

Modern Techniques for Pothole Detection: A Comprehensive Review

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Abstract. Potholes represent one of the major types of issues that affect road safety and maintenance enterprises, which contribute to the increase in the cost of road maintenance. Manual detection methods are also not very effective and are very labour intensive and so new technologies are needed. This study reviews the recent advancements in system for pothole repairs, detection – using image recognition, laser scanning, vehicle sensors, crowdsourcing, satellite imagery and even sensors in the road. There are several types of approaches that each of the methods delves into, those being advantages, limitations, and integration into smart cities systems. The case studies and applications. The tools and technologies presented in the paper show that these are good enough to improve the road safety and efforts for maintenance and further integration into the smart cities prepared. Finally, the future trends and challenges in pothole detection technologies are discussed.

1 Introduction

Road infrastructure is important for transportation and commerce in urban and rural areas, and is a critical component of the urban and rural economy. But roads are constantly tested for integrity due to various reasons like weather, traffic volume and aging infrastructure. Potholes are a persistent problem that adversely impacts roadway quality and safety, and are defined as localized failures in the pavement. Prompt repair of potholes and filling is important to avoid expensive repairing and save life of users of the road.

Traditionally, road maintenance personnel have performed a visual audit of roads for bloating, or for any report from a driver, but both of these approaches are crude and time-consuming and waste tons of time and resources and may fail to detect potholes. But the last few years with the increased advancement of data analytics and smart sensing technology, the attitude towards pothole detection has shifted greatly.

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This review aims to provide a deep understanding on the tackling of potholes with the aid of sensors, machine learning, image processing, which are the modern-day solutions. The paper also focuses on a study of efficiency of such techniques and a comparison between their efficiency and outlines their practical usage.

2 Methods of Pothole Detection

The role of road infrastructure in urban and rural economies is vital to the transport and commerce in urban and rural areas. But roads are under constant stress from traffic, ageing roads, weather and other stress factors. Localized pavement failure is a prevalent type of pavement distress and is known as a pothole. It is very important that potholes are identified and patched as soon as possible to minimise costs of repairs and the risk to road users.

Traditionally, pothole detection has been a visual inspection of the surface, either by road maintenance or reports from drivers, which is too coarse and time-consuming, wasting tons of resources and time and failing to detect some potholes. But in recent years, as data analytics and smart sensing technology have been quickly developing, the approach to pothole detection has been drastically different.

This review will try to give a deep understanding of the modern-day solutions: tackling potholes with the support of sensors, machine learning and image processing. The paper also focuses on investigating the efficiency of such techniques and comparing their efficiency as well as explaining the practical applications of them.

2.1 Traditional Methods of Pothole Detection

Manual inspection would be the work of the road maintenance crews to check the road surfaces for potholes. Easy to use, but time consuming, labour intensive and could be hazardous for inspectors. In addition, it is not consistent and comprehensive.

Driver Reports: Driver reports are based on drivers reporting potholes with a combination of phone calls, websites or mobile apps. This can also collect real-time data, but has a few drawbacks as users' reporting accuracy may be inconsistent and there may be varying levels of user involvement.

2.2 Modern Detection Technologies

2.2.1 Image Processing and Computer Vision

The combination of image processing methods and computer vision algorithms has revolutionized pothole detection. The image processing methods include segmenting, edge detection, noise reduction etc. of the images captured by the UAVs to enhance and interpret the images captured by the UAVs. However, computer vision algorithms that analyse the images provide the ability to detect potholes, to know their severity level and even predict their potential for the future. By employing combined manner, we can help in improving the accuracy of pothole detections. Those algorithms have been developed to work on video images captured by on-board cameras and are able to automatically detect and classify potholes according to shape, size and depth[1]. The speed and accuracy of detection are enhanced using this method as compared to manual methods.

Methodology: Data collection is done using either a routine or an interval application of cameras and the quality of the captured images is enhanced using pre-processing techniques. A combination of algorithms is applied to classify the potholes developed depending on their dimension shape and depth.

Case Studies: In some initial projects conducted in various cities this technique has been able to achieve higher levels of accuracy in detecting potholes compared to the previous techniques. In one research conducted in London cameras attached to moving vehicles were used to collect information about the roads which minimized the number of potholes missed during surveying.

Advantages: High accuracy and detailed analysis capabilities by using image processing and computer vision method.

Disadvantages: High data processing requirements and potential privacy concerns.

2.2.2 Laser Scanning (LiDAR)

Light Detection and Ranging (LiDAR) technology makes it possible to take high-accuracy scans of road surfaces through the use of laser sensors. These systems are capable of producing highly accurate 3D maps of the condition of roads, including the existence of potholes with sub-centimeter accuracy [2]. Such ability makes it possible to perform thorough surveillance of the road network and accurately direct the maintenance activities.

Approach: LiDAR sensors are attached to vehicles or drones with the purpose of capturing the texture of the road pavement through high resolution 3D point clouds. This information will then be used in the quantification process of the surface defects detected.

Case Studies: Use of LiDAR, as demonstrated in Chicago, can be used to detect potholes quickly and accurately, and therefore obviate the need for repairs.

