

# Intégration et interrogation de données

## Askomics

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INRA

27 septembre 2018

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# Outline

- 1 A nightmare of data
  - Why it is difficult
  - Why RDF and SPARQL are relevant
- 2 RDF
  - RDF graph of resources
  - Serialization
- 3 the SPARQL language
- 4 Askomics
  - Integrating data
  - Querying data
- 5 Modeling
  - AskoR
- 6 Conclusion
- 7 Principles of federated queries

# Big data and the deluge of life science data

## Big data

Datasets so **large** or **complex** that traditional data processing is inadequate [Laney2001]

## Life science: data deluge [Aldhous1993]

- computerized biomedical data
- Genomics and bioinformatics

Science, 1993 Oct 22;262(5133):502-3.

**Managing the genome data deluge.**

Aldhous P.

PMID: 8211171 [PubMed - indexed for MEDLINE]

Science, 1995 Aug 4;269(5224):630.

**Europe opens institute to deal with gene data deluge.**

Williams N.

PMID: 7624788 [PubMed - indexed for MEDLINE]



# Complexity of life science data: distributed

- 1500+ biological databases [Galperin2015]
- Lack of interoperability
- Some efforts of unified access (BioMart, InterMine...)



ORGANIZED VIEW OF THE TRANSCRIPTOME



Saccharomyces Genome Database



# What to expect for 2025?

Our estimation is that genomics is **one of the most demanding domain** in terms of

- data acquisition
- data storage
- data distribution
- **data analysis**

## Big Data: Astronomical or Genomical?

Zachary D. Stephens<sup>1</sup>, Skylar Y. Lee<sup>1</sup>, Faraz Faghri<sup>2</sup>, Roy H. Campbell<sup>2</sup>, Chengxiang Zhai<sup>3</sup>, Miles J. Efron<sup>4</sup>, Ravishankar Iyer<sup>1</sup>, Michael C. Schatz<sup>2\*</sup>, Saurabh Sinha<sup>3\*</sup>, Gene E. Robinson<sup>6\*\*</sup>

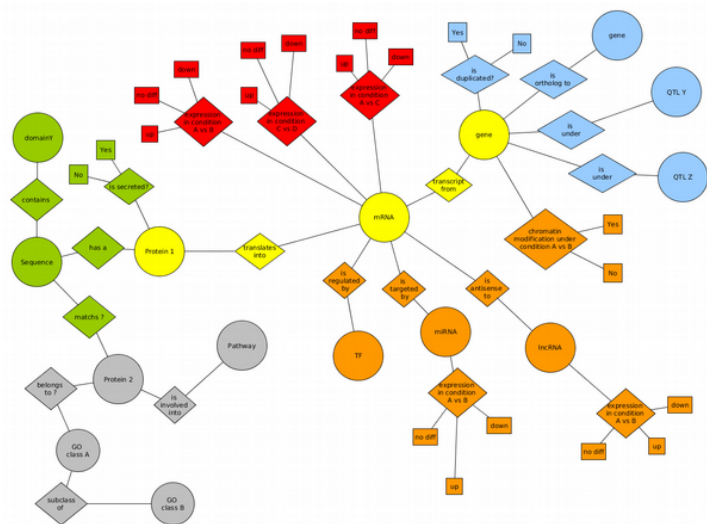
PLOS Biology | DOI:10.1371/journal.pbio.1002195 July 7, 2015

**Table 1. Four domains of Big Data in 2025.** In each of the four domains, the projected annual storage and computing needs are presented across the data lifecycle.

Data Phase	Astronomy	Twitter	YouTube	Genomics
<b>Acquisition</b>	25 zetta-bytes/year	0.5–15 billion tweets/year	500–900 million hours/year	1 zetta-bases/year
<b>Storage</b>	1 EB/year	1–17 PB/year	1–2 EB/year	2–40 EB/year
<b>Analysis</b>	In situ data reduction	Topic and sentiment mining	Limited requirements	Heterogeneous data and analysis
	Real-time processing	Metadata analysis		Variant calling, ~2 trillion central processing unit (CPU) hours
	Massive volumes			All-pairs genome alignments, ~10,000 trillion CPU hours
<b>Distribution</b>	Dedicated lines from antennae to server (600 TB/s)	Small units of distribution	Major component of modern user's bandwidth (10 MB/s)	Many small (10 MB/s) and fewer massive (10 TB/s) data movement

doi:10.1371/journal.pbio.1002195.t001

# Data analysis needs data integration



# Data everywhere!

The image displays three overlapping Microsoft Excel spreadsheets, illustrating the complexity and volume of data in a testing environment. The top spreadsheet shows a list of ACVP IDs (e.g., ACVP1089495, ACVP1007777) and their corresponding test conditions. The middle spreadsheet shows a similar list with additional columns for test results and dates. The bottom spreadsheet shows a list of test conditions with a 'Condition' column. The spreadsheets are layered, with the bottom one partially obscured by the middle one, and the middle one partially obscured by the top one.

