-35 S @ 95th St |
| I-35 at Prairie St | 38.889840, -94.789524 | 8239 | K035SBVR-77 | I-35 S @ Prairie Street |
| 1-55 at Fiamle St | 30.003040, -34.703324 | 8240 | K035NBVR-77 | I-35 N @ Prairie Street |

3.2 Ground Truth Data

Ground truth data collection occurred in two phases. During the first phase, 6 continuous hours of field data were collected at each study location between June 29 and July 16, 2017. The second data collection phase, which occurred between October 28 and November 19, 2017, validated the counts collected during the previous phase and verified the accuracy of the investigated sensors. During the second data collection phase, data were obtained at all six study locations for 3 continuous hours. Table 3.2 presents the data collection information for each location and both phases.

Table 3.2: Data Collection Periods

| Lagation | Da | ta Collection P | hase I | Data Collection Phase II | | | | | |
|-------------------------------|------------|-----------------|-----------------------|--------------------------|-------------|-----------------------|--|--|--|
| Location | Date | Time | Weather Conditions | Date | Time | Weather Conditions | | | |
| I-70 West of N 72nd St | 06/29/2017 | 9:35–15:35 | Heavy rain | 10/29/2017 | 7:00–10:00 | Good weather | | | |
| I-435 North of Kansas Ave | 07/16/2017 | 14:45–20:45 | Good weather | 11/18/2017 | 14:50–17:50 | Good weather | | | |
| I-635 North of Shawnee Dr | 07/15/2017 | 11:00–17:00 | Good weather | 11/19/2017 | 8:25–11:25 | Good weather | | | |
| I-35 West of Cambridge Cir | 06/30/2017 | 10:20–16:20 | Good weather | 10/29/2017 | 10:25–13:25 | Good weather | | | |
| I-35 at W 95th St | 07/16/2017 | 7:50–13:50 | Good weather | 10/28/2017 | 13:05–16:05 | Good weather | | | |
| I-35 at Prairie St | 07/01/2017 | 10:10–16:10 | Good weather | 10/28/2017 | 9:30–12:30 | Good weather | | | |

For both data collection phases, the research team used video recording equipment (digital camcorder) operated on site from within a parked vehicle or placed on a tripod outside the roadside clear zone. Figures 3.1 through 3.6 depict positions of the recording equipment and the corresponding mapped locations of the KC Scout detectors. Adverse weather conditions (heavy rain) were present at the beginning of the first data collection period (on June 29) on I-70, but no precipitation occurred during the remaining periods. For the purposes of this study and to ensure the safety of the recording team, a highway permit was obtained from KDOT to allow use of the highway right-of-way. The permit covered all six locations, but the highway right-of-way was utilized in only three of the cases (I-435, I-635, and I-25 at 95th Street); available public parking spaces were used for the remaining three cases, as shown in Figures 3.1 through 3.6.



Figure 3.1: I-70 West of North 72nd Street, Detector and Recording Locations

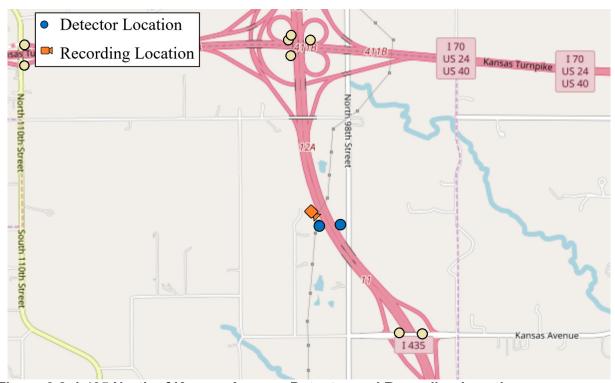
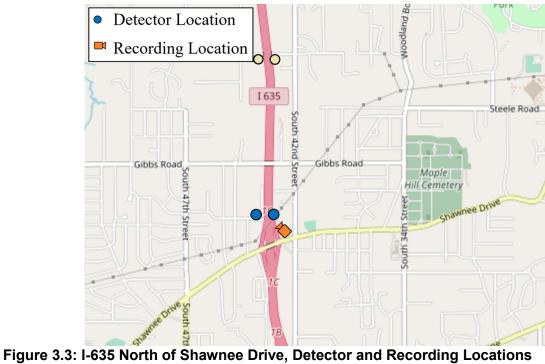


Figure 3.2: I-435 North of Kansas Avenue, Detector and Recording Locations



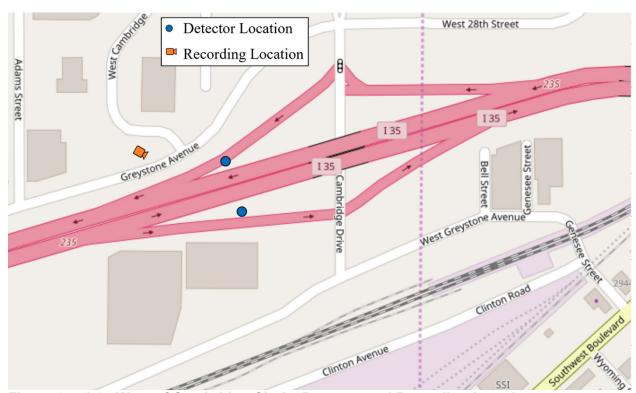


Figure 3.4: I-35 West of Cambridge Circle, Detector and Recording Locations



Figure 3.5: I-35 at West 95th Street, Detector and Recording Locations

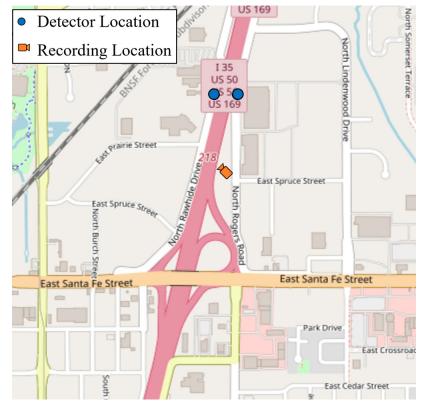


Figure 3.6: I-35 at Prairie Street, Detector and Recording Locations

3.3 Sensor Data

For the 9-hour time periods (6 hours during first phase and 3 hours during second phase) of the field data collections (Table 3.2), raw (30 second) traffic data records for both directions at each location were obtained from the KC Scout database. The raw detector counts were compared to the ground truth data to evaluate each sensor's accuracy. To compare the data quality reported by KC Scout with the data quality calculated based on raw data (Section 5.2), 5-minute reports for the same time periods were also obtained.

3.4 System Reliability Data

Overall system reliability was estimated using 1 year (November 1, 2016, to October 31, 2017) of raw (30 second) traffic data records obtained from the KC Scout database for each of the 12 detectors in Table 3.1. A step-by-step guide for obtaining raw or aggregate sensor data from the KC Scout portal is provided in Appendix A. Using the quality control checks of Table 2.1, data records were manually flagged for bad quality according to the following criteria:

- Reported system errors,
- Reported lane status errors,
- Missing time intervals,
- Consecutive duplicate values,
- Extremely high volume (greater than 25 veh/lane/30-sec interval),
- Extremely high speed (greater than 90 mph).
- Extremely high occupancy (greater than 90),
- No volume but speed of non-zero,
- Speed of zero but volume of non-zero, and
- Extremely high density (greater than 250 veh/lane/mile).

This study obtained the listed thresholds from the literature (Nihan, Jacobson, Bender, & Davis, 1990; Jacobson, Nihan, & Bender, 1990; Turner, Margiotta, & Lomax, 2004; Elefteriadou et al., 2011) since the exact values used by KC Scout were not known. The annual percentages of good-quality and bad-quality data for each detector were calculated.

Chapter 4: Analysis of Data Accuracy

4.1 Comparison Methodology

The traffic volume for each direction (ground truth field data) was obtained via manual observation of the video recordings. These volumes were then compared to the equivalent raw 30-second volume counts available in the KC Scout database (detector data) to evaluate sensor accuracy. To avoid errors due to bad synchronization between the KC Scout clock and ours, we compared volumes per hour of data collection. Thus, both the manual traffic counts and the raw detector data were aggregated in 1-hour periods. The difference between the field data and the KC Scout detector data in each 1-hour period was expressed as a percentage:

$$Difference (\%) = \frac{Field\ Volume - Detector\ Volume}{Field\ Data\ Volume} * 100\%$$
 Equation 4.1

In addition, the absolute hourly difference was calculated as:

Abs. Difference (%) =
$$\left| \frac{Field\ Volume-Detector\ Volume}{Field\ Data\ Volume} \right| * 100\%$$
 Equation 4.2

Finally, the average difference for each detector during each data collection period was calculated as the mean of the respective hourly differences, and the average absolute difference was the mean of the absolute hourly differences.

