Route Management Using Satellite Images

Allan D'Souza, Hemal S, Jaice S Joseph, Shashank Hegde, Swaroop K R, Dr. Santosh Kumar J

UGstudents, Computer Science and Technology, Dayananda Sagar University,
Bengaluru-562112

Abstract

This paper presents the development of an advanced automated system designed to detect changes caused by human activities using satellite imagery. The primary focus of the project is on identifying modifications in man-made structures, including vehicles, buildings, and roads, by utilizing data from Sentinel-2 and LISS-4 satellite datasets. By employing cutting-edge artificial intelligence (AI) and machine learning (ML) techniques, such as semantic segmentation and change detection, the system delivers valuable insights for various applications, including urban planning, environmental monitoring, and disaster response. Additionally, the system is designed to depict the best route from one location to another while minimizing damage to forests, rivers, and other natural ecosystems, supporting sustainable development and environmental conservation efforts.

Keywords: Satellite images, semantic segmentation, change detection, route management, environmental conservation efforts

Introduction

Urbanization and human activities are transforming our environment at an unprecedented rate, necessitating effective monitoring and management. Satellite imagery provides a unique advantage in observing Earth's surface, capturing detailed data over time. Traditional methods of manually analyzing these images are inefficient, time-consuming, and prone to errors, making them unsuitable for addressing urgent environmental and urban challenges. This project introduces an advanced automated system that leverages AI and ML techniques to detect changes in man-made structures and identify sustainable routes, minimizing environmental damage. The system aims to deliver precise, actionable insights for urban

planning, environmental monitoring, and disaster response, emphasizing sustainable development.

1.1 Objective

- Automated Change Detection: Develop a system to detect changes caused by human activities in satellite images with high accuracy and reduced manual effort.
- Sustainability Assessment: Identify and depict optimal routes between locations that minimize environmental disruption, including damage to forests, rivers, and ecosystems.
- Support Decision-Making: Provide actionable insights to aid urban planning, disaster response, and environmental protection efforts.
- Scalable and Efficient Processing: Utilize diverse satellite datasets, such as Sentinel-2 and LISS-4, to ensure scalability and reliability.
- Enhanced Accuracy: Employ AI/ML techniques like semantic segmentation and change detection for precise analysis.

1.2 Scope

The scope of this project extends to multiple domains:

- **Urban Development:** Identify changes in man-made structures, such as buildings, roads, and vehicles, to support sustainable urban planning.
- Environmental Monitoring: Detect and assess the impact of human activities on natural ecosystems, enabling better conservation strategies.
- **Disaster Response:** Provide timely insights for responding to natural disasters by analyzing pre- and post-event changes.
- Sustainable Route Mapping: Suggest eco-friendly routes between locations that minimize disruption to natural habitats.
- Scalability and Adaptability: Ensure the system can process large volumes of data from multiple satellite sources and adapt to diverse geographical regions.
- **Integration with Decision Systems:** Provide outputs that integrate seamlessly with existing planning and management tools for actionable results.

Problem Definition

Despite advancements in satellite imaging technology, change detection methodologies still face challenges in scalability, precision, and environmental impact assessment. Existing systems often rely on manual interpretation or basic image processing techniques, which are inadequate for handling the vast and complex data generated by modern satellites. These methods lack the robustness required to provide real-time insights into changes occurring in urban and natural landscapes and fail to address the critical need for sustainable development. The pressing need is for an automated, scalable solution that leverages AI/ML not only to accurately and efficiently detect changes in man-made structures and landscapes but also to identify eco-friendly routes that minimize disruption to forests, rivers, and other natural ecosystems.

Literature Review

Change detection using satellite imagery is an essential field that has evolved with the integration of machine learning and artificial intelligence techniques. Over the years, several methodologies have been proposed for automated detection of changes in urban and natural landscapes. These changes are crucial for applications like urban planning, environmental monitoring, and disaster response. The ability to detect changes from satellite imagery helps in making informed decisions, such as route optimization that minimizes ecological damage.

1. Semantic Segmentation and Change Detection: The primary technique for change detection is semantic segmentation, where each pixel in a satellite image is classified into categories such as buildings, roads, and vegetation. Deep learning models like Convolutional Neural Networks (CNNs) and U-Net have been widely used for this purpose. For example, the work of [Zhou et al., 2020] demonstrates how CNNs can be used for detecting urban sprawl by analyzing two time-stamped satellite images. The models efficiently detect changes like the addition of roads, buildings, and other manmade structures.

