METHODS AND TOOLS FOR VISUALIZATION AND MANAGEMENT OF SBGN PROCESS DESCRIPTION MAPS

A THESIS

SUBMITTED TO THE DEPARTMENT OF COMPUTER ENGINEERING AND THE GRADUATE SCHOOL OF ENGINEERING AND SCIENCE OF BILKENT UNIVERSITY IN PARTIAL FULFILLMENT OF THE REQUIREMENTS FOR THE DEGREE OF MASTER OF SCIENCE

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ABSTRACT

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Graphs are commonly used to model relational information in many areas such as relational databases, software engineering, biological and social networks. In visualization of graphs, automatic layout, interactive editing and complexity management of crowded graphs are essential for effective utilization of underlying information.

Advances in graphical user interfaces have given rise and value to interactive editing and diagramming techniques in graph visualization. As the size of the information to be visualized vastly increased, it became harder to analyze such networks, making use of relational information needed to be acquired. To overcome this problem, sophisticated and domain-specific complexity management techniques should be provided.

The Systems Biology Graphical Notation (SBGN) has been developed over a number of years by biochemists and computer scientists to standardize visual representation of biochemical and cellular processes. SBGN introduces a concrete, detailed set of symbols for scientists to represent network of interactions, in a way that is not open to more than one interpretation. It also describes the manner, in which such graphical information should be interpreted.

The SBGN Process Description (PD) language shows how entities are influenced by processes, which are represented by several reaction types in a biological pathway. It can be used to show all the molecular interactions taking place in a network of biochemical entities, with the same entity appearing multiple times in the same diagram. We developed methods and tools to effectively visualize and manage SBGN-PD diagrams. Specifically, we introduced new algorithms for proper management of complexity of large SBGN-PD diagrams. These algorithms strive to keep SBGN-PD diagrams intact as complexity management takes places. In addition, we provided software components and web-based tools that implement these methods. These tools use state-of-the-art web technologies and libraries.

Keywords: Bioinformatics, Biology, Graph Visualization, Pathways, SBGN, Complexity Management, Visualization Software, Web-based Software.

ÖZET

TÜRKÇE BAŞLIK

Mecit Sarı Bilgisayar Mühendisliği, Yüksek Lisans Tez Yöneticisi: Doç. Dr. Uğur Doğrusöz Temmuz, 2014

Çizgeler, ilişkisel bilgiyi modellemek amacıyla yazılım mühendisliğinde, ilişkisel veritabanlarında, sosyal ve biyolojik ağların gösteriminde yaygın olarak kullanılırlar. Bilginin etkin kullanımı için otomatik yerleştirme, interaktif ortamda değişikliklerin yapılabilmesi ve kalabalık çizgelerin karmaşıklıklarının yönetilmesi, çizge gösterimi için gerekli yöntemlerdir.

Çizge gösteriminde interaktif ortamda değişiklik yapma ve diyagramlama teknikleri, grafiksel kullanıcı arabirimlerindeki gelişmelerle birlikte önemli ve etkin hale geldi. Gösterilmek istenen bilginin artışı ile birlikte, bu ağların analizi ve elde edilmek istenen ilişkisel verinin kullanımı oldukça zorlaşmaktadır. Bu problemi çözmek için, karmaşık ve alana özgü karmaşıklık yönetimi tekniklerinin geliştirilmesi ve sağlanması gerekmektedir.

Systems Biology Graphical Notation (SBGN), biyokimyasal ve hücresel proseslerin görselleştirilmelerini standart bir şekilde ifade edebilmek amacıyla, biyokimyacılar ve bilgisayar uzmanları tarafından, yıllardır süregelen bir çalışma ile geliştirilmektedir. SBGN, etkileşim ağlarının kesin ve belirsizliğe yer vermeyecek şekilde gösterimi amacıyla, somut ve detaylı bir sembol listesi sağlayan bir görsel dil ya da notasyondur. Ayrıca, SBGN bu tarz bir grafiksel bilginin nasıl yorumlanması gerektiğini de izah eder.

SBGN proses dili, biyolojik yolaklardaki entitilerin, biyolojik reaksiyonları temsil eden proseslerden nasıl etkilendiğini açıklar. Aynı entitiyi birkaç defa aynı diyagramda göstererek, biyokimyasal entiti ağında yer alan bütün moleküler etkileşimlerin gösterimi yapılır.

Bu çalışmada, SBGN-PD diyagramlarının etkin bir şekilde gösterimi ve analizi için metotlar ve araçlar geliştirdik. Özellikle, büyük SBGN-PD diyagramlarının karmaşıklıklarının etkin bir şekilde yönetilmesi amacıyla yeni algoritmalar sunduk. Bu algoritmalar, karmaşıklık yönetimi teknikleri uygulandığında SBGN-PD diyagramlarının bütünlüğünü koruyacak şekilde tasarlandı. Ek olarak, bu metotların kullanıldığı yazılım bileşenleri ve web tabanlı araçlar üretildi. Bu araçlar gelişmiş ve modern web teknolojilerini ve kütüphanelerini kullanmaktadırlar.

Anahtar sözcükler: Biyoinformatik, Biyoloji, Çizge Gösterimi, Yolaklar, SBGN, Karmaşıklık yönetimi, Görselleştirme Yazılımları, Web Tabanlı Yazılım.

Acknowledgement

I would like to express my special thanks my advisor Dr. Uğur Doğrusöz for his guidance and support throughout my study on this thesis. I have learned so much from him during my graduate study.

I would like to thank to Assist. Prof. Dr. Burkay Genç and Assist. Prof. Dr. Özgür Şahin for reviewing and commenting on the manuscript of this thesis.

I express my deepest thanks to Istemi Bahçeci, Can Çağdaş Cengiz, Doğukan Çağatay, Merve Çakır, Begüm Genç, Muhsin Can Orhan for being my close friends and the good times in the office.

Special thanks to Bülent Arman Aksoy and Selçuk Onur Sümer for their precious support for my thesis study. I know I would not be able to finish my thesis without them.

I would like to thank TUBITAK for their financial support during my thesis and to Bilkent University for the environment they have provided.

I would like to thank my parents Necdet and Zekiye for their endless love and trust. Also, my siblings Fatih, Handan, and Reyhan have given me strength during my study.

Contents

1	Intr	roduction	1
	1.1	Motivation	5
	1.2	Contribution	6
2	Bac	kground And Related Work	8
	2.1	Graph Visualization	8
	2.2	Complexity Management in Graph Visualization	11
	2.3	Systems Biology Standards	16
		2.3.1 BioPAX	16
		2.3.2 Systems Biology Graphical Notation (SBGN) $\ldots \ldots$	16
	2.4	Related Software	21
		2.4.1 Cytoscape	21
		2.4.2 Pathway Commons	26
		2.4.3 PCViz	26
		2.4.4 Paxtools	30

		2.4.5	BioGene	31
		2.4.6	cBioPortal	31
		2.4.7	CySBGN	31
		2.4.8	VISIBIOweb	32
		2.4.9	Biographer	33
		2.4.10	SBGN-ED	35
3	Met	thods I	For Visualizing SBGN-PD Maps	37
	3.1	Motiva	ation	37
	3.2	Compl	exity Management of SBGN-PD Maps	40
		3.2.1	Hide Selected Node Group	48
		3.2.2	Show Selected Node Group	49
		3.2.3	Highlight Processes of Selected Node Group	50
		3.2.4	Highlight Neighbors of Selected Node Group	51
		3.2.5	Filter by Arbitrary Domain Knowledge	52
4	Тоо	ls For	Visualizing SBGN-PD Maps	54
	4.1	SBGN	Viz.js	54
	4.2	SBGN	Viz.js-SA	55
	4.3	PCViz		59
5	Cor	clusior	1	63

CONTENTS

5.1	Future Work		•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	64
5.2	Availability						•				•								•		•									64

List of Figures

1.1	Textual representation of a biological pathway (Recruitment of re- pair and signaling proteins to double-strand breaks) in Pathway-	
	Commons [1]	2
1.2	Visual representation of a biological pathway (Recruitment of re- pair and signaling proteins to double-strand breaks) in Pathway- Commons [1]	2
		-
1.3	Visualization of a biological pathway (ATM Mediated phosphory- lation of Repair Proteins) in ChiBE [2]	3
1.4	A complex real-life graph from software modeling $[3]$	4
1.5	Left: A map of a computer network after a series of complexity management operations applied. Right: The same network with certain desired parts revealed for detailed analysis. [3]	4
2.1	A graph topology where a, b, c, d, e, f, g are vertices and the lines that connect the vertices are the edges.	8
2.2	A compound graph with multiple levels of nesting	9
2.3	Graph representation of a social network [4]	10
2.4	Graph representation of a biological pathway	10

