

Structural bioinformatics

RINspector: a Cytoscape app for centrality analyses and DynaMine flexibility prediction

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Abstract

Motivation: Protein function is directly related to amino acid residue composition and the dynamics of these residues. Centrality analyses based on residue interaction networks permit to identify key residues in a protein that are important for its fold or function. Such central residues and their environment constitute suitable targets for mutagenesis experiments. Predicted flexibility and changes in flexibility upon mutation provide valuable additional information for the design of such experiments.

Results: We combined centrality analyses with DynaMine flexibility predictions in a Cytoscape app called RINspector. The app performs centrality analyses and directly visualizes the results on a graph of predicted residue flexibility. In addition, the effect of mutations on local flexibility can be calculated.

Availability and implementation: The app is publicly available in the Cytoscape app store.

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Supplementary information: [Supplementary data](#) are available at *Bioinformatics* online.

1 Introduction

Understanding the function of proteins lies at the heart of fundamental biology. Tools that use either primary (sequence) or tertiary (3D) structure of proteins exist to aid in the identification of their function but few permit to integrate different approaches. Several years ago, a network-based approach was proposed as an alternative representation of a tertiary structure, thus enabling the use of graph analysis tools. This approach consisted of generating a residue interaction network (RIN) from a PDB structure, considering nodes as residues and edges as detected interactions—see e.g. (Amitai *et al.*, 2004; Greene, 2012; Hu *et al.*, 2014). Centrality analyses can then be performed on the graph to evaluate key residues in such a network. These centrality analyses are often based on measures that involve shortest path length calculations like closeness or betweenness, or following the approach of (del Sol *et al.*, 2006), which uses the change of the characteristic path length under removal of individual nodes. They have been shown useful to identify key residues

involved in the function of proteins, folding, allostery or long range interactions.

Cytoscape is a tool for the visualization and analysis of networks (Shannon *et al.*, 2003). Recently, the structureViz Cytoscape app (Morris *et al.*, 2007) integrated the possibility of generating RINs from a PDB structure through a connection made with the Chimera structure visualization and analysis program (Pettersen *et al.*, 2004). This simplified the creation and analysis of such networks which can now be done with Cytoscape NetworkAnalyzer tools (Assenov *et al.*, 2008) or *i.e.* with its RINalyzer app, designed specifically for the purpose of RIN analyses and visualization (Doncheva *et al.*, 2011). While these enable centrality analyses such as closeness or betweenness, based on shortest path length (shortest path centralities), effective electric resistance (current flow centralities) or hitting time (random walk centralities) for distances between two nodes (Doncheva *et al.*, 2012), none permit to perform residue centrality analyses as proposed by (del Sol *et al.*, 2006) and associate a Z-score to each residue.

