

Leveraging Quantum Computing For Enhanced Earth Observation Satellites

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Abstract—Quantum computing has the potential to transform several fields, including earth observation satellites. This paper searches the application of quantum algorithms and quantum sensing techniques to improve the competences of earth observation satellites. By harnessing the principles of quantum mechanics, quantum computing can significantly improve data processing, image analysis, and sensor performance. The projected approach aims to leverage the computational power of quantum computers to aid extra precise and effective monitoring of Earth's environment, contributing to better decision-making and addressing global challenges.

Keywords— Quantum Computing; Quantum Algorithms; Earth Observation Satellites; Quantum Machine Learning; Quantum Key Distribution

I. INTRODUCTION

Satellites are the primary technique to obtain a complete view of what happens on the surface of the earth through remote sensing to keep us informed of global climate change, natural disasters, and all aspects of human development based on how fast our environment degradation. The size of satellite data being produced occurs at an increasing rate; thus, there are major difficulties that arise in processing, analyzing, and interpreting this data. Furthermore, additional parameters related to traditional sensor techniques can delay their ability to process and interpret visually acquired data, including but not limited to atmospheric interference, relatively low signal-to-noise ratios, and very low spatial or spectral resolution. At this time, quantum computing continues to progress rapidly and is applying various phenomena based on the laws governing quantum physics with the intent to assist in resolving existing problems, especially satellite remote sensing of naturally occurring phenomena. With respect to the concept of quantum computing as presently being developed, quantum computers would use atomic properties of matter as per the principles of quantum theory and, therefore, would complete all computations significantly faster than conventional computing methods, thus providing new opportunities for accomplishing complex computer simulations and data analyses [1].

II. CONTEXT AND RELEVANCE

Quantum computing can yield significant outcomes when combined with Earth observation satellites. First, quantum algorithms can be used to process and analyse the massive volumes of data collected by these satellites. Quantum algorithms that focus on optimisation, machine learning, and signal processing can improve the accuracy and effectiveness of real-time data analysis, which is crucial for monitoring and decision-making. Furthermore, quantum sensing techniques can be used to improve the functionality of satellite sensors. Quantum-based sensors will be able to more successfully penetrate the atmosphere because they are more sensitive, have a higher spatial-spectral resolution, and can give precise information about the Earth's surface, atmosphere, and oceans.

A. Paper Objectives

The paper has three main objectives, which are to discuss how quantum computers can be applied to Earth observation satellites by using quantum algorithms to process and analyze sensor data, and provide insight into how quantum computing technologies can be commercialized in satellite systems through an exploration of subjects such as power consumption, radiation hardening, and in-board computing requirements. Additionally, this paper will provide a roadmap for developing and implementing a quantum computing solution for Earth observation satellites by considering the current status of quantum technologies available and provides insight on future developments.



Figure 1. Quantum X – Satellites Earth Observation

B. Theoretical background

The evolution from traditional computers to quantum computers is a major milestone since quantum computers utilise the laws of quantum physics for their processing functions. The most notable characteristic of quantum computers compared with traditional computers is that quantum bits (or qubits) may exist in a state of superposition (0 and 1) simultaneously; traditional computers can only represent bits in a binary series (0 or 1). The properties of superposition, quantum entanglement and quantum parallelism enable quantum computers to rapidly search vast numbers of states at once, which can potentially provide a great deal of assistance with certain types of problems. Additionally, certain quantum algorithms have been shown to be exponentially faster than classical algorithms; examples include Shor's algorithm (for prime factorization) and Grover's algorithm (for unstructured searches). These algorithms take advantage of quantum effects to improve the way in which their respective problems are solved, thus creating new uses of a computer's available resources to help address complex tasks. In terms of application of quantum computing with respect to Earth observation satellites, the potential for use is massive. For example, applications for processing data, enhancing sensor performance, and performing image analysis will see tremendous benefit from quantum algorithms through improved computational resources. Improvements to qualitative data analysis through quantum algorithms using optimisation, machine learning, and signal processing will ultimately create more accurate and efficient processes which facilitate real time monitoring and decision-making capabilities.