Although the data reporting requirements of the TVT report include hourly traffic count data by lane, lane-specific accuracy was not evaluated for the following reasons: first, the video footage, obtained from near-ground level on the side of the road, could not be used in most cases to distinguish the lane of each vehicle, and second, most observation locations were marginally downstream or upstream of the actual detectors and any lane changing occurring between the two spots would not be taken into account.

4.2 Summarized Results

4.2.1 First Data Collection Phase

As shown in Table 4.1, for the first data collection phase, the average difference between the sensor data and the field data was less than 5% for seven directional sites. The detectors underestimated the volumes of three directional sites by approximately 6%, 10%, and 14%, respectively, but the detectors overestimated the volumes of the remaining two directional sites by approximately 18% and 30%, respectively. However, this last overestimation was deemed invalid because the quality of the detector's volume data was nearly zero during the data collection period; thus, the detector's measurements could not be compared to the ground truth data.

Table 4.1: Comparison of Field Data and KC Scout Data for Phase I

| K | C Scout Detector Location | Data Colle | ction Period | Average | Average Absolute |
|------|------------------------------|------------|------------------------|---------|---------------------|
| ID | Station Name | Date | Date Time | | Difference |
| 8277 | I-70 E @ 72nd St | 06/20/2017 | 0.25 15.25 | -17.95% | 17.95% |
| 8278 | I-70 W @ 72nd St | 06/29/2017 | 9:35–15:35 | -29.83% | 29.83% |
| 7726 | I-35 N @ Cambridge Cir | 06/30/2017 | 20/20/2017 10 20 10 20 | | 2.41% |
| 7732 | I-35 S @ Cambridge Cir | 00/30/2017 | 10:20–16:20 | -0.70% | 0.87% |
| 8239 | I-35 S @ Prairie St | 07/01/2017 | 10:10–16:10 | -1.87% | 2.84% |
| 8240 | I-35 N @ Prairie St | 07/01/2017 | | 5.56% | 5.56% |
| 7478 | I-35 N @ 95th St | 07/16/2017 | 7:50–13:50 | 14.09% | 14.09% |
| 7672 | I-35 S @ 95th St | 07/16/2017 | 7.50-15.50 | -1.57% | 1.61% |
| 8307 | I-435 S, North of Kansas Ave | 07/16/2017 | 14:45–20:45 | 0.56% | 0.63% |
| 8308 | I-435 N, North of Kansas Ave | 07/16/2017 | 14.45-20.45 | 0.88% | 0.91% |
| 7619 | I-635 N @ Shawnee Dr | 07/15/2017 | 11:00–17:00 | -1.22% | 1.61% |
| 7620 | I-635 S @ Shawnee Dr | 07/13/2017 | 11.00-17.00 | 9.87% | 9.87% |

4.2.2 Second Data Collection Phase

The radar sensors were determined to be configured incorrectly (e.g., missing lanes, wrong lanes assigned, etc.) at locations with high percentage differences. Once KC Scout corrected the sensor configurations, the research team repeated the data collection at all six locations for a 3-hour period. Table 4.2 summarizes the average percent difference between detector and field-measured counts for the second data collection phase. The results showed that the average absolute difference between the sensor data and the field data was less than 3%, and in many cases as low as approximately 1%, for all 12 directional sites.

Table 4.2: Comparison of Field Data and KC Scout Data for Phase II

| K | C Scout Detector Location | Data Collec | ction Period | Average Difference | Average Absolute |
|------|------------------------------|----------------------|--------------|-----------------------|---------------------|
| ID | Station Name | Date | Date Time | | Difference |
| 8277 | I-70 E @ 72nd St | 10/29/2017 | 7:00–10:00 | -0.92% | 1.56% |
| 8278 | I-70 W @ 72nd St | 10/29/2017 | 7.00-10.00 | -0.81% | 0.81% |
| 7726 | I-35 N @ Cambridge Cir | 10/29/2017 | 10:25–13:25 | -1.95% | 1.95% |
| 7732 | I-35 S @ Cambridge Cir | 10/29/2017 | 10.25-13.25 | -0.74% | 1.16% |
| 8239 | I-35 S @ Prairie St | 10/28/2017 | 9:30–12:30 | 2.22% | 2.42% |
| 8240 | I-35 N @ Prairie St | 10/20/2017 | | -0.06% | 2.15% |
| 7478 | I-35 N @ 95th St | 10/28/2017 | 13:05–16:05 | -1.10% | 1.10% |
| 7672 | I-35 S @ 95th St | 10/20/2017 | 13.05-16.05 | -1.52% | 1.52% |
| 8307 | I-435 S, North of Kansas Ave | 11/18/2017 | 14:50–17:50 | 0.76% | 0.76% |
| 8308 | I-435 N, North of Kansas Ave | 11/10/2017 | 14.50-17.50 | 0.82% | 0.82% |
| 7619 | I-635 N @ Shawnee Dr | 44/40/0047 0:05 44:0 | | -1.05% | 1.05% |
| 7620 | I-635 S @ Shawnee Dr | 11/19/2017 | 8:25–11:25 | -1.51% | 1.51% |

4.3 Detailed Results

4.3.1 Eastbound I-70 at 72nd Street

Table 4.3 compares hourly volumes measured by direct observation (ground truth field data) and hourly volumes measured by corresponding detectors for the eastbound direction of I-70 at 72nd Street for both data collection phases. The significant difference observed in Phase I occurred because the wrong lanes were assigned to the detector. Once the lane assignment was corrected in Phase II, the hourly difference was less than 2%.

Table 4.3: Comparison of Field Data and KC Scout Data at I-70 E at 72nd Street

| Phase | Date Time Period | Time Devied | Hourly Volume | | Hourly | Absolute |
|--------|------------------|--|---------------|----------|------------|----------------------|
| Filase | | Time Period | Field Data | Detector | Difference | Hourly Difference |
| I | 06/29/2017 | 9:35–10:35 | 1714 | 2031 | -18.49% | 18.49% |
| I | 06/29/2017 | 10:35–11:35 | 1722 | 2064 | -19.86% | 19.86% |
| I | 06/29/2017 | 11:35–12:35 | 1853 | 2167 | -16.95% | 16.95% |
| I | 06/29/2017 | 12:35–13:35 | 1941 | 2286 | -17.77% | 17.77% |
| I | 06/29/2017 | 13:35–14:35 | 2019 | 2394 | -18.57% | 18.57% |
| ı | 06/29/2017 | 14:35–15:35 | 2209 | 2564 | -16.07% | 16.07% |
| | | st Data Collection Perage Hourly Differe | | | -17.95% | 17.95% |
| II | 10/29/2017 | 7:00–8:00 | 598 | 610 | -2.01% | 2.01% |
| II | 10/29/2017 | 8:00-9:00 | 877 | 892 | -1.71% | 1.71% |
| II | 10/29/2017 | 9:00–10:00 | 1353 | 1340 | 0.96% | 0.96% |
| | Seco Av | -0.92% | 1.56% | | | |

4.3.2 Westbound I-70 at 72nd Street

Table 4.4 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for the westbound direction of I-70 at 72nd Street for both data collection phases. The significant difference observed in Phase I occurred because the wrong lanes were assigned to the detector and because the reported data quality was very low. Once the lane assignment was corrected in Phase II, the hourly difference was less than 1.5%.

Table 4.4: Comparison of Field Data and KC Scout Data at I-70 W at 72nd Street

| | 5 / | · · | Hourly \ | /olume | Hourly | Absolute |
|-------|--------------|---------------------|------------|----------|------------|----------------------|
| Phase | Date | Time Period | Field Data | Detector | Difference | Hourly Difference |
| I | 06/29/2017 | 9:35–10:35 | 1818 | 2578 | -41.80% | 41.80% |
| I | 06/29/2017 | 10:35–11:35 | 1551 | 1794 | -15.67% | 15.67% |
| I | 06/29/2017 | 11:35–12:35 | 1921 | 2772 | -44.30% | 44.30% |
| I | 06/29/2017 | 12:35–13:35 | 2260 | 2713 | -20.04% | 20.04% |
| I | 06/29/2017 | 13:35–14:35 | 1978 | 2804 | -41.76% | 41.76% |
| I | 06/29/2017 | 14:35–15:35 | 2217 | 2558 | -15.38% | 15.38% |
| | | Data Collection Pha | | | -29.83% | 29.83% |
| II | 10/29/2017 | 7:00–8:00 | 675 | 684 | -1.33% | 1.33% |
| II | 10/29/2017 | 8:00-9:00 | 861 | 865 | -0.46% | 0.46% |
| II | 10/29/2017 | 9:00-10:00 | 1132 | 1139 | -0.62% | 0.62% |
| | Secor Ave | -0.81% | 0.81% | | | |

4.3.3 Northbound I-35 at Cambridge Circle

Table 4.5 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for northbound I-35 west of Cambridge Circle for both data collection phases. The hourly difference was less than 3% for all nine 1-hour periods.