LIST OF FIGURES

2.5	Visualization of the same graph before (left) and after (right) applying layout	11
2.6	Visualization of a complex biological pathway(Activation of Cas- passes 3 and 7) using PATIKAweb [5]	12
2.7	Same biological pathway with (Figure 2.6) after applying collaps- ing operations	13
2.8	Graph visualization with fisheye view $[6]$	14
2.9	Folding operation on a graph	15
2.10	Hiding and ghosting operations on a graph	15
2.11	Visual representation of SBGN [7]	18
2.12	SBGN Process Description describing metabolic pathways of MAPK cascade [8].	20
2.13	An example SBGN-PD map (left) and its SBGN-ML code (right)	21
2.14	Architecture of Cytoscape.js [9]	23
2.15	Initialization of a simple graph using Cytoscape.js	24
2.16	Graph model of Cytoscape.js	25
2.17	A sample view from PCViz	27
2.18	Two cancer studies are loaded to the network of MDM2 neighborhood	28
2.19	PCViz Architecture	29
2.20	Compound structure problem with CySBGN	32
2.21	Desired look of a node with auxiliary units (left), CySBGN look of nodes with auxiliary units (right)	32

2.22	VISIBIOWeb is a web based tool to analyze SBGN-PD maps	33
2.23	Members of a compound node must be inside it (left), dragging causes misbehavior (right)	34
2.24	Biographer can be used to import, export, edit and create SBGN diagrams for all of its specifications	35
2.25	SBGN-ED is a VANTED plugin used to analyze SBGN diagrams	36
3.1	A complex network visualization looks like an hairball with lots of edge crossings [10]	38
3.2	The visualization of ATM mediated phosphorylation of repair pro- teins in the context of MRN complex	39
3.3	Traditional filtering techniques produce an inconsistent graph (left), while the desired graph is a valid, complete SBGN map (right)	40
3.4	A complex and a neighbor process (with orange border) are asked to be expanded (left). First, all of their children are added to the expansion (right)	42
3.5	All of the parents of current node group are added to the expansion because of the 4^{th} principle (left), all components of the complexes are added to the expansion because of the 5^{th} principle (right)	43
3.6	Current expansion have processes (in blue) and neighbor processes (in red) to add their neighborhood to the expansion.	44
3.7	All of the neighborhood of the processes and neighbor processes are added to the expansion.	44

3.8	Newly added nodes might be in another parent or they might have children. So, we must add the parents (left) of the current expanded nodes considering the 4^{th} principle. Also, these parents might have another children, we add the children of complexes again because of the 5^{th} principle and complete expansion process (right).	45
3.9	Expanding non-selected nodes (those inside blue box) would expand them with unwanted nodes (those with orange border)	46
3.10	The node group to be removed is orange (left), undesired part of the network is in green box and desired part is in blue one after the expansion of remaining nodes (right)	47
3.11	Expansion of the desired part of the network (blue box in Figure 3.10 (right)), the blue box includes the nodes to be shown \therefore	48
3.12	Active RAS is asked to be removed (left), outcome of this operation in the network (right)	49
3.13	Inactive RAS is asked to be shown (left), outcome of this operation in the network (right)	50
3.14	Active Grb2 is asked to be highlighted with its processes (left), outcome of this operation in the network (right)	51
3.15	Active Grb2 is asked to be highlighted with its neighbors (left), outcome of this operation in the network (right)	52
4.1	A sample view from SBGNViz.js-SA	55
4.2	Detailed information of IRF1 is fetched from BioGene	57
4.3	SBGNViz.js-SA architecture	58
4.4	A process is selected (in magenta) and its details are shown in Details tab.	59

LIST OF FIGURES

4.5	Users click the edge between TP53 and MDM2 to see their detailed	
	process in SBGN	60
4.6	Detailed process information between MDM2 and TP53 in SBGN- $$	
	PD notation.	61
4.7	Filtering out the processes of NCI Nature from the SBGN-PD di-	
	agram in Figure 4.6.	62

Chapter 1

Introduction

A graph is a way of representing a set of objects (nodes) and relations (edges) between these objects. It is a data structure that could be used to model complex relational information such as network, communication, and data flow representation. Using graphs as a formal way to visualize relational information eases data validation, integration, querying, and visualization.

Although, textual representation of relational information is simple and straightforward, it generally obstructs deriving information (Figure 1.1). Visualization of information has become a considerable aspect for understanding any kind of information (Figure 1.2). *Information visualization* counts on the human eye's broad bandwidth pathway and offers techniques for representation of abstract information to allow people to see, explore, and understand large amounts of data at once and in intuitive ways [11].

The study and analysis of interaction between biological entities with networks has become a major area in bioinformatics (Figure 1.3). Many of the processes known to take place in biological cells are analyzed in the form of different types of networks [12]. The network complexity increases with new information produced about these processes, which leads to difficulties of analyzing and retrieving information.

Pathway: Recruitment of repair and signaling proteins to double-strand breaks

Authored: Matthews, L, 2003-11-18 00:00:00 more...

Biochemical Reactions (4) Sub-Pathways (1) Molecules (19)	
Showing 1-4 of 4	
1. TP53B_HUMAN + gamma H2AX:MDC1/NFBD1 compl \rightarrow 53BP1:H2AX complex at site	Reactome =
At the beginning of this reaction, 1 molecule of '53BP1', and 1 molecule of 'gamma H2AX:MDC1/NFBD1 complex at site of strand break' are present. At the end of this reaction, 1 molecule of '53BP1:H2AX complex at site of double-strand break	of DNA double- ' is present.
This reaction takes place in the 'nucleus'.	
References:	
DNA damage activates ATM through intermolecular autophosphorylation and dimer dissociation. Nature 421:499-506	[PubMed]
2. BRCA1_HUMAN + 53BP1:H2AX complex at site \rightarrow BRCA1:53BP1 complex at site	Reactome 🖃
<u>ACTIVATED</u> by MDC1_HUMAN	
At the beginning of this reaction, 1 molecule of '53BP1:H2AX complex at site of double-strand break', and 1 molecule of ' type 1 susceptibility protein' are present. At the end of this reaction, 1 molecule of 'BRCA1:53BP1 complex at site of DNA break' is present.	Breast cancer double-strand
This reaction takes place in the 'nucleus'.	
References:	
 Molecular views of recombination proteins and their control. Nat Rev Mol Cell Biol 4:435-45 [PubMed] A DNA damage-regulated BRCT-containing protein, TopBP1, is required for cell survival. Molecular and cellular biology 2 [PubMed] S3BP1, a mediator of the DNA damage checkpoint. Science 298:1435-8 [PubMed] 	22(2):555-66
3. ATM HUMAN (phosphorylated 1981) + MDC1/NEBD1:gamma-H2AX complex \rightarrow ATM associated with	Reactome ±
DNA dou	
4. <u>MDC1_HUMAN</u> + gamma H2AX-coated DNA doubl \rightarrow gamma H2AX:MDC1/NFBD1 compl	Reactome ±
<u>ACTIVATED</u> by <u>H2AX_HUMAN</u>	

Figure 1.1: Textual representation of a biological pathway (Recruitment of repair and signaling proteins to double-strand breaks) in PathwayCommons [1]



Figure 1.2: Visual representation of a biological pathway (Recruitment of repair and signaling proteins to double-strand breaks) in PathwayCommons [1]



Figure 1.3: Visualization of a biological pathway (ATM Mediated phosphorylation of Repair Proteins) in ChiBE [2]

Systems Biology Graphical Notation (SBGN) [13] has been developed by biochemists, modelers, and computer scientists to standardize biological pathway visualization so that scientists could represent biological pathways in a standard and unambiguous way. SBGN supports regularity, eliminates ambiguity, and facilitates software support for transmission of complex information like well known standard visual languages such as Unified Modeling Language (UML) and Data Flow Diagrams. SBGN is formed by three languages (process description [14], entity relationship [15], and activity flow [16]), among which process description diagrams are arguably most commonly used ones in biology.

As mentioned earlier, size of the information to be visualized could be excessive and cause problems to understand information. The increase in the size of the information (e.g., size of information databases and the complexity of their structures) to be visualized forces a demand for more sophisticated complexity management techniques for many applications [3] (Figure 1.4). Showing, hiding, and emphasizing some parts of visualized network could dramatically increase the human comprehension over the visualization (Figure 1.5).