III. QUANTUM COMPUTING FOR ENHANCED EARTH OBSERVATION SATELLITES

The use of quantum computing in the field of monitoring Earth's satellites has seen significant growth over the past number of years, with newly discovered and documented uses of quantum technologies to enhance this capability. One of the main applications for quantum computing in this area will be related to data processing and image analysis (the two major components) that are required by Earth-observing satellites. Earth-observing satellites produce massive amounts of data and face many challenges related to the storage, transmission, and analysis of this data.

The use of quantum algorithms for the purpose of data compression, pattern recognition and machine learning can be utilized to solve many of the challenges associated with processing of large volumes of data from Earth-observing satellites. Researchers estimate that quantum algorithms can compress images up to [5] and significantly reduce their size, therefore enabling the storage of data while preserving valuable data.

Thus, these two advancements will provide significant improvements in the ability to transmit and store large amounts of data and will provide an

opportunity for enhanced improved data management capabilities. Additionally, quantum machine learning algorithms, such as Quantum Support Vector Machines (QSVM) and Quantum Neural Networks (QNN), can assist in image classification, object detection and pattern recognition and their ability to leverage the computational power of quantum computers will provide very high levels of accuracy and performance.

Quantum computing application in the sphere of enhanced monitoring satellites on earth is accumulating popularity during the last several years, and researchers have discovered many possibilities to exploit the potential of quantum technologies in the sphere. Data Processing and Image Analysis: This is one of the primary elements of quantum computing that can happen be used in earth observation satellites; data processing and analysis of images. Such satellites have huge volumes of data that are challenging in terms of storage, transmission and analysis.

Quantum algorithms of data compression, pattern recognition and machine can solve these challenges learning. The researchers have estimated quantum algorithms to compress images [5], which can considerably shrink the size, store data and save valuable information.

The latter will provide an opportunity to better the mass of data transmission and storage and this will benefit the more qualified data management. In addition, it is possible to classify images, detect objects, and recognize patterns with the assistance of quantum machine learning algorithms, such as quantum support machine (QSVM) and quantum neural networks (QNN) [6]. These algorithms will be in position to harness the computational power of the quantum computers and decide on elevated degree of precision and performance in comparison to the classical algorithms.

A. Sensor Enhancement

Quantum computing has the potential to enhance satellite sensors for earth observation by utilizing new quantum sensing technologies such as those that utilize quantum-entangled particles and/or quantum metrology. Scientists anticipate utilizing quantum-entangled particles to increase the resolution of satellite imaging systems (7), and therefore improve their ability to detect small features and structures. Additionally, because of quantum metrology's high accuracy, it can be used for measuring atmospheric gases or mapping gravitational fields (8) with great precision. Since there are numerous satellites moving back and forth over the same area of the earth as well as multiple possible capture sites, quantum computing will allow the scheduling of image captures via quantum algorithms to resolve the complicated optimization challenges related to managing satellite passes as well as the priority of data collection. The use of the quantum approximation optimization algorithm may increase the ability to improve the temporal resolution of images captured by satellites as

well as enable the collection of recurring images with a specific focus. By utilizing quantum-enhanced sensors, it is estimated that there will be an increase in environmental monitoring and scientific research accuracy and sensitivity as shown in Figure 2.

