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# Flexible network reconstruction from relational databases with Cytoscape and CytoSQL

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## Abstract

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**Background:** Molecular interaction networks can be efficiently studied using network visualization software such as Cytoscape. The relevant nodes, edges and their attributes can be imported in Cytoscape in various file formats, or directly from external databases through specialized third party plugins. However, molecular data are often stored in relational databases with their own specific structure, for which dedicated plugins do not exist. Therefore, a more generic solution is presented.

**Results:** A new Cytoscape plugin 'CytoSQL' is developed to connect Cytoscape to any relational database. It allows to launch SQL ('Structured Query Language') queries from within Cytoscape, with the option to inject node or edge features of an existing network as SQL arguments, and to convert the retrieved data to Cytoscape network components. Supported by a set of case studies we demonstrate the flexibility and the power of the CytoSQL plugin in converting specific data subsets into meaningful network representations.

**Conclusions:** CytoSQL offers a unified approach to let Cytoscape interact with relational databases. Thanks to the power of the SQL syntax, this tool can rapidly generate and enrich networks according to very complex criteria. The plugin is available at <http://www.ptools.ua.ac.be/CytoSQL>.

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## Background

Molecular interactions are the focus of many functional genomics studies, and they form a cornerstone of Systems Biology research. Software to integrate and analyse these interactions and their attributes plays an increasingly important role. The most widely used open source network visualization workbench is Cytoscape [1]. Data from various sources can be imported into this tool to build networks, and to highlight specific node or edge features. Cytoscape can also be used to filter and browse a network and it offers extensive data mining possibilities. Many of these features are provided or extended through third-party plugins.

The potential of Cytoscape to integrate heterogeneous data relies heavily on its data import capabilities. Import functions for several common file types and connectivity to web services are built in. A number of third party plugins, such as BioNetBuilder [2], the MiSink plugin [3], BiNOM [4] and MiMI [5] provide a dedicated interface between Cytoscape and specific data sources. Nevertheless, the standard import capabilities and the existing range of import plugins have certain limitations. Interactions and their attributes are widely collected into relational databases, with their own specific structure and maintained by different institutes and organisations. In bioinformatics facilities that support wet laboratories, experiments are often stored in local, internally developed and continuously changing databases. Usually such databases are not supported by an existing Cytoscape plugin. Exporting data from these databases as text and importing it into Cytoscape is possible, but takes time, and needs to be repeated every time the network needs to be updated with the most current database information. This process becomes even more cumbersome if a user wants to import new attributes from a database for all given nodes or edges of the network. One way to achieve this consists of exporting the full attribute table from the database, and let Cytoscape filter out the attributes relevant for the given network. This is possible, as long as the attribute table is small enough. An alternative approach would be to export all node (or edge) identifiers from the network, and to query the attribute table of the database with these identifiers. This repeated process of exporting from Cytoscape, querying the database and importing the results back in Cytoscape is

particularly time consuming.

To tackle these issues, we propose a unified solution that works with virtually any accessible relational database. The approach was implemented as a Cytoscape plugin called 'CytoSQL', which connects Cytoscape directly with any relational database through a generic method. With this plugin, users can construct and extend networks using "Structured Query Language" (SQL) syntax, a well known database interaction language.

## **Implementation**

CytoSQL was implemented in Java as a Cytoscape plugin. It interfaces with relational databases through the JDBC driver, which offers an abstraction of most relational database systems. The required drivers for MySQL, SQLite and PostgreSQL are included in the default installation, and the online documentation explains how to configure the plugin for use with alternative drivers or drivers for other database systems. The plugin website (<http://www.ptools.ua.ac.be/CytoSQL>) also offers an example relational (MySQL) database structure, along with a tutorial and a number of Python scripts to populate the example database with publicly available test case data.

## **Installation and testing**

All local database instances were running on an Ubuntu 6.06 LTS server running MySQL 5.0.22. CytoSQL and the application cases were tested with Cytoscape version 2.6.3 and earlier, on Microsoft Windows XP, Ubuntu 8.04.1 and Mac OS X 10.5.8.

