
Non-destructive Estimation of Tender Coconut Water Volume: Challenges methods and future Perspectives

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Introduction

Coconut (*Cocos nucifera* L.) is a multipurpose perennial crop cultivated in tropical and coastal regions worldwide. Known as the "Kalpa Vriksha" or "tree of life" in Sanskrit, the coconut palm is revered for its versatility, providing essential resources such as food, fuel, and building materials. Among its various products, coconut water is particularly prized for its nutritional and hydrating properties. The liquid endosperm inside a young, green coconut, known as tender coconut water, accounts for about 25% of the total fruit weight and is celebrated for its low-calorie content (17.4 kcal/100 g), rich mineral profile, and various bioactive compounds. This clear, mildly sweet liquid is not only a refreshing drink but also has numerous health benefits, including aiding in digestion, dehydration recovery, and providing essential electrolytes.

In recent years, the global demand for coconut water has skyrocketed, driven by consumer preferences for natural, healthy beverages and an increasing awareness of the negative effects of sugary, carbonated drinks. The tender coconut water market in India alone was valued at INR 5,051.5 crore in 2022 and is projected to reach INR 10,295.6 crore by 2028, growing at a compound annual growth rate (CAGR) of 12.5%. Given this surge in demand, accurately determining the volume of coconut water is crucial for both producers and

consumers. Precise volume estimation ensures fair pricing, consistency in product quality, and enhances industry-wide standardization.

However, estimating the volume of tender coconut water non-destructively—without opening or damaging the fruit—remains a challenge. Traditional methods rely on subjective assessments, while advanced technologies such as Magnetic Resonance Imaging (MRI) and X-ray systems, though accurate, are cost-prohibitive and not feasible for large-scale or field use. This article explores the various methods employed for estimating coconut water volume, their associated challenges, and future prospects for the development of affordable, precise, non-destructive techniques.

Importance of Tender Coconut Water and Volume Estimation

The quality and quantity of coconut water vary significantly depending on the fruit's maturity. Tender coconuts aged 6-7 months typically yield the highest volume (170-220 ml) of water with optimal quality. The organoleptic properties of the water—its flavor, sweetness, and mineral content—are also highly dependent on the coconut's maturity. Therefore, the ability to non-destructively estimate the water volume before harvesting can be valuable for determining the ideal time for harvest, ensuring consistent product quality, and optimizing postharvest

handling. For consumers, knowing the exact volume of water inside a coconut guarantees value for money and promotes trust in the product. For farmers and processors, accurate volume estimation can improve supply chain efficiencies, pricing strategies, and product standardization, thus contributing to the overall growth of the industry.

Traditional Methods for Estimating Coconut Water Volume

Traditional methods for estimating tender coconut water volume are often imprecise and rely on subjective judgment. These include:

1. Visual Assessment: This method involves estimating the volume based on the coconut's size, shape, and appearance. Although it can provide a rough approximation, the accuracy depends heavily on the individual's experience and is subject to significant variability.

2. Shaking: In this method, the coconut is shaken, and the sound produced by the liquid sloshing inside is used as an indicator of volume. While simple, this approach is highly subjective and offers only a rough estimate.

3. Floating Method: The buoyancy of the coconut when placed in water is observed to gauge the volume of water inside. However, this method provides only a general approximation and lacks the precision needed for commercial purposes.

4. Weighing Method: The coconut is weighed, and the weight is compared to a standard reference. While more reliable than other traditional methods, this approach does not account for the thickness of the shell or the amount of solid endosperm, which can vary considerably between coconuts.

5. Tapping Method: In this method, the coconut is tapped with a knuckle or small hammer, and the resulting sound is analysed. A hollow sound is typically associated with a higher water content. However, this method is highly subjective and requires a trained ear to interpret the sounds accurately.

These methods, while commonly used, are inconsistent, and their accuracy varies significantly depending on the skill and experience of the individual performing the assessment. Furthermore, they offer limited precision, making them unsuitable for large-scale commercial operations where accurate volume estimation is essential.

Advanced Non-Destructive Techniques for Volume Estimation

In order to overcome the limitations of traditional methods, several advanced non-destructive techniques have been developed for estimating tender coconut water volume. These techniques leverage modern technologies such as imaging, acoustic analysis, and mechanical vibration to provide more accurate and reliable results. Some of these methods include:

1. Magnetic Resonance Imaging (MRI): MRI is a powerful imaging technique that can accurately determine the volume of water inside a coconut by capturing detailed images of its internal structure. However, the high cost, bulky equipment, and need for specialized training limit its practicality for large-scale or field applications.

