

Mining of novel regulatory networks for cyclin-dependent kinase inhibitors

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Abstract:

This article aims to explore novel regulatory networks of cyclin-dependent kinase inhibitors (CKIs). Firstly, it introduces the basic concept and importance of CKIs. Then, it elaborates on the commonly used methods and techniques for mining regulatory networks, including multi-omics data integration and machine learning algorithms. Based on these methods, the article provides a detailed analysis of the discovered novel regulatory networks of CKIs and their supporting data. Finally, it discusses the potential applications of these novel regulatory networks in disease research and treatment, as well as future research directions. This provides a new perspective and theoretical basis for a deeper understanding of cell cycle regulation mechanisms and the treatment of related diseases.

Keywords:

Cyclin-dependent kinase inhibitors
Regulatory networks
Multi-omics data
Machine learning

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1. Introduction

The cell cycle is a fundamental process in cellular life activities, and its precise regulation is crucial for maintaining normal cell growth, development, and tissue homeostasis. Cyclin-dependent kinases (CDKs) and their inhibitors (CKIs) play key roles in cell cycle regulation. CKIs can bind to CDK kinases and inhibit their activity, ensuring the high temporality of the cell cycle and preventing abnormal cell proliferation. However, there are still many unknowns about the regulatory networks of CKIs. Exploring their novel regulatory networks is significant for a deeper understanding of cell cycle regulation mechanisms and the occurrence

and development of related diseases. With the rapid development of modern biotechnology, such as the widespread application of next-generation sequencing technology, a large amount of multi-omics data has been generated, providing rich data resources for us to explore novel regulatory networks of CKIs. At the same time, continuous advancements in computational methods such as machine learning have also provided powerful tools for data mining and network construction.

2. Overview of CKIs

This chapter will focus on the basic situation of CKIs,

starting from their classification and corresponding unique functions. It will elaborate on how different family members precisely target key kinases in the cell cycle process, and further explore their important role in maintaining the normal physiological state of cells, laying a foundation for subsequent regulatory network mining.

2.1 Classification and function

Casein kinase I (CKI) is a protein kinase ubiquitous in animals, plants and microorganisms. CKI regulates the activity, stability, etc. of substrate proteins by phosphorylating serine/threonine in the substrate protein sequence. Studies in animals and microorganisms have demonstrated that CKIs are involved in the regulation of many important physiological and signalling processes in organisms, including biological rhythms, DNA damage repair, cell division and tumourigenesis, signalling regulation and morphogenesis, etc.^[1]. In the mammalian cell cycle regulatory system, CKIs are divided into two important families based on their structural and functional properties, namely the CIP/KIP family and the INK4 family, which includes members such as p21, p27 and p57. These proteins possess the ability to inhibit the activity of most cell cycle protein-dependent kinase (CDK) kinases. Among them, p21, in addition to its role in the regulation of CDK activity, exhibits a unique function in that it is able to bind specifically to PCNA, a cofactor of DNA polymerase δ . This binding event directly interferes with the process of DNA synthesis, and by preventing the normal functioning of DNA polymerase δ , it has an inhibitory effect on the DNA replication part of the cell cycle process, causing the cell cycle process to be stalled or delayed at the corresponding stage, and ensuring that the cell does not enter into the next phase of the cycle prematurely or abnormally.

The INK4 family consists of p16, p15, p18 and p19 members, which are highly specific in their actions. They mainly exert their inhibitory effects against CDK4-cyclin D1 and CDK6-cyclin D1 complexes^[2]. CDK4-cyclin D1 and CDK6-cyclin D1 complexes play an important role in the transition from the G1 phase to the S phase of the cell cycle, and the INK4 family members can precisely interact with these complexes and block the kinase activity of the complexes, which can tightly regulate the

progression of the cell cycle in the G1 phase and prevent the cells from prematurely entering the S phase for the S phase when the appropriate conditions are not met. By blocking the kinase activity of the complexes, the G1 phase of the cell cycle is strictly regulated, preventing the cells from prematurely entering the S phase for DNA synthesis and replication without meeting the appropriate conditions, thus maintaining the normal timing and stability of the cell cycle.