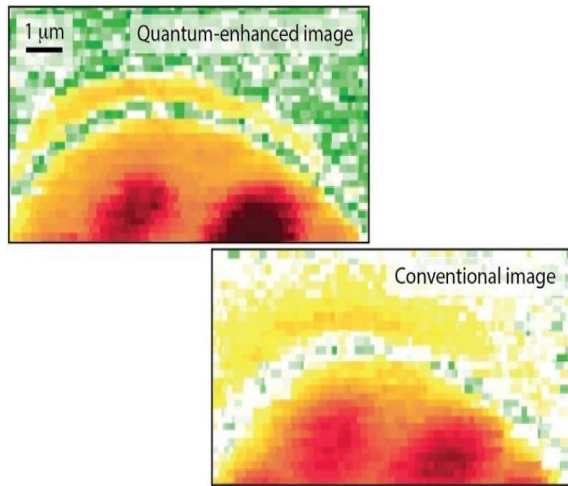


Figure 2. Showing quantum-enhanced image processing of a satellites

B. Quantum machine learning on Earth Observation Data analysis

Quantum Machine Learning (QML) is a new era of science with ties between machine learning and quantum computing in an innovative way that provides new approaches to the analysis of Earth Observation datasets. QML algorithms have the ability to perform a wide range of predictive analyses faster than traditional machine learning approaches and can also provide superior performance in comparison to traditional machine learning approaches when applied to large-scale/high-dimensional datasets. QML's specific applications in Earth Observation datasets include: Image Classification and Object Detection. QML can be applied to image classification/object detection problems in Earth Observation data using Quantum Support Vector Machines (QSVM) and Quantum Neural Networks (QNN), including, but not limited to, land use/land cover classification, urban mapping, and monitoring the environment. Processing and classifying vast volumes of satellite imagery and other Earth Observation datasets in one operation will be greatly enhanced by the use of quantum algorithms because of the ability of quantum computers to take advantage of both quantum parallelism and quantum interference. Time-Series Analysis and Forecasting. Time-series analysis and forecasting are essential to many Earth Observation applications such as weather forecasting, climate modelling, and monitoring natural disasters. Quantum algorithms for various techniques (e.g., regression, clustering, etc.) can enhance the accuracy and scalability of contributing to the analysis of complex/dynamic Earth Observation datasets.

C. Quantum enhanced data analysis and enhanced computational technique

The enormous groups of data created by Earth observation activities are usually too large for traditional computers to be able to process effectively, thus creating delays in the ability to analyze the data and use it for practical purposes. Quantum computing will improve the speed in which these large datasets are processed through algorithms that use quantum parallelism. For instance, quantum Fourier transforms and quantum machine learning algorithms could drastically increase the speed at which satellite images are analyzed, improving the detection of changes in environmental conditions and speeding up the ability to make decisions. The amount of data generated by Earth observation satellites represents an enormous challenge for traditional computing platforms and therefore results in significant processing delays that impede our ability to interpret and apply important environmental data. Quantum computing has the potential to rapidly improve this environment by executing quantum algorithms with quantum parallelism, which, if executed successfully, could dramatically improve the speed and effectiveness of data processing.

Quantum parallelism refers to the capacity of quantum computers to carry out numerous calculations at the same time, compared to classic computers, which complete one calculation before going to the next one. This comes about because of quantum bits, or qubits, which are able, because of superposition, to be in many states at the same time (as compared to traditional bits which can only be in a state of either 0 or 1). In addition to the quantum Fourier transform (QFT), which is a quantum version of the discrete Fourier transform, most quantum algorithms rely on the QFT. QFT can be especially useful for compressing and extracting features from images, dynamically improving resolution and facilitating the detection of temporal variability in the environment, in the context of Earth observation. Ultimately, this use of QFT will speed up the analysis of very large satellite images, thereby allowing for faster updates and more timely environmental monitoring.

D. Quantum technologies for navigation and positioning / quantum advancements

Today's satellite navigation systems are heavily dependent upon the accuracy of atomic clocks to provide timing accuracy, which is essential for determining position based on the speed of light travel and satellite to earth signal transmission times. However, many external events can adversely affect these systems such as atmospheric accesses, space weather, environmental events, etc. By using quantum-enhanced atomic clocks and quantum accelerometers in future navigation systems will allow for a substantial increase in the accuracy and reliability of satellite navigation systems.

The timekeeping of quantum atom clocks takes advantage of quantum physical properties of atoms, such as superposition and entanglement. Traditional atomic clocks use microwave frequencies to measure the energy differences between cesium and rubidium atoms; however, they perform poorly in environments where microwaves are unstable. The time accuracy provided by quantum atomic clocks is far greater than that provided by traditional atomic clocks since quantum atomic clocks employ optically based (optical lattice) methods with strontium atoms with alternating frequency structures [31]. As a result of these developments, the accuracy of timing in satellite navigation systems will increase significantly, since they will be able to reduce their time measurement from nanoseconds to fractions of nanoseconds. The time measuring devices called quantum accelerometers utilize a method of measuring acceleration through the motion of super cooled atoms, which are in a state of quantum superposition. Quantum accelerometers measure acceleration in a different manner than traditional accelerometers that suffer from drift and require periodic calibration; rather, quantum accelerometers operate based on the principle of matter-wave interferometry and are not impacted by external factors such as temperature and electromagnetic interference [32]. As a result of their reliability and accuracy, quantum accelerometers will be a valuable addition to inertial navigation systems on satellites where an accurate position must be maintained without the use of an external reference.