Table 4.5: Comparison of Field Data and KC Scout Data at I-35 N at Cambridge Circle

| Dhasa | Dete | Time Period | Hourly \ | /olume | Hourly | Absolute |
|-------|--------------|---------------------|------------|----------|------------|----------------------|
| Phase | Date | Time Period | Field Data | Detector | Difference | Hourly Difference |
| I | 06/30/2017 | 10:20–11:20 | 2719 | 2793 | -2.72% | 2.72% |
| I | 06/30/2017 | 11:20–12:20 | 2919 | 3006 | -2.98% | 2.98% |
| I | 06/30/2017 | 12:20–13:20 | 3181 | 3234 | -1.67% | 1.67% |
| I | 06/30/2017 | 13:20–14:20 | 3007 | 3067 | -2.00% | 2.00% |
| I | 06/30/2017 | 14:20–15:20 | 3148 | 3242 | -2.99% | 2.99% |
| I | 06/30/2017 | 15:20–16:20 | 3482 | 3555 | -2.10% | 2.10% |
| | | Data Collection Pha | | | -2.41% | 2.41% |
| II | 10/29/2017 | 10:25–11:25 | 1956 | 1979 | -1.18% | 1.18% |
| II | 10/29/2017 | 11:25–12:25 | 2151 | 2200 | -2.28% | 2.28% |
| II | 10/29/2017 | 12:25–13:25 | 2464 | 2523 | -2.39% | 2.39% |
| | Secor Ave | -1.95% | 1.95% | | | |

4.3.4 Southbound I-35 at Cambridge Circle

Table 4.6 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for southbound I-35 west of Cambridge Circle for both data collection phases. The hourly difference was less than 2% for all nine 1-hour periods.

Table 4.6: Comparison of Field Data and KC Scout Data at I-35 S at Cambridge Circle

| Phase | Date | Time Period | Hourly \ | /olume | Hourly Difference | Absolute |
|--------|-------------|---|------------|----------|----------------------|----------------------|
| Filase | Date | Time Period | Field Data | Detector | | Hourly Difference |
| I | 06/30/2017 | 10:20–11:20 | 2616 | 2603 | 0.50% | 0.50% |
| I | 06/30/2017 | 11:20–12:20 | 2953 | 2971 | -0.61% | 0.61% |
| I | 06/30/2017 | 12:20–13:20 | 3084 | 3124 | -1.30% | 1.30% |
| I | 06/30/2017 | 13:20–14:20 | 3140 | 3200 | -1.91% | 1.91% |
| I | 06/30/2017 | 14:20–15:20 | 3587 | 3598 | -0.31% | 0.31% |
| I | 06/30/2017 | 15:20–16:20 | 4020 | 4044 | -0.60% | 0.60% |
| | | at Data Collection Plerage Hourly Differe | | | -0.70% | 0.87% |
| II | 10/29/2017 | 10:25–11:25 | 1684 | 1712 | -1.66% | 1.66% |
| II | 10/29/2017 | 11:25–12:25 | 2105 | 2130 | -1.19% | 1.19% |
| II | 10/29/2017 | 12:25–13:25 | 2335 | 2320 | 0.64% | 0.64% |
| | Seco Ave | -0.74% | 1.16% | | | |

4.3.5 Southbound I-35 at Prairie Street

Table 4.7 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for southbound I-35 at Prairie Street for both data collection phases. The recording location for this site was approximately 1,000 ft from the detector in the southbound direction. The hourly difference barely exceeded 5% for a 1-hour period and was less for the remaining eight periods.

Table 4.7: Comparison of Field Data and KC Scout Data at I-35 S at Prairie Street

| Dhasa | Data | Time Period | Hourly \ | /olume | Hourly Difference | Absolute |
|-------|--------------|---------------------|------------|----------|----------------------|----------------------|
| Phase | Date | | Field Data | Detector | | Hourly Difference |
| I | 07/01/2017 | 10:10–11:10 | 2752 | 2725 | 0.98% | 0.98% |
| I | 07/01/2017 | 11:10–12:10 | 3147 | 3086 | 1.94% | 1.94% |
| I | 07/01/2017 | 12:10–13:10 | 3012 | 3132 | -3.98% | 3.98% |
| I | 07/01/2017 | 13:10–14:10 | 3103 | 3175 | -2.32% | 2.32% |
| I | 07/01/2017 | 14:10–15:10 | 2995 | 3140 | -4.84% | 4.84% |
| I | 07/01/2017 | 15:10–16:10 | 2966 | 3054 | -2.97% | 2.97% |
| | | Data Collection Pha | | | -1.87% | 2.84% |
| II | 10/28/2017 | 9:30–10:30 | 2483 | 2358 | 5.03% | 5.03% |
| II | 10/28/2017 | 10:30–11:30 | 2736 | 2744 | -0.29% | 0.29% |
| II | 10/28/2017 | 11:30–12:30 | 3060 | 3001 | 1.93% | 1.93% |
| | Secor Ave | 2.22% | 2.42% | | | |

4.3.6 Northbound I-35 at Prairie Street

Table 4.8 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for northbound I-35 at Prairie Street for both data collection phases. The 5–6% difference occurred because the detector missed one lane (counting only four of the five lanes). Once that oversight was corrected, however, the difference was approximately 3%, even when accounting for the aforementioned inconvenient distance between the recording location and the detector.

Table 4.8: Comparison of Field Data and KC Scout Data at I-35 N at Prairie Street

| Phase | Date | Time Period - | Hourly \ | /olume | Hourly Difference | Absolute |
|--------|--------------|---------------------|------------|----------|----------------------|----------------------|
| Filase | Date | | Field Data | Detector | | Hourly Difference |
| I | 07/01/2017 | 10:10–11:10 | 3759 | 3545 | 5.69% | 5.69% |
| I | 07/01/2017 | 11:10–12:10 | 3771 | 3568 | 5.38% | 5.38% |
| I | 07/01/2017 | 12:10–13:10 | 3654 | 3464 | 5.20% | 5.20% |
| I | 07/01/2017 | 13:10–14:10 | 3430 | 3256 | 5.07% | 5.07% |
| I | 07/01/2017 | 14:10–15:10 | 3381 | 3181 | 5.92% | 5.92% |
| I | 07/01/2017 | 15:10–16:10 | 3417 | 3209 | 6.09% | 6.09% |
| | | Data Collection Pha | | | 5.56% | 5.56% |
| II | 10/28/2017 | 9:30–10:30 | 3227 | 3126 | 3.13% | 3.13% |
| II | 10/28/2017 | 10:30–11:30 | 3467 | 3543 | -2.19% | 2.19% |
| II | 10/28/2017 | 11:30–12:30 | 3639 | 3680 | -1.13% | 1.13% |
| | Secor Ave | -0.06% | 2.15% | | | |

4.3.7 Northbound I-35 at 95th Street

Table 4.9 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for northbound I-35 at West 95th Street for both data collection phases. The 14% difference occurred because the detector missed one lane (counting only three of the four lanes) due to improper recalibration after a fourth lane was added. Once that oversight was corrected, however, the difference was approximately 1.5%.

Table 4.9: Comparison of Field Data and KC Scout Data at I-35 N at 95th Street

| Dhasa | Data | Time Period | Hourly \ | /olume | Hourly Difference | Absolute |
|-------|--------------|---|------------|----------|----------------------|----------------------|
| Phase | Date | Time Period | Field Data | Detector | | Hourly Difference |
| I | 07/16/2017 | 7:50–8:50 | 948 | 842 | 11.18% | 11.18% |
| I | 07/16/2017 | 8:50-9:50 | 1373 | 1172 | 14.64% | 14.64% |
| I | 07/16/2017 | 9:50-10:50 | 1717 | 1489 | 13.28% | 13.28% |
| I | 07/16/2017 | 10:50–11:50 | 1840 | 1562 | 15.11% | 15.11% |
| I | 07/16/2017 | 11:50–12:50 | 2090 | 1781 | 14.78% | 14.78% |
| I | 07/16/2017 | 12:50-13:50 | 2062 | 1741 | 15.57% | 15.57% |
| | | Data Collection Pharage Hourly Differen | | | 14.09% | 14.09% |
| II | 10/28/2017 | 13:05–14:05 | 2412 | 2430 | -0.75% | 0.75% |
| II | 10/28/2017 | 14:05–15:05 | 2535 | 2561 | -1.03% | 1.03% |
| II | 10/28/2017 | 15:05–16:05 | 2399 | 2436 | -1.54% | 1.54% |
| | Secor Ave | -1.10% | 1.10% | | | |

4.3.8 Southbound I-35 at 95th Street

Table 4.10 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for southbound I-35 at West 95th Street for both data collection phases. The hourly difference was less than 4% for all nine 1-hour periods and less than 2% for all but two of the periods.