# Data are distributed

## Definition: Entity

Anything that can be identified (i.e. the things we can talk about)

- some informations about an entity in a repository
- other informations about the same entity in another repository

your question requires to combine entity descriptions from multiple datasets

Only possible if:

- Entities are identified
- Datasets use the same identifier to describe the same entity

Good luck with your spreadsheets! :-)

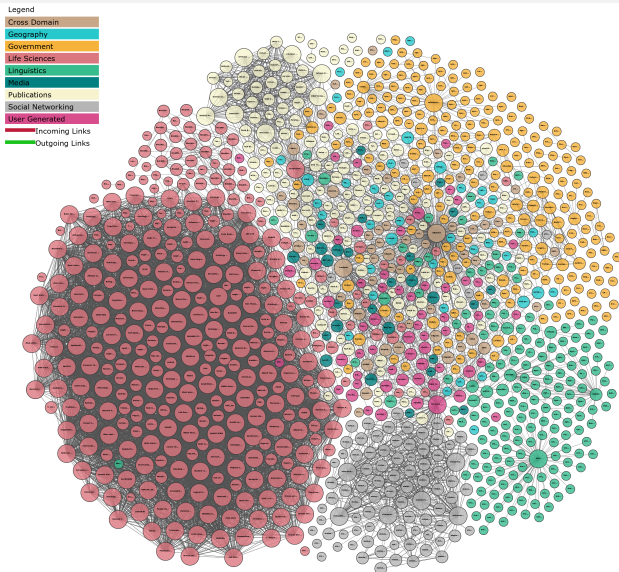
# Data description involves hierarchies

- Knowledge has been formalized (e.g. in ontologies)
- Query engines (more or less) gracefully handle
  - linking data and ontologies
  - reasoning on the ontologies

## The good news (1/3)

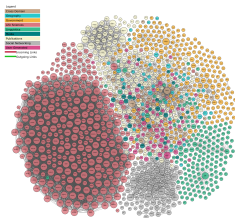
Semantic Web technologies (RDF, SPARQL, OWL) address all of these

# Linked open data (in 2017)



Linked open data cloud, by M. Schmachtenberg, C. Bizer, A. Jentzsch and R. Cyganiak <http://lod-cloud.net/>

# Linked Open Data



The not so good news: Linked data are here... but still have to be adopted by end users

“Real” users

- do not contribute (yet) their data to the LOD cloud
- do not use the LOD cloud for analyzing their own data (yet)

“Real” users need to retain their ability to interact with **their** data



# The RDF format

- Identify things
  - Describe them
  - their characteristics
  - their relations to other things
  - their categories
- Possibly combine descriptions from multiple places
- Elements of the descriptions should themselves be identifiable
- Support rich querying and reasoning on descriptions



"Now! *That* should clear up a few things around here!"

# Resources (aka entities)

## Resource (= entity)

Resource: anything in the universe

## Two kinds of resource

- **Referent**: resource with an identity
  - identified by an **URI or IRI**
  - there can be 0, 1 or more IRI identifying the same resource
- **Litteral**: resource defined by its value
  - represented as a string (e.g. "foo" or 'foo')
  - each litteral has 1 **datatype** that defines its nature and the range of possible values
    - default=string
    - string, integer, float, date, dateTime, boolean...
    - use XSD

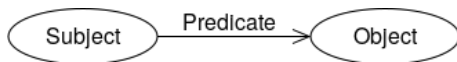
# Litteral

- Represented by a string (delimited by single or double-quotes; escape if necessary)
- Its **datatype** (default = string) explains how to interpret
  - "12" = the string with two characters ('1' and '2')
  - "12"^^xsd:integer = the string representing the number twelve
  - "12.0"^^xsd:float = the string representing the number twelve
  - "true" = the string with four characters
  - "true"^^xsd:boolean = the string representing the boolean true
  - "1"^^xsd:boolean = the string representing the boolean true
  - "2017-08-24T18:54:42"^^xsd:dateTime
- String literals can be qualified by a **language tag**
  - "ADN"@fr or "DNA"@en

# RDF triple

RDF triple = <subject, predicate, object>

- **subject**: the resource being described
- **predicate**: the relation (from the subject to the object)
- **object**: the value of the predicate for the subject  
(one of them if the predicate can have several values for the subject;  
in this case use as many triples as necessary)



# RDF triple

- an IRI can be the subject of many triples
- an IRI can be the the object of many triples
- an IRI can be the subject of some triples and the object of other triples
- a littéral can only be an object

# RDF graph

RDF graph = set of RDF triples

- Set
  - No order among the triples
  - Redundant triples are ignored
- Structure = labeled directed graph
  - nodes = resources (subject or object of as least one triple)
  - edges = triples
    - start = subject IRI
    - end = object IRI
    - edge label = property IRI

The graph itself can be seen as a resource (**named graph**)

- identified by its IRI
- useful for describing who generated the graph, when, how, from which data...
- not mandatory (default graph)

# RDF in practice

RDF can be stored:

- in files (several formats: n3, turtle, xml-rdf,...)
- in triplestores (~ DB): Virtuoso, fuseki, sesame & RDF4J, Oracle, 4store,...
- within HTML: RDFa

RDF is supported by most languages (and most triplestores have bindings)

# RDF format: N-triples

- 1 triple / line
  - URI delimited by angle brackets (“<” and “>”)
  - subject, predicate and object separated by space
  - line ends with a colon (“.”)
- no order between triples
- order within triple matters (obviously)

Straightforward, but not easy to read/write (for humans)



