



Leveraging BIM and Big Data to Deliver Well Maintained Highways

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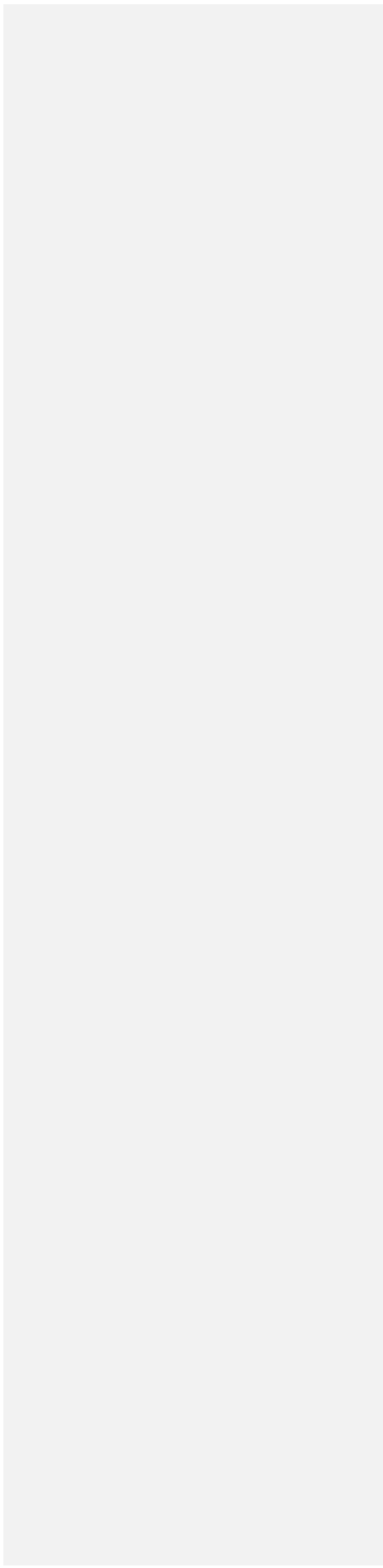
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1. INTRODUCTION

The Highway infrastructure is one of the most valuable assets for any state or national Government (Taggart and Moss, 2015). Efficient operations of Highways lead to success of national and local economies as well as improve the quality of life of the general public dependant on it. In order to ensure aging road networks continues to move with its ever increasing number of users, requires maintenance and improvements to the road network at the highest standard. Increasing scrutiny over the cost of maintenance along with increasing pressure from Government and the public for transparency over road network spending, has made a strong case for more



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7 efficient management of the Highway road asset and traffic management data. Better management of
8 information could allow for life cycle management of asset data and predictive analytics.

9 Data required for smooth operation of Highways could be split into various categories including a) Traffic
10 volume, speed, journey time; b) Roadway data such as road surface condition, road marking, message signs, road
11 surface markings, traffic junctions infrastructure, bridges on the network, c) road edge data such as shoulders,
12 curbs, gutters, driveways, inlets, sidewalks, and d) roadside data such as ditches, storm water management
13 infrastructure, vegetation, topographical information. Staff from different departments and organisations are
14 involved in collection and maintenance of this data including Engineering, Traffic Management, maintenance
15 and specialist service providers. Absence of an integrated approach to data management often leads to absence of
16 an inventory of key assets and condition assessment, leading to maintenance operations which are often sub-
17 optimal. [Even in situations where data is maintained, it is often in an unstructured format, which is difficult to
18 analyse. Big data analytics provide approaches to identify patterns and trends in data, that can help identify
19 opportunities for improvement.](#)

20 An optimal data management strategy must begin from early road scheme design stage. In recent years, there has
21 been tremendous growth in methods of handling engineering design information, evolving beyond CAD designs
22 to 3D Parametric modelling/Building Information Modelling (BIM) enabled integrated digital design models.
23 However, as highlighted by Steel et al (2012), 2D AutoCAD/Micro station based hardcopy sign off files are still
24 most commonly used method of disseminating engineering drawings. Data included within these drawings
25 include plan layouts (e.g. road layout, drainage, structure, signage, electrical, communications, etc.), 2D Views
26 (e.g. profile, elevation, cross section) and non-graphical data (e.g. co-ordinate geometry, templates, networks).
27 Data embedded in 2D drawings, such as survey data, sub-structure design data, location/survey data, could
28 effectively be used to support asset management. However, effective utilisation of this data will require a
29 consistent approach in design, construction and asset management. Reliance on traditional processes often based
30 around exchange of 2D drawings lead to critical infrastructure data buried in piles of drawings, which can only
31 be interpreted by human visual recognition, for scaling and approximate distance measurement, limiting
32 information utility and processing capabilities. While prevalent sign-off contractual processes signify need for
33 hardcopy signed off drawings, there is lack of appreciation of benefits interoperable digital data could bring in
34 design, construction and lifecycle management of assets.

35 The UK Government Construction Strategy (2011) has outlined the requirement to have all projects using
36 collaborative 3D BIM by 2016 (BIM Task Group, 2013a). Major infrastructure clients are required to meet such
37 targets. In addition, Highways Administration authorities are under pressure to reduce congestion, improve
38 network safety, and improve environmental outcomes. This paper reviews the value that can be generated
39 through integrated life cycle data management of data as enabled by BIM (Fig 1). It is argued that data from the
40 design and construction phases of projects can be used to inform asset registers from an earlier point in time.
41 This information, including models, can be used to plan management and maintenance schedules. Moreover, it
42 can also be integrated with data generated from numerous other sensors to develop a better picture of network
43 operations and support key decision making. [Big data analytics could help prioritise spending decisions, based
44 on predictive life cycle modelling, based on whole life cycle modelling approaches, deterioration modelling and
45 real time traffic information.](#)