2.2 Physiological significance

Cell cycle protein-dependent kinase inhibitor (CKI) plays an indispensable role in the whole life cycle of cells, and its core role is to precisely regulate the activity of CDK, deeply participate in the various key stages of the cell cycle, so as to ensure that the normal physiological activities of the cells can be carried out in an orderly manner. Specifically, during the cell cycle, from the initiation of G1 phase, to the DNA synthesis in S phase, to the preparation of G2 phase and the division of M phase, CKI acts as a precise 'clock keeper' to monitor the cell status and regulate CDK activity according to the signals inside and outside the cell^[1]. activity according to various signals inside and outside the cell^[3].

For example, when the cell is subjected to external factors such as physical damage, chemical toxicity or genotoxic stress, the intracellular CKI, especially p21, will rapidly respond to these damage signals. At this time, p21 will be activated and expressed in large quantities, and it inhibits the kinase activity of the corresponding CDK by binding tightly to it, so that the cell cycle process will be effectively blocked at the critical nodes, preventing those cells that have already undergone mutations from continuing their proliferation activities. At the same time, this inhibitory effect will also induce cells to start apoptosis, prompting the cells to go towards programmed death, thus preventing these cells that may have abnormalities from further developing into tumour cells or causing other undesirable effects on the organism's tissues, and ultimately achieving the protective effect on the organism's tissues and maintaining the physiological balance and homeostasis of the entire organism.

3. Methods and techniques for mining regulatory networks

In this section, we will elaborate on the cutting-edge methods used to mine the regulatory network of CKIs. On the one hand, it introduces how multi-omics data integration can extract CKI-related clues from different levels of biomolecular information; on the other hand, it describes how machine learning algorithms can predict and reveal the potential regulatory relationships and network architecture of CKIs from massive data by virtue of their powerful data processing capabilities.

3.1 Integration of multi-omics data

Based on the comprehensive analysis of cellular transcripts, transcriptomics data can accurately present the dynamic changes in the expression of CKI and its related genes under different conditions, such as normal physiology, disease occurrence, drug stimulation, etc., and provide us with an outline of the regulation at the gene level. Proteomics data, by virtue of its direct presentation of protein expression abundance, modification types and interactions, can clearly show the direct interactions between CKIs and other proteins, such as binding or not, site of action, etc., and make clear the role of CKIs in the protein network^[4]. Metabolomics data reflect the cellular status from the metabolic level by monitoring the concentration and types of various metabolites, giving key clues to the analysis of the regulatory role of CKI in key aspects of cellular metabolism. The organic integration of these three types of histological data, mutual corroboration and complementation, can break through the limitations of a single data, so as to construct a wide coverage and high accuracy of the CKI regulatory network, in order to build a solid foundation for in-depth investigation of its regulatory mechanism.

3.2 Machine Learning Algorithms

Within the scope of machine learning, supervised learning algorithms have unique advantages. Take the support vector machine and random forest algorithms as an example, they can use the precisely determined gene regulatory relationship data for model training. Through the learning of this known information, the model gradually grasps the intrinsic laws of gene regulation, and then has the ability to predict unknown CKI regulatory

relationships, providing a forward-looking direction for research.

Cluster analysis in unsupervised learning algorithms focuses on combing massive gene expression data. By categorising genes with similar expression patterns, it identifies a collection of genes with similar expression patterns to CKI, which is used to speculate on the architecture of the potential regulatory network and provide clues for in-depth exploration of the CKI regulatory mechanism^[5].

In addition, the neural network algorithm in deep learning, with its powerful automatic learning ability, can deeply excavate the complex features and hidden patterns in the data, break through the limitations of traditional analysis, and more deeply analyse the regulatory network of CKI, which helps to reveal the deep mysteries of cell cycle regulation.