# RDF format: N-triples

```
1
2 <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH>
  • <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#firstName> "Frank" .
3 <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH>
  • <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#lastName> "Herbert" .
4 <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH>
  • <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#citizenOf>
  • <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#USA> .
5 <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH>
  • <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#authorOf>
  • <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#Dune> .
6 <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH>
  • <http://www.w3.org/1999/02/22-rdf-syntax-ns#type>
  • <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#Author> .
7 <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH>
  • <http://www.w3.org/1999/02/22-rdf-syntax-ns#type>
  • <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#Person> .
8
9 <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#Dune>
  • <http://www.w3.org/1999/02/22-rdf-syntax-ns#type>
  • <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#Book> .
10 <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#Dune>
```

# RDF format: Turtle

- N-triples syntax still possible
- comments start with “#” until end of line
- prefix declaration for CURIE
  - @PREFIX prefixName: <URI template> .
  - (also a triple)
  - usually at beginning of file
- 1 triple / line
  - URIs can be full URIs (<...>) or CURIE (no delimiters)
  - a triple can mix both
  - line ends with “;” ⇒ next line has
    - same subject (no need to repeat)
  - line ends with “,” ⇒ next line has
    - same subject (no need to repeat)
    - same property (no need to repeat)

# RDF format: Turtle

```
1 @prefix sf: <http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#> .
2 @prefix rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#> .
3
4 #
5 # FRANK HERBERT
6 #
7 sf:FH sf:firstName "Frank" .
8 sf:FH sf:lastName "Herbert" .
9 sf:FH sf:citizenOf sf:USA .
10 sf:FH sf:authorOf sf:Dune .
11 sf:FH rdf:type sf:Author .
12 sf:FH rdf:type sf:Person .
13
14 sf:Dune rdf:type sf:Book .
15 sf:Dune rdf:type sf:SciFiBook .
16 sf:Dune sf:title "Dune" .
17 sf:Dune sf:wonAward sf:Nebula1965 .
18 sf:Dune sf:wonAward sf:Hugo1966 .
19
20 sf:Nebula1965 rdf:type sf:NebulaAward .
21 sf:Hugo1966 rdf:type sf:HugoAward .
..
```

# Other formats

## N3

Do not confuse with N-Triples!

- N3 = turtle + additional features
  - Named graphs
  - Inference rules
  - ...
- not a W3C recommendation

## RDF-XML

- XML serialization of RDF
- a major pain to read or edit these by hand

# RDF format: RDF-XML

```
1 <?xml version="1.0" encoding="utf-8"?>
2 <rdf:RDF xmlns:rdf="http://www.w3.org/1999/02/22-rdf-syntax-ns#"
3   * xmlns:sf="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#">
4   <rdf:Description rdf:about="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH">
5     <sf:firstName>Frank</sf:firstName>
6   </rdf:Description>
7   <rdf:Description rdf:about="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH">
8     <sf:lastName>Herbert</sf:lastName>
9   </rdf:Description>
10  <rdf:Description rdf:about="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH">
11    <sf:citizenOf rdf:resource="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#USA"/>
12  </rdf:Description>
13  <rdf:Description rdf:about="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH">
14    <sf:authorOf rdf:resource="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#Dune"/>
15  </rdf:Description>
16  <rdf:Description rdf:about="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH">
17    <rdf:type rdf:resource="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#Author"/>
18  </rdf:Description>
19  <rdf:Description rdf:about="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#FH">
20    <rdf:type rdf:resource="http://www.irisa.fr/dyliss/public/odameron/SciFiAwards#Person"/>
21  </rdf:Description>
```

# SPARQL Endpoints

- SPARQL queries are executed against RDF datasets, consisting of RDF graphs.
- A SPARQL endpoint accepts queries and returns results via HTTP.
- Endpoints can be generic (i.e. web accessible datasets) or specific to a dataset
- The results of SPARQL queries can be returned and/or rendered in a variety of formats (XML, JSON, RDF, HTML)

# SPARQL queries

SPARQL = query language similar to SQL

Variable names start with a question mark

```
@prefix foaf: <http://xmlns.com/foaf/0.1/> .  
@prefix mus: <http://www.irisa.fr/dyliss/public/mus#> .
```

```
SELECT ?player ?instr  
WHERE {  
  ?player foaf:name Alice  
  ?player mus:plays ?instr .  
}
```

## SPARQL queries (2)

```
@prefix foaf: <http://xmlns.com/foaf/0.1/> .
@prefix mus: <http://www.irisa.fr/dyliss/public/mus#> .

SELECT ?player ?instr
WHERE {
  ?player foaf:name Alice
  ?player mus:plays ?instr
  ?instr mus:instrclass corde .
}
```



## SPARQL queries (3)

```
1 SELECT ?player ?instr
2 WHERE {
3   ?player foaf:name Alice
4   ?player mus:plays ?instr
5   ?instr mus:instrclass corde
6   ?player info:age ?age
7   FILTER (?age <= 24) .
8 }
```

# SPARQL queries (4)

+ many other features

- OPTIONAL
- UNION
- ORDER BY
- DISTINCT
- ...

# AskOmics: reconciling domain experts with Semantic Web

AskOmics is useful for:

- Integrating data
- Querying data

The screenshot displays the AskOmics web interface. At the top, the title "AskOmics" is visible. Below it, there are navigation menus for "Files", "Graph", "View", and "Shortcuts", along with a "Reset" button and a search bar containing the text "gene3".

The main area is divided into two panels. The left panel shows a semantic network graph with nodes representing biological entities and their relationships. The nodes include "gene", "TF", "operon", "metabolic\_network", "SCS", "rxn\_gene", "metabolic\_network1#name", "gene1#WT\_vs\_GSH", and "SCS1#operon\_covered". Edges represent relationships such as "has", "is part of", "contains", and "is associated with".