The CytoSQL plugin can be installed from the Cytoscape plugin manager, under the "Network and Attribute I/O" category.

## **User interface**

After installation, CytoSQL can be launched from the plugin menu and it offers access to the query window and to the database definition window.

### *Database definition*

Prior to any query execution, its connection must be defined. The database definition window (Figure 1) collects common database access coordinates. The form supports storage and retrieval of multiple

connection settings and facilitates quick switching between different databases. It is thus straightforward to extract information from different databases in one single session.

### *Query window*

The main CytoSQL window (Figure 2) lets the user specify, test and launch SQL statements against the selected database. In the query definition field the user can enter any SQL 'SELECT' statement. The recent query history is available through a drop-down box that allows to rapidly relaunch a previous query. A second drop-down box enables users to store and launch a set of favorite queries, which can be edited and managed in a dedicated editor window. The query can then be executed through one of the four modes of operation: create network, expand network, update node attributes or update edge attributes. Depending on the chosen mode of operation, a query may support 'bind variables'. Bind variables are 'replacement' variables that a user can add into the SQL query. They are instantiated with chosen attributes of currently selected Cytoscape network nodes or edges. A preview field enables the user to verify the results of the query, prior to finalizing the import of the results as network elements into Cytoscape.

## **Results**

### **Launching queries and mapping results**

After execution of the query, the resulting rows and columns are subsequently mapped to Cytoscape network elements in a way determined by the selected mode of operation:

#### *Mode 1: Creating a new network*

The first and most simple mode is the creation of a new Cytoscape network through one 'SELECT' statement. Result sets of SQL statements are returned in single table format, consisting of rows (records) and columns. The plugin interface prompts the user to specify for each column whether it concerns the source node, the target node or an attribute of the source, target or edge (see documentation for more details). The Cytoscape network is immediately generated hereafter. Field types (integer, double, string, ...) are automatically converted to equivalent Cytoscape data types.

For example:

```
SELECT protn1, protn2, intType, confirmed FROM interactions WHERE confirmed = 'Y'
```

This hypothetical query could retrieve two interacting nodes (protn1 and protn2), and two edge attributes

for this interaction (interaction type "intType" and whether the interaction is confirmed or not).

#### *Mode 2: Loading attributes for selected nodes*

A second mode of operation enables loading new attributes for a set of selected nodes or - if no nodes are selected - for all nodes in the network. The user can put one or more 'bind' (replacement) variables (represented by question marks) in the 'WHERE' clause of the SQL query. A plugin dialog box then asks the user which Cytoscape node field(s) should replace the bind variable(s). The query will be subsequently launched for each node individually with the appropriate variable(s) replaced by the value(s) of the selected node fields.

For example:

```
SELECT protein, mass, pI FROM features WHERE protein = ?
```

In this example, the Cytoscape node identifier may be mapped to the bind variable "?", and the query is launched once for each node, retrieving "mass" and pI" as new node attributes.

#### *Mode 3: Loading attributes for selected edges*

In a fashion similar to Mode 2, the plugin can load new attributes for existing edges, based on one or more replacement variables in the 'WHERE' clause. Both node or edge attribute fields can be used to replace this variable, and the query will be launched once for each edge.

For example:

```
SELECT protn1, protn2, intType, score FROM predictedInteractions WHERE protn1 = ? AND  
protn2 = ?
```

The query contains two bind variables, each of which is populated with a different Cytoscape attribute, in this hypothetical example the interacting node identifiers of each selected edge. The query loads predicted information (type, score) for interactions that are already present in the network.

#### *Mode 4: Expanding an existing network*

The last mode of operation is used to extend an existing network, by loading new nodes that interact with the selected nodes, together with their edges. This mode also requires the use of at least one bind variable,

that inserts a Cytoscape node attribute in the 'WHERE' clause of the SQL query.

For example:

```
SELECT protn2, intType, score FROM predictedInteractions WHERE protn1 = ?
```

This query loads new interactions that originate from selected nodes.

A toy example database against which aforementioned example queries can be executed, is provided on the plugin website.

