Mining Protein Interactome Networks to Measure Interaction Reliability and Select Hub Proteins

Young-Rae Cho, Baylor University, USA
Aidong Zhang, State University of New York, Buffalo, USA

ABSTRACT

High-throughput techniques involve large-scale detection of protein-protein interactions. This interaction data set from the genome-scale perspective is structured into an interactome network. Since the interaction evidence represents functional linkage, various graph-theoretic computational approaches have been applied to the interactome networks for functional characterization. However, this data is generally unreliable, and the typical genome-wide interactome networks have a complex connectivity. In this paper, the authors explore systematic analysis of protein interactome networks, and propose a k-round signal flow simulation algorithm to measure interaction reliability from connection patterns of the interactome networks. This algorithm quantitatively characterizes functional links between proteins by simulating the propagation of information signals through complex connections. In this regard, the algorithm efficiently estimates the strength of alternative paths for each interaction. The authors also present an algorithm for mining the complex interactome network structure. The algorithm restructures the network by hierarchical ordering of nodes, and this structure re-formatting process reveals hub proteins in the interactome networks. This paper demonstrates that two rounds of simulation accurately scores interaction reliability in terms of ontological correlation and functional consistency. Finally, the authors validate that the selected structural hubs represent functional core proteins.

Keywords: Flow Simulation, Functional Core Proteins, Interactome, Protein Interaction Networks, Protein-Protein Interactions

INTRODUCTION

Understanding functional behaviors of molecular components is an underlying base for biomedical applications. A wide range of computational approaches have been applied to characterize molecular functions from various types of data sources. In the past, sequence or structure analysis of proteins has contributed to characterize their functions. However, they are incapable of systematically analyzing complex functional mechanisms through biochemical reactions or interactions. Proteins typically execute their functions through interactions.
with other biomolecular units. Comprehensive knowledge of protein-protein interactions is thus essential to understanding the intrinsic mechanisms of biological processes.

Earlier data of protein-protein interactions were obtained via intensive small-scale investigations of restricted sets of proteins of interest, each yielding data sets regarding a limited number of protein-protein interactions. However, recent high-throughput techniques, such as yeast two-hybrid systems and mass spectrometry, involve genome-wide detection of protein-protein interactions (Uetz et al., 2000; Ito, Chiba, Ozawa, Yoshida, Hattori, & Sakaki, 2001; Gavin et al., 2002; Ho et al., 2002; Giot et al., 2003; Li et al., 2004). The yeast two-hybrid system (Parrish, Gulyas, & Finley, 2006) seeks feasible binary interactions between any two proteins encoded in the genome of interest. The interaction of two proteins transcriptionally activates a reporter gene. This reaction tracks the interaction, revealing “prey” proteins that interact with a known “bait” protein. The mass spectrometry (Aebersold & Mann, 2003) analyzes the composition of a partially purified protein complex. It uses an affinity tag attached to target “bait” proteins for purifying complexes. Comprehensive protein-protein interaction data sets in model organisms, generated by the high-throughput experiments, are publicly available in a number of open databases such as BioGRID (Breitkreutz, Stark, Reguly, Boucher, Breitkreutz, Livstone, Oughtred, Lackner, Bahler, Wood, Dolinski, & Tyers, 2008), MIPS (Mewes, Dietmann, Frishman, Gregory, Mannhaupt, Mayer, Munsterkotter, Ruepp, Spannagl, Stumpfle, & Rattei, 2008), DIP (Salwinski, Miller, Smith, Pettit, Bowie, & Eisenberg, 2004), MINT (Chatr-aryamontri, Ceol, Montecchi-Palazzi, Nardelli, Schneider, Castagnoli, & Cesareni, 2007), IntAct (Aranda et al., 2010), and HPRD (Prasad et al., 2009).

However, accurate analysis of protein-protein interactions has been limited due to unreliable interaction data. The large-scale experimental data sets are susceptible to false positives, i.e., some fraction of the putative interactions detected should be considered spurious because they cannot be confirmed to occur in vivo (von Mering, Krause, Snel, Cornell, Oliver, Fields, & Bork, 2002; Sprinzak, Sattath, & Margalit, 2003).

The protein-protein interaction data sets from a genome-scale perspective are structured into an interactome network, which is represented as an undirected, un-weighted graph having proteins as a set of nodes and interactions between them as a set of edges. Specific topological features have been observed in the networks, such as scale-free distribution (Barabasi & Albert, 1999), small-world property (Watts & Strogatz, 1998), and hierarchical modularity (Ravasz, Somera, Mongru, Oltvai, & Barabasi, 2002). Various graph-theoretic computational approaches (Sharan, Ulitsky, & Shamir, 2007) have been applied to the interactome networks for functional characterization. Connection pattern is a major attribute to predict functions of unknown proteins in the networks (Oliver, 2000). However, accurate analysis of interactome networks has been challenged because of complex connectivity. In general, this complexity is caused by multiple functions of each protein and numerous cross-links between functional modules (Hartwell, Hopfield, Leibler, & Murray, 1999). A functional module is defined as a group of proteins that participate in the same functional activities (Spirin & Mirny, 2003). When handling such complex interactome networks, classical graph-theoretic algorithms are inefficient. A novel algorithm to extract functional connection patterns effectively from the complex systems is urgently needed.

Hubs play a central role in structural behaviors of scale-free networks which have power-law degree distributions (Barabasi & Oltvai, 2004). It has been observed that a protein interaction network is composed of a collection of functional modules hierarchically distributed, and hubs exist in each functional module. Based on this observation, we can achieve the hierarchical distribution of hubs, from local hubs to global hubs. Local hubs mostly include intra-module hubs which have high connectivity to the members in each functional module. In
Related Content

SPCCTDM, a Catalogue for Analysis of Therapeutic Drug Monitoring Related Contents in the Drug Prescription Information
[www.irma-international.org/article/spcctdm-catalogue-analysis-therapeutic-drug/45162/](www.irma-international.org/article/spcctdm-catalogue-analysis-therapeutic-drug/45162/)

3D Printing: Basic Concepts Mathematics and Technologies
[www.irma-international.org/article/3d-printing-basic-concepts-mathematics-and-technologies/89400/](www.irma-international.org/article/3d-printing-basic-concepts-mathematics-and-technologies/89400/)

A Novel Radial Basis Function Networks Locally Tuned with Differential Evolution for Classification: An Application in Medical Science

Estimation of Fractal Dimension in Different Color Model
[www.irma-international.org/article/estimation-of-fractal-dimension-in-different-color-model/202365/](www.irma-international.org/article/estimation-of-fractal-dimension-in-different-color-model/202365/)