

Review: Insight of Medical Imaging for Precision Medicine In Focusing on Radiomics Aspect

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Abstract

Precision medicine is a revolutionary medical approach that takes into account individual variations in genes, environment, and lifestyle to tailor treatment and prevention strategies for each patient. One crucial aspect of precision medicine is medical imaging, which plays a fundamental role in the accurate assessment and diagnosis of diseases. By utilizing various imaging modalities, such as MRI, CT scan, and PET scan, doctors can obtain detailed information about a patient's condition and make informed decisions about the most effective therapeutic options. Furthermore, imaging techniques like radiomics have emerged as a promising tool in precision medicine.

By extracting quantitative data from medical images, radiomics allows for objective and quantitative analysis of the biological characteristics of diseases. This information can then be correlated and integrated with genomic data to further enhance our understanding of diseases, a concept known as radiogenomics. Imaging plays a vital role in the development of precision medicine. Radiomics, based on high-throughput medical imaging, allows for the extraction of vast amounts of data from medical images to perform objective and quantitative analysis of the biological characteristics of diseases. This is crucial for tumor diagnosis, differential diagnosis, prognosis evaluation, and prediction of treatment response. Medical imaging, specifically radiomics, has greatly advanced the field of precision medicine by providing a comprehensive analysis of tumors and extracting quantitative data from medical images. This data can be correlated and integrated with genomic information to enhance our understanding of diseases and enable personalized treatment plans. In summary, medical imaging, particularly radiomics, plays a central and vital role in the development of precision medicine.

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1. Understanding Precision Medicine

Precision medicine is a revolutionary medical approach that takes into account individual variations in genes, environment, and lifestyle to tailor treatment and prevention strategies for each patient^[1].

One crucial aspect of precision medicine is medical imaging, which plays a fundamental role in the accurate assessment and diagnosis of diseases. By utilizing various imaging modalities, such as MRI, CT scan, and PET scan, doctors can obtain detailed information about a patient's condition and make informed decisions about the most effective therapeutic options. Furthermore, imaging techniques like radiomics have emerged as a promising tool in precision medicine^[2]. By extracting quantitative data from medical images, radiomics allows for objective and quantitative analysis of the biological characteristics of diseases^[3]. This information can then be correlated and integrated with genomic data to further enhance our understanding of diseases, a concept known as radiogenomics^[4]. Imaging has the potential to revolutionize precision medicine by providing valuable insights into a patient's unique genetic makeup, environmental factors, and lifestyle choices^[3]. This data can then be used to personalize treatment plans and improve patient outcomes. Medical imaging, particularly radiomics, is a crucial component of precision medicine as it allows for the extraction of detailed quantitative data from medical images. This data can then be correlated and integrated with genomic information to enhance our understanding of diseases and tailor treatment plans for individual patients. Imaging plays a central role in the development of precision medicine, specifically through the use of radiomics.

Radiomics, through the conversion of medical images into quantifiable features, enables a comprehensive analysis of the total tumor at a three-dimensional level^[5]. By capturing information related to tumor pathophysiology, radiomics acts as a virtual whole tumor biopsy, providing clinicians with a wealth of data for personalized treatment plans and decision-making. Imaging, particularly radiomics, has emerged as a powerful tool in precision medicine. It allows for the extraction of detailed quantitative data from medical images, which can be correlated and integrated with genomic information to enhance our understanding of diseases and tailor treatment plans for individual patients. Imaging, particularly radiomics, is at the forefront of precision medicine, enabling the extraction of detailed quantitative data from medical images.

Imaging plays a vital role in the development of precision medicine. Radiomics, based on high-throughput medical imaging, allows for the extraction of vast amounts of data from medical images to perform objective and quantitative analysis of the biological characteristics of diseases^[3]. This is crucial for tumor diagnosis, differential diagnosis, prognosis evaluation, and prediction of treatment response. Medical imaging, specifically radiomics, has greatly advanced the field of precision medicine by providing a comprehensive analysis of tumors and extracting quantitative data from medical images. This data can be correlated and integrated with genomic information to enhance our understanding of diseases and enable personalized treatment plans. In summary, medical imaging, particularly radiomics, plays a central and vital role in the development of precision medicine.