46 This paper focuses on [proposing](#) a platform that integrates various technologies and systems of Highways
47 Authority and its supply chain, to allow for continuous flow of data throughout an [asset's assets](#) life-cycle,
48 leading to seamless, collaborative and effecting working. The integration takes into account developments in the
49 area of BIM and big data; BIM provides a platform to better integrate information whereas big data can provide
50 analytical platform to draw insights [based on existing conditions of Highways assets through accurate asset
51 management, and an ability to record and analyse ongoing construction work and its impact on the road network.](#)
52 Rest of the paper is organised as below. Section 2 presents [research background where emerging](#) standards for
53 life cycle management of data are reviewed [along with best practice case studies. The background assists in
54 understanding the](#) concept [and structure](#) of asset information models [through the whole life cycle of asset
55 management.](#) Section 3 presents [methodological approach](#), followed by presentation of a system architecture that
56 integrates data from different disciplines. Section 5 explores opportunities for integration of Highways
57 maintenance and operations data with big data. Conclusions are drawn in Section 6.
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Project stages		
Design	Construction	Maintenance
Drawings creation	Indicating differences	Better data availability
Clash detection	Better management	Asset lifecycle monitoring
Time and Cost plans	Quick overview of changes	Asset condition management
Simulations and analysis	Progress monitoring	Traffic and diversion simulations

Figure 1: BIM relevance for Highways Design, Construction and Maintenance

2. RESEARCH BACKGROUND

While the value of capturing information from early project life cycle stages is starting to be realised, it is important for this information to be retained, enhanced and accessible at handover and in operations and maintenance stage of a facility. Handover stages are often associated with major information losses e.g. when project moves from construction to operations stage. Smooth flow of 'information' is of critical importance to make any collaborative system or modelling function effective. Capturing up-to-date and accurate information means the work that follows will be of value with waste reduced. For instance in road repair example, capturing information such as how road was it repaired, repair duration, used materials, cost, potential reasons for degradation (i.e. weather, increased traffic flow) etc. is a valuable knowledge base that can be taken into account on future projects. Accurate information can be fed into electronic collaborative workspaces, allowing Highways Administration and their supply chain to work together more efficiently. Specifications such as PAS 1192:3, which alongside PAS 1192:2, provide a structure for information management through the whole life cycle of asset management. PAS 1192:3 looks at the assets at operational level by creating an asset information model (BIM Task Group, 2013b). To use the model, the 'asset owning organisation' must identify their assets and numerous pieces of information about those assets to enable creation of the asset information model. A key element of this standard discusses information being available, transferable and having integrity. It includes how a Project Information Model (PIM) is transferred to become an Asset Management Model (AIM) (Mordue, 2013).

UK Government is also promoting use of Government Soft Landings Policy (GSL) (2012) to deliver smoother transition of information when project is handed over from design/construction to operations/maintenance stages. The client is involved from an early stage, engaging with design and construction teams to identify their requirements and expectations at the end of the process. This provides an opportunity to Highways Administration authorities to capture relevant information they require as they engage with their stakeholders, in order to meet varied expectations of Highways operations. Aforementioned initiatives provide necessary structures, which will inevitably help project teams deliver more efficient information as they are supported by a formal process and effective early engagement and support of the Client. Information in the final models will

naturally mature through the design and construction processes, provided the teams maintain it throughout and transition project information for handover.

Operation and maintenance manuals submitted at the conclusion of projects can sometimes be late, incomplete or submitted as volumes of paper where information is difficult to find and update. Use of BIM in this area, either by following PAS 1192:3 asset management model or Government Soft Landings, allows information to be collated with a greater chance of reusability at handover to the user/operator at project completions. Table 1 provides a summary of BIM usage [following the above mentioned standards](#) in road development schemes and discuss how integrated workflows and processes may support life cycle management of assets. [The two cases in the table highlight the benefits of a unified environment for data storage where various stakeholders have confidence in the accuracy and relevance in the information being exchanged among various parties.](#)

Table 1: Case study review

Case	Benefits Realised	Reference
<p>The A556 project</p> <p>The project objective is to transfer a 4.5 miles road into a modern dual carriageway. Project used Level 2 BIM throughout the project from design, construction to operation stage. Fully coordinated drawings were produced and cost information was integrated into the 3D model to achieve a 4D model. Moreover, 3D Modeling was used to develop a hazard risk register; capture accurate asset information; and collate built information of pavements, footways, lighting, ducting, drainage and structures, throughout the construction phase</p>	<ul style="list-style-type: none"> · Improved monitoring and scheduling · Improved road safety where the design team highlights any hazard & modify any error during the design stage · The cost integration facilitated the adoption of different target cost techniques during various project stages 	Knutt (2014)
<p>M25 Motorway</p> <p>Upgrade of the M25 orbital motorway in London for the Olympics in 2012 used BIM to create 3D models of infrastructure to an agreed level of detail. This information was required to enable the project to be delivered on a faster timescale than would typically be required for a scheme of this nature. With a number of stakeholders in the delivery team, the information/models from each discipline were integrated through Autodesk Navisworks which provided an opportunity to undertake clash detection exercise. The final BIM models were issued to the construction team for use on site with three quarter of staff having access to these models for use on a range of tasks including daily briefings and communicating design information. Having gone from an initial desire to create a buildable design that didn't have clashes, the result was a vast amount of useful data that could be attributed to objects and cost effectiveness.</p>	<ul style="list-style-type: none"> · The project collates vast amount of useable information which can be utilized in operation and maintenance phase after construction · Use of BIM in a project lifecycle where teams have come together and collaborated successfully · Cost reduction 	Burleigh (2012)

In the A556 project, the project the team is enabling a digital handover model to an Integrated Asset Management System (IAMS), which will replace 17 agency and suppliers systems within one single integrated system for operations management. Systems like drainage data management system, structure management

information system, and geotechnical data management system are all integrated within one Geographical Information System. The integrated system will hold information as asset attributes which define the characteristics of an individual asset. Moreover, IAMS endorses components to know what they are and where they are situated within the project. This offers massive benefits to the contractor when work starts on-site, as it allows employees to use 'iPads' to navigate to their position of work, inter- connecting with the master design. To enable IAMS, a digital handover was put in place. The process mainly utilised [Construction Operations Building Information Exchange \(COBIE\)](#) to allow different sources of information to be interoperable e.g. bridges and retaining were imported from Civil 3D to Revit, then families created and parameters identified. Files were then exported to IFC and to [COBIE](#). The process starts by capturing information from site digitally using mobile technology, the captured information will be stored in the cloud platform, and the information then will be transformed from different digital format into IFC and then [COBIE](#). The information is subsequently used to create AIM (Asset Information Model) which is used as a single source to store all information related to this project. AIM allows a smooth and easy way to search for any needed information during the operational phase of the asset.