Table 4.10: Comparison of Field Data and KC Scout Data at I-35 S at 95th Street

| Dhasa | Data | Time Period | Hourly \ | /olume | Hourly Difference | Absolute |
|-------|--------------|---------------------|------------|----------|----------------------|----------------------|
| Phase | Date | | Field Data | Detector | | Hourly Difference |
| I | 07/16/2017 | 7:50–8:50 | 861 | 860 | 0.12% | 0.12% |
| I | 07/16/2017 | 8:50–9:50 | 1221 | 1237 | -1.31% | 1.31% |
| I | 07/16/2017 | 9:50-10:50 | 1574 | 1588 | -0.89% | 0.89% |
| I | 07/16/2017 | 10:50–11:50 | 1735 | 1775 | -2.31% | 2.31% |
| I | 07/16/2017 | 11:50–12:50 | 2050 | 2078 | -1.37% | 1.37% |
| I | 07/16/2017 | 12:50–13:50 | 2050 | 2125 | -3.66% | 3.66% |
| | | Data Collection Pha | | | -1.57% | 1.61% |
| II | 10/28/2017 | 13:05–14:05 | 2477 | 2521 | -1.78% | 1.78% |
| II | 10/28/2017 | 14:05–15:05 | 2239 | 2274 | -1.56% | 1.56% |
| II | 10/28/2017 | 15:05–16:05 | 2438 | 2468 | -1.23% | 1.23% |
| | Secor Ave | -1.52% | 1.52% | | | |

4.3.9 Southbound I-435, North of Kansas Avenue

Table 4.11 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for southbound I-435, north of Kansas Avenue for both data collection phases. The hourly difference was less than 1% for all but one 1-hour period; that one period was slightly greater than 2%.

Table 4.11: Comparison of Field Data and KC Scout Data at I-435 S, North of Kansas Avenue

| Dhasa | Date | Time Period | Hourly \ | /olume | Hourly Difference | Absolute |
|-------|--------------|---|------------|----------|----------------------|----------------------|
| Phase | Date | | Field Data | Detector | | Hourly Difference |
| I | 07/16/2017 | 14:45–15:45 | 1946 | 1949 | -0.15% | 0.15% |
| I | 07/16/2017 | 15:45–16:45 | 1841 | 1836 | 0.27% | 0.27% |
| I | 07/16/2017 | 16:45–17:45 | 1757 | 1718 | 2.22% | 2.22% |
| I | 07/16/2017 | 17:45–18:45 | 1396 | 1397 | -0.07% | 0.07% |
| I | 07/16/2017 | 18:45–19:45 | 1190 | 1182 | 0.67% | 0.67% |
| I | 07/16/2017 | 19:45–20:45 | 1013 | 1009 | 0.39% | 0.39% |
| | | Data Collection Pha rage Hourly Differen | | | 0.56% | 0.63% |
| II | 11/18/2017 | 14:50–15:50 | 2231 | 2209 | 0.99% | 0.99% |
| П | 11/18/2017 | 15:50–15:50 | 2015 | 1997 | 0.89% | 0.89% |
| П | 11/18/2017 | 16:50–17:50 | 2195 | 2186 | 0.41% | 0.41% |
| | Secor Ave | 0.76% | 0.76% | | | |

4.3.10 Northbound I-435, North of Kansas Avenue

Table 4.12 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for northbound I-435, north of Kansas Avenue for both data collection phases. The hourly difference was less than 1% for six 1-hour periods, and less than 2.5% for all nine 1-hour periods.

Table 4.12: Comparison of Field Data and KC Scout Data at I-435 N, North of Kansas Avenue

| Dhasa | Data | Time Period | Hourly \ | /olume | Hourly Difference | Absolute |
|-------|--------------|---------------------|------------|----------|----------------------|----------------------|
| Phase | Date | Time Period | Field Data | Detector | | Hourly Difference |
| I | 07/16/2017 | 14:45–15:45 | 2060 | 2055 | 0.24% | 0.24% |
| I | 07/16/2017 | 15:45–16:45 | 2035 | 2023 | 0.59% | 0.59% |
| I | 07/16/2017 | 16:45–17:45 | 2072 | 2035 | 1.79% | 1.79% |
| I | 07/16/2017 | 17:45–18:45 | 1900 | 1854 | 2.42% | 2.42% |
| I | 07/16/2017 | 18:45–19:45 | 1434 | 1435 | -0.07% | 0.07% |
| I | 07/16/2017 | 19:45–20:45 | 1179 | 1175 | 0.34% | 0.34% |
| | | Data Collection Pha | | | 0.88% | 0.91% |
| II | 11/18/2017 | 14:50–15:50 | 2447 | 2435 | 0.49% | 0.49% |
| II | 11/18/2017 | 15:50–15:50 | 2350 | 2332 | 0.77% | 0.77% |
| II | 11/18/2017 | 16:50–17:50 | 2462 | 2432 | 1.22% | 1.22% |
| | Secor Ave | 0.82% | 0.82% | | | |

4.3.11 Northbound I-635 at Shawnee Drive

Table 4.13 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for northbound I-635 north of Shawnee Drive for both data collection phases. The hourly difference was less than 5% all nine 1-hour periods and less than 2% for seven of the periods.

Table 4.13: Comparison of Field Data and KC Scout Data at I-635 N at Shawnee Drive

| Phase | Date | Time Period | Hourly Volume | | Hourly | Absolute |
|--|------------|-------------|---------------|----------|------------|----------------------|
| | | | Field Data | Detector | Difference | Hourly Difference |
| I | 07/15/2017 | 11:00–12:00 | 1894 | 1876 | 0.95% | 0.95% |
| I | 07/15/2017 | 12:00–13:00 | 2084 | 2106 | -1.06% | 1.06% |
| I | 07/15/2017 | 13:00–14:00 | 1997 | 2052 | -2.75% | 2.75% |
| I | 07/15/2017 | 14:00–15:00 | 2083 | 2078 | 0.24% | 0.24% |
| I | 07/15/2017 | 15:00–16:00 | 2201 | 2301 | -4.54% | 4.54% |
| I | 07/15/2017 | 16:00–17:00 | 2128 | 2131 | -0.14% | 0.14% |
| First Data Collection Phase Average Hourly Difference | | | | | -1.22% | 1.61% |
| II | 11/19/2017 | 8:25–9:25 | 864 | 873 | -1.04% | 1.04% |
| II | 11/19/2017 | 9:25–10:25 | 1225 | 1236 | -0.90% | 0.90% |
| II | 11/19/2017 | 10:25–11:25 | 1470 | 1488 | -1.22% | 1.22% |
| Second Data Collection Phase Average Hourly Difference | | | | | -1.05% | 1.05% |

4.3.12 Southbound I-635 at Shawnee Drive

Table 4.14 compares hourly volumes measured by direct observation and hourly volumes measured by corresponding detectors for southbound I-635 north of Shawnee Drive for both data collection phases. A 10% difference occurred because the manual counts included the volume of the exit-only ramp lane, but the detector did not count exiting vehicles. In Phase II, however, the manual count ignored all exiting vehicles, so the difference was less than 2%.