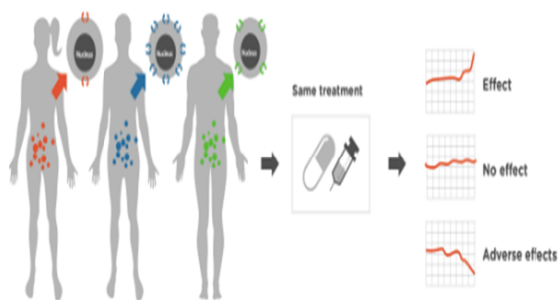


Figure 1. Traditional medicine: Same treatment for all, cancer patient with e.g colon cancer receive the same therapy even though they have different biomarkers

2. Role of Medical Imaging in Precision Medicine

The role of medical imaging in precision medicine is crucial as it allows for the extraction of detailed and quantitative data from medical images. This data, obtained through techniques like radiomics, provides valuable insights into the biological characteristics of diseases. By integrating this imaging data with genomic information, we can enhance our understanding of diseases and develop personalized treatment plans for patients. Additionally, medical imaging can be utilized in clinical-decision support systems to improve medical decision-making by providing objective and quantitative analysis of tumors. By leveraging high-throughput medical imaging techniques such as radiomics, precision medicine can take advantage of the wealth of data available in medical images to enhance diagnosis and treatment planning for individual patients. The integration of radiomics, which extracts quantitative data from medical images, with genomic information has paved the way for precision medicine^[4]. Using radiomics to extract quantitative data from medical images has revolutionized the field of precision medicine^[5]. Through radiomics, medical imaging has transformed from a diagnostic tool to a key

component of precision medicine by providing detailed information about tumor pathophysiology.

In recent years, medical imaging has expanded its role in precision medicine by incorporating radiomics, a technique that extracts highly detailed and quantifiable features from medical images.

This allows for a more comprehensive analysis of diseases and enables objective and quantitative evaluations of tumors in terms of diagnosis, differential diagnosis, prognosis evaluation, and prediction of treatment response. As a result, medical imaging, particularly radiomics, has become an essential tool in precision medicine^[2].

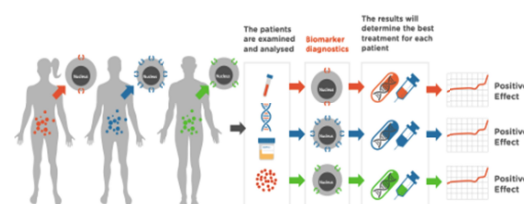


Figure 2. Innovative medicine: Personalized medicine, Cancer patients with e.g. colon cancer receive a personalized therapy based on their biomarkers^[15]

3. Advancements in Medical Imaging Techniques

Advancements in radiological image processing techniques have led to the development of radiomics, which allows for the extraction of qualitative and quantitative data from clinical images^[4].

This data can then be correlated and integrated with genomic information, resulting in a field known as radiogenomics. Radiogenomics is an emerging precision medicine approach that combines radiomics data with genomic data to provide a

deeper understanding of diseases and personalize treatment plans for patients based on their individual characteristics. In the context of personalized precision medicine, medical imaging is rapidly evolving from being a mere diagnostic tool to playing a central role^[6]. Medical imaging, specifically radiomics, is an essential component of precision medicine, enabling objective and quantitative analysis of tumors and providing valuable information for diagnosis, prognosis evaluation, and treatment planning^[3]. Radiomics, a cutting-edge field in medical imaging, has revolutionized precision medicine. With the increasing volume of data and complexity in decision-making processes, the field of precision medicine has emerged to address the variability of patients and diseases^[7].

By analyzing radiomics data, which involves the extraction of quantitative features from medical images, precision medicine can better understand tumor heterogeneity in a noninvasive, economical, and repeatable way. Radiomics provides highly detailed and quantifiable information about tumor pathophysiology, allowing for a comprehensive analysis of diseases and personalized treatment plans based on individual characteristics. Additionally, radiomics does not require invasive sampling inside the tumor like biopsies do, making it a less burdensome and more accessible method for obtaining patient information^[8].