Use of BIM in a project lifecycle where multiple stakeholders collaborate and produce vast of data. However, use of BIM in a project lifecycle is not the only data source, other systems (e.g. GIS, ERP etc.), stakeholders (such as contractors, subcontractors, client, suppliers etc.), site data collection technologies (such as RFIDs, wireless sensors etc.) and external data (web streams, social media, open data etc.) collate vast amount of data which can be utilized in operation and maintenance phase after construction. All this data creation and usage point to the four dimensions of Big Data: volume, variety, velocity and veracity (IBM, 2014). Data is considered 'Big' when it exceeds the capacity of traditional database management systems, doesn't fit in the structures of database architectures and posing challenges such as scalability, unstructured or semi-structured data, accessibility, real time analytics and fault tolerance (Satyanarayana, 2015). Managing this Big Data is critical where the Big Data movement seeks to glean intelligence from data (McAfee and Brynjolfsson, 2012) and to uncover patterns to guide decision makers using predictive and prescriptive analytics (Camm et al., 2015). For example, predictive modeling can be used for distribution of the performance variables to provide future maintenance needs, or to predict a single value for each performance variable and provide the location as well as volume of future maintenance (Taggart and Moss, 2016). Therefore, there is a need that in addition to leveraging BIM data for accurate maintenance of Highway assets, inventory and conditions, new opportunities as enabled by Big Data are also explored.

3. RESEARCH METHODOLOGICAL APPROACH

The encompassing theme of this research is emerging field of Big Data Analytics and its applications within Highways context This study employed different methods to provide a multi-faceted view of the problem area, both at specific Highways Scheme level as well as to understand broader issues faced by the industry. A literature review was initially performed to systematically gather information to identify and understand the problem domain. This literature along with discussed case studies became a starting point to understand role of BIM processes and technologies as a unified information exchange mechanisms through the asset life cycle.

Data management applications in other industries were also reviewed. Interviews were held with owner and contractors involved in Highways maintenance to develop a better understanding of key challenges. In total 10 interviews were conducted in a semi-structured manner, each lasting approximately an hour. Interviews were done to understand challenges in BIM Implementation on transportation infrastructure projects. Also, two industry workshops were organized. Each workshop involved over 50 participants and focus of each workshop was to understand BIM implementation challenges within Highways development projects and the role BIM can play in bridging inefficiencies resulting from loss of information at handover phases. The overall understanding lead to drawing up of user needs, gathering system requirements and eventually a system architecture design. Industry workshops were supported by a series of semi-structured interviews with industry experts, to provide an overview of key challenges encountered. Findings were used to identify Highway Sector needs for big data analytics and subsequent presentation of a system architecture is presented developed to address identified needs, to based on leverage ing-BIM for accurate maintenance of whole life cycle asset data, for accurate maintenance of Highway assets, inventory and conditions. Key objective is to account for accurate archival of assets that Highways agencies possess, their locations and performance levels. New opportunities as enabled by Big Data and a prototype demonstrator, as part of the proposed platform, are also discussed.

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4. SYSTEM ARCHITECTURE

Traditionally the design and construction of an asset has been regarded as a separate and distinct phase from its operation and maintenance. There are significant information losses as major Highways and road development schemes are handed over from Design and Construction team to Operations and Maintenance. Lack of consistent data management across project life cycle may result in data generated in Design and Construction phase not being compatible with asset management software. As a result, information may require re-formatting and re-entering. Also, gaps in information or incompatibility of data issues may only come to light at handover stage and result in delaying the handover. Also, more rigorous and time-consuming data checks may be required as asset managers have not had prior input and sign-off during the asset design and construction. All of this leads to poor management of data.

This section presents a system architecture and technology demonstrator based on having a single flow of information through the asset life cycle. As such, it enables end-to-end life cycle data management to enable Transportation agency and its suppliers to work alongside in a data driven environment from the scheme outset to its operations. A data driven approach enables a wide range of stakeholders to contribute to the development of the asset and the corresponding data is captured, developed and enriched in a consistent format. Interviews with Transportation agency and their supply chain highlighted that over past decade, there has been major investments in different types of reporting tools, IT and Enterprise Resource Management and back office systems. Very often accounting led software outputs are not well aligned with commercial and operational requirements of clients. Resulting fragmentation and inconsistent reporting has put enormous strains on operational and commercial teams. Resulting fragmentation affects key areas of business including reporting fragmentation, overlaps and duplication.

In developing the architecture (Fig 2), consideration has been given to the different types of data present in an asset's lifecycle - from the three dimensional physical data of the asset (augmented with it maintenance requirement) to the performance, cost and other data sets. These different types of data have been considered as layers which can be built up (one on top of another) to provide a multi-dimensional model and representation of the asset. Practically delivering this continuous and comprehensive flow of data requires a fully integrated approach in the deployment of technology.