The right panel contains a query form with several input fields:
 

- gene
- name
- WT\_vs\_WT\_Fe (with a dropdown menu set to "=")
- function
- WT\_vs\_WT\_Fe\_SD (with a dropdown menu set to "=")
- WT\_vs\_GSH (with a dropdown menu set to "=")
- WT\_vs\_GSH\_SD

At the bottom of the graph panel, there is a "Launch query" button.

# AskOmics (1) integrating data with RDF

## Integrating data

- Import your data files
  - CSV or TSV
  - RDF
  - GFF
- Import public knowledge bases (GO, Reactome, NCBI taxon,...)
- Declare (remote) SPARQL endpoints (in progress)

## The good news (2/3)

Don't worry about RDF, AskOmics generates it from your csv

## AskOmics (2) generating user-friendly SPARQL queries

### Querying data

- Graph-based user-friendly SPARQL query composer
  - based on an abstraction of your data
    - depends on the data structure (small)
    - not on the data themselves (possibly huge)
  - can be enriched (shortcuts and virtual links)
  - modular design (select/deselect datasets)
- Span multiple SPARQL endpoints (in progress)
- You do not have to see the SPARQL code
- Save the query result (obviously) in RDF or TSV

### The good news (3/3)

Don't worry about SPARQL queries, AskOmics generates them for you (and runs them as well)

# Querying data

Askomics

Files ▾ Graph ▾ View ▾ Shortcuts ▾

Reset

`gene3`

Launch query

gene

name

WT\_vs\_WT\_Fe

function

WT\_vs\_WT\_Fe\_SD

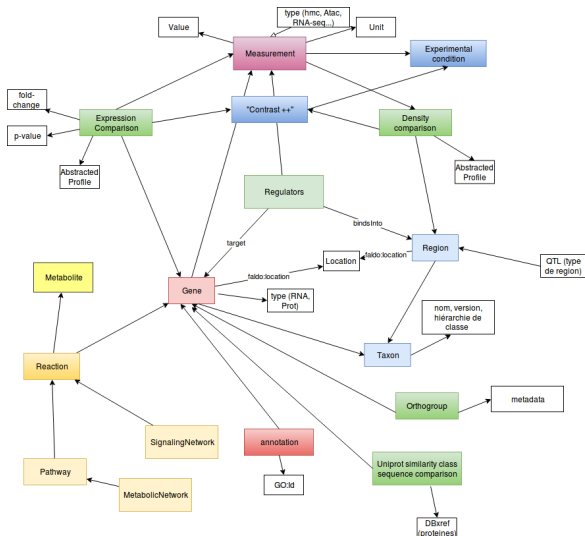
WT\_vs\_GSH

WT\_vs\_GSH\_SD

# AskOmics: new features in latest release

- Improved distribution
  - docker-compose
  - Genostack (thank you, GenOquest)
- Collaborative mode with public/private graphs management (authentication)
- Internal Modules
  - Gene Ontology
  - BioPax-v3 (Reactome,...)
- External modules integration
  - Metabolic Pathways (generated by Aureme)
  - Expression Analysis (generated by Askor)

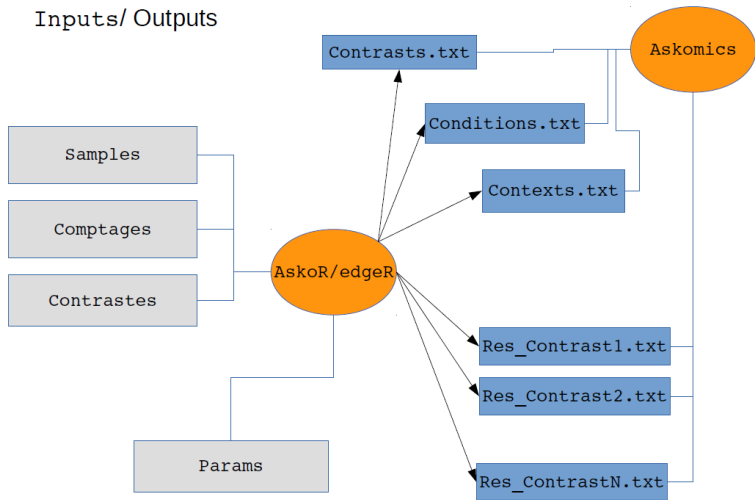
# Managing your own data





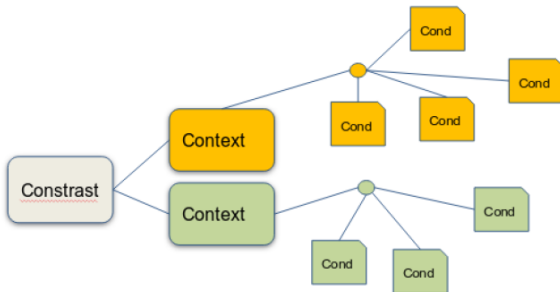
# AskorR - The scheme

## Inputs/ Outputs



# AskoR - 3 cons

Contrastes, contextes et conditions



# AskoR - Inputs

## Inputs / Outputs

- Comptages

Geneid	T1A_1	T1A_2	T1A_3	T1A_4	T1K_1
LOC100569617	380	12933	13406	3136	8825
LOC100160354	2679	15	13	5	7
LOC100162386	21215	870	458	207	360