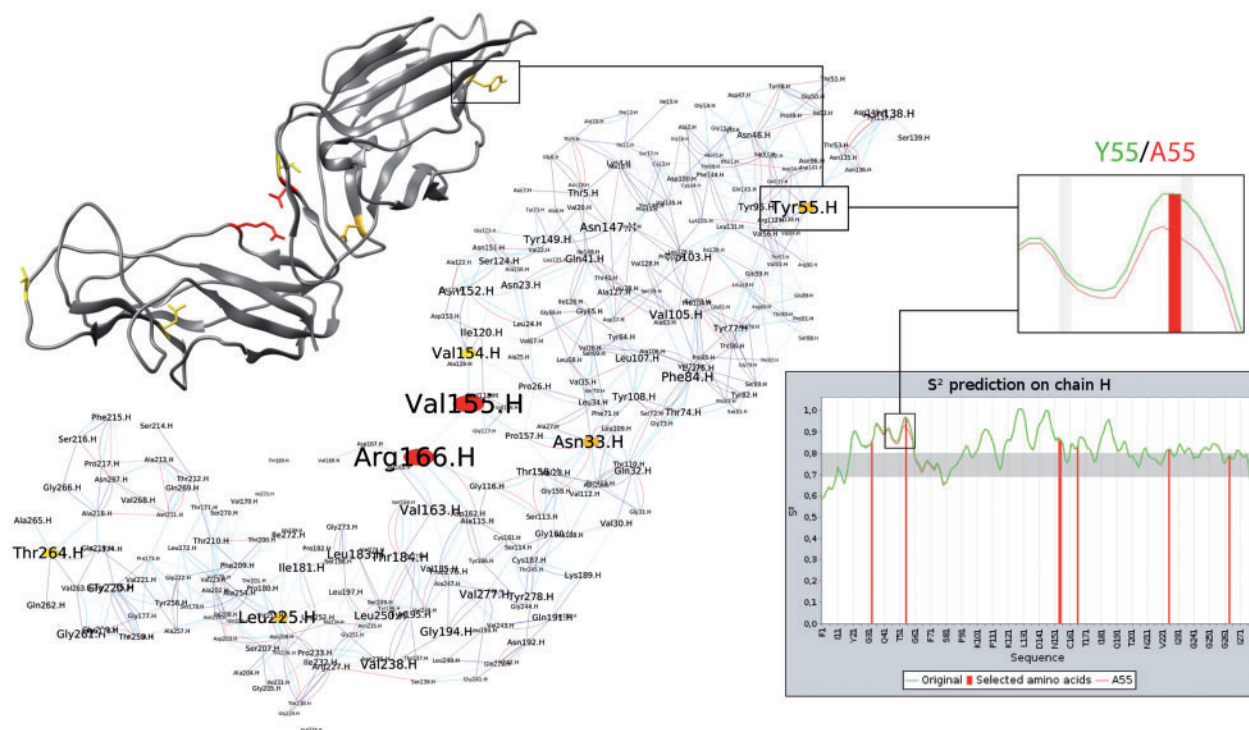


Fig. 1. Example of RINspector inter-module connectivity. Central residues are colored from yellow (Z -score = 2) to red (Z -score ≥ 4) on structure and network. The central residues are indicated with red bars in the flexibility graph. The zoom shows the increase in local flexibility for the Y55A mutation (green to red curve)

Besides its sequence and structure, a key ingredient of protein function is its dynamic behavior. Several tools are available to predict residue disorder in a protein, like PrDOS2 or DISOPRED2+3, which were respectively ranked first and second in CASP9 and CASP10 (Atkins *et al.*, 2015), but they require evolutionary information and predictions take several minutes. DynaMine directly predicts backbone dynamics, does not require evolutionary information, with predictions taking only a few seconds and showing good performances in estimating disorder compared to other methods, including PrDOS2 (Cilia *et al.*, 2013, 2014).

Here we present RINspector, a Cytoscape app that combines residue interaction network (RIN) centrality analyses with direct visualization of the predicted local flexibility of the associated sequence. In combination with the structureViz app, it links the three aspects of structure, network and flexibility, making it a useful tool for the investigation of protein structure and subsequent applications such as protein design or the selection of mutants for mutagenesis experiments.

2 Implementation and features

RINspector is written in JAVA as an app for Cytoscape. It incorporates DynaMine predictions from a JSON API. Prior to any RINspector analysis, a RIN needs to be generated, which can be done through the structureViz Cytoscape app (which communicates with Chimera) or any third-party program. RINspector can then perform the following operations on the network (see [Supplementary Material](#) for additional details):

- Perform one or several centrality analyses: (i) residue centrality, based on the change of average shortest path length under removal of each node; (ii) betweenness centrality; (iii) closeness centrality.
- Connect to the DynaMine server to retrieve the prediction of backbone dynamics for a selected protein chain. The backbone flexibility graph is displayed in the result panel.

Nodes and labels sizes and nodes color are adapted following the results of the calculations. Selection of residues highlights them in all three representations (structure, network or flexibility graph).

An on-line tutorial is available through the Cytoscape app store.

3 Example and validation of the approach

Figure 1 illustrates the use of RINspector on the FimH structure (PDB: 3JWN) of the commensal *Escherichia coli* F18 strain. FimH is the tip adhesin of the *E. coli* type 1 fimbriae, which are responsible for adhesion of the bacterium to target cells. FimH consists of two relatively rigid domains that show inter-domain flexibility. We generated the RIN using structureViz (default parameters, hydrogens added) and performed a residue centrality analysis. Seven central residues (V155, R166, N33, T55, L225, T264, V154) are identified on the protein (Z -score ≥ 2). Indeed, R166 has a very high Z -score and is known to be associated to AIEC (Adherent-Invasive *Escherichia coli*) bacteria when mutated into cysteine, histidine or serine (Dreux *et al.*, 2013). Moreover, mutating Y55 into alanine was shown to have an impact on adhesion (Feenstra *et al.*, 2017) in a close ortholog of FimH originating from the laboratory strain *E. coli* K12. The lower right-hand side of Figure 1 shows the obtained DynaMine flexibility prediction graph. The central residues are selected and therefore depicted with red bars. The inset zooms on the region surrounding Y55 and shows that a mutation into alanine increases the local flexibility. An investigation of the three-dimensional structure shows Y55 to be located close to the binding pocket (not shown). An increase in flexibility of this region is expected to have an adverse effect on binding efficiency and thus adhesion with respect to wild type FimH. (Feenstra *et al.*, 2017) discussed such an indirect effect for T53, located close to Y55, behind the binding pocket, which when mutated into alanine makes FimH lose adhesion to mannose substrates.

This example shows how RINspecter can be used to identify key residues, to mutate these *in silico*, and to predict the effect of these mutations on local flexibility of the protein.

4 Discussion and perspectives

In addition to investigating single structures, our approach can in principle also be used for an ensemble of conformations like those provided in PDB files from NMR experiments. Calculating centralities on the different conformations in the ensemble identifies those residues that are central in the ensemble. The console dialog provided by Cytoscape makes it possible to run script files but is resource intensive for these calculations. We are currently working on a command line workflow for batch generation of RINs and calculation of centralities.

We also foresee, in a future release of RINspecter, the integration of additional analyses like the calculation of Z-scores on eigenvector centralities. This would permit to identify clusters of residues, which could highlight zones of interest as opposed to individual residues.

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Conflict of Interest: none declared.

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