Figure 1.4: A complex real-life graph from software modeling [3]



Figure 1.5: Left: A map of a computer network after a series of complexity management operations applied. Right: The same network with certain desired parts revealed for detailed analysis. [3]

1.1 Motivation

Many graph visualization software have been developed to visualize pathway information. While some of these tools are used for simple network visualization [17, 18, 19], there are also other alternative tools that support SBGN diagrams [20, 21, 22, 23, 24, 25]. However, most of these tools are desktop applications [21, 23, 26, 25] or plugins for desktop applications [24]. Despite the fact that there are web based tools that support SBGN [20, 22], they do not support interactive editing [22] or not available on touch enabled devices [20]. More importantly these tools also lack full support for compound structures used in representing molecular complexes and cellular locations / compartments.

In recent years, biological network data exchange format (BioPAX [27]) and biological pathway visualization standards (SBGN) have been developed and they take advantage of advanced graph visualization, including compound structure. All these reasons led us to research and development of visualization and complexity management of complicated biological networks.

Web based technologies have gained importance in recent years and became commonplace in software development. Along with the development of computing and storage technologies, users now heavily depend on online services. Besides that, web based software which has native browser support and does not depend on third party applications (like Flash) is platform independent and users do not need to install any other software. Those advantages make web based technologies an appropriate candidate to provide services to end users.

With the introduction of touch enabled mobile devices and computers, users have new possibilities to interact with software and applications. Touch feature required specialized software and hardware in the past, however, nowadays a lot of manufacturers offer devices and software supporting these new input methods [28].

1.2 Contribution

Considering the complexity and the domain of biological pathways and underlying information, we determined the principles and invariants to properly manage complexity in SBGN-PD diagrams. Then, considering these principles and invariants, we proposed algorithms to apply complexity management operations that involve showing, hiding, and emphasizing certain parts of a network without destroying the integrity of the pathway. These algorithms can be used when the user selects an entity group and applies any complexity management operation or when managing complexity according to an arbitrary domain knowledge is necessary.

We also developed an extension to *Cytoscape.js* (an open-source JavaScript graph library for analysis and visualisation) [9], called *SBGNViz.js*, to be able to visualize SBGN-PD diagrams. This extension includes a converter from SBGN-ML [29] to JSON since Cytoscape.js only accepts the JSON format and SBGN-ML generator to export the current network in SBGN-ML format. Additionally, SBGN-PD entities can have dynamic data as described in section 2.3.2.

SBGNViz.js has the advantage of being written purely in JavaScript and inherits support for touch enabled devices from Cytoscape.js, enabling use in a wide variety of devices, from a mobile phone to a desktop computer with a web browser. Also, SBGNViz.js is highly portable, thus a developer could easily use SBGNViz.js in any web-based application.

We also created a *sample application*, called SBGNViz.js-SA, to show the functionalities of SBGNViz.js and how easy to port it into a web application. SBGNViz.js-SA takes biological pathways to be visualized in SBGN-ML file format and display it in SBGN-PD notation. SBGNViz.js inherits features of Cytoscape.js scrolling, zooming, hiding and deleting facilities as well as its support for compound structure for compartments and complexes in SBGN. More importantly, we implemented complexity management operations that we designed. Furthermore, users could access gene-specific information from EntrezGene [30] through BioGene [31] facility.

Lastly, we integrated SBGNViz.js into *PCViz* [32], an open-source web-based network visualization tool that helps users query *Pathway Commons* [1] and obtain details about genes and their interactions extracted from multiple pathway resources. Users are able to see the neighborhood of a gene and select an interaction between a pair of genes to see its detailed pathway visualization in SBGN-PD format on a separate window.

Chapter 2

Background And Related Work

2.1 Graph Visualization

A graph G = (V, E) consists of a set of vertices V and edges E. An edge $e \in E$ is a pair of vertices (u, v) where $u \in V$ and $v \in V$ are the *endpoints* of the edge. An edge associates its endpoints (Figure 2.1).

In a directed graph, every edge e = (u, v) has direction from $u \in V$ to $v \in V$ where u is the source vertex and v is the target vertex. However, there is no sense of direction for the edges in an undirected graphs.



Figure 2.1: A graph topology where a, b, c, d, e, f, g are vertices and the lines that connect the vertices are the edges.

If there is an edge e = (u, v) where u = v, that edge is called a *loop* or *self* edge. Two or more edges connecting the same source and target vertices are called *multi-edges*.

An edge e is in the *outgoing edge list* of a vertex u if u is the source of e; similarly, e is in the *incoming edge list* of a vertex u if u is the target of e.

A graph is called a *compound graph* if it contains any vertex that in turn includes nodes or edges inside (Figure 2.2). Compound graphs have child-parent relationship such that a compound vertex v is the parent of the vertices inside of v and every node inside of vertex v is a child of vertex v. A child node might in turn be a compound node giving opportunity to define multiple levels of nesting (Figure 2.2).



Figure 2.2: A compound graph with multiple levels of nesting

Graphs are used to define topological structure of relational information and they do not provide any geometric information for visualization. However, visualization of a graph is a vital concept for users to understand the underlying information in a graph. Since the size and the complexity of information to be analyzed has been vastly increasing, graph visualization techniques are needed even more for analysis (Figure 2.3 and Figure 2.4).

Graph visualization is in fact the field of drawing a graph by defining geometry



Figure 2.3: Graph representation of a social network [4]



Figure 2.4: Graph representation of a biological pathway

for graph elements such as location, width, height, and border along with its topological structure. Many cosmetic properties like color, transparency, border shapes, edge arrow shapes are also considered aspects of graph visualization. In fact, any visual concept that influences viewers' comprehension is treated as a graph visualization concept.

Layout of a graph corresponds to its geometry, aiming visualization with aesthetically pleasing results. Although the aesthetic quality of a visualization might change from one to another, there are some certain aspects to consider while applying layout like minimizing edge crossing number, total drawing area, total edge length and increasing uniformity of edge length and reflecting the topological symmetry of the graph. A graph visualized with a bad layout could confuse users whereas a good layout would help to understand the underlying information and its topology (Figure 2.5).



Figure 2.5: Visualization of the same graph before (left) and after (right) applying layout

2.2 Complexity Management in Graph Visualization

Complex relational information such as biological and social networks are generally too large to visualize at once and details become hard to detect resulting in extra effort of users to understand the network. In visualization of graphs, masking unwanted parts of the network and unmasking those parts when needed are the strategies called *complexity management techniques*. The techniques like *hiding, folding, ghosting,* and *nesting* have an important role on visualization of biological networks as well as any other domain.

The practicality of complexity management techniques is variant in the context of the information to be visualized. For example, hiding a child of a compound node is not a good way to manage the complexity if the compound node is only complete with its components and might have different type or meaning in its new state. This will be discussed in more detail later in Section 3.1. After all, some complexity management operations could not be applied blindly without considering the domain knowledge.

A common complexity management technique for graphs with nested topology is *collapsing* a compound node. It simply shows a compound node as a simple node and creates meta edges for the node's children. Using this method, a complex graph (Figure 2.6) could be simplified and currently unnecessary parts of the topology could be made insignificant in a reversible way (Figure 2.7).



Figure 2.6: Visualization of a complex biological pathway (Activation of Caspasses 3 and 7) using PATIKAweb [5]



Figure 2.7: Same biological pathway with (Figure 2.6) after applying collapsing operations

Another popular complexity management technique, called *fisheye view*, scales up the center of the view decreasing the level of details towards the boundaries of the graph [33]. Thus, the user could emphasize the area of interest of the graph (Figure 2.8). This technique can be used in real time as users change the area of interest and focus point is updated smoothly and simultaneously.

Folding operation creates a new folder node and puts a group of graph members inside of the folder node. The folder node is a simple node and created in collapsed mode to decrease the graph size. Using this method, currently unwanted parts of the network can be collapsed in a folder node, allowing to reverse the operation on demand by unfolding the node. Also, it can be used to group the graph components according to some criteria.

Figure 2.9 shows an example of folding operation on a graph. The nodes in dark blue are asked to be folded in a node and the result of that operation is on the right. Dark blue nodes and their edges are placed in a newly created folder node. Meta edges are created between folder node and the rest of the graph, representing the edges of nodes a and b whose one end is inside the folder.



Figure 2.8: Graph visualization with fisheye view [6]

Hiding operation could be applied to a graph member by not rendering it on the display. In that case, the graph member is not displayed in the current network and it is removed from the graph topology, thus users are unable to interact with it.

