Research on the Pathogenic Genes of Insulin Resistance Based on Metagenomic Sequencing

Gang Huang^{1,*,#}, Yinzhu He^{2,#}

Abstract: Insulin resistance refers to a decreased sensitivity of target organs to insulin, leading to reduced uptake and utilization of glucose by the body, thereby causing hyperglycemia and metabolic syndrome. As the core pathophysiological mechanism of metabolic diseases such as type 2 diabetes, obesity, and cardiovascular diseases, insulin resistance poses a significant threat to global public health. Although both genetic and environmental factors are believed to be associated with the onset and development of insulin resistance, the specific pathogenic genes and their mechanisms of action are not yet fully clarified. With advances in life science technology, especially the rapid development of metagenomic sequencing, scientists have begun to explore the etiology of insulin resistance from the perspective of the gut microbiome. The gut microbiome is a complex ecosystem containing trillions of microbes, which form a mutually dependent and interactive microenvironment with the human body. The collective genome of these microbes, the metagenome, has a profound impact on human metabolism and immune function. In-depth research not only helps us to understand the pathogenesis of insulin resistance more comprehensively but also provides a scientific basis for developing new intervention measures and treatment strategies, contributing to the improvement of global public health.

Keywords: Metagenomic Sequencing; Insulin Resistance; Pathogenic Genes

1. Importance of Insulin Resistance

Insulin resistance is not only central to metabolic diseases like diabetes, obesity, and cardiovascular diseases but also plays a key role in the development of many other conditions. This makes research into insulin resistance crucial for understanding these diseases' pathogenesis and developing prevention and treatment plans [1]. Firstly, insulin resistance is a critical factor in the development and progression of type 2 diabetes, a chronic disease affecting millions worldwide. Insulin resistance leads to ineffective glucose utilization, resulting in hyperglycemia. Over time, this demands increased insulin production from the pancreas, eventually leading to pancreatic failure and the onset of type 2 diabetes. Therefore, research into insulin resistance aids in understanding the mechanisms of type 2 diabetes, providing a basis for more effective prevention and treatment strategies [2]. Secondly, insulin resistance is closely linked to the development of obesity, a common metabolic disease associated with increased risk of various chronic conditions. When the body's sensitivity to insulin decreases, fat cells cannot effectively absorb and store fat, leading to fat accumulation and weight gain. Moreover, insulin resistance can disrupt the balance of hormones secreted by fat cells, exacerbating obesity. Thus, studying insulin resistance helps to understand the mechanisms of obesity and develop effective weight loss and prevention strategies [3]. Lastly, insulin resistance is closely associated with the development and progression of cardiovascular diseases, a leading cause of death globally [4]. Insulin resistance can lead to abnormal lipid metabolism, hypertension, and atherosclerosis, increasing the risk of cardiovascular diseases [5]. Understanding the relationship between insulin resistance and cardiovascular diseases enables better comprehension of their pathogenesis and the development of effective intervention measures to reduce their risk.

¹Huazhi Biotechnology Co. Ltd., Changsha, 410125, China

²Changsha BGI Meixi Lake Clinical Laboratory Co. Ltd, Changsha, 410125, China

^{*}Corresponding author

^{*}These authors contributed equally

2. Research Methodology

2.1 Sample Collection

During the sample collection process, several points must be carefully considered to ensure the collected samples represent the target population and provide reliable data for the analysis of pathogenic genes of insulin resistance, as shown in Figure 1. First, different sample types such as blood, tissue, and feces can be collected according to the research purpose and needs. Each sample type contains different microbiomes, potentially affecting insulin resistance differently. Therefore, appropriate sample types should be selected based on the research hypothesis. Second, to ensure the reliability and statistical significance of the results, a sufficient number of samples should be collected from different groups for cross-validation and analysis. The diversity and heterogeneity among individuals should also be considered to ensure the representativeness of the samples. Third, immediate appropriate processing and preservation of the samples after collection are necessary to avoid degradation and alteration of the microbiome. Different handling and preservation methods are needed for different sample types to ensure the stability and accuracy of the microbiome structure. Fourth, ethical principles must be followed during sample collection, ensuring the privacy and rights of participants are protected. Participants should be informed about the purpose, methods, and potential risks of the study, and their informed consent obtained. Fifth, quality control and standardization are crucial to ensure the quality and reliability of the samples. This includes strict control and management of all aspects of sample collection, processing, preservation, and transportation to ensure data accuracy and reliability.