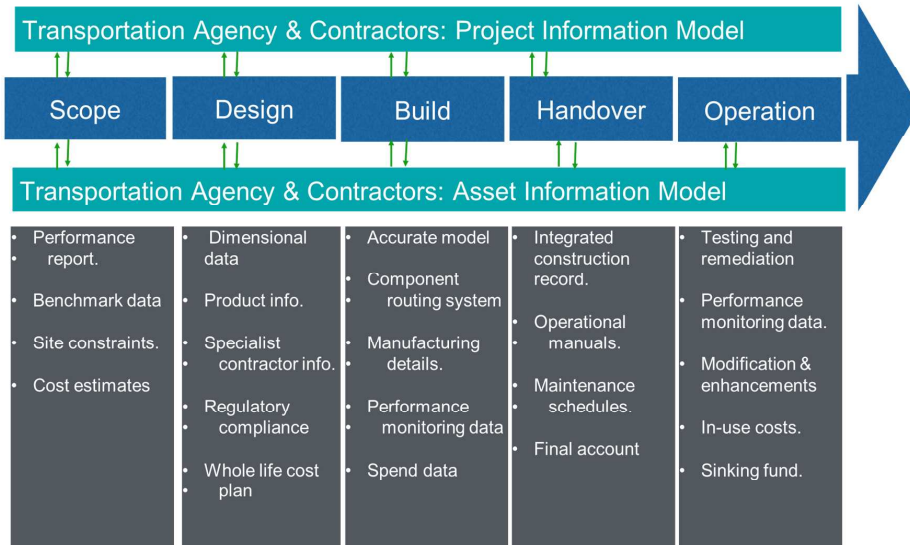


Figure 2: System Architecture

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7 The function of the technology platform is to be able to handle data at three levels: access; management and
8 form. Firstly, at the access level, central concept is that of a BIM technology hub, which acts as a data repository
9 for the asset concerned. In presented model, this is a physical server located at Transportation Authority with
10 cloud based computational 3D models hosted on a central server. This allows a fast and secure local area
11 network (LAN) access to be established for Transportation Authority and its suppliers, with remote access for
12 site based operatives. Asset Information Model is used to define a standard format of data and using industry
13 grade BIM software tools, data is generated and exchanged between multi-disciplinary teams. Common data
14 environment (CDE) provides a platform to allow the exchange of this data into and out of the hub from
15 stakeholders IT system. This CDE is enabled by languages and data protocols, such as Construction Operations
16 Building Information Exchange (COBIE) - allowing the exchange of information. Open source IFD information
17 (from catalogue or dictionary to detail asset component etc.) are used to allow data to be read by the platform
18 and made available to its users. Using information exchange standards such as PAS1192:2 and PAS1192:3, such
19 unified environment for data storage ensures stakeholders have confidence in the accuracy, completeness and
20 relevance in the information being exchanged across various parties. Cloud based computing, including pooled
21 computing resources and services delivered over the web, could provide an alternative to a central server located
22 at Transportation Authority. This would have the added benefit of requiring lower (and thus cheaper) processing
23 and ease of scalability if the system needs to be expanded. Concerns regarding the security and control of data
24 using a cloud based platform, however, must be addressed. In addition to designing an appropriate architecture
25 for the hardware and software platform, an additional layer of data management and control is needed to ensure
26 the effective operation and integrity of the model (see Fig 3). This extends beyond the protocols for organizing
27 data checking, verification and authorization. A key challenge faced by various Transportation agencies is that
28 there critical data is often maintained externally by their service providers. Often data management involves
29 various layers of bureaucracy within various IT departments. Consistent data flow supported by an Asset
30 Information Model could help enhance collaboration between various stakeholders. This signifies a departure
31 from the way traditional Electronic Data Management Systems (EDMS) operate. EDMS are file based - building
32 up larger archives of detailed files on a related subject, with access to that data via the directory or search term
33 and with limited cross referencing of the data. Using BIM and supporting standards, organizes information
34 graphically, layering detailing (beyond the three dimensions of the physical data to include additional dimension
35 of performance cost etc.) into 'meta data'. Data is simply retrieved, interrogated and updated by browsing and
36 entering the graphical models rather than searching a library of files. This will enable better life cycle decisions.
37 For instance, a civil engineer involve in road design will be able to analyse design models to quickly determine
38 whether the road geometry meets safety parameters for sight distance. Data integration will allow them to
39 consider not only the road layout, but also overlay this with other information which will impact on sight
40 distance such as the road camber, visual obstructions (such as central barriers) and road-side foliage. Any gaps in
41 the capability of the platform can be overcome by enhancing existing programmes by using plug-ins (e.g. which
42 provide details of new specification) or by using software development kit (SDK) to create bespoke additional
43 features and functionality. Users are able to interface with the platform using applications suitable for their work
44 so project managers may use application such as Primavera within the platform rather than the 3D model
45 orientated software that engineer would prefer. As such, the platform should be considered as a single integrated
46 approach which provides the 'back office' for managing data and information and is flexible in allowing the user
47 to interface with it based on their needs.

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49 Improving the quality of information across all asset classes (i.e. structural, pavement, drainage, geo-technical
50 works and technology) is a key to achieving operational efficiency and effectiveness. Augmenting asset data
51 with performance, operational and maintenance data will help create a useful knowledge management strategy.
52 This is enabled through continuous data capture related to the asset post construction, to provide an up-to-date
53 and enriched data, captured from road-side sensors, hand held devices which record the activity of operational
54 staff, drones which provide aerial surveys of the assets, and sensor data which monitors performance of the asset
55 and enhancements / maintenance works carried out using the platform. It is acknowledged that some of the
56 historical asset data will not be in a format that can be readily uploaded to the platform (see Fig 4). There are
57 various tools (such as document imaging software) that are able to convert this information for uploading. When
58 responding to either planned or responsive maintenance on drainage, the platform can be relied upon to generate
59 data on the specific drainage system, the components used and its GIS location. This will allow operatives or
60 contractors to arrive on site with the relevant knowledge and components to accurately excavate the relevant part
of the drainage and make the repair. This work, in turn, can be captured by the platform using hand held on other

mobile devices, ensuring information remains up-to-date.