IV. FUTURE PROSPECT AND CHALLENGES OF QUANTUM COMPUTING FOR ENHANCED EARTH OBSERVATION SATELLITES

A. Challenges

Creating QML algorithms that are efficient and can be used for a variety of purposes to perform analysis of earth observation data (including classification of images, detecting objects, and making predictions over time). Overcoming the current limitations of quantum hardware, such as very low numbers of qubits, noise, and decoherence can negatively affect the performance and accuracy of QML algorithms. Demonstrating that QML algorithms for earth observation data are robust enough and can apply to a wide range of such data due to their inherent diversity and exposure to many types of environmental and sensor-related effects. Integrating QML algorithms into current classical data processing pipelines and allowing them to work in conjunction with existing legacy systems and legacy data formats. Building a qualified workforce that is well-versed in both quantum computing and machine learning and provides a bridge between these two rapidly evolving domains. Quantum sensors are being developed to be radiation resilient and suitable for use in the harsh

conditions of space and to continue to perform quantum logic and execution.

Because quantum sensors require substantial power to operate properly. Thus, the amount of power consumed by these sensors must also include any necessary cooling for quantum sensor operation and any required support systems. Quantum sensors must also be incorporated into other existing satellite sensors while ensuring compatibility with existing data formats and processing pipelines. Quantum sensors have many challenges to achieve long term reliability and durability in a space environment. Finally, ways must be developed to effectively process and analyze the high quality and very high-resolution data produced by quantum sensors.

B. Prospects

Earth-monitoring satellites will benefit the characteristics and methods of their sensors through the use of quantum sensing methods. A few examples of quantum phenomena include superposition, entanglement and quantum interference. Quantum sensors provide the highest possible standards of resolution, magnitude, and precision than any other sensor available today. For example, quantum-improved imaging techniques in earth monitoring will allow for surpassing diffraction-limited resolution using quantum entanglement to image objects at previously undetectable distances and allowing for imaging to extract more detailed images of properties and structures located on the Earth's surface. In addition, quantum sensor technologies, such as quantum magnetometers and quantum gravimeters, can provide one-to-one mapping of the Earth's magnetic and gravitational fields. These sensors provide unprecedented levels of accuracy and sensitivity, enabling extensive studies of geophysical processes, the exploration of natural resources, and the monitoring of our environment.

V. CURRENT RESEARCH AND DEVELOPMENTS IN QUANTUM COMPUTING FOR ENHANCED EARTH OBSERVATION SATELLITES

With the rapid expansion of quantum computing as a viable technology since early 2020, its applications are being intensely pursued for how it can ultimately revolutionize earth observation satellite capabilities through improved data acquisition, processing, and analysis. Current research and development activities aim at mitigating the various hurdles posed by the massive volumes of data created by EO satellites along with the complicated computations needed to process this data. As such, significant progress is also occurring with respect to how quantum algorithms may be applied to enhance satellite mission planning and image acquisition efficiency. One key area of focus is the optimization of satellite mission planning through quantum

algorithms, which can be utilized to mitigate the numerous challenges associated with scheduling and planning satellite tasks both of which are crucial for maximizing the extent of potential coverage and the level of utility provided by EO satellites.

Recent studies have demonstrated how quantum computing may ultimately improve various types of imaging acquisition approaches. By encoding the programming challenges as binary variables and applying quantum annealing techniques, researchers are attempting to reduce the computational overhead associated with satellite imaging operations while simultaneously increasing the value of such operations.

An additional aspect of core development is the use of squared measurements for Synthetic Aperture Radar (SAR) calculations using Quantum computing. There are Quantum algorithms currently being developed to assist with the squared SAR calculations in a more efficient manner through the ability of Quantum computing to complete complex Fourier calculations at a phenomenal rate when compared to classical computing approaches. In addition, Quantum clustering algorithms can be used to combine data points from satellite imagery; as a result, there is more efficient handling and analysis of spatial and temporal data. This method can be extremely beneficial to mission planning since a study of physical characteristics (e.g., distance) is necessary for optimising the position and time of satellite operations.