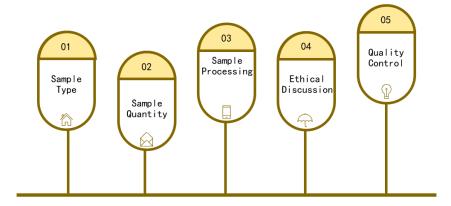


Figure 1: Considerations for Sample Collection

2.2 Metagenomic Sequencing

Metagenomic sequencing of the collected samples allows for comprehensive genomic analysis, offering insights into the composition and function of microbiomes and revealing potential links to insulin resistance. This process involves sample preparation, sequencing, and complex data analysis and interpretation. Firstly, metagenomic sequencing provides an unbiased approach to studying all microbial gene sequences in the samples, allowing for a comprehensive understanding of microbial diversity and complexity and revealing interactions and ecological balances among different species. Secondly, data analysis is a crucial aspect of metagenomic sequencing. The raw sequencing data undergoes steps like quality control, sequence alignment, gene annotation, and functional prediction, helping identify microbial species, gene expression levels, and potential functional activities in the samples. By comparing microbiome data between healthy individuals and those with diseases, specific microbial populations or gene functions related to insulin resistance can be discovered, further elucidating potential pathogenic mechanisms. Thirdly, metagenomic sequencing offers a novel perspective for studying the etiology of insulin resistance. Traditional views focus mainly on human metabolism and endocrine regulation, often overlooking the role of the microbiome. Metagenomic sequencing can reveal connections between the microbiome and insulin resistance and explore its potential role in disease onset and progression, providing new insights and strategies for prevention and treatment.

2.3 Data Processing and Analysis

Advanced bioinformatics methods and techniques are employed to deeply mine metagenomic sequencing data. This involves basic sequence alignment and gene annotation, as well as more complex functional and evolutionary analysis, and integration with other 'omics' data. First, data quality control is crucial for reliable analysis. Assessing sequencing data quality, sequence length, and the proportion of repetitive sequences helps identify and remove low-quality data, reducing errors and noise. This step is vital for accurate alignment and gene annotation. Next, sequence alignment involves matching short sequencing reads to reference genomes, a process aided by efficient algorithms and computational resources, enabling precise gene sequence localization. This is significant for identifying microbial species, gene variations, and structures. Finally, in the gene annotation stage, sequencing genes are functionally annotated using database resources. This includes aligning gene sequences with databases like NCBI and UniProt to predict coding regions, promoters, and terminators. By comparing with known gene sequences and functional characteristics, new gene functions can be predicted, and their potential roles in the microbiome understood. To delve into the microbiome's functions and metabolic activities, gene functional analysis is conducted. Key genes or metabolic pathways related to insulin resistance are identified by comparing gene expression profiles between different samples. Additionally, metabolic network models are used to predict potential metabolic products and interactions within the microbiome, offering a more comprehensive understanding of its role in disease.

2.4 Pathogenic Gene Screening

In the pathogenic gene screening stage, candidate genes related to insulin resistance are further selected based on statistical analysis results. This involves several key steps, as shown in Figure 2. The first step is to use statistical methods to deeply mine metagenomic sequencing data for gene expression differences related to insulin resistance. Significant differentially expressed genes associated with disease states are identified by comparing gene expression profiles between healthy and diseased populations. The second step involves selecting candidate pathogenic genes related to insulin resistance based on the results of statistical analysis, combined with existing biological knowledge and literature. This step considers factors like gene function, expression patterns, and associations with other biomarkers. The third step involves deeper functional annotation and classification of the selected candidate genes. This includes understanding the biological functions of genes, their roles in metabolic pathways, and interactions with other genes, providing a comprehensive understanding of their mechanisms in insulin resistance. The fourth step employs bioinformatics methods to predict analysis of candidate pathogenic genes, such as gene mutations and transcription factor binding sites. These predictions provide a basis for subsequent experimental validation and help uncover potential disease mechanisms. The final step involves experimental validation of the selected candidate genes, including gene expression analysis, mutation detection, and functional verification. Experimental validation is a crucial step in confirming the association of candidate pathogenic genes with insulin resistance and is necessary to translate data analysis results into practical scientific discoveries.



Figure 2: Steps in Pathogenic Gene Screening

3. Results

3.1 Whole-Genome Level Analysis

In the whole-genome level analysis phase, attention should be given not only to the expression and function of individual genes but also to a more macroscopic deep analysis of the entire genome. By comparing the genomic sequences of different samples, genomic variations, including insertions, deletions, inversions, and chromosomal translocations, are detected. These structural variations might be associated with the pathogenesis of insulin resistance and could affect gene expression and function. Copy Number Variations (CNVs) refer to the increase or decrease in the number of copies of repeat sequences in the genome. Detecting CNVs helps understand the variation of repeat sequences in the genome and further explore their association with insulin resistance. Bioinformatics methods are used for gene function enrichment analysis to identify functional categories and pathways related to insulin resistance. This includes gene annotation, classification, and clustering to discover potential functional modules or complexes. Functional enrichment analysis provides a comprehensive understanding of the genomic role in insulin resistance. Constructing gene co-expression networks explores the interactions between genes. By analyzing the network's structure and modules, key genes and regulatory modules related to insulin resistance are identified, revealing their potential biological functions.

