



UNIVERSITAS TARTUENSIS

Erik Jaaniso

# Automatic mapping of free texts to bioinformatics ontology terms

Master's Thesis

Supervisor: Hedi Peterson, PhD

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Ontology (philosophy) – what “things” exist

⇒ “things” represented by *concepts*, labelled by *terms*

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To better query, browse and share knowledge in a domain

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EDAM – simple bioinformatics ontology (3218 concepts)

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4 main sub-ontologies or *branches*:

- 👉 **topic** – “Data visualisation”, “Proteomics”
- 👉 **operation** – “Visualisation”, “Sequence alignment”
- 👉 **data** – “Image”, “Sequence”
- 👉 **format** – “PNG”, “FASTA”

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EDAM – simple bioinformatics ontology (3218 concepts)

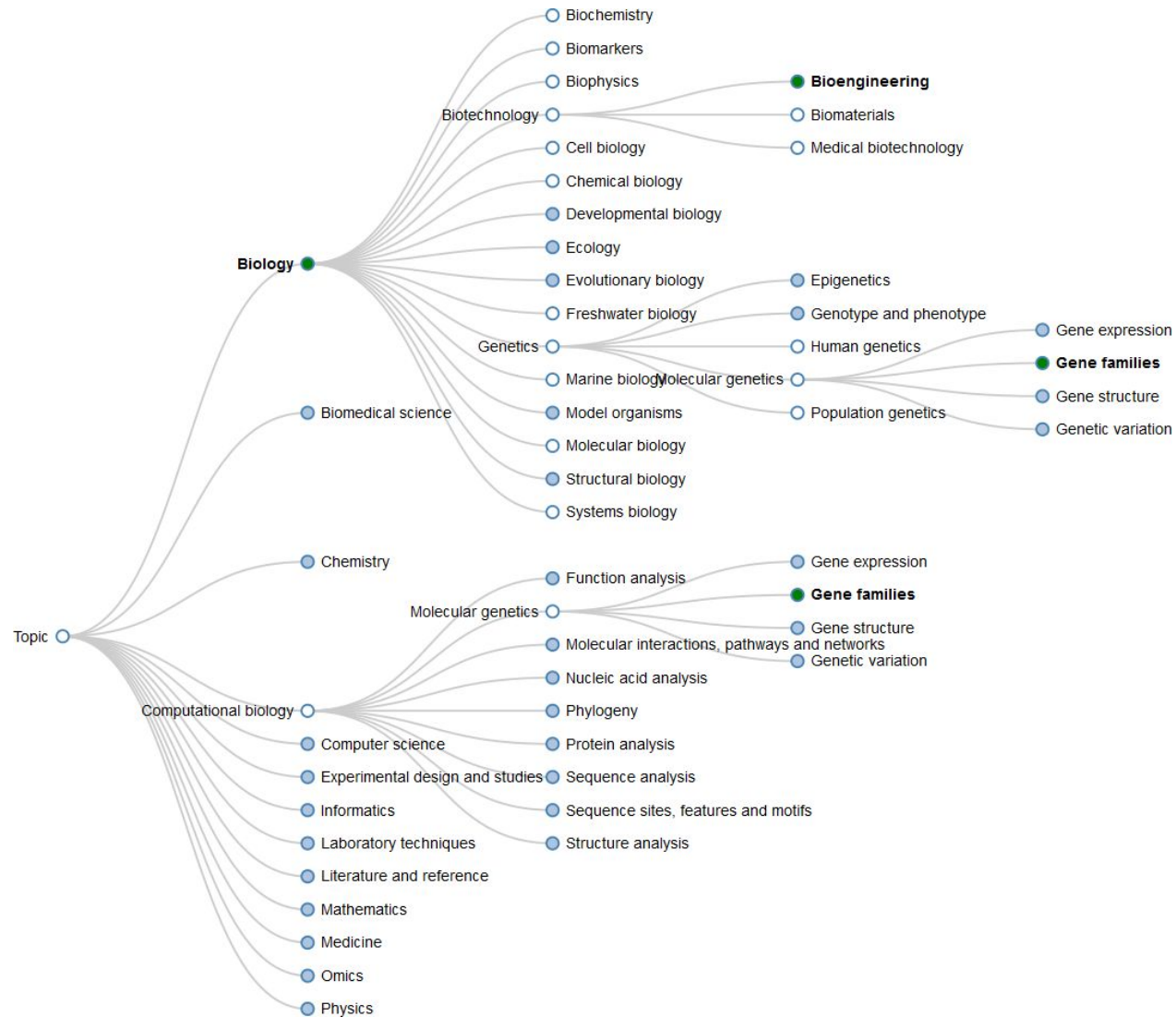
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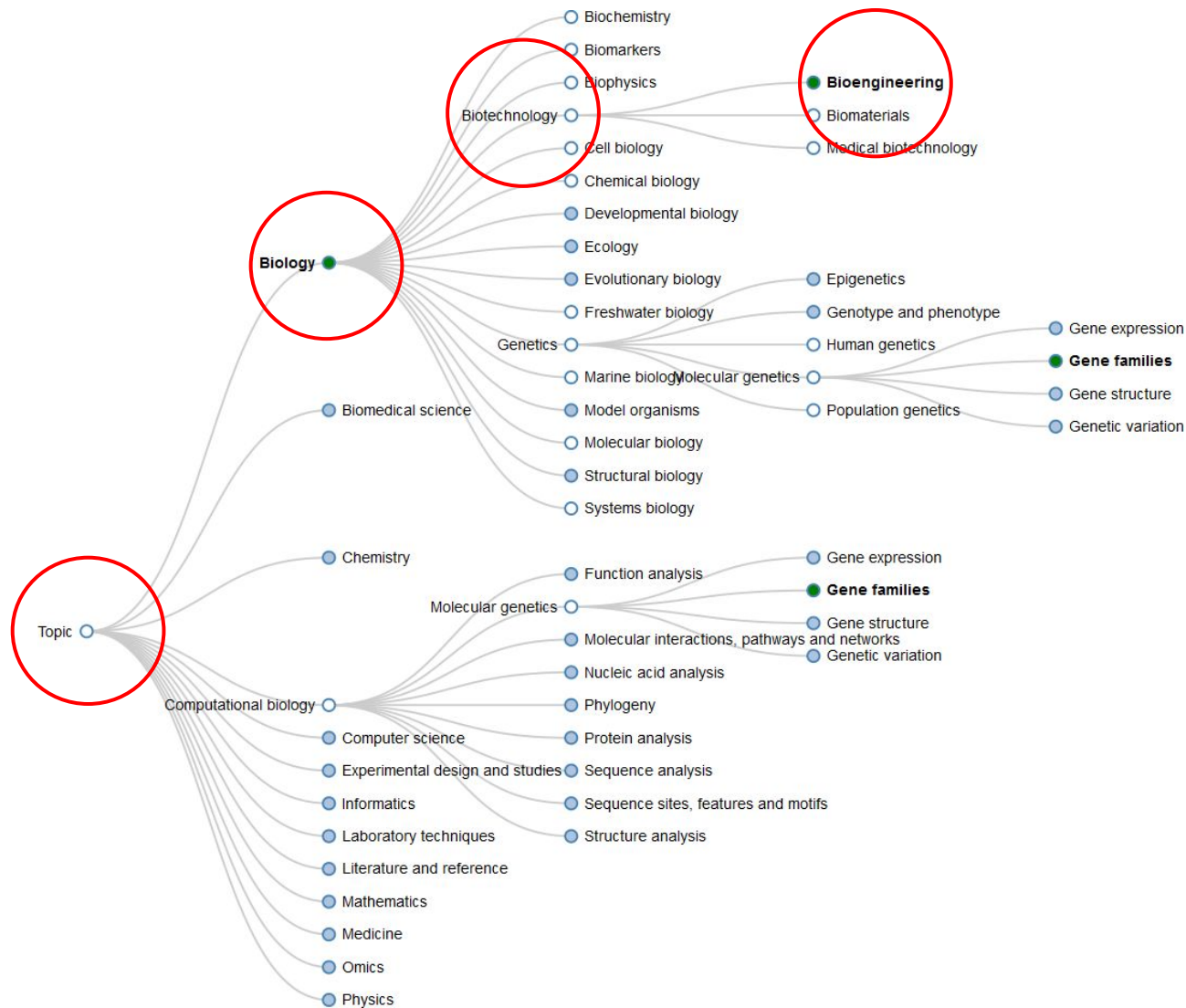
Concept ID is URI and it has *parts*:

- 👉 **label**/term – “Visualisation”
- 👉 **synonyms** (exact/narrow/broad) – “Rendering”
- 👉 **definition** & comment – “Visualise, plot or render (graphically) biomolecular data such as molecular sequences or structures.”

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[bio.tools](https://bio.tools) – ELIXIR Tools and Data Services Registry

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An entry is a collection of free texts (*query*), with *parts*:

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An entry is a collection of free texts (*query*), with *parts*:

👉 **name** – “WEBnma”

👉 **description** – “provides users with quick, automated computation and analysis of low-frequency normal modes for protein structures.”