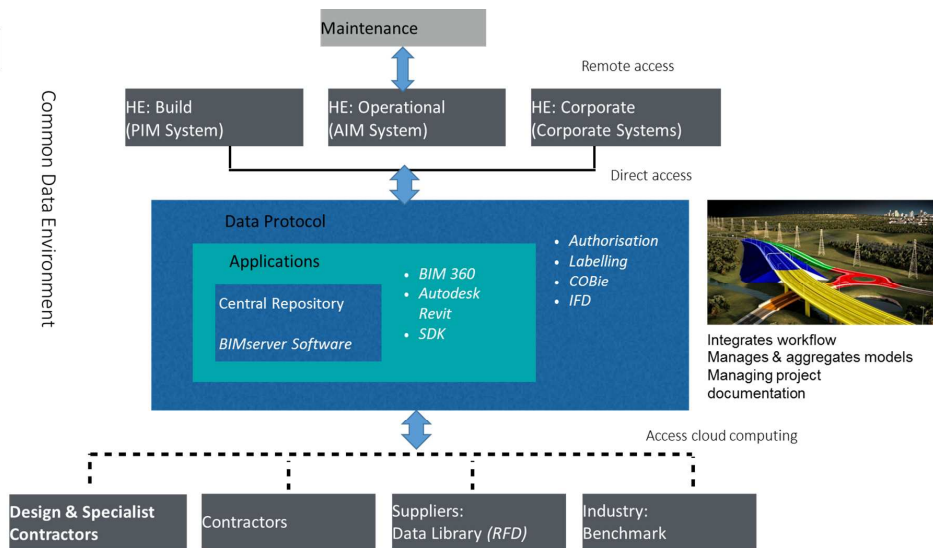


Figure 3: Integrated Data Environment

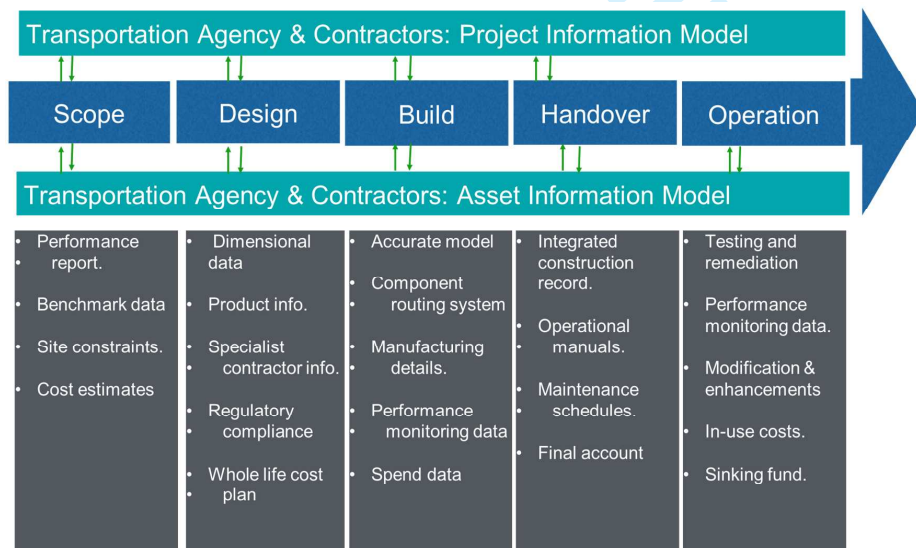


Figure 4: Data Management

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7 Effective asset management will allow for an asset that is fit for purpose and can be readily and cost effectively
8 operated and maintained. This is achieved by defining standard asset information model, enabling early and
9 continuous intervention by all of the relevant stakeholders and avoiding handover stage data losses. Having high
10 quality, up-to-date data and information can be used to drive decision making and activity, particularly as this
11 data is in a user-friendly visual format.

12 **5. INTEGRATION HIGHWAY MAINTENANCE AND OPERATIONS DATA WITH BIG DATA/ 13 OPEN DATA OPPORTUNITIES**

14 Effective Road network management involves collection and analysis of vast amounts of data from a variety of
15 sources including live traffic data, infrastructure data and operational and maintenance records. Recent growth in
16 open data/big data analytics and data integration technologies provides new opportunities to optimise operations
17 of Highways Infrastructure (e.g. use of cameras and sensors to monitor real time traffic flow, speed and travel
18 times, GPS data to monitor journey times, data from telecom operators/social media apps to develop better
19 understanding of journey patterns, asset data on condition of roads, etc). Opening up data (infrastructure related
20 and network management) and linking it up with data from different sources provide new opportunities for
21 optimisation. (e.g. road asset maintenance, cross-asset comparisons, provision of better information to road
22 users, etc.).

23 Different data types are classified as below:

- 24 • **Traffic Data Collected through Fixed sensors** e.g. loop detectors which captures traffic data through
25 wires embedded in the road or through cameras. It can measure congestion data.
- 26 • **Traffic Data Collected through Mobile sensors:** This include data collected through mobile phones
27 via Bluetooth/telecom operators, satellite navigation, or onboard vehicle navigation systems. Could be
28 used to capture key parameters such as time of travel, journey pattern, general speed on the road, and
29 understanding of transportation key decisions.
- 30 • **Road Asset Data:** Accurate record of assets to optimise operations and maintenance. Big data offers
31 new opportunities to investigate predictive analytics and analyse historical data. Recent applications
32 include use of Ground Penetrating radars to maintain accurate records of road surface condition right to
33 base layers, use of mobile ICT to capture on-site road condition data, use of crowdsourcing to obtain
34 information about state of assets e.g. journey time captured through mobile apps.
- 35 • **Open Data:** UK government is producing significant amount of open data which is made available
36 through open data portal (www.data.gov.uk). Datasets from this portal also offer opportunities for
37 analysis and data visualization. Some examples of such datasets are: road safety data, road traffic
38 counts, road casualties and accident data, road statistics (traffic, speeds and congestion), road
39 conditions, road length statistics, out door air quality data, air pollutant and monthly/historical
40 meteorological data for asset maintenance etc.

41 **5a. Hadoop Framework for Highway Road Asset and Traffic Management Data**

42 In UK, Smart Motorway Programme has been used to collect data from wide range of sensors (e.g. cameras,
43 CCTV, traffic sensors) to monitor traffic data and adjust speed limit to optimise traffic flow (Inrix, 2012). With
44 the rapid advancements in sensor technologies, in nowadays different types of RFID tags and wireless sensors
45 are deployed in highways for asset management (Alavi et al., 2016). The problem is how to deal with the huge
46 amount of data in an efficient way that has been collected from RFID readers, sensor gateways, mobile devices
47 and open data repositories to transform it to meaningful information and to integrate it with BIM for effective
48 visualizations that can be used by asset managers for management and monitoring of assets. The huge amount of
49 data from multiple sources and their volume would be extremely enormous to the scale of the so called Big Data
50 that can be analyzed by utilizing cloud computing technology (Zhou et al., 2016). The technology of cloud
51 computing has merged to deal with the problem of big data storage and processing (Assunção et al., 2015).
52 Among various open source cloud computing platforms, Hadoop is chosen to give to solution for BIM based
53 assets management. Hadoop was created by Doug Cutting, the creator of Apache Lucene and best known for
54 MapReduce and its distributed filesystem (HDFS) (Ghazi and Gangodkar, 2015). Hadoop has its origins in
55 Apache Nutch, an open source web search engine, itself a part of the Lucene project (Ghazi and Gangodkar,
56 2015). System architecture based on BIM and Hadoop platform is illustrated in Fig 5. The real-time and historic
57 data is collated from several systems and managed by a big data server (Hadoop cluster), which has high
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availability and fault tolerance capabilities and is equipped to handle a large volume and variety of data (Maitrey and Jha, 2015). External information system such as Geographical Information Systems (GIS) is integrated with the BIM server to provide the localization of real time assets of a highway. To take a benefit of the parallel processing that Hadoop provides, query for data extraction will be executed as a MapReduce job. Map Reduce is a distributed data processing model and execution environment that works by breaking the query processing into two phases: the map phase and the reduce phase (Jach et al., 2015). Whereas, HBase a Hadoop application, is a distributed column-oriented database built on top of HDFS and is used to query large datasets in real time (Qiu et al., 2011). HBase is not relational and does not support SQL, but it is able to do what an RDBMS cannot: host very large, sparsely populated tables created from different data sources on clusters made from commodity hardware (Lee et al., 2015).