- Fichier de description des échantillons

ID	condition	stage	treatment
ID	condition	stage	treatment
T1A_1	T1A	T1	Acetone
T1A_2	T1A	T1	Acetone
T1A_3	T1A	T1	Acetone
T1A_4	T1A	T1	Acetone
T1K_1	T1K	T1	Kinoprene
T1K_2	T1K	T1	Kinoprene
T1K_3	T1K	T1	Kinoprene
T1K_4	T1K	T1	Kinoprene
T2A_1	T2A	T2	Acetone
T2A_2	T2A	T2	Acetone
T2A_3	T2A	T2	Acetone
T2A_4	T2A	T2	Acetone
T2K_1	T2K	T2	Kinoprene
T2K_2	T2K	T2	Kinoprene
T2K_3	T2K	T2	Kinoprene
T2K_4	T2K	T2	Kinoprene

- Contrastes

Condition	T1AvsT1K	T2AvsT2K	T1vsT2	AvsK
Condition	T1AvsT1K	T2AvsT2K	T1vsT2	AvsK
T1A	+	0	+	+
T1K	-	0	+	-
T2A	0	+	-	+
T2K	0	-	-	-

# AskoR - Commands

## AskoR

### Ligne de commande

```
usage: /home/flegnai/local/askoR/Rscripts/AskoR_BE.R [options]

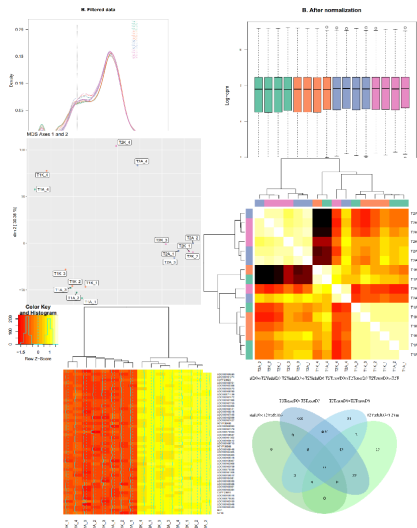
Options:
  -o CHARACTER, --out=CHARACTER
    output file name [default= out.pdf]
  -d CHARACTER, --dir=CHARACTER
    data directory path [default= .]
  --outdir=CHARACTER
    outputs directory [default= .]
  -O CHARACTER, --org=CHARACTER
    Organism name [default= Asko]
  -f CHARACTER, --fileofcounts=CHARACTER
    file of counts [default= NULL]
  -G INTEGER, --col_genes=INTEGER
    col of ids in count files [default= 1]
  -C INTEGER, --col_counts=INTEGER
    col of counts in count files [default= 7 (featureCounts) ]
  -t CHARACTER, --sep=CHARACTER
    col separator [default= |]
  -a CHARACTER, --annotation=CHARACTER
    annotation file [default= annotation.txt]
  -S CHARACTER, --sample=CHARACTER
    samples file [default= Samples.txt]
  -c CHARACTER, --contrasts=CHARACTER
    Contrasts file [default= Contrasts.txt]
  -k LOGICAL, --mk_context=LOGICAL
    generate automatically the context names [default= FALSE]
  -p CHARACTER, --palette=CHARACTER
    color palette (ggplot)[default= Set2]
  -R LOGICAL, --regex=LOGICAL
    use regex when selecting/removing samples [default= FALSE]
  -S CHARACTER, --select=CHARACTER
    selected samples [default= NULL]
  -r CHARACTER, --remove=CHARACTER
    removed samples [default= NULL]
```

### Galaxy

Format options	
Column of the genes	<input type="text" value="1"/>
Color palette (Colorbrewer)	<input type="text" value="Set2"/>
Organism	<input type="text" value="Asko"/>
Number of genes in the heatmap	<input type="text" value="50"/>
Samples selection options	
List of selected samples (separated by comma)	<input type="text"/>
List of removed samples (separated by comma)	<input type="text"/>
Threshold options	
Minimum CPM value for selecting a gene	<input type="text" value="0.5"/>
Number of samples with CPM >= this_comp for selecting a gene	<input type="text" value="3"/>
FCM threshold for reporting a differential gene	<input type="text" value="0.05"/>
Statistics options	
Normalization method	<input type="text" value="TPM"/>
GLM method	<input type="text" value="df"/>
Multitest correction method	<input type="text" value="fdr"/>