### **Application cases**

To demonstrate the functionalities of the CytoSQL plugin with real data and to facilitate its comparison with alternative import options, we describe its use in a series of application cases.

#### *Case 1: Rapid reconstruction of complex networks*

To demonstrate how complex networks can be rapidly reconstructed from relational databases, we installed a local instance of the UCSC (University of California Santa Cruz) proteome browser MySQL database [6]. Using a single SQL statement, combining three different tables, we built a yeast-specific network (Additional file 1) consisting of proteins and domains as two different types of nodes, and in which edges between both node types represent the fact that a given protein contains a given domain. The graph offers a global view on the distribution of protein-domain memberships and could, in combination with protein interaction data, for example serve as a starting point to study the importance of domains in protein interactions. The relative simplicity of this query highlights the power of SQL statements in extracting specific subsets from large databases: individually loading these complete three tables in Cytoscape could easily reach internal memory constraints.

#### *Case 2: Enrichment of existing networks*

In the next case study, we demonstrate the enrichment functions of the CytoSQL plugin, on a reaction network from a local instance of the Reactome database [7–9]. The first two queries are used to generate a network consisting of relationships between "molecules" and the "reactions" between them. To demonstrate the simplicity of using CytoSQL to enrich an existing network, we added useful node attributes for reactions and molecules, with one extra query, which loads molecule and reaction

descriptions for selected (or all) nodes. The resulting network view and detailed queries are shown in Additional file 2. Executing the same task through file export and import functions requires exporting the full (and potentially large) attribute table from the database, and importing it into Cytoscape. Using CytoSQL, only the attributes for relevant nodes need to be loaded and this is done in one single step.

### *Case 3: Use of public, remote relational databases*

CytoSQL is also useful for the local integration of data from remote databases. As a demonstration, we employed 'BioWarehouse', a Bioinformatics toolkit to collect biological data from multiple databases into a so-called "data warehouse" [10]. A public instance is available for users (after free registration). Using a single query, we constructed a network representation of the relationships between different "terms" in the warehouse. The network representation (Additional file 3) visualizes the structure of the relationships between terms, and reveals how terms belonging to different ontologies group together, and whether and how terms within an ontology are hierarchically organized. Other warehouse systems exist that offer similar possibilities to query heterogeneous and complex data with SQL statements [11–13].

## **Discussion**

Network reconstruction has become a major aspect in computational analysis of biological data. This task is often dependent on data distributed in distinct databases. Correct combinatorial analysis of data residing in different sources usually requires downloading and combining each dataset, a task that may become challenging if some of these datasets are large, whereas the intersect subset that is actually required may still be small. Relational databases facilitate the task of combining data and generating subsets of data based on complex criteria. The tool presented here unifies all types of interactions with databases into a single Cytoscape plugin. Due to the query language and the generic nature of the plugin, it facilitates otherwise complex data import and export procedures and it offers a valuable complement to existing Cytoscape plugins, which are often focussed on certain data sources or on very specific applications.

This ability to import data from any user accessible database simplifies otherwise extensive processing tasks for network generation, network analysis, and network attribute manipulation, to one or more SQL statements. Since SQL syntax supports data conversion through string and numeric functions, even small data manipulations can be accomplished during import. The bind variable option allows the user to incrementally extend or enrich an existing network, through any combination of node and edge attributes.

Together with the easy connection switching option a user can sequentially interconnect independent relational databases using selected attributes, allowing the user to gradually integrate various data sources while generating visual network representations.

The plugin may be utilized to connect to local databases, but can also be used to connect to any relational database that the user has sufficient access permissions for. Potential disadvantages of this approach are the requirement of unwrapped SQL connections and the related security risks. For internal applications this does not pose problems, but externally only a limited number of databases are directly accessible by SQL statements. The replication or "mirroring" of data repositories may mitigate this problem and bring the full query potential within any lab. With its generic approach, this plugin complements existing plugins, but it does not replace the available plugins that are specifically designed to offer biologist access to common databases. A relevant drawback of this plugin is the fact that a user is assumed to have some knowledge of SQL. It is also essential that the user understands the structure of the database to be queried. These factors may be a disadvantage for biologists and make the tool primarily relevant for bioinformaticians. Nevertheless, with a basic understanding of the 'SELECT' statement syntax however, the user can already accomplish most network generation tasks. Right now the plugin supports storing queries. Future developments may include a graphical query builder and tools to exchange stored queries among users, in order to bring its power within reach of a larger user base.