Ghosting technique could be used to deemphasize a graph member by changing its visual style like opacity, color, and brightness. Ghosting does not remove any graph member from the graph and the topology, it only looses the focus on the ghosted graph member and users are able to interact with it.

Figure 2.10 shows an example of hiding and ghosting operations. Nodes a, b, and their incident edges are hidden in the graph. Additionally, compound node c and its children with their incident edges are ghosted i.e., transparency of these nodes is increased.



Figure 2.9: Folding operation on a graph



Figure 2.10: Hiding and ghosting operations on a graph

2.3 Systems Biology Standards

2.3.1 BioPAX

BioPAX, short for *Biological Pathway Exchange*, has been developed as a standard language to represent biological pathways at molecular and cellular level [27]. It covers a variety of pathways from signalling to ppi networks. In recent years, plenteous amount of pathway data has been generated by diverse communities. Such a development has conceived huge databases and many tools for utilization of pathway information. However, diversity of tools, databases and notation across communities have caused inefficiency because of the lack of data integrity. To overcome this problem, BioPAX has been introduced as a standard to collect, index, interpret and share pathway information. By courtesy of BioPAX, a huge amount of pathway data from many types of organisms is now available from an expanding number of databases.

2.3.2 Systems Biology Graphical Notation (SBGN)

Biology is one of the fields that have highest rate of graphical and textual information. Although BioPAX filled a gap in storing and formatting of biological information, there was still an ambiguity of a standard graphical notation. To resolve this problem, Systems Biology Graphical Notation (SBGN), a visual language developed by a community of biochemists, modelers, and computer scientists, was introduced [13].

While developing SBGN, scientist's major concern was to cover almost all technical and practical needs of the diverse biology community. Therefore, SBGN is an open source project, and is still improved by a large community. Common biological objects, their properties and interactions from different biological communities are visually supported with this notation. SBGN is in favor of keeping notation, number of objects and syntax at a minimum level to increase learning curve and comprehension of users. Also, it is highly modular to handle large diagrams and complexity easily.

Interactions between biological entities differentiate with their properties. It is useless and vain to represent all reactions and interactions in the same diagram, resulting in incomprehension and confusion. To solve this problem, three different styles of notation has been introduced, Process Description [14], Entity Relationship [15], and Activity Flow [16], to represent only required interactions of a specific context. Our focus and work was on Process Description (Figure 2.11) diagrams since it is widely used by the biology community.



Figure 2.11: Visual representation of SBGN $\left[7\right]$

A process diagram represents all the molecular processes and interactions taking place between biochemical entities and their products [13]. Change is the aspect of process description describing how entities are processed from one form to another.

Entity Pool Node (EPN) represents any physical or conceptual entity in a biological network. The PD includes six EPN that represents physical entities: unspecified entity, simple chemical, macromolecule, nucleic acid feature, multimer, and complex. Additionally, source, sink, and perturbing agents are conceptual entities in PD.

EPNs could contain auxiliary units that provide additional information. They are placed on the boundaries of the EPN.

- Unit of information is used to show abstract information related to the functionality of the entity it belongs to.
- *State variable* shows current state of the entity, corresponds to physical or informational configuration.
- *Clone marker* shows whether the entity is cloned, indicates that another occurrence of that entity can be found in the map.

EPNs are transformed to other EPNs by *processes*. Different process types are represented with *process*, *omitted process*, *uncertain process*, *association*, *dissociation*, and *phenotype* as seen in Figure 2.11.

Complex and *Compartment* are compound nodes in PD maps. Complex node represents an entity that consists of a number of other entities. A complex has its own identity and must be considered with all of its components. Compartment node represents a logical or physical structure composed of entity pool nodes.

For example, in Figure 2.12, RAF macromolecule and ATP enter a process with the catalysis RAS macromolecule in active state and leave as phosphorylated RAF and ADP. As it is seen, the overall diagram shows how entities are changed by different processes. Above, we gave an overview of Process Description language. Further details could be found in Process Description language Level 1 documentation [14].



Figure 2.12: SBGN Process Description describing metabolic pathways of MAPK cascade [8].

Although SBGN standardizes representation of biological pathway information in a concise and unambiguous way, it does not offer any standard for how the maps should be stored. Because of that, the biological maps produced by any tool could not be used in another. To overcome this problem, *SBGN-ML*, a dedicated, lightweight XML-based file format, was developed[29]. SBGN-ML includes all necessary information to draw the entities in SBGN and stores the positions of entities, i.e., layout of the maps (Figure 2.13).



Figure 2.13: An example SBGN-PD map (left) and its SBGN-ML code (right)

2.4 Related Software

In this section, we will go over related software tools.

2.4.1 Cytoscape

Cytoscape family has three visualization software, *Cytoscape*, *Cytoscape* Web, and its successor *Cytoscape.js*.

Cytoscape [34] is an open source desktop application to visualize molecular interaction and biological networks and integrate these networks with additional data like annotations and gene expressions. Cytoscape was developed for biological research but it is a general platform for complex network analysis and visualization nowadays. It offers lots of features for data integration, analysis, and visualization.
Cytoscape Web is a web based graph visualization library that depends on Flex / ActionScript technologies. It can be easily embedded to any web application. Additionally, Cytoscape Web offers a JavaScript API to customize and manipulate the network at client side.

Cytoscape.js has been developed as an open source graph library written in JavaScript, utilized for analysing and visualizing graphs. It does not depend on any third-party application like flash and also supports mobile browsers. Along with all the features of Cytoscape Web, it offers new queries for data management and takes advantage of latest web technologies. It is funded by NRNB (Natural Resource for Network Biology) [35] and NIH (National Institutes of Health) [36].

The main difference between Cytoscape's web and desktop applications is that Cytoscape is an application for end users, whereas Cytoscape web applications require to write code using their API.

Cytoscape.js gives users an opportunity to display and manage graphs interactively. It supports both desktop and mobile browsers; thus, it allows users' interaction with graphs, such as selection, pinch-to-zoom, and panning for both touch and non-touch operated devices.

Cytoscape.js depends on event-driven model with a core API [9] (Figure 2.14). The core is the component that offers functions to change the graph as a whole, like applying layout and panning the graph. Also, it provides lots of functions for efficient access of graph elements. Additionally, it has some extensions and is responsible to notify the extensions when needed. Extensions make the necessary changes on graph elements and notify the core about the changes. The extensions are non-transparent to the client applications, as clients access Cytoscape.js only through the core using its API.



Figure 2.14: Architecture of Cytoscape.js [9]

Cytoscape.js gets graph elements and their style properties, layout options, and any other graph property as JSON objects during initialization (Figure 2.15). Style properties follow CSS convention and Cytoscape.js introduces its own style properties in case CSS properties are insufficient.

Another strong side of Cytoscape.js is that it contains lots of graph analysis algorithms from graph theory such as breadth first search, depth first search, minimum spanning tree and Dijkstra's shortest path. Users are able to obtain and operate on neighborhood, connected edges, descendants, children, parents, siblings, etc. of a node group with a single function.

Cytoscape.js provides full support for compound structures and offers useful functions to access, traverse, and perform operations on compound nodes. This support makes Cytoscape.js convenient to use in domains where hierarchically structured information needs to be visualized.

Cytoscape.js adopts the selector facility of JQuery [37] and selectors work on graph elements. It greatly simplifies traversing and manipulating the nodes according to some criteria. For example, the user could apply breadth first search

```
$('#cy').cytoscape({
  style: cytoscape.stylesheet()
     .selector('node')
        .css({
           'content': 'data(name)',
           'shape': 'data(shape)'
           'text-valign': 'center',
           'color': 'white',
        1)
     .selector('edge')
        .css({
           'target-arrow-shape': 'triangle'
        }),
  elements: {
     nodes: [
       { data: { id: 'j', name: 'Jerry', shape: 'triangle' } },
  { data: { id: 'e', name: 'Elaine', shape: 'square' } },
  { data: { id: 'k', name: 'Kramer', shape: 'circle' } },
  { data: { id: 'g', name: 'George', shape: 'hexagon' } }
     ],
     edges: [
        { data: { source: 'j', target: 'e' } },
        { data: { source: 'j', target: 'k' } },
        { data: { source: 'j', target: 'g' } },
        { data: { source: 'e', target: 'j' } },
        { data: { source: 'e', target: 'k' } },
     ٦
  },
  layout: {
     name: 'grid',
  },
  ready: function(){
  }
});
```

Figure 2.15: Initialization of a simple graph using Cytoscape.js

on nodes with weight higher than a number, get all descendants of a compound node with a certain shape and logically combine a couple of criteria together. Besides, those functions are chainable, users are able to call several functions on the same graph element consecutively. For example, to get all complexes' macromolecule children, the user can apply the following function:

```
cy.nodes("node[class='complex']")
.descendants("node[class='macromolecule']")
```

As it is seen, selectors and chaining are very useful to apply complexity management operations on SBGN diagrams.