<https://github.com/askomics/askoR>

# AskoR - Graphics



## AskoR - Results

A	B	C	D	E	F	G	H	I	J	
Test_id	measured	Ing@Contrast	is@gene	logFC	FC	PValue	Expression	Significance	FDR	T1A/T1A
T1AvsT1K_LOCI	T1AvsT1K	LOC100161937	LOC100161937	0.653834957839295	1.57334489210274	4.81858946507366E-06	T1A>T1K		1.000168079424688595	366.33881
T1AvsT1K_LOCI	T1AvsT1K	LOC100169047	LOC100169047	0.554263254810566	1.46841856028124	8.1989963262792E-06	T1A>T1K		1.000168079424688595	660.0001
T1AvsT1K_CUFF	T1AvsT1K	CUFF.97	CUFF.97	0.408060428526691	1.32690071781475	0.00544597066531144	T1A=T1K		0.744282657592564	325.29000
T1AvsT1K_CUFF	T1AvsT1K	CUFF.96	CUFF.96	0.497352102541705	1.41162031985068	0.0072613322881088	T1A=T1K		0.744282659551152	153.82481
T1AvsT1K_CUFF	T1AvsT1K	CUFF.109	CUFF.109	-0.190933718249136	1.14150226187365	0.675236096851377	T1A=T1K		0.993886768190958	17.659149
T1AvsT1K_CUFF	T1AvsT1K	CUFF.110	CUFF.110	0.320111948023169	1.24842741868724	0.400686446457362	T1A=T1K		0.993886768190958	24.00020
T1AvsT1K_CUFF	T1AvsT1K	CUFF.114	CUFF.114	1.03276580324467	2.04594278884631	0.482085236923211	T1A=T1K		0.993886768190958	1.4358237
T1AvsT1K_CUFF	T1AvsT1K	CUFF.118	CUFF.118	0.215011118753834	1.16071285988534	0.396267052900753	T1A=T1K		0.993886768190958	73.691263
T1AvsT1K_CUFF	T1AvsT1K	CUFF.129	CUFF.129	-0.144728291343889	1.10552242615384	0.748169300799149	T1A=T1K		0.993886768190958	12.359010
T1AvsT1K_CUFF	T1AvsT1K	CUFF.132	CUFF.132	0.571461301454879	1.48602800186383	0.626292191113836	T1A=T1K		0.993886768190958	2.9658498
T1AvsT1K_CUFF	T1AvsT1K	CUFF.144	CUFF.144	0.658731498142573	1.57869393326964	0.325276937731316	T1A=T1K		0.993886768190958	11.184737
T1AvsT1K_CUFF	T1AvsT1K	CUFF.145	CUFF.145	1.08860022277432	2.12667595274367	0.41072866385443	T1A=T1K		0.993886768190958	2.8312470
T1AvsT1K_CUFF	T1AvsT1K	CUFF.147	CUFF.147	0.104362303890681	1.07501910842269	0.228439282472105	T1A=T1K		0.993886768190958	776.42269
T1AvsT1K_CUFF	T1AvsT1K	CUFF.152	CUFF.152	2.21534568979048	4.64392827401222	0.0242142509635883	T1A=T1K		0.993886768190958	9.5546642
T1AvsT1K_CUFF	T1AvsT1K	CUFF.169	CUFF.169	0.379567457976464	1.3009517517463	0.688175237377923	T1A=T1K		0.993886768190958	4.8763343
T1AvsT1K_CUFF	T1AvsT1K	CUFF.18	CUFF.18	0.89136521635132	1.8549306066824	0.330090154993124	T1A=T1K		0.993886768190958	6.16615259
T1AvsT1K_CUFF	T1AvsT1K	CUFF.180	CUFF.180	0.15381814632941	1.11250987386404	0.366212609251911	T1A=T1K		0.993886768190958	118.47186
T1AvsT1K_CUFF	T1AvsT1K	CUFF.193	CUFF.193	0.166920359002629	1.12265944626905	0.454848905277003	T1A=T1K		0.993886768190958	65.666067
T1AvsT1K_CUFF	T1AvsT1K	CUFF.197	CUFF.197	0.458430251815576	1.37405595107827	0.0326378906741092	T1A=T1K		0.993886768190958	147.18919
T1AvsT1K_CUFF	T1AvsT1K	CUFF.201	CUFF.201	-0.403370989344635	1.32259466692448	0.113833674349306	T1A=T1K		0.993886768190958	45.792778
T1AvsT1K_CUFF	T1AvsT1K	CUFF.223	CUFF.223	-0.559031780374769	1.47328013957694	0.587910730582268	T1A=T1K		0.993886768190958	2.1739359
T1AvsT1K_CUFF	T1AvsT1K	CUFF.248	CUFF.248	0.0297669356951964	1.02084719669969	0.720011514243992	T1A=T1K		0.993886768190958	960.840
T1AvsT1K_CUFF	T1AvsT1K	CUFF.249	CUFF.249	1.38641967720025	1.10086836272236	0.917517489057362	T1A=T1K		0.993886768190958	2.1873373
T1AvsT1K_CUFF	T1AvsT1K	CUFF.250	CUFF.250	0.0600379138630071	1.04249315708376	0.90316737421562	T1A=T1K		0.993886768190958	21.29668
T1AvsT1K_CUFF	T1AvsT1K	CUFF.274	CUFF.274	0.0100708000715915	1.007004496748201	0.902524048639907	T1A=T1K		0.993886768190958	1754.3596
T1AvsT1K_CUFF	T1AvsT1K	CUFF.28	CUFF.28	4.21581110122135	18.5817065621698	0.067245207593197	T1A=T1K		0.993886768190958	2.2411396
T1AvsT1K_CUFF	T1AvsT1K	CUFF.31	CUFF.31	0.535476644218393	1.44942094181101	0.616458009242795	T1A=T1K		0.993886768190958	9.2524939
T1AvsT1K_CUFF	T1AvsT1K	CUFF.314	CUFF.314	0.0276159857394859	1.0193263242328	0.816204173282946	T1A=T1K		0.993886768190958	1770.4728
T1AvsT1K_CUFF	T1AvsT1K	CUFF.335	CUFF.335	0.825059639047238	1.77160827256308	0.0957189111613422	T1A=T1K		0.993886768190958	22.208630
T1AvsT1K_CUFF	T1AvsT1K	CUFF.338	CUFF.338	1.67026977519934	3.18274103259636	0.0673842450966175	T1A=T1K		0.993886768190958	6.4544081
T1AvsT1K_CUFF	T1AvsT1K	CUFF.361	CUFF.361	-0.4165048489091627	1.33469014239525	0.701687141644462	T1A=T1K		0.993886768190958	2.1873372
T1AvsT1K_CUFF	T1AvsT1K	CUFF.366	CUFF.366	-0.123674565796954	1.08950632041113	0.921540229834845	T1A=T1K		0.993886768190958	3.4885582
T1AvsT1K_CUFF	T1AvsT1K	CUFF.369	CUFF.369	-0.28340048906213	1.21706016504722	0.437466359354328	T1A=T1K		0.993886768190958	19.0622227
T1AvsT1K_CUFF	T1AvsT1K	CUFF.370	CUFF.370	-0.0352250982417408	1.024716693022413	0.883820141001062	T1A=T1K		0.993886768190958	111.27648
T1AvsT1K_CUFF	T1AvsT1K	CUFF.371	CUFF.371	-2.27257812577995	4.83185823049461	0.0130034793559183	T1A=T1K		0.993886768190958	1.818281
T1AvsT1K_CUFF	T1AvsT1K	CUFF.379	CUFF.379	0.204325147940067	1.1521472787188	0.58845362274765	T1A=T1K		0.993886768190958	33.267472
T1AvsT1K_CUFF	T1AvsT1K	CUFF.382	CUFF.382	-0.165641199600011	1.12166448621467	0.675209312290905	T1A=T1K		0.993886768190958	19.605234