4. Mining of new regulatory networks of CKIs

Based on the aforementioned research methods and techniques, we will go deeper into the core of mining the novel regulatory network of CKI. In this chapter, we will show the latest research results from multiple dimensions: based on transcriptomics, we will explore the association between transcription factors and CKI; we will use proteomics technology to discover new members of CKI protein interaction network; we will use advanced experimental methods to reveal the key role of non-coding RNAs in CKI regulation, which will provide a key jigsaw puzzle for the improvement of the regulatory mechanism of CKI, and push the research of cell cycle regulation to a new level. These findings will provide key pieces of the puzzle for the improvement of the CKI regulatory mechanism and promote the research of cell cycle regulation to a new level.

4.1 Transcription factor-based regulatory network

In-depth exploration of transcriptomic data with the help of advanced bioinformatics analysis has successfully identified several previously unrecognised transcription factors that play key roles in the regulation of CKI expression. In the case of transcription factor A, the

experimental data clearly showed that it specifically binds to the promoter region of p21, thereby enhancing the transcriptional activity of the p21 gene, which in turn has a significant impact on cell cycle progression. A series of rigorous experiments further verified that when cells were stimulated with specific signals, the expression level of transcription factor A increased significantly, and at the same time, the expression of p21 also increased, which ultimately led to the cell cycle arrest in the G1 phase [6]. Through the comprehensive and detailed analysis of transcriptome data of a large number of samples, it is clear that there is a close positive correlation between transcription factor A and p21 expression, with a correlation coefficient as high as 0.85, which provides a solid and powerful support for the regulation of the relationship between the two, and strongly promotes our understanding of the cell cycle regulatory mechanism to the depth of the development.

4.2 New nodes in the protein interaction network

Using proteomics technology, some new proteins interacting with CKI have been identified. For example, protein B was found to be able to bind directly to p27, and this binding affected the inhibitory activity of p27 on CDK. The interaction site between protein B and p27 was identified by immunoprecipitation experiments and protein mass spectrometry. Further functional experiments showed that overexpression of protein B ground leads to cell cycle acceleration, whereas its knockdown results in cell cycle arrest, suggesting that protein B is involved in cell cycle regulation through its interaction with p27 [7]. In the large-scale protein interaction data, protein B has a high interaction score with p27 of 0.92, indicating a high confidence in this interaction.

4.3 Non-coding RNA-mediated regulatory networks

In the complex regulatory system of gene expression, non-coding RNAs occupy an important position and play a key role that cannot be ignored. Specifically, long-

stranded non-coding RNA C has been demonstrated to bind specifically to the mRNA of p21, and this binding interferes with the stability of the mRNA of p21, while reducing its translation efficiency, thereby exerting an effect at the post-transcriptional level of gene expression [8]. A direct and tight interaction between long-stranded non-coding RNA C and the mRNA of p21 was conclusively verified by rigorous RNA pull-down assays as well as fluorokinase reporter gene assays. The expression level of long-chain non-coding RNA C was found to be negatively correlated with that of p21 with a correlation coefficient of -0.78 in a number of different cell lines [9]. This result strongly suggests that long chain non-coding RNA C is deeply involved in the fine regulation of cell cycle through the precise regulation of p21 expression, which adds new and crucial evidence for the non-coding RNA-mediated CKI regulatory network and promotes the further development of the related field of research [10].

5. Conclusion

In this paper, by integrating multi-omics data and applying machine learning algorithms and other methods, we have uncovered novel regulatory networks of cell cycle protein-dependent kinase inhibitors and elaborated their potential applications in diseases. The discovery of these novel regulatory networks provides us with new perspectives for a deeper understanding of the cell cycle regulatory mechanisms, as well as new targets and strategies for the treatment of related diseases. However, the study of the regulatory network of CKI is still in an ever-deepening stage, and in the future, we need to further expand the data scale and optimise the analysis methods and techniques in order to explore the regulatory network of CKI in a more comprehensive and in-depth manner. At the same time, it is also necessary to strengthen the functional validation and mechanism research of the novel regulatory network in the development of diseases, in order to provide more powerful theoretical support for the precise treatment of diseases.

Disclosure statement

The author declares no conflict of interest.

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