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Chapter 11

BIOMEDICAL LITERATURE ANALYSIS: CURRENT STATE AND CHALLENGES

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ABSTRACT

Advances in molecular biology tools and techniques from the end of the last century had shifted the focus of biomedical research from the study of individual proteins and genes to the interactions within an entire biological systems. At the same time, advanced tools generates large sets of experimental data which required collaborations of groups of biologists to decipher. This resulted in a need to have a diverse research knowledge. However, the amount of published research information in the form of published articles is increasing exponentially, making it difficult to maintain a productive edge. Biomedical literature analysis is seen as a means to manage the increased amount of information – to gather relevant articles and extract relevant information from these articles. We review the central (information retrieval, information extraction and text mining) and allied (corpus collection, databases and system evaluation methods) domains of computational biomedical literature analysis to present the current state of biomedical literature analysis for protein-protein and protein-gene interactions and the challenges ahead.

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