Cytoscape.js stores the elements (nodes and edges) in an array structure and uses a map structure to access the elements using their ids. For parent-child relationship, the parent has an array list of children kept consistent with the graph state. Accessing an element using its id takes O(logN), where N is the size of the element array. Also, iterating over elements array costs O(N).

The core of Cytoscape.js offers a couple of functions to access the elements in the graph. These functions return a *Collection*, which stores a set of elements in the graph. Additionally, collections offer a set of functions to filter, edit, and traverse the collections. Most iteration operations, if not all, cost O(N) on the list itself but O(1) for accessing the list.

Figure 2.16 shows the class diagram that summarizes graph model of Cytoscape.js. Since Cytoscape.js does not have object-oriented design, this diagram does not show the actual architecture but gives the overall design approach.



Figure 2.16: Graph model of Cytoscape.js

Cytoscape.js offers a couple of functions to layout graphs. Users are able to choose a suitable layout algorithm according to the context of their graph. Grid, Breadth First, Arbor [38], Preset with predefined positions, and CoSE [39] are some of the layout algorithms that Cytoscape.js support.

2.4.2 Pathway Commons

Pathway Commons [1] is a service that provides publicly available pathway information of various organisms. It includes several database sources which support BioPAX format for biological pathways. Biologists can use web interface of Pathway Commons's to access an extensive amount of biological data. They can specify a gene set and the type of the query such as paths between and neighborhood and obtain the pathway data in various format such as SBGN-ML, BioPAX, and Simple Interaction Format (SIF).

2.4.3 PCViz

PCViz [32] is an open source web based network visualization tool that offers to make queries to Pathway Commons to retrieve biological pathway information for a set of genes from several pathway data providers. It uses these queries to visualize networks of interaction and acquire information about gene details (Figure 2.17).

PCViz provides lots of features and advantages for biological network analysis and visualization. PCViz

- is compatible with almost all web-browsers, including the ones on the mobile devices (e.g., iPad and devices with Android OS).
- is only human-oriented, does not include information about other organisms.



Figure 2.17: A sample view from PCViz

- uses Pathway Commons data to be able to visualize thousands of genes and their interactions.
- allows to add new genes of interest to the current network of interest.
- takes advantage of full *BioPAX* representation and extract relevant information from the complex *BioPAX* data coming from Pathway Commons.
- reduces the size of the network by filtering genes or interactions based on different criteria like interaction type, more relevant genes with the genes of interest
- allows users to load multiple cancer contexts to the network to see the overall frequency of alteration for each gene and uses this information to enhance the complexity management. For instance, when cancer context is

loaded, the nodes that have low frequency of alteration are filtered first.

As mentioned before, PCViz provides cancer context information. It uses cBioPortal [17] to retrieve cancer information about the genes in the network. After the network is loaded, users can get a list of all cancer studies and select one study and get a list of all genomic data types available. When the cancer data is loaded to the network, PCViz represents this data via visual styles, e.g. from gray to red gradient color on the nodes (Figure 2.18).



Figure 2.18: Two cancer studies are loaded to the network of MDM2 neighborhood

Figure 2.19 shows PCViz architecture and summarizes its features. Back-end of PCViz

- is implemented with Springs MVC framework as a REST service. All services provide data in JSON format to the client side. Queries are cached on the backend side to reduce lag for queries.
- retrieves pathway information of specified genes of interest in BioPAX format.
- makes a query to BioGene and retrieve the gene information in JSON format when users click to a gene.
- makes a query to iHOP and retrieve edge annotation data in text format when users click to an edge.
- makes a query to cBioPortal and fetch cancer study to be loaded in TSV (tab seperated value) format.



Figure 2.19: PCViz Architecture

Back-end of PCViz converts all data to JSON and passes it to front-end. PCViz's front-end

- is responsible to render the view of PCViz.
- generates a canvas for SIF view and SBGN view using Cytoscape.js. It uses Backbone.js to structure the view by defining gene names as model and Cytoscape.js instance on the html dom object as view component. The network information from Pathway Commons is retrieved in the Backbone instance using the genes of interest.
- generates *Details* view in the tabbed menu (Figure 2.18). When users click a gene, it renders the BioGene information of this gene using Backbone.js. It uses Backbone.js as SBGNViz.js-SA uses. Additionally, when users click an edge, it makes a query to iHOP and shows edge annotation data.
- generates *Settings* view. This view offers filtering according to the interaction types and a smart filtering option that filters the nodes according to relevance with the genes of interest.
- generates *Context* view. When users select a cancer study, it makes a query to cBioPortal and retrieve the alteration frequencies of the genes in the network.

2.4.4 Paxtools

BioPAX, as mentioned earlier, encapsulates a huge amount of pathway data and genetic, protein interactions. Since BioPAX includes massive number of classes and properties, it is grueling to produce and modify such data. *Paxtools* sorts this problem out by introducing a java API that transforms BioPAX properties to Java classes, offering methods and algorithms for utilization of BioPAX properties. Such methods include reading, writing, searching, merging, comparing, and transforming pathway information and help scientists to access and use BioPAX data with proven software since Paxtools is developed by the community [40]. With lots of pathway data providers that support BioPAX, scientists can easily access data and use it within their software tools for visualization, validation, and analysis.

2.4.5 BioGene

BioGene [31] is a simple web service where scientists can query a gene and retrieve information about its functions and references. It primarily uses Entrez Gene, a gene database provided by NCBI [30].

2.4.6 cBioPortal

cBioPortal is a web application that allows users to explore, visualize, and analyze cancer genomics data [17]. Given a set of gene and associated cancer study, it visualizes the network with alteration frequencies caused by the cancer study in question. It uses Adobe Flash Based CytoscapeWeb for visualization and cannot be used in mobile devices.

2.4.7 CySBGN

CySBGN is a Cytoscape plugin that lets users import, modify, and examine SBGN Diagrams [24]. Since Cytoscape is a desktop application, it can not be used online, however it supports all major operating systems: Linux, Windows and MacOs X.

Unfortunately, CySBGN does not support all edge and node shapes in SBGN-PD. It makes its own conventions for shapes that Cytoscape does not support. Also, it is not compatible with the latest version of Cytoscape and does not support compound nodes. Complexes and compartments are drawn with transparency to represent parent-child relations. When the user moves a child, it might jump out of the compound node in a way that violates the compound structure (Figure 2.20). Also, some Cytoscape features like layout can not be applied to any SBGN-PD diagrams since it will ignore the nesting structure.

Another problem with CySBGN is that, it does not have z-index ordering for nodes. That causes a problem when rendering a node with auxiliary units, since



Figure 2.20: Compound structure problem with CySBGN

they are rendered as other nodes and connected to its node with an edge. In other words, a node might be rendered with its auxiliary units behind it, resulting in unpleasant layouts (Figure 2.21).



Figure 2.21: Desired look of a node with auxiliary units (left), CySBGN look of nodes with auxiliary units (right)

2.4.8 VISIBIOweb

VISIBIOWeb [22] is a free web service that is used for visualization and layout of BioPAX pathway models (Figure 2.22). It depends on JavaScript and Google Maps API [41] and shows a static image of the pathway in SBGN-PD format, allowing use in both mobile and desktop browsers. It only accepts ".owl" type files to load and analyse, however users are able to export the network in SBGN-ML format.

VISIBIOWeb does not allow users to edit the geometry or the style of the graph elements since it displays a static image of the pathway; in other words,



Figure 2.22: VISIBIOWeb is a web based tool to analyze SBGN-PD maps

the visualized network can not be edited interactively. However, nodes could be clicked on to show their properties as extracted from associated ".owl" file. Additionally, basic graph visualization concepts like zooming, panning, and scrolling are also possible.

2.4.9 Biographer

Biographer is a comprehensive tool developed by Theoretical Biophysics Group in Berlin and used for visualization and layout of biological networks [20]. It is formed by three components, layout component written in C++, JavaScript web component for visualization and server component that composes those components and provides network import and visualization.

Layout component of Biographer is a combination of spring and hierarchical

model. It builds up a layout for overall positioning of the networks, making use of hierarchical model for layout of individual reactions. Hierarchical layout puts substrates at the top and products at the bottom, placing other entities to the left and the right.