Table 4.14: Comparison of Field Data and KC Scout Data at I-635 S at Shawnee Drive

| Dhees | Date | Time Period | Hourly Volume | | Hourly | Absolute |
|-------|--------------|-------------|---------------|----------|------------|----------------------|
| Phase | | | Field Data | Detector | Difference | Hourly Difference |
| I | 07/15/2017 | 11:00–12:00 | 2158 | 1981 | 8.20% | 8.20% |
| I | 07/15/2017 | 12:00-13:00 | 2241 | 2066 | 7.81% | 7.81% |
| Ι | 07/15/2017 | 13:00–14:00 | 2248 | 2071 | 7.87% | 7.87% |
| Ι | 07/15/2017 | 14:00–15:00 | 2391 | 2091 | 12.55% | 12.55% |
| I | 07/15/2017 | 15:00–16:00 | 2316 | 2042 | 11.83% | 11.83% |
| I | 07/15/2017 | 16:00–17:00 | 2278 | 2028 | 10.97% | 10.97% |
| | First Ave | 9.87% | 9.87% | | | |
| П | 11/19/2017 | 8:25–9:25 | 992 | 1001 | -0.91% | 0.91% |
| II | 11/19/2017 | 9:25–10:25 | 1363 | 1388 | -1.83% | 1.83% |
| II | 11/19/2017 | 10:25–11:25 | 1740 | 1771 | -1.78% | 1.78% |
| | Secor Ave | -1.51% | 1.51% | | | |

Chapter 5: Assessment of System Reliability

This section presents reliability analysis of count data at the selected sensor locations. Downtime frequency, percentage of missing or invalid data, and percentage of imputed values were analyzed and reported for a 1-year period (from November 1, 2016, to October 31, 2017) and for 9 hours of field data collection in 2017. The analysis utilized quality control checks described in Table 2.1 and threshold values listed in Section 3.4 to flag the raw (30 second, per lane) traffic data records for bad quality. Output of the process was the number and percentage of missing and bad-quality records per error category for each selected time period. Data quality reported by KC Scout was then compared with process results. The following sections describe analysis results for the 1-year period and the 9 hours of data collection.

5.1 One-Year Reliability Assessment

One-year reliability assessment for each detector was performed in four 3-month periods due to computational restrictions of voluminous data records. System reliability and consistency were also assessed within the 1-year period. Results showed that the following four data-quality criteria (Section 3.4) caused more than 99% of the flagged data records for all detectors:

- Missing time intervals,
- Duplicate records (consecutive identical volume, occupancy, and speed values caused by hardware failure or errors in data archiving logic or software process),
- Extremely high-traffic volume (greater than 25 veh/lane/30-sec interval), and
- Zero volume with non-zero speed.

Duplicate records and zero volume with non-zero speed errors were significant in eight of the 12 detectors, while high-traffic volume errors were significant in three detectors. A significant percentage of missing intervals was observed on only one pair of detectors. The remaining six criteria (i.e., system errors, lane status errors, zero speed with non-zero volume, extremely high speed, extremely high occupancy, and extremely high density) were not statistically significant for all detectors. Table 5.1 shows the 1-year data quality for each detector expressed as the percentage

of data missing or flagged for bad quality, as well as the percentages corresponding to each of the four error criteria that were significant.

Table 5.1: One-Year Data Quality Analysis (November 2016 to October 2017)

| | Percentage of | Error Criteria | | | |
|------------------------------|--------------------------------|----------------------|----------------------|----------------|---------------------|
| Station Name | Missing or Bad Quality Data | Missing Intervals | Duplicate Records | High Volume | Volume=0 Speed≠0 |
| I-70 E @ 72nd St | 18.99% | 1.35% | 6.47% | 0.18% | 10.88% |
| I-70 W @ 72nd St | 23.95% | 0.52% | 10.19% | 3.23% | 9.82% |
| I-35 N @ Cambridge Cir | 2.41% | 0.76% | 1.05% | 0.00% | 0.09% |
| I-35 S @ Cambridge Cir | 2.60% | 0.91% | 0.86% | 0.00% | 0.12% |
| I-35 S @ Prairie St | 14.67% | 0.70% | 5.29% | 0.00% | 8.61% |
| I-35 N @ Prairie St | 16.32% | 0.67% | 6.13% | 0.02% | 9.42% |
| I-35 N @ 95th St | 40.27% | 8.42% | 15.73% | 7.76% | 8.27% |
| I-35 S @ 95th St | 39.04% | 8.41% | 15.04% | 8.21% | 7.24% |
| I-435 S, North of Kansas Ave | 27.17% | 0.41% | 10.67% | 0.05% | 15.67% |
| I-435 N, North of Kansas Ave | 23.07% | 0.42% | 8.91% | 0.00% | 13.44% |
| I-635 N @ Shawnee Dr | 2.03% | 0.89% | 1.10% | 0.00% | 0.00% |
| I-635 S @ Shawnee Dr | 2.06% | 0.88% | 1.13% | 0.00% | 0.00% |

Data were unavailable for the two detectors at I-35 at 95th Street from November 1, 2016, to November 29, 2016, due to construction. These 29 days were excluded from the data quality analysis of these two detectors; only the remaining 337 days of the year were used (the extra day being due to the leap year). This unavailability demonstrated that construction can negatively affect data quality. Therefore, detectors should be monitored more thoroughly if construction takes place close to their location.

Table 5.1 shows that data quality varied significantly between detectors, although most detector pairs at each location exhibited similar characteristics. Two pairs of detectors showed excellent year-long quality (approximately 98% good-quality data), while the other four pairs demonstrated approximately 85%, 79%, 75%, and 60% good-quality data, respectively.

The causes of bad-quality data varied among detector pairs. Flow-related criteria (last two columns of Table 5.1) failed on four detector pairs, potentially indicating that the detector needed calibration or maintenance. Duplicate records consistently accompanied the flow-related errors and were responsible for a significant percentage of bad-quality data (33–55%).

Data quality consistency throughout the four 3-month periods for each detector was investigated. Results shown in Table 5.2 indicate that quality was relatively consistent throughout the year, except for the detector at I-35 at 95th Street, where the data quality ranged from approximately 82% in the first 6 months to approximately 57% for the last 6 months of the year. The causes of error also varied between these two periods, with almost zero errors due to extremely high volume in the first six months but more than 200,000 high-volume errors (approximately 33% of all error causes) in the last 6 months. Duplicate value errors were also three to five times more common in the last 6 months. These results are potential indications of detector hardware malfunctions.

Table 5.2: Data Quality Analysis Throughout the Year

| | Data Quality | | | | | |
|------------------------------|---------------------------|--------------------------|-------------------------|-------------------------|--------------------------|--|
| Station Name | 11/01/2016- 10/31/2017 | 11/01/2016- 1/31/2017 | 2/01/2017— 4/30/2017 | 5/01/2017— 7/31/2017 | 8/01/2017— 10/31/2017 | |
| I-70 E @ 72nd St | 81.01% | 79.71% | 81.65% | 82.55% | 80.13% | |
| I-70 W @ 72nd St | 76.05% | 79.66% | 82.48% | 59.78% | 82.51% | |
| I-35 N @ Cambridge Cir | 97.59% | 96.67% | 97.68% | 97.23% | 97.85% | |
| I-35 S @ Cambridge Cir | 97.40% | 96.74% | 97.68% | 97.25% | 97.95% | |
| I-35 S @ Prairie St | 85.33% | 83.58% | 84.28% | 86.85% | 86.56% | |
| I-35 N @ Prairie St | 83.68% | 81.79% | 82.75% | 85.15% | 84.98% | |
| I-35 N @ 95th St* | 67.68% | 79.79% | 82.62% | 52.85% | 59.75% | |
| I-35 S @ 95th St* | 68.91% | 81.46% | 84.11% | 53.57% | 60.91% | |
| I-435 S, North of Kansas Ave | 72.83% | 69.60% | 71.72% | 75.43% | 74.54% | |
| I-435 N, North of Kansas Ave | 76.93% | 74.56% | 76.46% | 78.50% | 78.20% | |
| I-635 N @ Shawnee Dr | 97.97% | 97.34% | 98.10% | 97.81% | 98.65% | |
| I-635 S @ Shawnee Dr | 97.94% | 97.31% | 98.05% | 97.78% | 98.61% | |

^{*} Excluded data from 11/1/2016 to 11/29/2016.

Table 5.3 shows data quality percentages reported by the KC Scout data portal. These percentages were calculated via aggregation of 5-minute quality completeness factors for each 3-month period.