2. X-ray Technology: X-rays can penetrate the coconut shell and provide an accurate estimate of the water volume by analysing the internal composition. Like MRI, X-ray systems are expensive, require specialized expertise, and are not feasible for widespread use in the coconut industry.

3. Near-Infrared Spectroscopy (NIRS): NIRS, combined with chemometric analysis, has been used to discriminate coconut water based on postharvest storage time, cultivar, and maturity. This technique offers promising results for non-destructive volume estimation but requires further validation for commercial use.

4. Radio Frequency (RF) Technology: RF technology has been explored for detecting spoiled coconuts at the pre-processing stage. Since the dielectric properties of coconut water change with maturity, RF sensors can potentially estimate water content non-destructively. However, the technology is still in the experimental stage and has yet to be widely adopted.

5. Acoustic Resonance: Acoustic resonance techniques involve analysing the sound produced by tapping or knocking on the coconut shell. Studies have shown that the acoustic frequency produced by the coconut shell can provide information about the water content and maturity of the fruit. While promising, this method requires further refinement to improve accuracy and consistency.

Challenges in Non-Destructive Volume Estimation

Despite the promising advancements in non-destructive volume estimation techniques, several challenges remain:

1. Cost and Accessibility: Many of the advanced techniques, such as MRI and X-ray, are prohibitively expensive and require specialized equipment and training. This limits their accessibility, particularly for small-scale farmers and processors.

2. Accuracy and Validation: While techniques such as acoustic resonance and mechanical

vibration show promise, they still require further validation and refinement to ensure consistent accuracy across different coconut varieties and maturity stages.

3. Environmental Factors: Variations in temperature, humidity, and handling conditions can affect the accuracy of non-destructive techniques. Developing methods that are robust to these environmental factors is essential for widespread adoption.

4. Scalability: Many of the advanced techniques are not yet scalable for commercial use. Developing cost-effective, portable devices that can be used in the field is crucial for ensuring the widespread adoption of these technologies.

Mechanical Vibration and Piezoelectric Sensors: A Promising Approach

One of the most promising techniques for non-destructive estimation of coconut water volume involves the use of mechanical vibration and piezoelectric sensors. Piezoelectric sensors are widely used in various industries for their ability to convert mechanical stress into electrical signals. In the context of tender coconut water volume estimation, these sensors can be applied to measure the vibrations or resonance patterns that occur when the coconut is subjected to a controlled mechanical force, such as tapping or knocking. The vibrations produced will vary depending on the internal structure of the coconut, including the volume of water, the thickness of the shell, and the density of the endosperm. When a piezoelectric material is subjected to mechanical stress, it generates a voltage proportional to the applied force. This voltage can be analysed to estimate the internal composition of the coconut, including the volume of water.

Mechanical and acoustic vibrations have been used extensively in the food industry for assessing the quality and texture of fruits and vegetables. For example, vibration experiments have been employed to evaluate the firmness of apples, pears, and tomatoes. The same principle can be applied to tender coconuts, where the vibration response of the fruit is related to its internal water content. By combining piezoelectric sensors with machine learning algorithms such as Support Vector Regression (SVR), it is possible to develop a low-cost, portable device for accurately predicting coconut water volume. SVR is a powerful predictive tool that can handle nonlinear relationships and is robust to outliers, making it well-suited for this application. The use of ensemble learning, which combines multiple SVR models, can further improve prediction accuracy and generalization performance.

When a coconut is tapped, the piezoelectric sensor detects the resulting mechanical waves. The frequency and amplitude of these waves are affected by the water content inside the coconut. A coconut with a higher volume of water will produce a different acoustic response compared to one with less water. By analysing these waveforms, it is possible to derive a correlation between the mechanical vibrations and the volume of water contained within the coconut.

Piezoelectric sensors are advantageous because they are relatively inexpensive, highly sensitive, and can be integrated into portable devices. In addition, they can be used in field conditions without the need for specialized equipment, making them particularly well-suited for use by coconut farmers and processors.