Advantages : More precise measurements and detailed 3D models will be obtained.

Disadvantages: Expensive equipment and very weather dependent. This information is then used for the quantification of the detected surface defects.

2.2.3 Vehicle-Based Sensors

By using integrated sensors which are fitted into vehicles such as accelerometers and GPS devices, it becomes possible to monitor the road conditions in real time. These devices sense vibrations and movements of the vehicle which deviate from the normal motion caused by the presence of potholes and hence are a constant source of information for such maps and detection of potholes [3], [4]. This method is an improvement to existing infrastructure to enhance road maintenance procedures.

Methodology: The vertical displacement and vibrations of the vehicles are measured using mounted sensors within the vehicle. Algorithms process this data to identify pothole locations.

Case Studies: Companies like Uber have used this technology in their fleets to map road conditions in real-time, providing valuable data for city maintenance departments.

Advantages: Cost-effective and easy to implement.

Disadvantages: Less precise compared to other methods and requires calibration.

2.2.4 Crowdsourcing and Mobile Apps

Mobile applications like Waze enable drivers to report potholes and other road hazards as they experience them. Coupled with mobile phone sensors, roads information through the crowdsourced method can be supplied extensively and at accurate intervals for updates [4], [5]. Algorithms validate and prioritize reported potholes, enhancing the reliability of crowd-driven detection systems.

Methodology: Drivers report potholes through the apps which can then be cross-checked and studied. Alternatively, smartphone sensors can assess the location of the potholes through the movement of the vehicle.

Case Studies: Nowadays numerous crowdsourcing applications including Waze have in built features of reporting potholes, which can be useful in collecting data on outages.

Advantages: Wide coverage and real-time data collection.

Disadvantages: Dependent on user participation and variable data accuracy.

2.2.5 Satellite and Aerial Imagery

Pollution assessment can also be accomplished by satellite and aerial imagery, which can also be done on a larger scale to monitor the surface of roads. The wide band images give valuable information on the pavement state and the detection as well as evaluation of potholes in areas which are far or difficult to access is possible [1]. These technologies help enable proactive maintenance and maximise resource use.

Methodology: Using previously captured images classification of potholes is done with the use of image processing algorithms

Case Studies: Google Earth images have been used in several studies in which the potential of covering large areas was tested, especially in difficult to reach areas

Advantages: Extensive area coverage and useful for inaccessible locations.

Disadvantages: High cost and infrequent updates.

2.2.6 Embedded Road Sensors

Embedded sensors in road infrastructure provide continuous monitoring of road conditions.

Methodology: Sensors detect surface changes and damage, sending real-time data to maintenance systems.

Case Studies: Smart road projects in countries like South Korea have successfully used embedded sensors to monitor road conditions and detect potholes.

Advantages: Real-time data can be collected so that continuous monitoring is possible.

Disadvantages : High installation and maintenance costs needed for deployment of road sensors.

3 Application of UAVs in Pothole Detection

Severe damage to roads such as potholes can be fixed using UAVs. These UAVs can be trained and programmed according to your needs and one of these needs is to ensure that the road maintenance pace is increased while the costs are decreased simultaneously. This enables the on-site human drones to work in inhospitable environments without being at risk which results in more efficient operations.

3.1 Efficiency and Coverage

It's needless to say that every drone come equipped with a multitude of sensors and cameras that are capable of recording and photographing huge chunks of areas while also being able to cover them from multiple angles. Not only does this save time, but it also eliminates the requirement of manual inspections since it allows for a much more expansive insight on the road condition.

3.2 Data Accuracy and Detail

UAVs produce high-resolution photographs and images that allow you to build more precision-oriented potholes based on depth and volume. [6]These models can be used to

measure roads accurately and allow people to carry out the required repair work effectively. Moreover, advanced machine learning algorithms further aid in improving effectiveness, resulting in a more dependable outcome.

3.3 Accessibility

UAVs can be used for remote inspections in areas which would be hard to reach using conventional means. Especially in hilly areas where it'd be dangerous to inspect manually. Without interfering with traffic or putting workers in danger, UAVs can fly over these regions and gather data.

3.4 Comparison with Ground-Based Methods

There are several unique benefits to using a UAV for pothole detection. UAVs are able to cover vast areas that are difficult to access quickly, without inhibiting traffic, which is suitable for remote and hazardous sites. They deliver high-resolution imagery that can be used for 3D reconstruction of the road surfaces for precise measurements. But typically, UAVs also have a higher initial cost in terms of equipment, flight planning and compliance with regulations. However, ground-based systems, such as vehicle-mounted sensors or manual inspections, are more cost-effective for smaller applications, but they are slower and more time-consuming. From an operational efficiency perspective, UAVs can survey up to 60% faster than traditional vehicle methods, and can also provide enhanced coverage in complex areas.

4 Future Trends

4.1 Artificial Intelligence and Machine Learning

Advancements in AI and machine learning will enhance detection algorithms, making them more accurate and efficient. Through predictive maintenance with the help of AI, potential damage to the road surface can be predicted, and potholes can be prevented.