## **Conclusions**

Relationships between biological data become increasingly relevant and are more and more studied with high throughput techniques. It can be expected that the amount of available relational information will grow rapidly the coming years. This plugin leverages the use of omnipresent relational data through offering generic access to this information.

## **Availability and requirements**

- Project name: CytoSQL
- Project home page:  
<http://www.ptools.ua.ac.be/CytoSQL>
- Operating system(s): Platform independent
- Programming language: Java

- Other requirements: Cytoscape 2.6.1 or higher
- License: GNU LGPL3
- Any restrictions to use by non-academics: none

## Authors contributions

KL, DTH, KVL and JH developed and tested the application, KL wrote the manuscript, GDJ, MK and EW were involved in drafting the initial concepts and provided real application cases, and AV coordinated the project. All authors read and approved the final manuscript.

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## Figures

### Figure 1 - Screenshot of the CytoSQL database connectivity window

The database connectivity window allows to define and store database connection settings and enables rapid switching between different databases.

### Figure 2 - Screenshot of the CytoSQL query window

The main CytoSQL window allows to define, save, evaluate and launch queries.

## Additional Files

### Additional file 1: AdditionalFile1.pdf - Application case 1

A pdf document that lists the queries and shows the generated network of application case 1: Rapid reconstruction of complex networks.

### Additional file 2: AdditionalFile2.pdf - Application case 2

A pdf document that lists the queries and shows the generated network of application case 2: Enrichment of existing networks.

### Additional file 3: AdditionalFile3.pdf - Application case 3

A pdf document that lists the queries and shows the generated network of application case 3: Use of public, remote relational databases.

# Specify Database Connection Info

Custom

## preformatted database specifications

Driver:

Database host:

Port number:

Database name:

## custom database specification

Driver:

URL:

Username:

Password:

OK

Cancel

Figure 1

1. Define database: 

2. Enter SQL query:

 Auto Completion

```

select
ppi.orf_id 1, ppi.orf_id 2, ppi.reference, ppi.ppi_id,
loc1.orf_id as loc1_orf_id, loc1.localization as localization_1,
loc2.orf_id as loc2_orf_id, loc2.localization as localization_2
from
ppi_table ppi, orf_localization_table loc1, orf_localization_table loc2
where
loc1.orf_id = ppi.orf_id 1
and loc1.localization = "cytosol"
and loc2.orf_id = ppi.orf_id 2
and loc2.localization = "cytosol"

```

Select query from favorites...

Select query from history...

3. Select one Operation: CREATE\_NETWORK OPERATION WAS SELECTED

4. SQL result preview:

orf_id_1	orf_id_2	reference	ppi_id	loc1_orf_id	localization_1	loc2_orf_id	localization_2
92	90	TAIR	155	92	cytosol	90	cytosol
90	89	TAIR	156	90	cytosol	89	cytosol
89	90	TAIR	157	89	cytosol	90	cytosol
90	93	TAIR	158	90	cytosol	93	cytosol
93	90	TAIR	159	93	cytosol	90	cytosol
94	95	TAIR	160	94	cytosol	95	cytosol
95	94	TAIR	161	95	cytosol	94	cytosol
102	103	TAIR	168	102	cytosol	103	cytosol
103	102	TAIR	169	103	cytosol	102	cytosol

5. Import results:

**Additional files provided with this submission:**

Additional file 1: AdditionalFile1.pdf, 1754K

<http://www.biomedcentral.com/imedia/1425754259415670/supp1.pdf>

Additional file 2: AdditionalFile2.pdf, 2800K

<http://www.biomedcentral.com/imedia/1410947404156719/supp2.pdf>

Additional file 3: AdditionalFile3.pdf, 6968K

<http://www.biomedcentral.com/imedia/9356689964156730/supp3.pdf>