👉 **publication** – [10.1186/s12859-014-0427-6](#),  
[10.1186/1471-2105-6-52](#)

👉 **homepage** – <http://apps.cbu.uib.no/webnma>

👉 **documentation** – <http://apps.cbu.uib.no/webnma/howto>

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- ☞ more “important” words matching

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- 👉 Publication parts extracted from XML, HTML or PDF

# Fetching homepage & docs

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<http://apps.cbu.uib.no/webnma>

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“About WEBnm@ provides users with quick, automated computation and analysis of low-frequency normal modes for protein structures. The computation performed through our server should help the user understand whether a given protein can undergo large amplitude movements, and ...”

<http://apps.cbu.uib.no/webnma/howto>



“HowTo Single Analysis Comparative Analysis Examples Single Analysis Comparative Analysis Other input examples Single Analysis Submit a structure file in the pdb format and our server will calculate the lowest frequency normal modes of your molecule. You will then be offered different types of ...”

# Pre-processing

“WEBnm@ provides users with quick, automated computation and analysis of low-frequency normal modes for protein structures.”

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## Punctuation removal and tokenisation

[webnm, provides, users, with, quick, automated, computation, and, analysis, of, lowfrequency, normal, modes, for, protein, structures]



## Stop words removal

[webnm, provid~~es~~, user~~s~~, quick, autom~~ated~~, comput~~ation~~, analysi~~s~~, lowfrequ~~ency~~, normal, mode~~s~~, protein, structur~~es~~]



## Stemming

[webnm, provid, user, quick, autom, comput, analysi, lowfrequ, normal, mode, protein, structur]



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[protein, structur, analysi]  $\Rightarrow$  [webnm, provid, user, quick, autom, comput, analysi, lowfrequ, normal, mode, protein, structur]  
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For each concept a match score, so annotations are ranked

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Manually tune algorithm parameters for best performance

# Mapping algorithm features

  Approximate matching

 Proximity matching

    Inverse document frequency

 Non-linear scaling of match count

  Bi-directional matching

 Combining parts' scores (weighted average)

  Stop words removal & Stemming



**“WEBnma” to “Protein flexibility and motion analysis”**

# “WEBnma”

## Tool

WEBnma

## description

[webnm, provid, user, quick, autom, comput, analysi, lowfrequ, normal, mode, protein, structur]

## publication title

[webnm, v20, web, server, servic, compar, protein, flexibl]

## publication abstract

[background, normal, mode, analysi, nma, us, elast, network, model, reliabl, costeffect, comput, method, characteris, protein, flexibl, extens, dynam, further, insight, dynamicsfunct, relationship, can, gain, compar, protein, motion, between, protein, homolog, function, classif, can, achiev, compar, normal, mode, obtain, from, set, evolutionari, relat, protein, result, we, have, develop, autom, tool, compar, nma, set, prealign, protein, structur, user, can, submit, sequenc, align, fasta, format, correspond, coordin, file, protein, data, bank, pdb, format, comput, normalis, squar, atom, fluctuat, atom, deform, energi, submit, structur, can, easili, compar, graph, provid, web, user, interfac, web, server, provid, pairwis, comparison, dynam, all, protein, includ, submit, set, us, two, measur, root, mean, squar, inner, product, bhattacharyya, coeffici, compar, analysi, ha, been, implement, our, web, server, nma, webnm, which, also, provid, recent, upgrad, function, nma, singl, protein, structur, includ, new, visualis, protein, motion, visualis, interresidu, correl, analysi, conform, chang, us, overlap, analysi, addit, programmat, access, webnm, now, avail, through, soapbas, web, servic, webnm, avail, http, appscbuuibno, webnma, conclus, webnm, v20, onlin, tool, offer, uniqu, capabl, compar, nma, multipl, protein, structur, along, conveni, web, interfac, power, comput, resourc, sever, method, mode, analys, webnm, facilit, assess, protein, flexibl, within, protein, famili, superfamili, analys, can, give, good, view, how, structur, move, how, flexibl, conserv, over, differ, structur]

# “Protein flexibility and motion analysis”

**Concept** [http://edamontology.org/operation\\_0244](http://edamontology.org/operation_0244)

## **label**

[protein, flexibl, motion, analysi]

## **definition**

[analys, flexibl, motion, protein, structur]

## **comment**

[us, concept, analysi, flexibl, rigid, residu, local, chain, deform, region, undergo, conform, chang, molecular, vibrat, fluctuat, dynam, domain, motion, other, largescal, structur, transit, protein, structur]

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## “WEBnma” to *operation* branch