5b. Connectivity and data exchanges of BIM objects with Hadoop Cluster

First of all, data from all sources that is logically mapped to BIM objects will be uploaded to HDFC via TCP connection. A TCP connection is established to the data server (Hadoop cluster) with the server's IP address and port number by executing a program written in Java. After a data file is successfully uploaded, the sensor application may move on to upload the next file and this process will keep on going until it reaches the upper limit of files. As soon as number of uploaded files reaches the defined upper limit, the TCP socket will be closed and MapReduce task will be triggered. To extract only the desired sensor data from data files, MapReduce will extract and then insert data to the HBase database system. The sensor data is inserted according to the column name it belongs to. A dynamic data connection is established between BIM server and Hadoop cluster. Proposed system GUI is invoked as a Revit Add In from Revit Structures GUI, using "External Tools" option. A self-updating GUI is displayed with real-time sensor data. BIM plays a significant role in this process since the sensor data of the highways is populated with relevant parametric data from the BIM software. The asset manager can select the desired junction using its unique ID which will display its BIM model and information from the embedded sensors in that location. Establishing a data link that uniquely ties sensed data to a highway junction is all that is required to pair collected data to the space that it describes. Asset managers can connect to BIM server either by standard web browser or an Android Application that is developed to visualize the collected data from the data server. In addition, job scheduler application is also designed to automate the process of data acquisition.

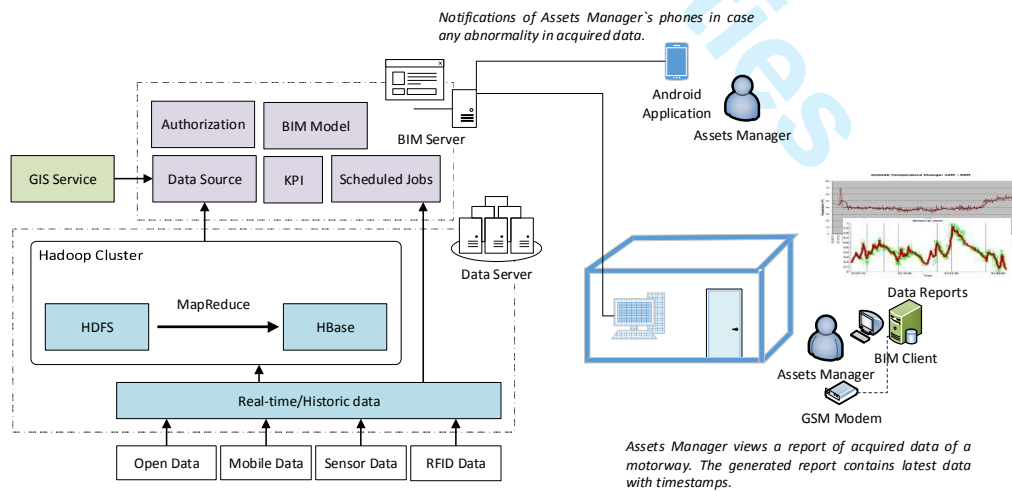


Figure 5: Hadoop and BIM Integration for Asset Management

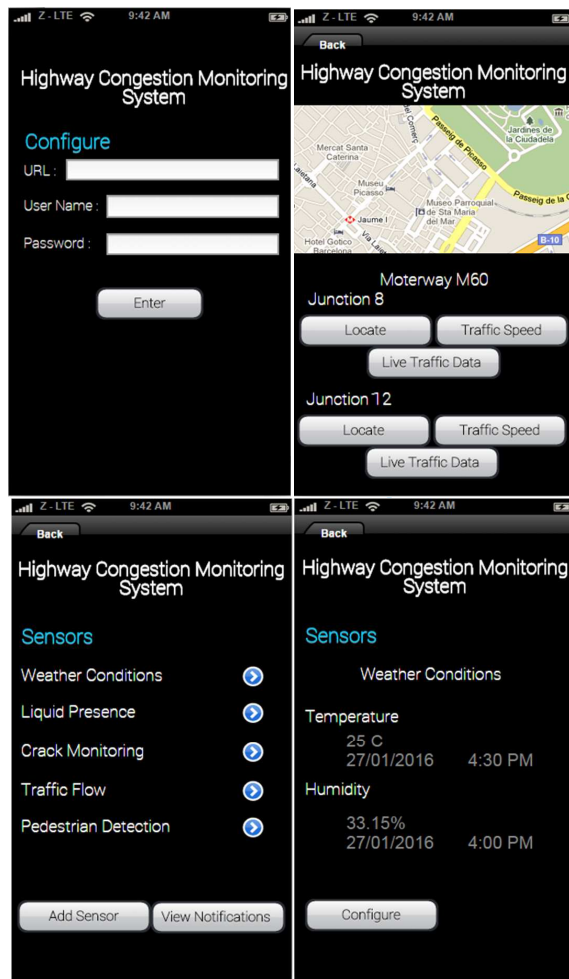


Figure 6: Highway Congestion Monitoring System Android Application

5c. Prototype Mobile Application

To keep updated with the acquired data, system should not only manage data acquisition from sensors but also synchronization and provide GUI to asset managers to remotely monitor data of a motorway and its assets. In order to do so, an Android based application is necessary. An Android based platform is chosen because of its free, open source and powerful software development kit (Janpla et al., 2015). Android prototype application, as part of the proposed platform, is designed using Eclipse and it is tested in Android Virtual Device (AVD). Eclipse is an integrated development environment (IDE) contains a base workspace and an extensible plug-in system for customizing the environment (Chopvitayakun, 2015). Written mostly in Java, Eclipse is used to develop applications. Wi-Fi (standard IEEE 802.11) is used for connectivity with a web database and access to database is protected with a username and password. Developed Android application has several functions which

are: locating a motorway using “Google Maps”, displaying live traffic data and traffic speed to avoid time sensitive emergency situations occurring on a motorway. The screen shots taken from AVD are shown in Fig 6.