Unfortunately, compound structure support of Biographer is not complete. Although layout component takes compound entities of SBGN into account, user interaction with compounds does not go with the grain. When a user drags a compound node, its children also move within it. However, child node goes out of the boundaries of its parent in case of dragging, making it look like there is no child-parent relation between them (Figure 2.23). Additionally, users need to adjust width and height of SBGN compound structures manually to be able to add children.



Figure 2.23: Members of a compound node must be inside it (left), dragging causes misbehavior (right)

Biographer also provides an online editor for all of three specifications of SBGN. Users are able to create their diagram with lots of customization options (Figure 2.24).



Figure 2.24: Biographer can be used to import, export, edit and create SBGN diagrams for all of its specifications

2.4.10 SBGN-ED

SBGN-ED [21] is an extension of VANTED (Visualisation and Analysis of Networks containing Experimental Data) developed to create, edit, visualize, and validate SBGN maps (Figure 2.25). It supports all three types of SBGN.

VANTED [42] is an open source, desktop application, that provides loading, editing, and analyzing graphs with biological pathway information or functional hierarchies. VANTED and SBGN-ED can not be used online but works on all major operating systems with Java support.

Beyond visualization of SBGN-PD diagrams, SBGN-ED offers functionality for data mapping and processing, and statistical analysis. The features of VANTED and its add-ons are also available for SBGN-ED, allowing users to broaden the functionality of the software.



Figure 2.25: SBGN-ED is a VANTED plugin used to analyze SBGN diagrams

Chapter 3

Methods For Visualizing SBGN-PD Maps

3.1 Motivation

As mentioned before, biological pathways are generally too large to visualize and details become obscured. Such networks can be reduced temporarily by removing or understating the currently unnecessary parts of a network; such examples have been provided in Section 2.2.

The core of an SBGN-PD diagram is processes and their interactions. Although pathway data is accessed from databases with sophisticated and contextrelated queries, such biological information might contain thousands of molecular entities. Excessive amount of data restricts the capabilities and features of network visualization tools. Visualization of such networks ends up being slow on interactive analysis and graphs look like an hairball because of the great number of edge crossings (Figure 3.1). Using complexity management operations like hiding or folding unwanted parts of the graph and abstraction of the network in various layers could dramatically lower the size of such network diagrams, allowing effective visualization.



Figure 3.1: A complex network visualization looks like an hairball with lots of edge crossings [10]

These complexity management techniques fall behind when context and characteristics of process description diagrams are taken into account. It is crucial that the overall integrity and validation of a biological process network should not be destroyed while hiding or filtering some parts of that network. For example, a process node must be filtered out if all of its substrates, products and effectors are also filtered out. Otherwise, the diagram will remain in an inconsistent state.

For example, users might make a query to show only NBN proteins on such a network in Figure 3.2. Applying traditional techniques would end up with inconsistent results. As it is seen in Figure 3.3 (left), processes and their edges are cleared away and reaction information is lost. Additionally, some of the components of the complexes are removed although complexes have their own identity with their components. Consequently, a general complexity management technique would violate the underlying information and the characteristics of the entities. Considering the characteristics of SBGN-PD, we need to transform the query to "show only processes that involve NBN proteins". Such a query would give consistent results without violating SBGN-PD rules as seen in Figure 3.3 (right).



Figure 3.2: The visualization of ATM mediated phosphorylation of repair proteins in the context of MRN complex.

We intend to define all characteristics of SBGN-PD to be able to manage complexity in large biological networks. Considering these characteristics, we introduce new algorithms to be able to modify all types of general complexity management techniques to keep the SBGN-PD maps intact and consistent when these operations are applied to such diagrams. Additionally, we propose some techniques to manage complexity according to an arbitrary domain knowledge.



Figure 3.3: Traditional filtering techniques produce an inconsistent graph (left), while the desired graph is a valid, complete SBGN map (right)

3.2 Complexity Management of SBGN-PD Maps

Complexity management operations on SBGN-PD maps generally work in a way that shows, hides or emphasizes a part of the network. Those operations are generally applied to a node group that is a set of entities in a biological network. Unfortunately, as mentioned above, complexity management cannot be done by only showing or hiding such a node group. For example, a process must be considered with all of its inputs and outputs. Thus, hiding only one process has no meaning (some of the entities might be in the map to represent the hidden process). Similarly, hiding a subset of a complex's members will leave the network in an invalid state.

To overcome this problem, we have the following principles / invariants to satisfy when showing or hiding a node group:

- 1. If a node has to be shown, it should be displayed.
- 2. If a non-process node (EPN) has to be shown, all the processes it is involved

with should be displayed since SBGN-PD shows the transformation of these biological entities via processes.

- 3. If a process has to be shown, then all of its inputs, outputs, and effectors should be displayed too. A process shows the transformation of the biological entities and hiding an input, output, or effector might refer to a different kind of process. Additionally, hiding an input produces inconsistent results since the outputs are formed according to the inputs.
- 4. If a node has to be shown, the parent node (complex or compartment) should be displayed since the complexes are identified with their components and compartments represents the logical or physical structure that is formed by its components.
- 5. A complex molecule should always be displayed with all of its components since a complex represents a biological entity composed of other biological entities and the resulting entity has its own identity.

To be more clear, the 5^{th} principle partially applies to the same for compartments. If a compartment is in the node group to be shown, obviously, all of its components must be displayed too. However, some of the nodes in the node group to be shown might be in a compartment without the compartment itself being in the specified group. In that case, only those nodes must be shown, not all of the components of the compartment. In contrast, all of the complex's components must be displayed no matter what.

Thus, when a complexity management operation is performed on a node group, the group must be expanded according to the principles described above. Expanding a node group indicates adding other nodes (in the neighborhood of the node group and need to be added according to the principles) to the node group. We propose *expandNodes* algorithm to solve this problem (Algorithm 1). Algorithm 1 Expanding node group according to SBGN-PD criteria

```
procedure EXPANDNODES(NODEGROUP)
nodeGroup = nodeGroup ∪ nodeGroup.descendants()
nodeGroup = nodeGroup ∪ nodeGroup.parents()
nodeGroup = nodeGroup ∪ nodeGroup("complex").descendants()
processes = nodeGroup("process")
nonProcesses = nonProcesses.neighborhood("process")
nodeGroup = nodeGroup ∪ processes.neighborhood() ∪ neighborProcesses
U neighborProcesses.neighborhood()
nodeGroup = nodeGroup ∪ nodeGroup.parents()
nodeGroup = nodeGroup ∪ nodeGroup.parents()
endeGroup = nodeGroup ∪ nodeGroup("complex").descendants()
endeGroup = nodeGroup("complex").descendants()
endeGroup =
```

When a node group needs to be expanded (Figure 3.4 (left)), we first add all the descendants of the nodes (Figure 3.4 (right)).



Figure 3.4: A complex and a neighbor process (with orange border) are asked to be expanded (left). First, all of their children are added to the expansion (right).

According to the 4^{th} principle, we need to add all parents of the node group (Figure 3.5 (left)). Expanding the node group with parents might add new complex nodes, so we add all complexes' components to the node group because of the 5^{th} principle (Figure 3.5 (right)).



Figure 3.5: All of the parents of current node group are added to the expansion because of the 4^{th} principle (left), all components of the complexes are added to the expansion because of the 5^{th} principle (right).

Until now, we expand the selection with parents and children of the node group according to the principles. Now, we need to define three different node groups:

- *processes* are all the processes in the node group, we need to add all of their neighborhood considering 3rd principle.
- nonProcesses are all the non-processes in the node group, we need their processes because of the 2^{nd} principle.
- *neighborProcesses* are the processes connected to *nonProcesses* and not in the node group currently.

Figure 3.6 shows these node groups with different colors; *processes*, *nonProcesses*, and *neighborProcesses* are in blue, orange, and red, respectively.



Figure 3.6: Current expansion have processes (in blue) and neighbor processes (in red) to add their neighborhood to the expansion.

Next, we need to add *neighborProcesses* and neighborhood of *processes* and *neighborProcesses* (Figure 3.7). Notice that, *neighborProcesses* and their neighborhood are added to the node group due to 2^{nd} and 5^{rd} principles, respectively.



Figure 3.7: All of the neighborhood of the processes and neighbor processes are added to the expansion.

Lastly, adding new nodes might bring new parents and complexes, so we add parents and components of complexes again (Figure 3.8). Finally, node group has been expanded without destroying the integrity of the network.