Table 5.3: KC Scout Data Portal Quality Report Throughout the Year

| | Data Quality | | | | | |
|------------------------------|---------------------------|--------------------------|-------------------------|-------------------------|--------------------------|--|
| Station Name | 11/01/2016- 10/31/2017 | 11/01/2016- 1/31/2017 | 2/01/2017- 4/30/2017 | 5/01/2017— 7/31/2017 | 8/01/2017— 10/31/2017 | |
| I-70 E @ 72nd St | 82.66% | 80.93% | 83.35% | 84.64% | 81.74% | |
| I-70 W @ 72nd St | 78.93% | 80.90% | 83.41% | 68.50% | 83.09% | |
| I-35 N @ Cambridge Cir | 83.89% | 82.40% | 84.42% | 84.16% | 84.57% | |
| I-35 S @ Cambridge Cir | 86.79% | 84.73% | 87.02% | 87.34% | 88.06% | |
| I-35 S @ Prairie St | 84.50% | 82.88% | 83.51% | 86.23% | 85.38% | |
| I-35 N @ Prairie St | 82.35% | 80.57% | 81.39% | 84.14% | 83.27% | |
| I-35 N @ 95th St* | 73.63% | 80.16% | 83.99% | 64.36% | 68.34% | |
| I-35 S @ 95th St* | 74.03% | 81.84% | 85.43% | 63.30% | 68.30% | |
| I-435 S, North of Kansas Ave | 73.40% | 70.23% | 72.33% | 75.97% | 75.03% | |
| I-435 N, North of Kansas Ave | 78.15% | 75.80% | 77.79% | 79.70% | 79.26% | |
| I-635 N @ Shawnee Dr | 84.13% | 82.48% | 84.09% | 85.24% | 84.71% | |
| I-635 S @ Shawnee Dr | 80.83% | 79.27% | 80.60% | 82.03% | 81.40% | |

^{*} Excluded data from 11/1/2016 to 11/29/2016.

Comparison of results in Tables 5.2 and 5.3 revealed three trends. First, in the two detector pairs in which manual analysis resulted in data quality higher than 97%, KC Scout reported data quality between 80% and 87%. Second, for the detectors and the 3-month periods with manual analysis resulting in data quality from approximately 70% to 85%, KC Scout quality results were similar, while 3-month periods with data quality between 50% and 60% showed that KC Scout's data quality ranged from 60% to 70%. The differences and similarities in the data quality analysis results between the manual method and the automated KC Scout data portal can be attributed to the reasons (quality check criteria) for low-quality data in each case. Analysis of the temporal distribution of data quality per day and within each day allowed inferences to be made even though percentages that each criterion contributes to low-quality data in the KC Scout reports could not be obtained.

KC Scout reported very similar quality among high-quality detectors (97%) during daily peak hours but only 30–60% quality during off-peak hours, especially during the night, resulting in an overall percentage of 80–87% of good-quality data. These results were attributed to KC Scout's treatment of 30-second intervals with zero vehicle counts. KC Scout flags all intervals with volumes of zero as bad-quality, even if the speed is also zero; therefore, KC Scout flags all time intervals with no vehicles, a low-volume situation that often occurs during late night and early morning hours, resulting in significantly lower reported data quality in the KC Scout database for

those hours. Since mere lack of vehicles should not skew the data quality results, it appears that the KC Scout data quality checks process introduces false errors when flagging all zero-volume intervals. Manual analysis, on the other hand, correctly flagged only intervals with zero volume but non-zero speed, which cannot occur, thus indicating hardware or software malfunction.

The difference in flagging zero-vehicle time intervals should cause KC Scout results to always be 10–15% lower than manual analysis results. However, detectors demonstrating medium quality (70–85%) in the manual analysis exhibited similar quality levels in the KC Scout quality reports. Table 5.1 shows that detectors with 15–30% bad-quality records demonstrated approximately 10-15% bad-quality data due to time intervals where the volume was zero but the speed was non-zero and approximately 5-10% bad-quality data due to duplicate records. Distribution of these bad-quality intervals showed that both criteria occur overwhelmingly (98% of the time) during off-peak hours, especially during the night. Duplicate records and zero-volume with non-zero speed intervals had the same distribution as the zero-volume, zero-speed intervals incorrectly flagged by KC Scout during the quality check process of the high-quality (97%) detectors. These errors (duplicate records, zero volume with non-zero speed), though, were accounted for in both the manual analysis and the KC Scout quality checks of the medium-quality (70–85%) detectors. Therefore, peak-period quality results (95% or higher) and off-peak-period quality results (30–60%) for these detectors were consistent between the manual analysis and the KC Scout reports. The exact cause, though, of the errors (duplicate records, zero volume with nonzero speed) during off-peak hours should be investigated since it was not present in all detectors. For example, the high-quality (97%) detectors were free of such errors.

The average 10% higher quality that KC Scout reported for low-quality detectors (50–60%) compared to manual analysis could also be attributed to the cause of the bad-quality data. During the 3-month periods in which the detectors exhibited low-quality, duplicate values and zero volume, non-zero speed errors during off-peak hours were significant; however, the high-volume error was also prevalent. This error, unlike the zero volume, non-zero speed error, did not occur during specific hours in each day but was observed throughout the entire day for a period of many consecutive days, longer than a month in most cases. During these days, the manual analysis resulted in data quality near 0%, but the KC Scout data portal quality varied from 0% to 30%. The

assumption was made that the threshold for extremely high volume in KC Scout may be higher than the threshold used for the manual analysis. However, high-volume errors in one or more lanes had a very high tendency (close to 100%) to coincide with duplicate records in all lanes of each 30-second time interval, indicating that these two error types may have a common triggering factor, a malfunction that causes both simultaneously. In addition, KC Scout inconsistently identified duplicate records, especially records that also occurred during high-volume intervals. Although KC Scout correctly flagged most duplicate records as low quality (where high-volume intervals also occurred for some lanes), it failed to flag about one-sixth of them and mistakenly reported good or excellent quality instead. Because no data pattern explained this inconsistency, the duplicate records quality check procedure of the data portal software should be examined for errors. Whether varying high-volume error thresholds, KC Scout's failure to identify a portion of duplicate record errors, or both causes were to blame, this difference in flagging the high-volume and duplicate-values records during high-volume days was the reason for the average 10% higher quality reported by KC Scout.

In conclusion, comparison of the data quality results of the manual analysis and the data quality checks performed by KC Scout during data aggregation showed that the results were generally consistent for the peak periods and off-peak periods when duplicate records and zero-volume, non-zero speed errors occurred. However, unlike the manual analysis, KC Scout flags zero-volume, zero-speed intervals, has a higher threshold for very-high-volume errors, and detects only a percentage of duplicate record errors.

5.2 Reliability Assessment During Field Data Collection

Data quality analysis was applied to the 6-hour and 3-hour time periods of the first and second data collection phases (Table 5.4). With the exception of one detector (I-70 W @ 72nd St) during Phase I, the quality of data for all detectors during both phases was much higher than the 1-year average. Missing intervals were only observed in the I-70 W @ 72nd St detector during Phase I, while for all the other detectors, bad-quality records were exclusively (100%) due to consecutive duplicate values and zero volume with non-zero speed. The low-quality detector (2.5% data quality) had 30 missing intervals (1.4% of the total errors); approximately half of the

errors were due to consecutive duplicate values, and the other half were due to extremely high volumes. Data collection for this detector during Phase I occurred under heavy rain conditions.

Data quality reported by KC Scout for the corresponding time periods is shown in Table 5.5. As expected, since field data collection generally occurred during time periods with average-to-high volumes, the differences between the two methods are minimal in most cases. For the detector with only 2.5% quality in the manual analysis, KC Scout reported a higher percentage (10.8%) due to a higher threshold value for high-volume errors and failure to correctly identify one-sixth of the duplicate records.

Table 5.4: Field Data Quality Analysis

| | Data Quality | | |
|------------------------------|----------------------|-----------------------|--|
| Station Name | Phase I (6 hours) | Phase II (3 hours) | |
| I-70 E @ 72nd St | 96.81% | 85.28% | |
| I-70 W @ 72nd St | 2.50% | 85.28% | |
| I-35 N @ Cambridge Cir | 99.72% | 99.54% | |
| I-35 S @ Cambridge Cir | 99.86% | 99.35% | |
| I-35 S @ Prairie St | 99.03% | 98.61% | |
| I-35 N @ Prairie St | 99.26% | 98.89% | |
| I-35 N @ 95th St | 94.07% | 97.69% | |
| I-35 S @ 95th St | 94.35% | 98.80% | |
| I-435 S, North of Kansas Ave | 85.83% | 89.07% | |
| I-435 N, North of Kansas Ave | 93.61% | 98.47% | |
| I-635 N @ Shawnee Dr | 98.94% | 98.43% | |
| I-635 S @ Shawnee Dr | 98.70% | 97.78% | |