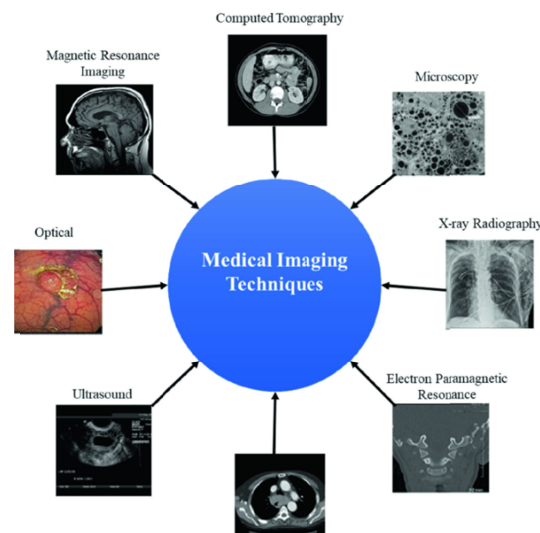


Figure.3 Medical Imaging Techniques in modern medicine^[16]

4. Medical Imaging Tools for Diagnosis and Treatment

Radiomics has proven to be a valuable tool in tumor diagnosis, differential diagnosis, prognosis evaluation, and prediction of treatment response^[3].

The use of radiomics in medical imaging has provided clinicians with a wealth of information regarding the biological characteristics of diseases.

This information can aid in accurate diagnosis, treatment planning, and monitoring of patients. Radiomics has also opened up new avenues in precision medicine by allowing for the integration of radiomics data with genomic information^[4]. This integration, known as radiogenomics, provides a deeper understanding of diseases by identifying imaging correlates of specific tumor genotypes or molecular phenotypes^[9]. Furthermore, the computational approach of radiomics allows for the correlation and integration of radiological data with genomics and other precision medicine data^[4]. This integration enhances the ability to identify biomarkers, predict treatment response, and develop personalized

treatment strategies. Medical imaging, particularly radiomics, has become an essential component of precision medicine^[3].

It allows for a more comprehensive and individualized approach to patient care, leading to improved diagnosis, treatment planning, and monitoring of diseases. In summary, medical imaging, specifically radiomics, plays a crucial role in the development and implementation of precision medicine.

5. Impact of Precision Medicine on Healthcare

The emergence of precision medicine has revolutionized healthcare by shifting the focus from a one-size-fits-all approach to a personalized and targeted treatment strategy for each patient. Imaging technologies, such as radiomics, have played a central role in enabling precision medicine. Radiomics, with its ability to extract quantitative features from medical imaging in a high-throughput manner, provides valuable insights into the biological characteristics of diseases. These insights help healthcare providers make more informed decisions regarding diagnosis, treatment selection, and prediction of patient outcomes. By integrating radiomics data with genomic information, radiogenomics has further enhanced the precision medicine approach by identifying imaging correlates of specific tumor genotypes or molecular phenotypes^[4].

Incorporating radiomics into precision medicine allows for a more comprehensive understanding of diseases, enabling the development of personalized treatment strategies based on each patient's unique characteristics^[7]. This integration of radiomics and genomics data is essential in developing targeted therapies and predicting treatment response,

ultimately leading to more successful outcomes for patients^[4].

The field of radiomics in precision medicine has the potential to greatly impact healthcare by providing a more comprehensive and individualized approach to patient care. With the ability to extract detailed quantitative features from medical images, radiomics enables a deeper understanding of disease phenotypes and tumor heterogeneity^[7]. These insights can guide treatment decisions, including selecting the most effective therapies and monitoring treatment response over time. Furthermore, the integration of radiomics data with other sources, such as electronic health records and patient-reported outcomes, can provide a holistic view of a patient's health status and aid in the development of personalized treatment plans. In summary, imaging, particularly radiomics, has a vital role in the development of precision medicine. By leveraging the vast amount of data extracted through radiomics, healthcare providers can make evidence-based clinical decisions, leading to more effective and targeted treatments for patients. In summary, imaging, particularly radiomics, plays a vital role in the development of precision medicine^[3].