6. DISCUSSION AND CONCLUSIONS

Building Information Modelling (BIM) ~~supported by Big Data analytics has the potential to is~~ revolutionizing the way assets are conceived, designed, built and operated (Davis and Sharp, 2014). The success of BIM, however, depends on the effective integration of its three components: people, process and technology. This paper focused more on technology aspects related to life cycle data management. More specifically, it is concerned with ~~proposing~~ a platform that integrates the various technologies and systems of Highways Authority and its supply chain, to allow for continuous flow of data throughout an asset’s life-cycle, leading to seamless, collaborative and effecting working. The developed prototype application investigates the integration of BIM with Hadoop framework for Highway road asset and traffic data management. It aims to reduce whole-life costs of Highways through better real-time monitoring and to provide operatives or contractors with relevant knowledge.

Implementing a new technology platform to enable life cycle data management using BIM will have its challenges, but this will be outweighed by the significant benefits that can be realised with such an approach, particularly in relations to effectively delivering their programme of work whilst realising significant cost savings and multifaceted targets such as environmental, safety and road congestion reduction. Effective data management could provide transportation authorities data agility and could enable them to meet the ever-increasing demands on the road network. ~~With constant influx of data emanating from numerous sources, big data analytics provide a promising tool to support critical decision-making decision-making within data rich environments. However, from expert opinion drawn from interviews within this research, it appears industry is slow to capitalise on emerging application scenarios and possibilities resulting from increasing volume, velocity and variety of data. Big data topic can mistakenly narrated as the remedy of unstructured data related problems within the industry industry or an emerging technology buzz word. Extracting true value from Big Data will require significant investments.investments supported by changed mindset and required skill sets. Existing contractual models and very fragmented structure of the industry could hinder data sharing and analytics among different parties. This requires industry and academia to work together to develop and drive a business case for BIM driven big data analytics for the indusdry.~~

As with any major change in the way of working, there will be several barriers and challenges to overcome in order to effectively implement the proposed platform. There are considerable costs involved in installing a new BIM based technology platform (relating to the outlay for the associated hardware, software and set up) and also the re-training of users to be able to effectively use that system. Use of Common Data Environment and COBIE standards could be seen as problematic by asset managers, who may see legacy systems being compromised through integration with larger BIM based technology platform. Standardising data and establishing new protocols for data management may require clear commitment from the workforce right from design and conception to asset management. Move towards integrated data management will involve major organizational cultural change. Resistance from various groups from within Transportation Agency or its supply chain may provide a barrier towards more collaborative way of working. ~~However, s~~Such barriers are not insurmountable, and will require a forward looking leadership and clear vision. Introducing a data management approach which enables collaboration along with the other benefits, ~~leading to cultural change in the mindset, supported by investments in technology infrastructure and skillsets,~~ will act as a motivation to overcome resistance and sensitively handle re-organising working habits and protocols.

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Response to Reviewer's Comments

Authors will like to thank reviewers for their comments and useful insights. We have revised the paper based on comments received. Following Table presents response to reviewer's comments.

Reviewers Comments to Author	Authors Response to Reviewer's Comments
<p>1. While the introduction section sets the scene for the paper, the word proposing a platform seems more appropriate than providing a platform. The last paragraph of this section is merely a content list of the paper, showing how these sections will add value to one another. For example, if emerging standards are to be discussed, how such discussion will benefit the forthcoming steps. Also, methodological approach would be more appropriate to use, than methodology.</p>	<p>Many thanks for Reviewers comment. This comment has now been addressed in the revision with suggestion on providing a platform removed from the paper. Last paragraph of Section 1 has been rewritten to indicate connectivity between various Sections.</p>
<p>2. State of the art review. It is not clear what added value table 1 brings to the paper. Which elements of these case studies actually feed into the methodology section? What is the underpinning theory that underpins the methodology? It seems that the methodology sets off by itself, without relying on the findings from literature. What is the methodology? The workshops, interviews etc... what were their objectives, how were they planned, did they have a timeline? What were the findings from these</p>	<p>Table 1 presents two relevant case studies linking conceptual discussion with practical application. Section 3 has been rewritten to address various comments raised by the reviewer.</p>

workshops that fed into the proposed platform?	
3. The system architecture section could have kicked off by itself, without the previous parts of the paper. There is not clear methodological steps or rationale behind the development of the system architecture.	Detailed discussion has been added in Section 4 prior to presentation of the system architecture. Also, Section 3 discusses how identification of user needs in earlier phases of research laid basis for development of system architecture.
4. Please be consistent with the use of terms. While in parts of the paper you make reference to a platform, in other parts you call is a prototype application.	This has been addressed in paper revision. . Word prototype is used where ‘prototype’ is presented and use of “platform” has been eliminated to avoid any confusion.
In general, I feel there is enough meat in this paper. However, the paper could be marginally improved by displaying the pre-development stages of the proposed system, then the developmental stages, with a description of the post developmental stages.	Paper presents a conceptual discussion. Various stages of development have been addressed within Section 3 and 4.
<p>The literature review and the paper's link to the past works are weak. The referencing to empirical academic works in the field is scarce, particularly in the introduction and state of the art review sections. The paper fails to show the gap or the base of its argument from the literature. For instance,</p> <ul style="list-style-type: none"> - How did you identify the categories for the data required for smooth operation of Highways? - Very little discussion based on the 	Thank you for identifying the gap. Literature review has been updated. A discussion on big data and analytics has been added and the reference list has also been updated.