Table 5.5: KC Scout Field Data Quality Report

| | Data Quality | | |
|------------------------------|--------------|-----------|--|
| Station Name | Phase I | Phase II | |
| 170 5 0 70 100 | (6 hours) | (3 hours) | |
| I-70 E @ 72nd St | 99.31% | 85.83% | |
| I-70 W @ 72nd St | 10.83% | 86.67% | |
| I-35 N @ Cambridge Cir | 100.00% | 100.00% | |
| I-35 S @ Cambridge Cir | 100.00% | 99.72% | |
| I-35 S @ Prairie St | 99.86% | 100.00% | |
| I-35 N @ Prairie St | 99.86% | 100.00% | |
| I-35 N @ 95th St | 96.11% | 99.44% | |
| I-35 S @ 95th St | 96.39% | 99.72% | |
| I-435 S, North of Kansas Ave | 86.11% | 90.83% | |
| I-435 N, North of Kansas Ave | 94.58% | 99.72% | |
| I-635 N @ Shawnee Dr | 99.58% | 94.17% | |
| I-635 S @ Shawnee Dr | 97.50% | 91.67% | |

Chapter 6: Conclusions and Recommendations

An analysis of previous studies showed that KC Scout's radar sensors can provide overall reliable traffic volumes; however, because the primary application of this data is for travel time/speed measurements, caution is recommended for volume-related data applications. This research project collected field data from 12 sensor sites in two multi-hour phases and corroborated these findings, showing that, when calibrated and checked by KC Scout personnel, volume data accuracy was quite high. In fact, the average difference between manual counts and raw sensor counts was less than 2.2% for all sites during Phase II, which is an adequate result for KDOT specifications. However, a long-term data quality analysis revealed complications either with sensor performance or the automated data quality checks and aggregation processes of the KC Scout data portal.

This research analyzed raw sensor data from KC Scout to investigate missing or imputed values. Data quality checks for 1 year revealed two pairs of detectors with excellent 1-year quality (approximately 98% good-quality data), while qualities of the remaining four pairs ranged from 85% to 60%. The most frequent source of error was the presence of duplicate records. Other reasons for low quality included zero traffic counts with speed of non-zero, extremely high vehicle counts, or missing intervals. An analysis of the temporal distribution of the errors showed the following:

- Missing intervals were distributed randomly throughout the year and within each day.
 - For all but one pair of sensors, missing intervals represented a small percentage (0.5–1.5%) of the daily errors.
 - One pair of sensors was offline for 29 days (8% of the year) in
 November 2016 due to construction work at the sensor location.
- High-volume records occurred in continuous blocks of several days, indicating a malfunction of the sensor or data portal software.

- Duplicate records and records of zero traffic counts with non-zero speeds occurred almost exclusively during off-peak hours, especially late at night and early in the morning.
- Duplicate records were also present during peak hours if high-volume records also occurred.

A comparison of these results with the automated data quality checks performed by KC Scout during data aggregation showed differences stemming from the use of diverse threshold values or different definitions for error criteria. KC Scout used a higher threshold for extremely high volumes and failed to identify a percentage of duplicate records. No pattern was identified to explain why some duplicate records were not registered as errors by the automated quality checks. However, KC Scout flagged all zero-volume records for bad quality, regardless of whether the speed was zero. Due to the temporal distribution of the errors, data quality results of the manual analysis and data quality checks performed by KC Scout during data aggregation were only consistent with each other for most of the peak periods and for the off-peak periods when duplicate records and zero-volume, non-zero speed errors occurred. KC Scout data quality was up to 30% higher than manual analysis data quality during days with extremely high recorded volumes, and 30–70% lower during the night when zero-volume, zero-speed intervals were frequent.

Data quality analysis during field data collection showed that, in all but one case, data quality was above 85% (Table 5.3). In 20 of the 24 cases, quality was over 93%. One case during Phase I exhibited very low data quality (2.5%), indicating a malfunctioning sensor. In Phase II of the data collection, which took place because four radar sensors were configured incorrectly during Phase I (e.g., missing lanes, wrong lanes assigned, etc.), nine out of 12 cases exhibited quality higher than 97.5%, and all 12 cases had a quality above 85%.

Missing data records, as well as data records determined to be of low quality by the automated quality checks of the KC Scout data portal, were imputed during the data aggregation process. If upstream and downstream data records of good quality were available, interpolation was performed; otherwise, a 2-year historical average was used. If a historical average was not available, the imputed values were entered manually. The data portal did not provide the

percentage of imputed values that were interpolation results, historical averages, or manual entries; only the total number of imputed values, equal to bad-quality data records, was known.

The errors and inconsistencies of the KC Scout data portal quality checks process, including a potentially poorly calibrated error threshold parameter, resulted in the imputation of valid data records and the validation and usage of data records with errors. Imputation of valid data records caused low-volume, off-peak hours to exhibit reported volumes 60% higher, on average, and up to 120% higher (or 100 to 250 more vehicles per hour) than actual traffic counts during those hours. Reported volumes should be discarded as invalid when sensor malfunction causes a combination of very high traffic counts and duplicate records.

The findings of this report suggest that under certain conditions, KC Scout sensors can record traffic counts of acceptable accuracy and quality. However, long-term reliability is inconsistent among the sensors and data quality within the year and within each day varied significantly in some cases, requiring sensors to be closely monitored for errors. In addition, errors found during data quality checks of the KC Scout data portal rendered it unreliable for use in its current state. If KDOT wishes to use traffic count data from the KC Scout data portal, the following steps are recommended:

- KDOT should monitor subject sensors for any maintenance or construction activity that could potentially decrease sensor accuracy and reliability.
- KDOT should communicate directly with KC Scout to verify that subject sensors are operating as expected and are configured properly.
- Year-long and daily data quality reliability of the subject sensors must be taken into account. This study showed that both year-long and daily data quality of the sensors varies. Some sensors exhibited exceptional quality for the entire year and during each day, some produced errors during low-volume, off-peak intervals every day of the year, and a few detectors had month-long malfunctioning periods. KC Scout should identify the causes of these errors and perform any maintenance necessary to prevent them or reduce their frequency.
- Since the exact sources of error are not available from the KC Scout data portal, the malfunctioning detectors can be identified by the data quality

check process used in this study. After downloading raw data from the KC Scout website (a step-by-step guide is shown in Appendix A), KDOT can perform quality checks to estimate the percentage of missing or erroneous records, including the specific sources of error, for each sensor. An Excel spreadsheet with an example calculation of data quality is available separately upon request.

• In addition, KC Scout should review and revise the automated data quality checks process of the data portal according to KDOT specifications to eliminate the errors and inconsistencies identified in this study, including unnecessary flagging of zero-volume, zero-speed intervals, failure to flag duplicate values, and error threshold values that may not be appropriately calibrated. If these revisions are performed, the automated data quality checks process of the data portal could replace the manual quality check process.

Final recommendations of this study include the following:

- If the percentage of good-quality records is acceptable in both the manual and the automated quality check process, KDOT can use aggregate volume data from KC Scout at the specific sensor for the specific time interval.
- If the percentage of good-quality records is acceptable in the manual process but not acceptable in the automated process, then KDOT should use raw traffic counts at the specific sensor for the specific time interval.
- If the percentage of good-quality records is not acceptable in the manual process, KDOT cannot obtain useful volume data at the specific sensor for the specific time interval.
- If the automated process is revised to remove the current errors and inconsistencies, the manual process is no longer required, and the percentage of good-quality records in the manual process is a sufficient indicator of data quality and whether the aggregate volume data can be used by KDOT for reporting purposes.

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Appendix A: Using the KC Scout Data Portal

This section describes the steps to extract monthly traffic data from KC Scout's database for submitting TVT report (TransCore ITS, 2016).

A.1 User Authentication and Navigation Interface

The KC Scout data portal is only accessible to registered users. Therefore, KC Scout administrators must create a user account for KDOT if one does not already exist. Once the account has been activated, the user should visit the data portal's webpage (http://kcscout.net/KcDataPortal/) and log in with credentials (user name and password).

The *Home* screen is displayed after user authentication is successfully completed. Depending on the role (or level of access) assigned to the user, various pages/areas are available from the navigation interface. Figure A.1 displays the *Home* screen for users with basic privileges, where the top navigation bar only includes *Home* and *Logout* buttons. System administrators and users with additional privileges can also access the *Data Edit* and *Administration* modules from the top navigation bar. The left navigation flow allows the user to browse the sub-modules of the data portal. In this guide only the first sub-module, *Detector Stations*, is relevant to the described process.



Figure A.1: Data Portal Home Screen

A.2 Detector Report Queries

The *Home* screen shown in Figure A.1 also serves as the *View Detector Reports* screen, which lists all existing detector report queries of the user. This screen also allows a user to search for a specific query or to edit, copy, delete, run, or create a new query. The following steps are applicable for creating, running, and downloading a detector report query:

- 1. Click the *Home* button or the *View Reports* menu item under the *Detector Stations* section to return to that screen if on a different screen.
- 2. Click the Add New button to navigate to the *Edit Detector Report* screen (Figure A.2).

