

School of Information and Library Science  
University of North Carolina at Chapel Hill  
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From *terminology* integration  
to *information* integration

*An example in the domain of genetics*



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# Outline

## ◆ Background

- Terminology integration:  
*The Unified Medical Language System*
- Information integration:  
*Genetics as an example*

## ◆ Applications

- GenesTrace
- BioMeKe



# Terminology integration

*The Unified Medical Language System*

# Motivation

- ◆ Started in 1986
- ◆ National Library of Medicine
- ◆ “Long-term R&D project”
- ◆ Complementary to IAIMS (Integrated Academic Information Management Systems)

«[...] the UMLS project is an effort to overcome two significant barriers to effective retrieval of machine-readable information.

- The first is the variety of ways the same concepts are expressed in different machine-readable sources and by different people.
- The second is the distribution of useful information among many disparate databases and systems.»



# Source Vocabularies

- ◆ 117 “sources”
- ◆ ~60 families of vocabularies
  - multiple translations (e.g., MeSH, ICPC, ICD-10)
  - variants (American-English equivalents, Australian extension/adaptation)
  - subsequent versions usually considered distinct families (ICD: 9-10; DSM: IIR-IV)
- ◆ Broad coverage of biomedicine
- ◆ Common presentation

# Biomedical terminologies

## ◆ Core vocabularies

- anatomy (UWDA, Neuronames)
- drugs (First DataBank, Micromedex)
- medical devices (UMD, SPN)

## ◆ Several perspectives

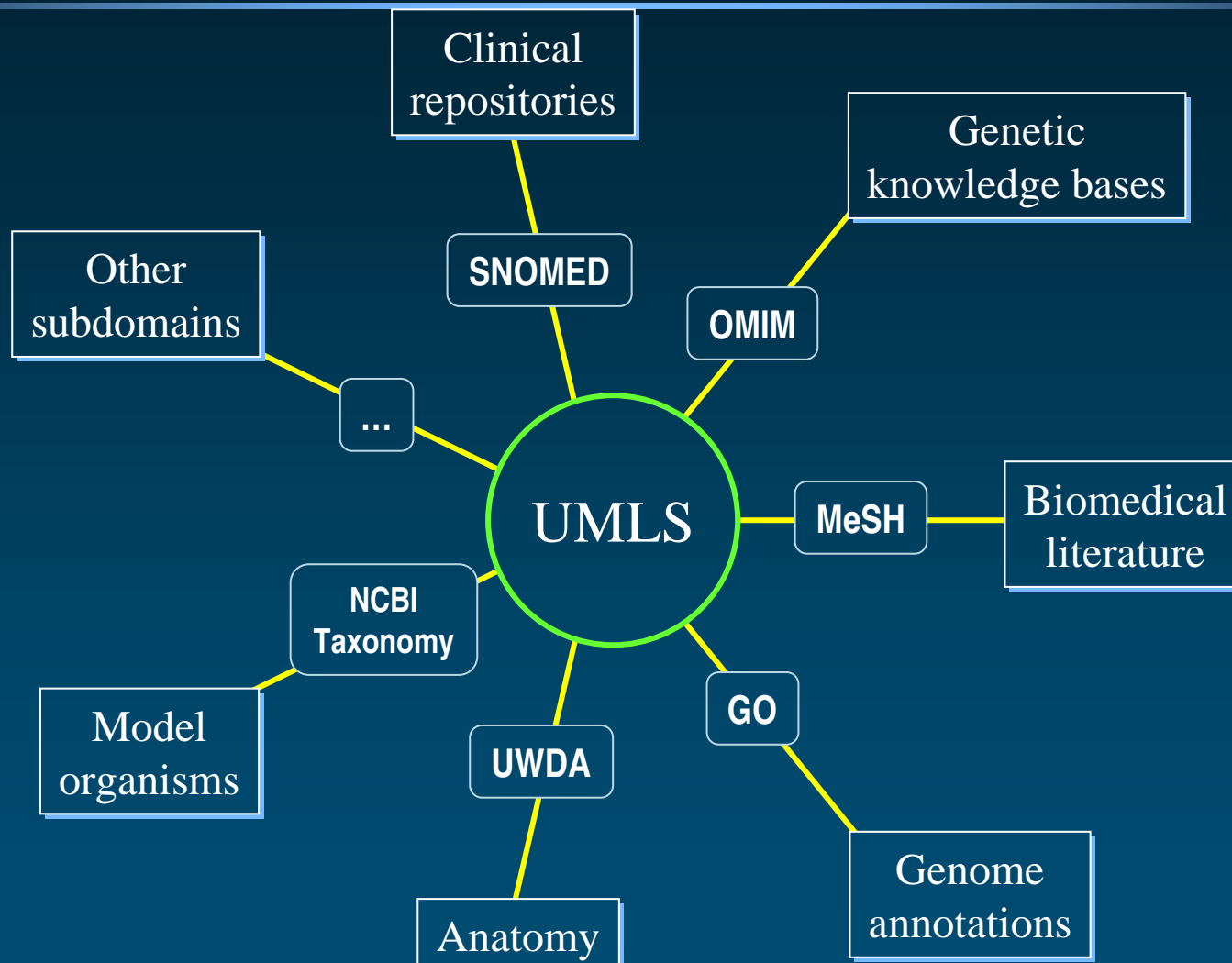
- clinical terms (SNOMED, CTV3)
- information sciences (MeSH, CRISP)
- administrative terminologies (ICD-9-CM, CPT-4)
- standards (HL7, LOINC)