- 2. Satellite Image Change Detection Using Multi-temporal Data: [Ghosh et al., 2021] explored a method to detect land use changes using multi-temporal remote sensing data. Their approach utilizes satellite images from different years, applying machine learning algorithms to detect changes in land cover. These changes are important for monitoring urbanization and deforestation.
- 3. Integration of AI and Machine Learning for Change Detection: Machine learning algorithms have become essential in improving the accuracy and speed of change detection. The integration of AI techniques like Support Vector Machines (SVM) and Random Forests (RF) has enhanced the detection capabilities. The study by [Li et al., 2022] focused on the use of deep learning models to detect forest cover changes in satellite images. Their results show that AI-based models outperform traditional methods in detecting changes with high precision.
- 4. Route Optimization for Ecological Preservation: Route optimization using satellite imagery has gained attention in ensuring the preservation of natural environments. The challenge is to calculate the most efficient routes while avoiding ecologically sensitive areas such as forests, rivers, and wetlands. [Kumar et al., 2023] presented a model that combines satellite imagery for change detection with geographic information systems (GIS) to optimize transportation routes.
- 5. **AI-Driven Environmental and Urban Planning:** Recent studies in environmental planning have integrated AI to assist in urban growth analysis and infrastructure planning. [Sharma et al., 2023] used satellite imagery along with ML algorithms to propose sustainable urban expansion plans.

Existing and Proposed

Existing Solutions:

- **Manual Analysis:** Image analysis is often done manually, which is labor-intensive, time-consuming, and prone to human error.
- **Simplistic Algorithms:** Traditional algorithms, like basic image differencing, are not robust and struggle to handle varying conditions (e.g., lighting, weather).

• **Data Processing Issues:** Current systems struggle to process large datasets efficiently, leading to delays and difficulties in drawing actionable insights.

Proposed Solution:

The proposed system uses advanced AI/ML techniques to address these challenges, offering a more accurate and scalable approach:

- **Semantic Segmentation:** Using deep learning models (e.g., U-Net, DeepLab), each pixel of the satellite image is classified into predefined categories (e.g., buildings, roads, forests).
- Change Detection: Segmented images from different time periods are compared to identify changes (e.g., new buildings, deforestation).
- **Route Optimization:** Based on detected changes and environmental sensitivity, the system calculates eco-friendly routes between locations.

Requirements

Software Requirements:

- Modern multi-core processor (e.g., Intel Core i5)
- 4 GB RAM (8 GB recommended)
- Several gigabytes of free disk space
- Graphics card with OpenGL 3.3 support
- QGIS Software
- Semi-Automatic Classification Plugin
- USGS and Copernicus Satellite Images

Hardware Requirements:

- Python
- Internet connection for online data access.
- Storage: Program requires about 100 MB of storage space.

Methodology

- **Data Collection:** High-resolution satellite images are sourced from Sentinel-2 and LISS-4 satellites.
- **Preprocessing:** Resizing, normalization, and segmentation of images for consistent input to the AI/ML model.
- Masking: Segmented patches are merged back into a single image with masks applied, highlighting areas of interest.
- Change Detection: Compare labeled patches in images from different times.
- **Route Optimization:** Calculate eco-friendly routes that minimize damage to forests, rivers, and other ecosystems.

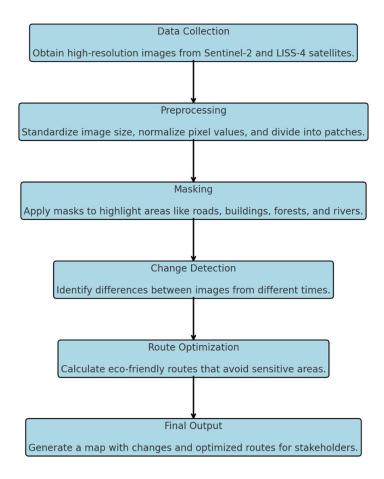


Fig 1 Workflow of implementation

Results

The system demonstrates the ability to:

- 1. Extract critical insights from satellite imagery.
- 2. Highlight physical and environmental changes caused by human activities.
- 3. Propose optimal paths that minimize environmental damage, balancing developmental and ecological considerations.