3.2 Differential Gene Expression Analysis

Differential gene expression analysis, a crucial step in bioinformatics, identifies genes with significant expression changes under specific conditions. In insulin resistance research, this analysis helps understand gene expression changes in disease states and explores potential therapeutic targets. First, experimental samples, typically including gene expression data from both insulin resistance patients and healthy individuals, are collected. This data is obtained through high-throughput sequencing technologies like RNA-seq. Then, suitable bioinformatics tools preprocess the raw sequencing data, including quality control, sequence alignment, and gene annotation, ensuring data quality and accuracy for subsequent analysis. After preprocessing, differential gene expression is screened, commonly using the limma package in R, which provides functions for gene expression analysis. By comparing gene expression profiles between insulin resistance patients and healthy individuals, differential expression fold-changes and corresponding P-values for each gene are calculated. These results help identify genes significantly differentially expressed in insulin resistance. Finally, bioinformatics tools annotate and perform pathway enrichment analysis on key differentially expressed genes, helping understand their mechanisms in insulin resistance and revealing potential therapeutic targets and biomarkers.

3.3 Pathogenic Gene Screening Results

In the pathogenic gene screening stage, candidate pathogenic genes related to insulin resistance were selected based on statistical analysis results. Here are some selected candidate pathogenic genes and their functional descriptions: Gene 1: INS-R, Function: Encodes insulin receptor protein, playing a key role in insulin signal transduction. Findings: Studies show that mutations or abnormal expression of INS-R gene are associated with the onset of insulin resistance. For instance, certain INS-R gene mutations can lead to receptor dysfunction, affecting normal insulin signal transduction and causing insulin resistance. Gene 2: GCK, Function: Encodes glucokinase, involved in glycolysis and gluconeogenesis. Findings: Research indicates that GCK gene mutations can affect glycolysis and gluconeogenesis processes, increasing the risk of insulin resistance and type 2 diabetes. For example, certain GCK gene mutations can reduce enzyme activity, affecting normal sugar metabolism and leading to insulin resistance. Gene 3: FAS, Function: Encodes fatty acid synthase, involved in fatty acid synthesis. Findings: Studies show that abnormal expression of the FAS gene is associated with the onset of insulin resistance and obesity. For instance, certain FAS gene mutations can increase fatty acid synthesis, leading to fat accumulation and insulin resistance. Functional validation experiments further explore these genes' specific mechanisms in insulin resistance, providing important scientific evidence for subsequent research and treatment.

4. Conclusion

In summary, the analysis of pathogenic genes of insulin resistance based on metagenomic

sequencing involved the analysis of a large amount of gene data, studying the expression and variation of genes related to insulin resistance. The research found that multiple genes are closely related to the onset and development of insulin resistance, involving aspects like sugar metabolism, fat metabolism, and inflammatory responses. The expression levels of some genes were significantly increased or decreased in patients with insulin resistance, suggesting they might play a disease-promoting or protective role. Additionally, new variation sites were discovered, potentially affecting susceptibility to insulin resistance. These findings are significant for a deeper understanding of the pathogenesis of insulin resistance and provide potential targets for developing new treatment strategies. However, it is also recognized that the data analysis of metagenomic sequencing has its complexity and challenges, requiring more in-depth research and validation. Considering individual differences and environmental factors, future research needs to expand the sample size and consider multiple factors comprehensively. More research is anticipated to delve deeper into the links between these genes and insulin resistance, providing more scientific evidence for its prevention and treatment.

References

- [1] Takeuchi, T., Kubota, T., Nakanishi, Y. et al. Gut microbial carbohydrate metabolism contributes to insulin resistance [J]. Nature621. 2023, 389–395.
- [2] Moller, D. E. New drug targets for type 2 diabetes and the metabolic syndrome [J]. Nature 414. 2001, 821–827.
- [3] Thingholm, L. B. et al. Obese individuals with and without type 2 diabetes show different gut microbial functional capacity and composition [J]. Cell Host Microbe 26. 2019, 252–264.
- [4] Gou, W. et al. Interpretable machine learning framework reveals robust gut microbiome features associated with type 2 diabetes. Diabetes Care44. 2021, 358–366.
- [5] Pedersen, H. K. et al. Human gut microbes impact host serum metabolome and insulin sensitivity [J]. Nature 535. 2016, 376–381.