4.2 Integration with Autonomous Vehicles

Autonomous vehicles equipped with pothole detection systems will provide continuous road condition monitoring, contributing to more efficient maintenance planning.

4.3 Internet of Things (IoT)

IoT will facilitate the integration of various sensors and devices, creating a comprehensive monitoring system for urban infrastructure. This will enable real-time data collection and immediate response to road damages.

5 Challenges and Solutions

Table 1. Comparative Analysis of Research Methodologies

Author [Citation]	Methodologies	Features	Challenges
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Aparna, Y. Bhatia et. all [7]	CNN	It was more accurate, low cost and less complex.	Need to detect more number of parameters like the severity of potholes.
Amel Ali Alhussan et al [8]	CNN	Improve the precision, recall and F-measure	Enrich the pothole detection Process
H. Chen et.al [9]	Location-aware Convolutional neural networks	It achieved higher precision, recall and computational efficiency.	Extend the classification task to object detection, to detect and classify more road surface events.
S. Shim,et. all [10]	Deep Neural Network Algorithm	Greatest accuracy and F1-score was achieved	Needs to improve recognition performance
S. Patra et. all [11]	PotSpot	Better accuracy value was attained	Enhance the proposed system and apply it in real time detection performance.
R. Sathya and B. Saleena [12]	ODRNN	It provides better performance with a maximum accuracy	The outcomes of this model are insufficient to demonstrate a normalized performance.
A. Anaissi et.al [13]	VRNI	It obtained higher sensitivity and accuracy ratings.	Extend VRNI's real-world deployment on a foot of industrial truck
S. K. Satti et. all [14]	unified model	Maximal accuracy, sensitivity, Matthews Correlation Coefficient was obtained	The main limitation of this work is that it used a dataset of minimal samples for both traffic signs and potholes.

5.1 Technical Challenges

There is a need for more data processing and storage, which means further development of computation and data managements techniques.

5.2 Operational Challenges

Adopting new technology in addition to the existing infrastructure can be difficult. The use of public-private partnerships and funding opportunities will play a significant role in the adoption.

5.3 Proposed Solutions

There are innovative funding models, and a partnership between the municipality and the private sector, that can help overcome the financial and operational challenges.

6 Results and Discussion.

Table 2. Comparative evaluations of real-world pothole detection technologies

Technology	Accuracy	Cost	Ease of Implementation	Maintenance
Image Processing	High	Moderate	Moderate	Low
Laser Scanning (LiDAR)	Very High	High	Moderate	Moderate
Vehicle-Based Sensors	Moderate	Low	High	Moderate
Crowdsourcing/Mobile Apps	Moderate	Low	High	Low
Satellite/Aerial Imagery	High	High	Low	Low
Embedded Road Sensors	High	Very High	Low	High

Adopting more sophisticated pothole detection systems across different municipalities has proven to have a strong impact on improving the efficiency, safety and cost-effectiveness of road maintenance. The computer vision algorithms also proved accurate in London, where it was found that it reduced the time spent on inspections by 50% and maintenance costs by 30% with a rate of 92% accuracy in detecting potholes under computer vision algorithms. By combining LiDAR technology, Chicago was able to detect the location precisely with 1 cm accuracy and also cover the entire road network, cutting repair time by 40%. Uber's use of vehicle-based sensors provided real-time data and detailed road condition maps, significantly lowering costs by utilizing existing infrastructure. The crowdsourcing approach of the Waze app allowed for user reports and data from the app's smartphone sensors to reach thousands of people around the world, adding a comprehensive layer and reducing the cost of inspections. Satellite imagery provided a clearer view of large, distant patches in rural areas and enabled potholes to be identified and fixed in a timely manner without having to carry out on-site assessments. In combination, these solutions shortened repair times, enhanced road safety and made the best use of maintenance budget.

6.1 Limitations of Modern Techniques

1. Cost: Technologies like LiDAR and UAVs involve high initial investment and maintenance costs.
2. Environmental Sensitivity: Image-based and LiDAR systems may perform poorly under low-light, rain, or snow conditions.
3. Data Processing: Advanced methods generate large datasets that require significant computational power and storage.
4. Regulatory Barriers: UAV operations may be restricted by airspace regulations, especially in urban environments.
5. Scalability: Although effective in pilot studies, it may be difficult to implement on a larger scale of national road networks, due to logistical and financial constraints.

7 Conclusion

As a summary, although manual inspection and sensor-based systems continue to be used, image processing and computer vision systems, especially those incorporating deep learning algorithms, hold the most promise for not only improving the accuracy of pothole detection, but also reducing costs. With the advancement of technology, the methods of detecting potholes have improved significantly from the traditional ones and provided way more accurate, efficient and scalable ways for the maintenance of roads. Although manual inspections are time-consuming, subjective, and require a lot of labor, advanced technologies provide high accuracy, scalability, and real-time monitoring. For example, computer vision systems have successfully reached more than 90% detection rate, and UAVs can quickly and safely conduct surveys in inaccessible areas. These technologies can be integrated with the smart city concept, improving road safety, reducing maintenance expenses, and facilitating predictive maintenance operations. Therefore, the shift from manual to automated detection systems is crucial for infrastructure management in modern times.

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