Figure 3.8: Newly added nodes might be in another parent or they might have children. So, we must add the parents (left) of the current expanded nodes considering the 4^{th} principle. Also, these parents might have another children, we add the children of complexes again because of the 5^{th} principle and complete expansion process (right).

The *expandNodes* algorithm can be used where users specify a node group and want to emphasize it somehow (showing, highlighting, etc.). Often times, user can specify a node group and emphasize the remaining nodes in the network (i.e., the specified node group might be deemphasized). In this situation, expanding the remaining nodes directly does not solve our problem. That approach might bring unwanted nodes back.

As it is seen in Figure 3.9, the user might ask to hide the selected nodes with orange border. Expanding the remaining nodes in blue box using *expandNodes* algorithm would result the entire graph to be in the node group after the expansion according to the 2^{nd} and the 3^{rd} principles. Phosphorylated RSK and phosphorylated ERK have a process in the node group to be hidden and this process must be hidden with all of its neighbors.



Figure 3.9: Expanding non-selected nodes (those inside blue box) would expand them with unwanted nodes (those with orange border)

We propose an *expandRemainingNodes* algorithm to be able to remove a node group properly, keeping the above principles in mind (Algorithm 2).

Algorithm 2 Expanding remaining node group according to SBGN-PD principles

procedure EXPANDREMAININGNODES(NODEGROUP, ALLNODES)
nodeGroup = expandNodes(nodeGroup)
remainingNodes = allNodes.not(nodeGroup)
remainingNodes = expandNodes(remainingNodes)
return remainingNodes
end procedure

When a node group is somehow needed to be deemphasized, that group must be expanded first, in line with principles set forth. In other words, we could not directly hide them since they might contain entities from desired part of the network because of the expansion. For example, the node group to be removed might contain a macromolecule connected to a process from the network to be shown. As it is seen in Figure 3.10 (right), we could not remove phosphorylated RSK since it has a process within the desired part.



Figure 3.10: The node group to be removed is orange (left), undesired part of the network is in green box and desired part is in blue one after the expansion of remaining nodes (right)

In fact, the problem is that an entity in the graph could possibly participate in any number of processes. Some of these processes might be in desired parts of the graph, whereas some might not be. Users probably do not want to see a group of processes and the remaining processes should be complete. In order to achieve this, we use *expandNodes* algorithm again, but on the node group to be shown. In Figure 3.10 (right), the node group in blue box is the one to be shown and Figure 3.11 shows the final node group to be shown after expansion.

The expandNodes and expandRemainingNodes algorithms are the bases for complexity management techniques for SBGN-PD maps. In expandNodes algorithm, we get parents, descendants, and neighborhood of given set of nodes. Those node groups might end up making up the entire graph, so its worst-case running time is O(N), where N is the number of nodes. The expandRemainingNodes algorithm uses the expandNodes algorithm twice, so its complexity is also O(N).

In the next section, we present the actual complexity management techniques implemented in SBGNViz.js, using the algorithms described above. Other than expanding algorithms, they only perform delete or highlight of the nodes, which



Figure 3.11: Expansion of the desired part of the network (blue box in Figure 3.10 (right)), the blue box includes the nodes to be shown

cost O(N) at the most.

3.2.1 Hide Selected Node Group

A node group could be selected and asked to be removed from the view. In that case, the *expandRemainingNodes* algorithm is applied to the selected node group. This algorithm returns the nodes to be shown in the network, so we hide the rest of the network (Algorithm 3).

Algorithm 3 Hide selected node group
procedure HIDESELECTEDNODES(SELECTEDELEMS)
allElems are all of the elements in the map
elemsToShow = expandRemainingNodes(selectedElems, allElems)
elemsToHide = allElems.not(elemsToShow)
hide(elemsToHide)
end procedure

As it is seen in Figure 3.12, active RAS with orange border is asked to be

removed from the graph. Such a request would remove all of its processes and all neighbors of these processes. Since the complex node is in another process from the desired part of the graph, it stays in the node group to be shown with all of its components.



Figure 3.12: Active RAS is asked to be removed (left), outcome of this operation in the network (right)

3.2.2 Show Selected Node Group

A node group could be selected with the purpose of hiding the rest of the network. We need to use the *expandNodes* algorithm on selected nodes to obtain the nodes to be shown. After expanding nodes, we need to hide the rest of the network (Algorithm 4).

Algorithm 4 Show selected node group
procedure showSelectedNodes(selectedElems)
allElems are all of the elements in the map
elemsToShow = expandNodes(selectedElems)
elemsToHide = allElems.not(elemsToShow)
hide(elemsToHide)
end procedure

In Figure 3.13, inactive RAS is asked to be shown. After expanding the

selected node, only its processes and involvements are shown in the network.



Figure 3.13: Inactive RAS is asked to be shown (left), outcome of this operation in the network (right)

3.2.3 Highlight Processes of Selected Node Group

Highlighting a node group emphasizes the node group without removing anything from the network. It can be done in several ways according to the style conventions of the tool used. We simply assume the opacity of the nodes that are not in the node group to be decreased for this purpose.

Highlighting processes of selected objects includes highlighting all of the selected processes and immediate neighbors of these processes. In fact, it highlights exactly the same node group that the *expandNodes* algorithm returns (Algorithm 5).

Algorithm 5 Highlight Processes of Selected Node Group
procedure HighlightProcessesOfSelected(selectedElems)
selectedElems = expandNodes(selectedElems)
highlight(selectedElems)
end procedure

Figure 3.13 shows an example of such an operation. Active Grb2 is asked to

be highlighted with its processes. Notice that, Grb2 itself is not directly involved in a process but its parent is a complex and 4^{th} and 5^{th} principles enforce the selection to be expanded to include the complex.



Figure 3.14: Active Grb2 is asked to be highlighted with its processes (left), outcome of this operation in the network (right)

3.2.4 Highlight Neighbors of Selected Node Group

Highlighting neighbors of the selected nodes is different from other complexity management techniques as it partially supports the principles. Since we just want to highlight neighbors, the 3rd principle is omitted. If a non-process node is selected, only its processes are highlighted instead of highlighting all neighborhood of those processes. Such an operation would be helpful in a crowded graph where it is difficult to understand the neighbors because of edge crossings. Hence, we do not base our Highlight Neighbors of Selected Node Group algorithm on any expand algorithms (Algorithm 6).

First, complex parents are added to the node group since complexes must be considered as a whole. Then, we add descendants of these parents since they may contain other entities. These two steps are very similar to second and third step of *expandNodes* algorithm. Next, neighborhood of the node group and their descendants are added to the node group and highlight operation is applied.

Algorithm 6 Highlight Neighbors of Selected Node Group

```
procedure HIGHLIGHTNEIGHBORSOFSELECTED(SELECTEDELEMS)
selectedElems = selectedElems U selectedElems.parents("complex")
selectedElems = selectedElems U selectedElems.descendants()
selectedElems = selectedElems U selectedElems.descendants()
selectedElems = selectedElems U selectedElems.descendants()
highlight(selectedElems)
end procedure
```

Figure 3.15 shows an example of this operation. Active Grb2 is asked to be highlighted with its neighbors. Since its parent is a complex, neighbors of that complex are also shown.



Figure 3.15: Active Grb2 is asked to be highlighted with its neighbors (left), outcome of this operation in the network (right)

3.2.5 Filter by Arbitrary Domain Knowledge

In addition to highlighting and filtering a user-selected node group, it is essential to apply such operations in the context of and in line with an arbitrary domain knowledge. For example, biological pathway data providers like Pathway Commons might offer biological pathways that include processes from various sources. Some sources might be thought to be highly reliable than others. Also, some biological pathways have network-context information like alteration frequencies of biological entities from a cancer study. Users should be able to eliminate less affected biological entities from a pathway map without destructing the map's integrity. Such queries can be handled by using the expand algorithms described earlier on the node group to be shown or hidden according to the domain knowledge.

Chapter 4

Tools For Visualizing SBGN-PD Maps

In this chapter, we present the software tools that implement our methods presented earlier.

4.1 SBGNViz.js

SBGNViz.js [43] is developed as an extension of Cytoscape.js [9] to visualize biological maps represented with SBGN Process Description language. Taking advantage of Cytoscape.js visualization and gesture facilities, SBGNViz.js supports all node and edge shapes introduced in SBGN Process Description notation.

Cytoscape.js accepts extensions of several types. An extension can be a core, collection, layout or renderer extension. Since SBGNViz.js introduces new node and edge shapes, it registers to Cytoscape.js as a renderer extension.