Mechanical Vibration and Resonance Analysis

The application of mechanical vibration for estimating fruit quality has been explored for various crops, and similar principles can be applied to coconuts. In mechanical vibration analysis, an external force is applied to the coconut (typically by tapping or using a controlled vibration source), and the response of the coconut is measured.

This response, which includes the vibration frequencies and damping characteristics, provides valuable information about the internal structure of the coconut. The water inside the coconut acts as a damping medium, altering the natural frequency of the vibrations. By measuring the vibration response and comparing it to known reference values, the volume of water inside the coconut can be estimated with a high degree of accuracy.

Several factors influence the vibration response of a coconut, including:

Coconut Maturity: As the coconut matures, the water volume decreases and the solid endosperm (coconut meat) increases. This change in the internal composition alters the resonance frequency and can be used as an indicator of both water volume and maturity level.

Shell Thickness: The thickness of the coconut shell also affects the mechanical vibrations. Thicker shells may dampen the vibrations more significantly, requiring adjustments in the calibration of the sensors.

Environmental Conditions: Temperature and humidity can affect the mechanical properties of both the coconut shell and the water inside, leading to variations in the resonance patterns. Calibration of the system under different environmental conditions is essential for achieving consistent results.

Using advance machine learning models for enhanced prediction

One of the key challenges in non-destructive volume estimation is the variability in coconut sizes, shapes, and compositions. To account for this variability, machine learning algorithms such as Support Vector Regression (SVR) and ensemble learning techniques can be employed. These algorithms can analyse large datasets of vibration responses, learn from the patterns, and predict the volume of coconut water with a high degree of precision.

Ensemble learning models, which combine multiple SVR models, can enhance the prediction accuracy by reducing the effects of outliers and increasing the robustness of the system. These models can consider various input features, including the vibration frequency, damping ratio, and shell characteristics, to make a more reliable prediction of water volume.

For instance, a dataset containing vibration responses from coconuts at different maturity stages and water volumes can be used to train the ensemble SVR model. Once trained, the model can be applied in real-time to estimate the water volume of new coconuts based on their vibration response.

This approach offers several advantages:

Improved Accuracy: Ensemble learning models can capture complex, nonlinear relationships between the input features and the target variable (coconut water volume), leading to more accurate predictions.

Robustness to Variability: By training on a diverse dataset, the model becomes more robust to variations in coconut size, shape, and environmental conditions.

Scalability: Once developed, the model can be deployed in low-cost, portable devices that can

be used in the field, allowing farmers and processors to estimate coconut water volume in real-time.

Field Applications and Commercial Potential

The use of piezoelectric sensors and machine learning-based volume estimation devices has significant commercial potential. These devices can be designed to be portable, affordable, and easy to use, making them accessible to coconut farmers and small-scale processors. By providing an accurate estimate of water volume before harvesting or sale, these devices can improve transparency and trust in the coconut supply chain.

Furthermore, non-destructive volume estimation techniques can help optimize the coconut harvesting process. By determining the optimal harvest time based on the coconut's water content and maturity level, farmers can ensure that their coconuts are harvested at the peak of freshness and quality, maximizing both yield and market value.

In addition to improving postharvest handling, these devices can be used in retail settings to provide consumers with reliable information about the coconut water content, enhancing customer satisfaction and confidence in the product.

Future Prospects

The future of non-destructive tender coconut water volume estimation lies in the development of affordable, portable, and accurate devices that can be used by farmers, processors, and retailers alike. Research should focus on:

1. Sensor Development: Further advancements in piezoelectric sensor technology, coupled with machine learning algorithms, hold the potential to revolutionize the coconut industry. Developing more sensitive, accurate, and cost-effective sensors will be key to achieving widespread adoption.

2. Machine Learning Algorithms: The application of machine learning techniques such as ensemble SVR can significantly improve the accuracy of volume estimation. Future research should explore the integration of different machine learning models and the use of large datasets to improve prediction performance.

3. Field Applications: Developing portable, user-friendly devices that can be used in the field is essential for ensuring the practical application of non-destructive techniques. These devices should be designed to withstand harsh environmental conditions and provide real-time volume estimates.

4. Standardization with more number and varieties of tender coconut: Establishing industry-wide standards for non-destructive volume estimation techniques is crucial for ensuring consistency and reliability. Future research should focus on developing standardized protocols and guidelines for coconut water volume estimation.