# AskoR - Integration in Askomics (1)

Askomics

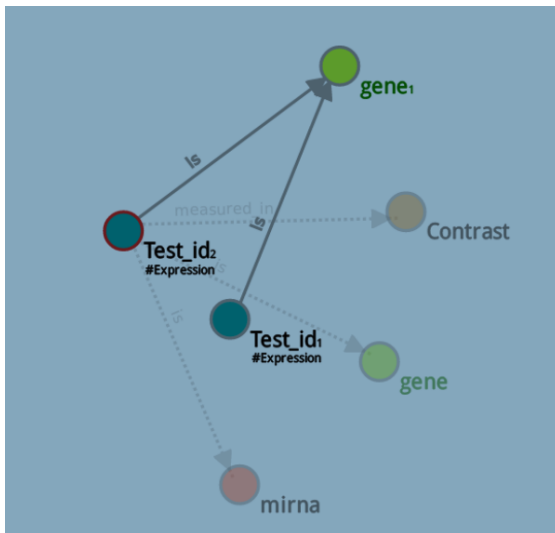
TSV file: BBRIC1AvsT1K.tsv

Test_id	measured_in@Contrast	is@gene	logFC	FC	PValue
Entity (Start)	General relation to ent	General relation to ent	Numeric	Numeric	Numeric
<a href="http://www.semanticweb.org/ur">http://www.semanticweb.org/ur</a>	<a href="http://www.semanticweb.org/ur">http://www.semanticweb.org/ur</a>	<a href="http://www.semanticweb.org/ur">http://www.semanticweb.org/ur</a>			
T1AvsT1K_LOC100161937	T1AvsT1K	LOC100161937	0.653834957839295	1.57334489210274	4.81858945507366e-06
T1AvsT1K_LOC100160047	T1AvsT1K	LOC100160047	0.554263254810566	1.46841856028124	8.19899632627292e-06
T1AvsT1K_CUFF:97	T1AvsT1K	CUFF:97	0.408060428526601	1.32600071781475	0.00544507066531144
T1AvsT1K_CUFF:96	T1AvsT1K	CUFF:96	0.4973521102541705	1.41162031985008	0.007261332861038
T1AvsT1K_CUFF:109	T1AvsT1K	CUFF:109	-0.190933718249130	1.14150220187305	0.07523009851377
T1AvsT1K_CUFF:110	T1AvsT1K	CUFF:110	0.320111948023169	1.24842741868724	0.400686446457362
T1AvsT1K_CUFF:114	T1AvsT1K	CUFF:114	1.03276590324467	2.04594278884631	0.482085236923211
T1AvsT1K_CUFF:118	T1AvsT1K	CUFF:118	0.215011118753834	1.16071295988534	0.306267052000753
T1AvsT1K_CUFF:129	T1AvsT1K	CUFF:129	-0.144728291343869	1.10552242615384	0.748109300798149
T1AvsT1K_CUFF:132	T1AvsT1K	CUFF:132	0.571461301454879	1.48602800186383	0.026292191113835
T1AvsT1K_CUFF:144	T1AvsT1K	CUFF:144	0.658731498142573	1.57869393326964	0.325276937731316

Preview RDF

Insert as a *private* dataset

## AskoR - Integration in Askomics (2)





# Askomics now

## AskOmics now

- Within Dyliss: data integration
- Dyliss ecosystem:
  - INRA
  - INSERM
  - Sanofi
  - received interest from: Fealinx + Theranexus
- Growing adoption by a wider user base
  - Docker image
  - GenoStack (support from GenOuest)
  - interface with Galaxy (developped by INRA)
  - Askor (developped by INRA)