6. Challenges in Implementing Precision Medicine

One challenge in implementing precision medicine is the computational intensity of genomic analysis and radiomics^[10]. The analysis of genomic data and the extraction of quantitative image features through radiomics generate a large amount of data that require significant computational power and resources. Additionally, integrating and analyzing these different types of data collectively, such as genomics, radiomics, and clinical data, presents

further computational challenges. Another challenge is the need for standardization and harmonization of radiomics and genomics data across different imaging modalities and genomic platforms.

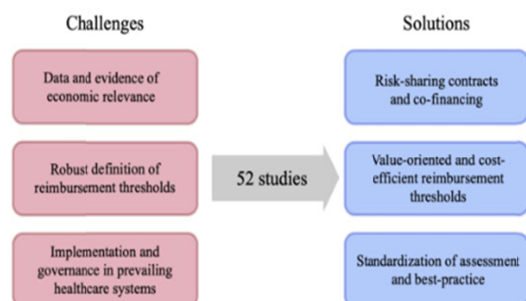


Figure 4. Integration of personalized medicine in healthcare systems^[16]

This standardization is essential for ensuring the accuracy and reproducibility of radiomics and genomics analyses, as well as for enabling data sharing and collaboration among different research institutions. Furthermore, the variability and complexity of patients and diseases also pose challenges in implementing precision medicine^[7]. Healthcare providers must consider the individual variability of patients and diseases when developing personalized treatment plans. Additionally, there is a need to integrate precision medicine data, which focuses on an individual's health, with public health data through the use of Big Data tools^[4]. This integration allows for the aggregation, analysis, and collective interpretation of data on a larger scale, leading to improved population health outcomes.

Overall, while there are challenges in implementing precision medicine, such as computational intensity, standardization, and variability of patients and diseases, the use of imaging and radiomics in precision medicine holds great promise for improving patient outcomes through personalized and targeted treatments^[7].

7. The Future of Precision Medicine and Medical Imaging

The future of precision medicine and medical imaging is promising. Advancements in imaging technology and data-driven analysis methods like radiomics are revolutionizing the field of precision medicine^[11]. These advancements enable the extraction of quantitative features from medical images, providing valuable information for diagnostic, prognostic, and predictive purposes. Integrating radiomics data with genomic data, known as radiogenomics, allows for a more comprehensive understanding of the underlying molecular characteristics of diseases and how they manifest visually in medical images^[4].

This integration opens up possibilities for more targeted and personalized treatment approaches, as well as the identification of new biomarkers and therapeutic targets. Additionally, the integration of radiomics and genomics data across different imaging modalities and genomic platforms is crucial for standardization and ensuring the accuracy and reproducibility of results^[12].

By harmonizing data processing and developing specific standards, the integration of genomics and radiomics into the data system can greatly enhance the potential of precision medicine for improving patient care .

With the creation of high-quality, ideally public, datasets that integrate radiomics, genomics, and proteomics information, along with clinical-prognostic and neuropathological data, the implementation of big data analysis in precision medicine can reach its full potential^[13].

These datasets will not only facilitate research and the development of new treatments, but also pave

the way for more personalized and precise clinical decision-making. Furthermore, the use of big data tools in combination with precision medicine data has the potential to revolutionize public health on a larger scale^[4].

In conclusion, the utilization of medical imaging and radiomics in precision medicine is a promising approach that can provide valuable quantitative information about diseases and patients^[11].

8. Ethical Considerations in Precision Medicine

Ethical considerations are paramount in the field of precision medicine, especially when it comes to medical imaging and radiomics. There are several ethical considerations that need to be addressed: 1. Privacy and consent: As medical imaging involves the collection and storage of personal health information, it is important to ensure patient privacy and obtain informed consent for the appropriate use and sharing of their data. 2. Data sharing and ownership: With the integration of different data sources in precision medicine, including radiomics and genomics, there is a need to establish clear guidelines for data sharing and ownership. This includes determining who has access to the data, how it can be used, and ensuring that individuals involved in data collection and analysis adhere to ethical standards and protect patient privacy. Furthermore, there is also a need to address potential biases and disparities that may arise in the application of precision medicine.