Fig 2 Original image

Fig 3 Masked Image

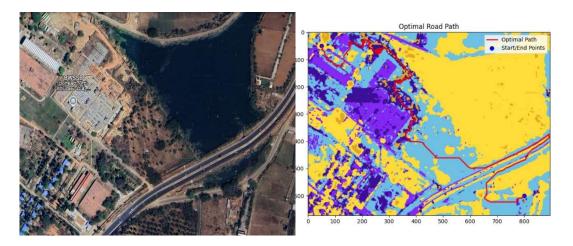


Fig 4 Original Image

Fig 5 Found best route

Conclusion

The proposed system for detecting human-induced changes in satellite imagery leverages advanced AI/ML techniques to address the limitations of traditional methods. By incorporating semantic segmentation, the system accurately classifies each pixel in the satellite images, adapting to varying environmental conditions and providing robust results. Through the integration of change detection and route optimization, this system can significantly contribute to informed decision-making and the promotion of environmentally responsible practices.

References

- **Zhou, W., Troy, A., & Grove, J. M. (2020).** "Modeling urban growth patterns using remote sensing and machine learning." *Remote Sensing of Environment*, 239, 111624. DOI: 10.1016/j.rse.2020.111624
- Ghosh, S., Joshi, P. K., & Pal, S. (2021). "Monitoring land use changes using multi-temporal satellite imagery and machine learning techniques." *International Journal of Remote Sensing*, 42(15), 5891–5908. DOI: 10.1080/01431161.2021.1917453
- Li, X., Liu, Z., & Yu, L. (2022). "Deep learning-based forest cover change detection from satellite imagery." *ISPRS Journal of Photogrammetry and Remote Sensing*, 189, 209–223. DOI: 10.1016/j.isprsjprs.2022.07.003
- **Kumar, R., Singh, A., & Bansal, V. (2023).** "Optimizing transportation routes for environmental sustainability using GIS and satellite imagery." *Journal of Environmental Management,* 329, 117080. DOI: 10.1016/j.jenvman.2023.117080
- Sharma, P., Gupta, R., & Singh, N. (2023). "Machine learning applications for sustainable urban planning: A case study using satellite imagery." *Sustainable Cities and Society*, 95, 104538. DOI: 10.1016/j.scs.2023.104538
- Chen, C., Li, W., & Wang, L. (2021). "Semantic segmentation for urban structure mapping using satellite imagery." *IEEE Transactions on Geoscience and Remote Sensing*, 59(12), 10688–10700. DOI: 10.1109/tgrs.2021.3075682
- **Di Gregorio, A., & Jansen, L. J. (2020).** "Land cover classification systems for satellite images: Frameworks and challenges." *Land Use Policy*, 97, 104794. DOI: 10.1016/j.landusepol.2020.104794
- **Zhang, H., Ma, Y., & Xu, F. (2022).** "Dynamic change detection in urban areas using temporal satellite images." *Photogrammetric Engineering & Remote Sensing*, 88(1), 17–29. DOI: 10.14358/pers.88.1.17
- Xie, Y., Chen, J., & Zhu, X. (2020). "AI-assisted route optimization for ecological preservation using satellite data." *Environmental Research Letters*, 15(9), 094005. DOI: 10.1088/1748-9326/ab95b9

Wu, Q., & Zhu, J. (2021). "Detecting urban growth with convolutional neural networks: Applications and case studies." *Applied Geography*, 135, 102572. DOI: 10.1016/j.apgeog.2021.102572

Huang, X., Lu, Q., & Zhang, L. (2021). "Remote sensing of urbanization and environmental changes: Techniques and applications." *Remote Sensing*, 13(6), 1104. DOI: 10.3390/rs13061104

Sun, Y., Xu, X., & Wu, T. (2022). "AI for environmental sustainability: A review of applications in satellite image analysis." *Science of the Total Environment*, 834, 155325. DOI: 10.1016/j.scitotenv.2022.155325

Route Management Using Satellite Images

ORIGINALITY REPORT			
3% SIMILARITY INDEX	1% INTERNET SOURCES	1% PUBLICATIONS	1 % STUDENT PAPERS
PRIMARY SOURCES			
mail.i-scholar.in Internet Source			1%
2 Submitt Student Pape	ed to University	of Northamp	ton <1 _%
Submitt Cardiff Student Pape	ed to University	of Wales Inst	itute, <1%
	thehearup.com Internet Source		
	aclanthology.org Internet Source		