TP	FP	FN	Concept	Query	Score
	Standardization and normalization (Normalization)		narrow_synonym	publication_title 10.1186/1471-2105-6-52	0.51%
Protein flexibility and motion analysis			label	publication_abstract 10.1186/s12859-014-0427-6	0.39%
Visualisation			label	doc	0.35%
	Protein modelling (Homology modelling)		exact_synonym	publication_abstract 10.1186/s12859-014-0427-6	0.28%
	Protein structure analysis		label	description	0.26%
		Structure visualisation			
		Protein structure comparison			

# “WEBnma” to *topic* branch

TP	FP	FN	Concept	Query	Score
Protein structure analysis (Protein structure)			exact_synonym	description	0.30%
Protein folds and structural domains (Protein folds)			narrow_synonym	publication_fulltext 10.1186/s12859-014-0427-6	0.28%
	Protein analysis (Proteins)		exact_synonym	publication_abstract 10.1186/s12859-014-0427-6	0.27%
	Molecular dynamics (Molecular motions)		broad_synonym	publication_fulltext 10.1186/s12859-014-0427-6	0.25%
	Small molecules (Peptides)		narrow_synonym	publication_mesh 10.1186/1471-2105-6-52 Peptides	0.25%

# “WEBnma” to *data* branch

TP	FP	FN	Concept	Query	Score
Protein structure			label	description	3.37%
	Structure alignment (protein) (Protein structure alignment)		exact_synonym	publication_abstract 10.1186/s12859-014-0427-6	2.77%
	Structure		label	doc	2.51%
	Protein flexibility or motion report (Protein flexibility or motion)		exact_synonym	publication_abstract 10.1186/s12859-014-0427-6	2.50%
	Protein structure report (Protein structural property)		exact_synonym	publication_fulltext 10.1186/s12859-014-0427-6	2.38%
		Plot			
		Sequence profile			
		Structure alignment			
		Structural profile			

## “WEBnma” to *format* branch

TP	FP	FN	Concept	Query	Score
	protein		label	publication_abstract 10.1186/s12859-014-0427-6	2.78%
	Format		label	doc	2.39%
	Protein secondary structure format		label	publication_abstract 10.1186/s12859-014-0427-6	1.42%
	Protein structure report (quality evaluation) format		label	publication_fulltext 10.1186/s12859-014-0427-6	1.39%
PDB			label	webpage	1.22%
		PDF			
		Textual format			
		FASTA-like (text)			



# Results

Top 5 & all branches: recall 27% ; average precision 16%

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- ☞ many false positives make sense
- ☞ flexibility (match short and long text, tune parameters)

# Conclusions

Manual annotation of thousands of bioinformatics tools

✓ very useful

✗ time-consuming and error-prone



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↕ reads in free text from metadata

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⇒ <https://github.com/edamontology/edammap>





# Future work

Development will continue in collaboration with curators

- Incremental updates
  - 👉 investigate effects of IDF
  - 👉 customise output to curators' needs
- Integrate with on-line bio.tools portal
- Annotate training materials (PPT, PDF)
- Discover new tools
- Extract new EDAM concepts

# “KEGGanim” results

## KEGGanim

KEGGanim is a web-based tool for visualizing experimental data in the context of biological pathways. KEGGanim produces animations or static images of KEGG pathways by overlaying public or user uploaded high-throughput data over handdrawn KEGG pathway maps.

### Publication 10.1093/bioinformatics/btm581

**Title:** KEGGanim: pathway animations for high-throughput data.

**MeSH terms:** Animals; Humans; Computational Biology; Gene Expression Regulation; Ventricular Remodeling; Computer Graphics; Software; Metabolic Networks and Pathways

**MOTIVATION:** Gene expression analysis with microarrays has become one of the most widely used high-throughput methods for gathering genome-wide functional data. Emerging -omics fields such as proteomics and interactomics introduce new information sources. With the rise of systems biology, researchers need to concentrate on entire complex pathways that guide individual genes and related processes. Bioinformatics methods are needed to link the existing knowledge about pathways with the growing amounts of experimental data.

**RESULTS:** We present KEGGanim, a novel web-based tool for visualizing experimental data in biological pathways. KEGGanim produces animations and images of KEGG pathways using public or user uploaded high-throughput data. Pathway members are coloured according to experimental measurements, and animated over experimental conditions. KEGGanim visualization highlights dynamic changes over conditions and allows the user to observe important modules and key genes that influence the pathway. The simple user interface of KEGGanim provides options for filtering genes and experimental conditions. KEGGanim may be used with public or private data for 14 organisms with a large collection of public microarray data readily available. Most common gene and protein identifiers and microarray probesets are accepted for visualization input. AVAILABILITY: <http://biit.cs.ut.ee/KEGGanim/>.

**Full text present** (9334 characters)

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