Conclusion

The non-destructive estimation of tender coconut water volume using mechanical vibration and piezoelectric sensors, enhanced by machine learning algorithms, offers a promising

solution to the challenges faced by the coconut industry. This approach provides an affordable, scalable, and accurate method for estimating coconut water volume, with applications ranging from field use by farmers to commercial processing and retail.

By continuing to refine these techniques and addressing the remaining challenges, the coconut industry can benefit from improved product quality, enhanced supply chain efficiency, and increased consumer confidence. The future of non-destructive coconut water volume estimation lies in the integration of advanced sensor technology and artificial intelligence, paving the way for a more sustainable and profitable industry.

The non-destructive estimation of tender coconut water volume is an important aspect of ensuring product quality and optimizing postharvest handling. While traditional methods remain widely used, they are imprecise and unreliable. Advanced techniques such as MRI, X-ray, and acoustic resonance offer greater accuracy but are limited by their high cost and complexity. The use of mechanical vibration and piezoelectric sensors, combined with machine learning algorithms, presents a promising approach for developing low-cost, portable devices for volume estimation. By addressing the challenges of cost, accuracy, and scalability, future research can pave the way for the widespread adoption of non-destructive techniques in the coconut industry. This will not only benefit farmers and processors by improving supply chain efficiencies but also enhance consumer confidence in the quality and value of tender coconut water.

References

- 1) Burns, D. T., Johnston, E. L., & Walker, M. J. (2020). Authenticity and the Potability of Coconut Water-A Critical Review. *Journal of AOAC International*, 103(3), 800–806. <https://doi.org/10.1093/jaoacint/qs2008>
- 2) Ding, C., Feng, Z., Wang, D., Cui, D., & Li, W. (2021). Acoustic vibration technology: Toward a promising fruit quality detection method. *Comprehensive Reviews in Food Science and Food Safety*, 20(2), 1655–1680. <https://doi.org/10.1111/1541-4337.12722>
- 3) Ding, C., Wu, H., Feng, Z., Wang, D., Li, W., & Cui, D. (2020). Online assessment of pear firmness by acoustic vibration analysis. *Postharvest Biology and Technology*, 160. <https://doi.org/10.1016/j.postharvbio.2019.111042>
- 4) El-Shafeiy, E., Abohany, A. A., Elmessery, W. M., & El-Mageed, A. A. (2023). Estimation of coconut maturity based on fuzzy neural network and sperm whale optimization. *Neural Computing and Applications*, 35(26), 19541–19564. <https://doi.org/10.1007/s00521-023-08761-0>
- 5) Hahn, F. (2012). An on-line detector for efficiently sorting coconut water at four stages of maturity. *Biosystems Engineering*, 111(1), 49–56. <https://doi.org/10.1016/j.biosystemseng.2011.10.007>
- 6) Hiruta, T., Sasaki, K., Hosoya, N., Maeda, S., & Kajiwarra, I. (2021). Firmness evaluation of postharvest pear fruit during storage based on a vibration experiment technique using a dielectric elastomer actuator. *Postharvest Biology and Technology*, 182. <https://doi.org/10.1016/j.postharvbio.2021.111697>
- 7) Hubo, X., Jie, W., Zhaopeng, W., Yongmao, G., Zhipeng, W., & Zhengqiang, Z. (2017). Discrimination of brownheart of Korla pear using vibration frequency spectrum technique. *International Journal of Agricultural and Biological Engineering*, 10(2), 259–266. <https://doi.org/10.3965/j.ijabe.20171002.1910>
- 8) Hussain, G., Al-Rimy, B. A. S., Hussain, S., Albarrak, A. M., Qasem, S. N., & Ali, Z. (2022). Smart Piezoelectric-Based Wearable System for Calorie Intake Estimation Using Machine Learning. *Applied Sciences (Switzerland)*, 12(12). <https://doi.org/10.3390/app12126135>
- 9) Kumar Varshney, A., Pathak, N. P., & Sircar, D. (2020). Non-destructive detection of coconut quality using RF sensor. *Electronics Letters*, 56(19), 975–977. <https://doi.org/10.1049/el.2020.1028>
- 10) Landahl, S., & Terry, L. A. (2020). Non-destructive discrimination of avocado fruit ripeness using laser Doppler vibrometry. *Biosystems Engineering*, 194, 251–260. <https://doi.org/10.1016/j.biosystemseng.2020.04.001>