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<p>1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30 31 32 33 34 35 36 37 38 39</p> <p>main Big Data literature body. What is actually s Big Data? What are the concerns/challenges before it? What types of analytics/ implementations can potentially yield what benefits?</p> <p>- Any past references that show/discuss the benefits of using life-cycle data in asset management (buildings, highways etc)</p> <p>- Beyond government task groups' reports and BIM specs, the paper seems to have overlooked the accumulating literature on the use of BIM in asset management and handover (could also be for building assets).</p> <p>- No specific discussion on how highways asset maintenance/handover is different from or similar to building asset management/handover in terms of data requirements and management, in which comparatively more academic works on the subject could be found.</p>	
<p>40 41 42 43 44</p> <p>- Please ensure that the in-text references match with the references in your references section.</p>	<p>All references have been checked to ensure alignment.</p>
<p>45 46 47 48 49 50 51 52 53 54 55 56 57 58 59 60</p> <p>3. Methodology: Is the paper's argument built on an appropriate base of theory, concepts, or other ideas? Has the research or equivalent intellectual work on which the paper is based been well designed? Are the methods employed appropriate?: The</p>	<p>Section 3 has been revised to address comments made by reviewers.</p>

<p>1 2 3 methodology section is too brief to 4 answer the following questions: 5 6 7 - How did you perform the systematic 8 literature review? What kind of a 9 system was used? What journals, 10 keywords etc were employed in your 11 systematic review? 12 13 14 - How did you review the data 15 management applications in other 16 industries? What industries are they? 17 How was the review performed? 18 19 20 21 - What is the profile of your 22 interviewees? 23 24 25 - How was the research process? 26 27 28 - What findings were collated from 29 what data resources to argue what? 30 31 32 33</p>	
<p>34 4. Results: Are results presented 35 clearly and analysed appropriately? 36 Do the conclusions adequately tie 37 together the other elements of the 38 paper?: - A framework and a mock 39 prototype were proposed for further 40 analysis/research. 41 42 43 44 - How did you validate your proposed 45 system? Elaborate a bit on the 46 requirement analysis effort please? 47 48 49 50 - Also, the proposed owners and 51 responsible of data are not clear. 52 What data in what phase of the 53 project delivery (design and 54</p>	<p>Further details have been added in Section 5 to address reviewer comments. See tracked changes.</p>

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<p>construction will be required)?</p> <ul style="list-style-type: none"> - The most important part of Big Data discussions is not clear however; what kind of data analytics is proposed in terms of analysis techniques and expected value? In other words, beyond the hardware and data collection means/ data resources (sensors, mobile devices etc), what will be the analytics part? What will be the expected hidden trends/findings from the analytics? Predictive maintenance? maintenance resource allocation? decision making framework creation? The value of the analytics is not clear. - How the data handover will be managed? -How about the return of investment (ROI); what could be the expected benefits and their monetary return? - Many technical terminology and some buzzwords (BIM Level 3, Hadoop Server, Big Data etc); However, no proper discussion of the technical and managerial challenges before the application of the proposed prototype. Data privacy issues, contractual systems/ project delivery methods, trained people requirements etc etc ?? - What do you suggest for future actions/ research? 	
<p>5. Implications for research, practice and/or society: Does the paper</p>	

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3 identify clearly any implications for
4 research, practice and/or society?
5 Does the paper bridge the gap
6 between theory and practice? How
7 can the research be used in practice
8 (economic and commercial impact),
9 in teaching, to influence public
10 policy, in research (contributing to
11 the body of knowledge)? What is the
12 impact upon society (influencing
13 public attitudes, affecting quality of
14 life)? Are these implications
15 consistent with the findings and
16 conclusions of the paper?: With the
17 constant influx of data from many
18 different resources, Big Data
19 analytics present a promising tool for
20 decision making in data rich
21 environments. Despite the ever
22 increasing volume, velocity and
23 variety of construction/asset
24 management data, the industry has
25 been slow in taking on the main
26 stream Big Data discussion, which is
27 in part fuelled by consultants and
28 large vendors. Also, the topic can
29 sometimes be treated superficially as
30 some sort of a buzz word and
31 mistakenly narrated as the remedy for
32 data related problems in the industry.
33 Extracting value from Big Data
34 analytics requires significant
35 investment with qualified workforce,
36 and the business case is just not there
37 for the industry still. Also, the
38 structure of the industry can hinder
39 data sharing and analytics among
40 different parties.

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54 This paper is interesting in the way
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Many thanks for useful comments by reviewers. We have made changes within various Sections of the paper as outlined above to address changes suggested by reviewer. Also, Discussion and conclusions Section has been rewritten to address identified changes.

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3 that it underlies the promising
4 potential of Big Data in asset
5 management efforts in highways with
6 a proposed architecture/ mock
7 system. However, many critical
8 issues as underlined above were
9 overlooked with the methodology
10 section and literature review sections
11 remaining quite weak.

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14 Therefore, it is hard to base the
15 discussion on past academic works
16 and to understand how the arguments
17 in the paper were developed. It is also
18 unclear what concrete benefits will be
19 gained for the asset management
20 practices supported by Big Data
21 analytics. Will it be worth the
22 investment? What should we
23 anticipate in that sense? If those
24 critical matters are not addressed
25 properly, the discussion on Big Data
26 will remain elusive for the industry.
27 Considering the industry is quite hard
28 benefit oriented and practical, if one
29 falls short in demonstrating the value
30 of Big Data, It will be hard to get the
31 industry's real buy-in to turn
32 conceptual architectures/ mock
33 models into working practices. It is
34 more about the analytics and
35 identifying the unseen trends than the
36 database systems and data collection
37 means.

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40 It is an area with potential for the
41 maintenance of assets. Thank you
42 very much for the interesting paper.
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52 A thorough proof-reading is highly
53 recommended. Many grammatical
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Paper has been thoroughly read to
address grammatical errors and

errors and typos were identified.
Those errors affect the
communication quality of the paper.
Please carefully read through the
paper from start to finish and improve
the language quality. Specific
examples can be given from the paper
if required.

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Facilities

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