# The future of AskOmics

## The future of AskOmics

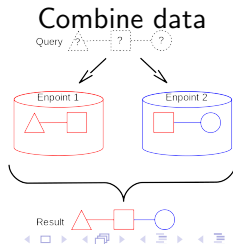
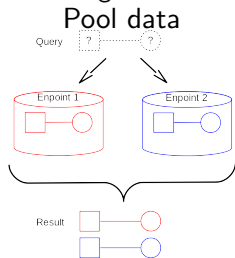
- extend query expressivity
- improve the GUI ergonomoy
- improve support for multiple endpoints
  - constellation of AskOmics
  - benefit from the FederatedQueryScaler PRE (with Wimmics)
- reach a larger user base

## AskOmicS received contributions from:

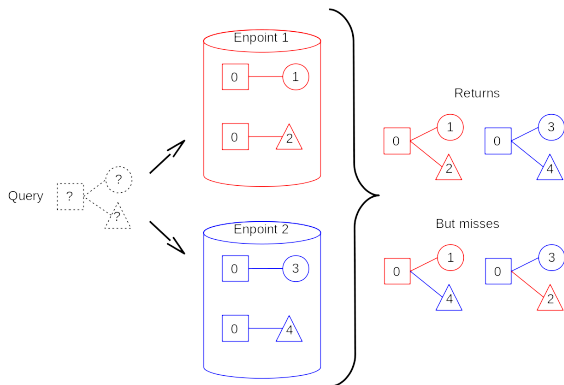
- Meziane Aite
- Arnaud Belcour (intern)
- Charles Bettembourg (postdoc + Sanofi)
- Anthony Bretaudeau (INRA)
- Yvanne Chaussin (intern)
- Olivier Dameron (Univ. Rennes 1)
- Aurélie Evrard (postdoc INRA)
- Olivier Filangi (INRA)
- Xavier Garnier (intern + INRA)
- Maël Kerbirou (intern)
- Fabrice Legeai (INRA)
- Sylvaine Bitteur (INRA / Agrocampus Ouest) for the logo
- Colleagues from Nantes for their insight on federated queries
  - Pascal Molli
  - Patricia Serrano Alvarado
  - Hala Skaf

# Federated queries principle

- Linked data
  - RDF repositories can be queried in SPARQL via endpoints
  - data from one endpoint can make references to data from another endpoint
- Federated queries span several endpoints
  - the SPARQL engine is responsible for propagating the query and merging the results
  - good news: supported by SPARQL language + query engines
  - not so good news: performances :-)

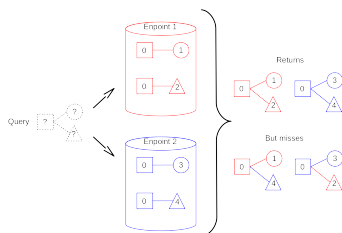


# Federated queries difficulty: endpoints not independent



Treating the endpoints independently fails when combining data

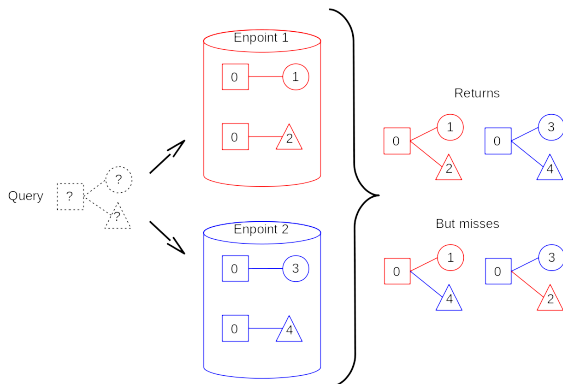
# Federated queries difficulty: endpoints can not be merged



## Merging the endpoints is not a viable solution either

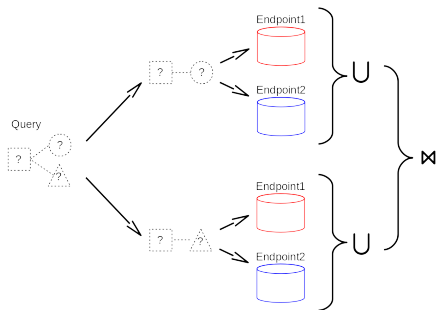
- each endpoint is potentially big
- merging
  - increases network traffic
  - increases storage consumption
  - decreases query answering performances
  - does not scale up to LOD

# Federated queries difficulty: queries must be decomposed



The query must be decomposed into fragments  
so that the endpoints are not treated as if they were disjoint

## Federated queries: q. fragmentation increases complexity



### Sending each fragment to each endpoint results in

- many subqueries for each endpoint (distant server overload)
- many unions and joins (local engine overload)
- potential transfer of large quantities of data before performing the joins, even if it ultimately few results (network overload)



# Processing federated queries: general approach

Decompose the query into fragments

The fewer fragments the better: reduces joins

For each fragment, select the relevant endpoints

The fewer endpoints the better (but no false negatives!): reduces joins

Determine the order for processing the fragments (q. planning)

Start by the most selectives, maybe parallelize, and potentially rewrite the subqueries

These three aspects can be inter-dependent

# Processing federated queries: existing solutions

- General low level SPARQL engines: Virtuoso, Fuseki,...
  - well adapted for serving 1 endpoint
  - naive approach for federated queries
- Dedicated high level engines (FedX, HiBISCuS,...)
  - front end to low-level engines
  - hot domain (in general)
  - still not up to Life Science queries