This includes ensuring equitable access to precision medicine technologies and addressing potential biases in the data and algorithms used for diagnosis and treatment. Additionally, there is an ethical responsibility to ensure that the implementation of precision medicine does not lead to undue burden

or harm for patients. This may involve monitoring potential risks and adverse effects, as well as addressing issues of affordability and accessibility in order to ensure equitable healthcare for all individuals. In conclusion, while medical imaging and radiomics hold great potential for precision medicine, it is important to approach their implementation ethically and address considerations such as privacy, consent, data sharing and ownership, potential biases, equitable access, and potential risks and harms^[6].

9. Success Stories of Precision Medicine Using Medical Imaging

Precision medicine has shown promising successes in various fields of healthcare, thanks to the integration of medical imaging and radiomics. One success story comes from the field of oncology, where precision medicine has revolutionized cancer treatment. By utilizing radiomics to analyze tumor heterogeneity and extract quantitative features from medical images, clinicians can tailor treatments based on the specific characteristics of a patient's tumor^[7].

This personalized approach has led to improved diagnostic accuracy, treatment selection, and patient outcomes. For example, in lung cancer, radiomics has been used to predict the response to chemotherapy, allowing for a more targeted and effective treatment plan. Another success story is in the field of neurology, where precision medicine has greatly advanced the diagnosis and treatment of neurological disorders. Using medical imaging and radiomics, clinicians can analyze brain scans to identify unique patterns and biomarkers associated with specific neurological conditions. This allows for early detection, accurate diagnosis, and

personalized treatment strategies. In cardiology, precision medicine using medical imaging has also proven to be transformative. Radiomics has allowed for the identification of specific features in cardiac imaging that can predict the risk of cardiovascular events, such as heart attacks or strokes. By applying precision medicine principles to these cases, physicians can develop individualized treatment plans and interventions to manage the patient's cardiovascular health more effectively. Overall, medical imaging and radiomics have demonstrated their value in advancing precision medicine^[3].

Not only do they enable more accurate diagnoses and treatment selection, but they also contribute to a personalized approach that takes into account the unique characteristics of each patient and their disease. Furthermore, the implementation of precision medicine using medical imaging comes with several considerations that need to be addressed. These include standardization of imaging protocols and analysis methods, data management and integration, and ethical considerations regarding patient data privacy.

10. The Intersection of Artificial Intelligence and Precision Medicine

The intersection of artificial intelligence and precision medicine has further enhanced the capabilities of medical imaging for personalized healthcare. Using artificial intelligence algorithms, medical images can be analyzed in a more efficient and accurate manner, allowing for the extraction of valuable insights and patterns that may not be immediately apparent to the human eye. This integration of artificial intelligence and precision medicine in medical imaging has the potential to

revolutionize healthcare by providing clinicians with more comprehensive and precise diagnostic information. Additionally, the use of neural networks in medical imaging can aid in image interpretation and decision-making. These technologies can identify subtle patterns and features in medical images that may be indicative of specific diseases or conditions, enabling earlier detection and intervention. In conclusion, medical imaging plays a vital role in precision medicine by providing valuable insights into intra-regional heterogeneity of abnormal tissues. This information can then be used to develop targeted treatment plans and interventions for individual patients, leading to improved outcomes in personalized healthcare. In summary, medical imaging is a crucial component of precision medicine by providing quantitative imaging biomarkers and aiding in the diagnosis, prognosis, and personalized treatment planning of patients. It enables clinicians to make more informed decisions based on accurate and detailed information about a patient's condition. Moreover, radiomics and the analysis of medical images using artificial intelligence and machine learning algorithms can contribute to a deeper understanding of tumor characteristics, enabling more precise diagnosis and prediction of treatment response^[14].

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