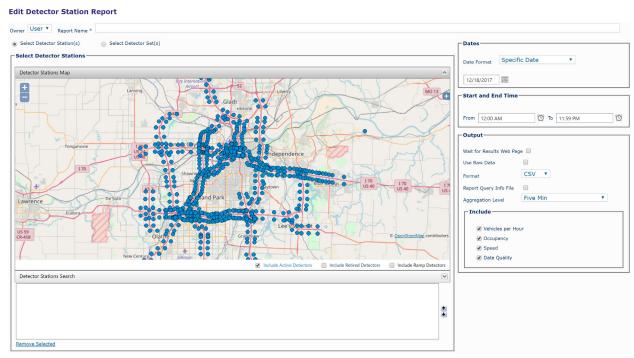


Figure A.2: Edit Detector Report Screen

- 3. Enter a name for the query in the *Query Name* input field.
- 4. Add detector stations of interest to the query by directly clicking on the detector station on the map under the *Select Detector Station(s)* option. The selected detectors will show up on the list box at the bottom of the screen. Alternatively, entire detector sets can be added at once using the *Select Detector Set(s)* option.

Existing detector station sets can be selected from the *Set* drop-down list in the *Detector Stations* search panel and added to the *Detector Stations* list box by clicking on the had button.

- 5. Select *Date Range* from the *Date Format* drop-down list. Then enter a start and end day for the query in the *Start* and *End* input fields or by clicking on the calendar pop-up button. Check the box or boxes for the days of the week to include in the query, and check or uncheck the box to identify if holidays should be excluded from the query. According to FHWA reporting requirements, the date range should be the entire month being reported, including all days of the week and holidays.
- 6. Select a start and end time in the *From* and *To* input fields. The default values of 12:00 a.m. to 11:59 p.m. are sufficient for reporting requirements.
- 7. Select an aggregation level of 1 hour for the query from the *Aggregation Level* drop-down list. Other aggregation levels are available if needed. If the *Use Raw Data* box is selected, the 30-second raw data are retrieved instead of the aggregated data. This step only applies to the manual data quality procedure and not the traffic trends report.
- 8. Select the type of output file from the *Format* drop-down list.
- 9. Click the save changes button to save the changes and to create the new query. The message success your action was successfull should be displayed at the bottom of the screen.
- 10. Click the button to submit the query for execution. By clicking the *View Report Status* menu item under the *Detector Stations* section, the user can see the status of the query and whether it is ready for download.
- 11. To download the report the user must click the *Retrieve Results* menu item under the *Detector Stations* section and then click on the download button (*).
- 12. The downloaded report file contains hourly traffic volumes for all selected detectors for the chosen time period. Figure A.3 shows an example of the output file, with November 1 data for the I-435 northbound sensor used in the accuracy

analysis. Column I, which lists vehicle counts during each time interval (1 hour), is a simple sum of the raw, unadjusted, 30-second data counts for each respective hour, regardless of data quality. Column J is the volume per hour calculated by summing the adjusted aggregate values. Separate results for each lane are also available: Columns U, AG, AS, BE, and BQ are the raw vehicle counts for lanes 1, 2, 3, 4, and 5, respectively, while Columns V, AH, AT, BF, and BR are the adjusted aggregate volumes. Section 2.1 describes how data points flagged for low quality are adjusted via interpolation using historical data or manual adjustment. Volume M is the volume data quality percentage according to KC Scout criteria, rounded to the nearest multiple of 10. The hourly counts and vehicles per hour (VPH) columns have the same values only if volume data quality is 100%. Therefore, KDOT can use either column when KC Scout data quality is high; when data quality is low, however, the values of the counts column become more unreliable, and values of the VPH column are based more on assumptions (interpolations or historical data) than on field data. A further complication is caused by the observation (Section 5.1) that current KC Scout criteria tend to falsely attribute low quality to hours with sparse traffic (primarily in the middle of the night) because these criteria interpret all intervals with 0 vehicles as bad-quality records, even if speed is also 0, indicating that no vehicle was present during that time. This causes the data quality during those hours to be reported as lower (20–50%, Figure A.3) than it should be, and the values of the VPH column to fail to represent the actual ground truth data contained in the Counts column. To solve this complication, KDOT could work with KC Scout to define quality check thresholds according to KDOT specifications and eliminate bad-quality flags for intervals with 0 vehicles if the speed is also 0, or KDOT could determine data quality directly from the raw data based on the procedure described in Chapter 5 and in the following subsection of the Appendix (see the example spreadsheet, available separately upon request to <u>KDOT#Research.Library@ks.gov</u>) instead of using the quality

reported by KC Scout. If the first method is followed, then the values in Column J (VPH) should be used; if the second method is used, Column I (Counts) should be used when quality is high and Volume J when quality is low.

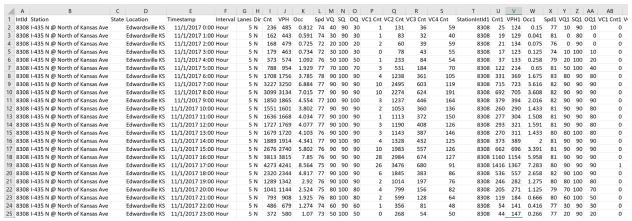


Figure A.3: Report File Example

A.3 Data Quality Assessment

This subsection describes the steps to determine volume data quality based on raw data from KC Scout and the data quality example spreadsheet (available separately upon request).

- 1. Use the instructions in Section A.2 to create and download a raw data detector report for each detector and time period of interest. Raw data are retrieved by selecting the *Use Raw Data* check box (Step 7 in Section A.2).
- 2. Open the downloaded report file and the data quality example spreadsheet and copy the entire report spreadsheet into the first tab (*RAW*) of the data quality example spreadsheet (or copy only the lines of data corresponding to the time period of interest).
- 3. Calculate the number of minutes that correspond to the data in the *RAW* tab. For example, if the *RAW* tab contains data for all days of the month of November, the number of minutes should be 30 days * 24 hours * 60 minutes = 43,200 minutes. Or *RAW* tab data for one day should be 1,440 minutes. Actual lines of data in the *RAW* tab will probably be less than the calculated number due to missing intervals.

- 4. Match the number of lines above the summary statistics in the *Quality Checks* tab with twice the number of minutes calculated in Step 3 by adding or subtracting lines in the *Quality Checks* tab accordingly (Figure A.4). The example spreadsheet contains lines for a 3-month period, so lines typically need to be subtracted from that. (Columns B–E are an alternative for calculating the number of 30-second intervals.)
- 5. Find the summary statistics on data quality, categorized by type of error, in the *Summary* tab (Figure A.5).

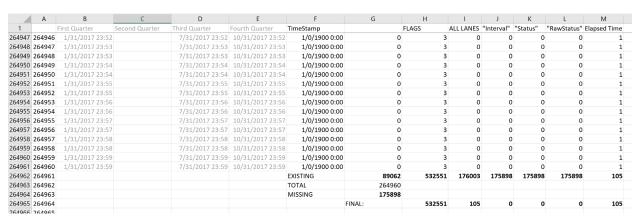


Figure A.4: *Quality Checks* Tab in the Data Quality Example Spreadsheet, Including Summary Statistics Lines

| | А | В | С | D |
|----|-----|------------------------------|---------------------|---------------|
| 1 | | | | |
| 2 | | Overall Records | 794880 | |
| 3 | | Bad Records (Flags) | 532551 | |
| 4 | | Good Quality Data % | 33.00% | |
| 5 | | | | |
| 6 | | | | |
| 7 | | By Category | Bad Records (Flags) | % By Category |
| 8 | | System Errors | 0 | 0.00% |
| 9 | | Lane Status Errors | 0 | 0.00% |
| 10 | | Elapsed Time Errors | 315 | 0.06% |
| 11 | | Consecutive Duplicate Values | 2659 | 0.50% |
| 12 | SUM | All System Errors | 2974 | 0.56% |
| 13 | | | | |
| 14 | SUM | Missing Intervals | 527694 | 99.07% |
| 15 | | | | |
| 16 | | High Volume | 0 | 0.00% |
| 17 | | High Speed | 730 | 0.14% |
| 18 | | High Occupancy | 0 | 0.00% |
| 19 | | 0 veh, >0 speed | 343 | 0.06% |
| 20 | | 0 speed, >0 veh | 902 | 0.17% |
| 21 | | High Density | 2 | 0.00% |
| 22 | SUM | All Measurement Errors | 1977 | 0.37% |
| | | | | |

Figure A.5: Summary Tab in the Data Quality Example Spreadsheet

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