These developments give rise to a future time frame where EO satellites will see tremendous enhancements in performance, resulting in improved performance and storage capabilities and greater accuracy and speed of data collection. The result will consequently include more accurate weather predictions, improved monitoring of environmental changes, and improved mitigation of natural disasters. Current research is focused on developing practical applications; some studies indicate that minor cases of problems may be solved using quantum techniques by 2025. However, solving large-scale problems using quantum computers could take 10 to 15 more years, depending on advances in quantum hardware and errors correction methods. These findings reveal an ongoing rapidly changing environment in which quantum computing has the potential to fundamentally change the way EO satellites are utilized; however, practical scalability presents future research challenges.



Figure 3. Quantum X – Satellites Earth Observation

VI. RELATED WORKS

Many different scientists and organizations have shown interest in how quantum computing can improve the performance of earth-observing satellites. [24] have created a complete plan, including future directions, for how to use quantum computing to enhance earth observation. They outline many possible applications, as well as potential issues and areas needing further investigation. They describe how quantum algorithms can be used for processing earth observation satellite data, enhancing images, and improving sensors, as well as integrating quantum-enabled technologies into current satellite systems. [25] explored the unique capabilities of quantum metrology with respect to measuring objects related to earth observation (e.g. measuring the gravity or magnetic fields around Earth) using quantum-enhanced sensors. The author outlines the advantages of using quantum-based sensor technologies compared to using traditional sensor technologies while mentioning challenges associated with using quantum-based sensors in a space environment. [26] also discovered that quantum communications have many applications (authentication and encryption) with regard to secure and efficient data transmission between earth observation satellites. They propose the use of quantum key distribution (QKD) in conjunction with quantum teleportation techniques to establish secure communication channels or to build shared distributed quantum computing architectures for processing of earth observation data. [27] examined various applications of quantum machine learning algorithms in relation to analyzing earth observation data for purposes that include (but are not limited to) identifying objects in an image or classifying images.

VII. CONCLUSION

Combining quantum technologies and quantum computing with Earth observation satellites offers tremendous potential to enhance our understanding of

Earth systems and processes. Quantum computing uses the power of quantum mechanics to revolutionize data processing, image analysis, and sensor performance (enabling us to better track and monitor our planet). Although quantum computing applications in earth observation are relatively new, they hold great promise. Quantum algorithms for data compression, machine learning, and signal processing will significantly increase the productivity and accuracy of data analysis, while new types of quantum sensors will enhance existing satellite sensor(s) resolution and sensitivity allowing unprecedented detail and accuracy.

However, realising the full potential for quantum computing to impact Earth observing satellites requires overcoming several significant challenges. These include developing a scaleable and fault-tolerant quantum hardware platform; developing efficient quantum algorithms specific to Earth observing applications; integrating quantum technologies into existing satellite systems; and addressing the needs of space-based applications (i.e., radiation hardening and power limitations).

VIII. DISCUSSION

IX. FURTHER WORK

The Quantum Computing and Quantum Technology for Earth Observation (QC-QT4EO) initiative emphasizes that further research and development are necessary within several key areas, such as:

- a. Development of quantum algorithms - designing and optimizing quantum algorithms that are specifically created for processing EO datasets (images), analyzing EO images and fusing data.
- b. Engineering of quantum hardware - developing compact, power efficient and radiation tolerant quantum computing hardware that can be deployed into EO satellites.
- c. Development of quantum sensing technologies - advancing quantum sensing techniques (i.e., quantum imaging and quantum metrology) for improving the performance of satellite sensors.
- d. Development of quantum communications technologies - investigating quantum key distribution and quantum teleportation for secure and efficient data transmission, as well as developing a distributed architecture for implementing quantum computing.

- e. Integration of quantum computing technologies into EO satellites - establishing standards and guidelines for the integration of quantum computing technologies into EO satellite systems that allow for interoperability and compatibility.
- f. Fostering of interdisciplinary collaborations - fostering collaborations between quantum physicists, computer scientists, aerospace engineers and EO scientists to promote technological innovation and address multidisciplinary challenges.

By addressing these challenges through significant research and international partnerships, the integration of QC/QTs with EO satellites will open new frontiers in our ability to understand and monitor the Earth's environment and offer improved decision-making and strategies to address global issues such as climate change, resource management and environmental sustainability.

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