Developers are allowed to add any property to nodes' and edges' data object in case the properties are needed for an extension. As explained before, along with the shape, dimensions and label of the entities of SBGN Process Description notation, they have other properties like auxiliary units, multimer and port information. Those SBGN-PD related properties are attached to nodes' and edges' data object as JSON objects to be used during initialization of Cytoscape.js and SBGNViz.js uses this data while rendering SBGN-PD node and edge shapes.

4.2 SBGNViz.js-SA

SBGNViz.js-SA [44], short for SBGNViz.js Sample Application, uses SBGNViz.js to visualize, analyze, and edit biological pathways represented in SBGN-ML (Figure 4.1). Along with its support for basic graph visualization features like panning and zooming, it provides full compound structure support for compartments and complexes in SBGN-PD notation.



Figure 4.1: A sample view from SBGNViz.js-SA

Since Cytoscape.js only accepts JSON format, a converter from SBGN-ML

to JSON needed to be implemented. The converter converts the glyph and arc entities to node and edge data objects, respectively. Then, these data objects are attached to nodes and edges at initialization so that SBGNViz.js could render the shapes accordingly.

SBGNViz.js-SA can be used to edit, delete, and reposition the graph elements. After such operations, one might want to export the current network in SBGN-ML format. To do this, we added SBGN-ML generator that produces current graph topology in SBGN-ML format. Additionally, the current drawing of the model can be saved as a static image in PNG format.

Often times, along with the pathway information, users want to see more information about the genes in the network. SBGNViz.js-SA provides that information using BioGene [9]. It gets a gene's name as a query and provides detailed information about the gene's function and references from EntrezGene [30].

When users left-click on an entity, SBGNViz.js-SA shows its full name in case the name does not fit into the node shape entirely. Right-clicking on a gene shows gene-specific detailed information, dynamically retrieved from Bio-Gene (Figure 4.2). SBGNViz.js-SA uses one of Cytoscape.js plugins, called Cytoscape.js-qtip [45]. This plugin allows to display any information inside a tooltip which can be positioned around a node's body.

Figure 4.3 summarizes the architecture of SBGNViz.js-SA. Back-end of SBGNViz.js-SA

- accepts files in SBGN-ML format and converts them to JSON model. Then, the JSON model is attached to the properties of nodes and edges to initialize Cytoscape.js.
- creates the SBGN-ML map of the current graph in Cytoscape.js. It uses the core's functions to get the nodes' attributes like position, shape, and id.
- allows users to apply any complexity management operations like hide / show selected, delete selected, and highlight neighbors / processes of selected. It uses Cytoscape.js's core API to get graph elements, on which to



Figure 4.2: Detailed information of IRF1 is fetched from BioGene

apply such operations.

• makes a query to BioGene and parses the necessary information to be shown in properties window.

Backbone.js [46] is a model-view-controller framework that gives structure to web applications by providing models with key-value binding and custom events. It allows to abstract the data into models and bind the HTML representation into views.

Front-end of SBGNViz.js-SA uses the latest JavaScript libraries and generates the view creating a navigation menu and a canvas for Cytoscape.js. It uses Backbone.js to structure the BioGene information defining its JSON object as the
model and properties window as the view component of Backbone.js. Similarly, Backbone.js is used for Cytoscape.js canvas defining Cytoscape.js instance on the HTMH div object as view component and the JSON array of graph elements as model component.



Figure 4.3: SBGNViz.js-SA architecture

As mentioned before, Cytoscape.js accepts various extensions registered to its core. We used qtip extension to show BioGene information and pan-zoom extension that lets users to pan and zoom the graph using a widget in the canvas. Additionally, SBGNViz.js is registered as a renderer to the core component of Cytoscape.js.

4.3 PCViz

Using SBGNViz.js, we added SBGN-PD visualization support to PCViz. It offers a better representation of pathways with full mechanistics. This is simply much better than the simple binary interaction networks, where state information cannot be shown.

When PCViz is initialized, it first visualizes the simple interaction network of a random gene. Users could modify the gene list by adding or removing any number of genes, it automatically loads the new network of interest. Also users could click an interaction between two genes to see the detailed pathway information between the two in SBGN-PD on a window using *fancybox* [47].

PCViz uses BioPAX data for both simple and detailed views of genes of interest. It extracts the necessary information for SIF (Simple Interaction Format) [48] and SBGN view, converting them to JSON object to visualize using Cytoscape.js. Along with the information for SIF and SBGN view, PCViz could provide additional information about genes like source, evidence terms, publications and gene related comments to provide more detailed information since BioPAX covers a broad spectrum of information about pathways (Figure 4.4).



Figure 4.4: A process is selected (in magenta) and its details are shown in Details tab.

PCViz uses BioGene to retrieve detailed information about a gene's function for both simple and SBGN view. However, it does not provide any information about processes and reactions which are the main aspects of SBGN-PD diagrams. Fortunately, BioPAX has all information about processes and PCViz extracts this information for processes together with SBGN-PD related information. Additionally, it uses iHOP [49] to provide edge annotation data, showing how many times two genes are co-citated and pubmed information.

When users click on an edge, edge annotation data is provided. In addition to this data, they could click the button that opens the detailed processes between the source and the target gene in SBGN-PD notation (Figure 4.5 and Figure 4.6).



MDM2 changes the state of TP53.

Figure 4.5: Users click the edge between TP53 and MDM2 to see their detailed process in SBGN.



Figure 4.6: Detailed process information between MDM2 and TP53 in SBGN-PD notation.

Since PCViz uses Pathway Commons, it includes processes from various pathway resources. In addition to the complexity management operations that were introduced in SBGNViz.js-SA, PCViz offers filtering facility according to process sources. In *Settings* view, it shows the dynamic list of the process sources in the current network. Users could click a process source to filter out this process from the network (Figure 4.7).



Figure 4.7: Filtering out the processes of NCI Nature from the SBGN-PD diagram in Figure 4.6.

Chapter 5

Conclusion

In this study, we determined the principles and invariants for managing complexity in SBGN-PD diagrams. Regarding these rules, we offered some algorithms to manage the complexity in SBGN-PD diagrams without destroying the integrity of the network.

We developed SBGNViz.js, an extension to Cytoscape.js, to support and visualize SBGN-PD notation. Using SBGNViz.js, we created a sample application, called SBGNViz.js-SA, to show SBGNViz.js capabilities. In addition to its capabilities like importing, editing, and saving biological pathways in SBGN-ML format, users could access gene details and functions which are retrieved using BioGene. Also, complexity management operations like hide / show selected nodes, highlight neighbors / processes of selected nodes are implemented in SBGNViz.js-SA using the algorithms described in this study.

We also added SBGN-PD visualization support to PCViz, an open source network visualization tool. PCViz allows users to see the interaction of a gene with other genes and select an interaction between a pair of genes to see its detailed process visualization in SBGN-PD notatioddo

5.1 Future Work

Although *SBGNViz.js* and *Sample Application* provide basic features sufficient to visualize, edit, and import SBGN-PD diagrams, it can still be improved with additional features. Some of the possible extensions is listed as follows:

- Support for other SBGN languages: SBGNViz.js currently supports only Process Description (PD) language specifications. Other SBGN languages, Entity Relationship and Activity flow, could be facilitated.
- 2. SBGN editor: SBGNViz.js-SA only supports importing, editing, and exporting SBGN diagrams. An editor that allows users to generate their own SBGN diagrams from scratch or by modifying existing models could be added to SBGNViz.js-SA.
- 3. Export / Import support: SBGNViz.js-SA currently supports loading a graph only in SBGN-ML format and saving in SBGN-ML and PNG format. Support for other formats can be added in order to save the graph information in various forms such as PDF, SVG, and JSON.
- 4. Experimental data analysis: Currently, SBGNViz.js-SA does not support any experimental data to analyze on SBGN-PD diagrams. As a future extension, SBGNViz.js-SA could make a query to cBioPortal to retrieve cancer data and show the alteration frequencies in the network.

5.2 Availability

Source code of SBGNViz.js, SBGNViz.js-SA, and PCViz are publicly available. SBGNViz.js source code is stored in Google Code [43]. For SBGNViz.js-SA, we created another repository in [43] and named it *sampleapp* [50]. Also, a demo web page for SBGNViz.js-SA can be launched using [44].

PCViz has been developed by Pathway Commons team and its source code is

stored in Google Code [51]. Currently, SBGN-PD support is in a branch, named as sbgn-view2 [52]. Additionally, PCViz website can be accessed using [32].

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