# Biomedical terminologies (cont'd)

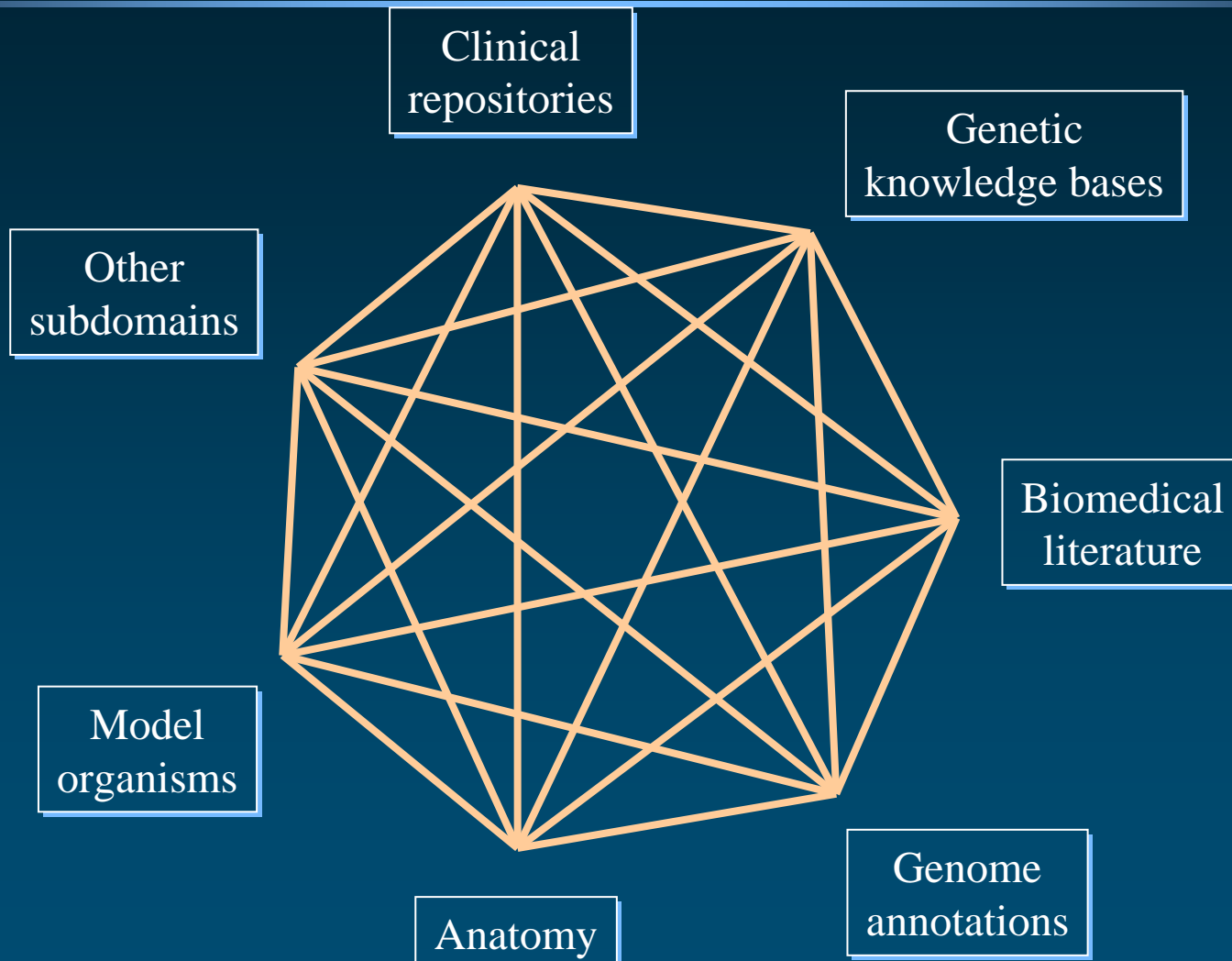
- ◆ Specialized vocabularies
  - nursing (NIC, NOC, NANDA, Omaha, PCDS)
  - dentistry (CDT)
  - oncology (PDQ)
  - psychiatry (DSM, APA)
  - adverse reactions (COSTART, WHO ART)
  - primary care (ICPC)
- ◆ Knowledge bases (AI/Rheum, DXplain, QMR)

# Integrating subdomains





# Integrating subdomains

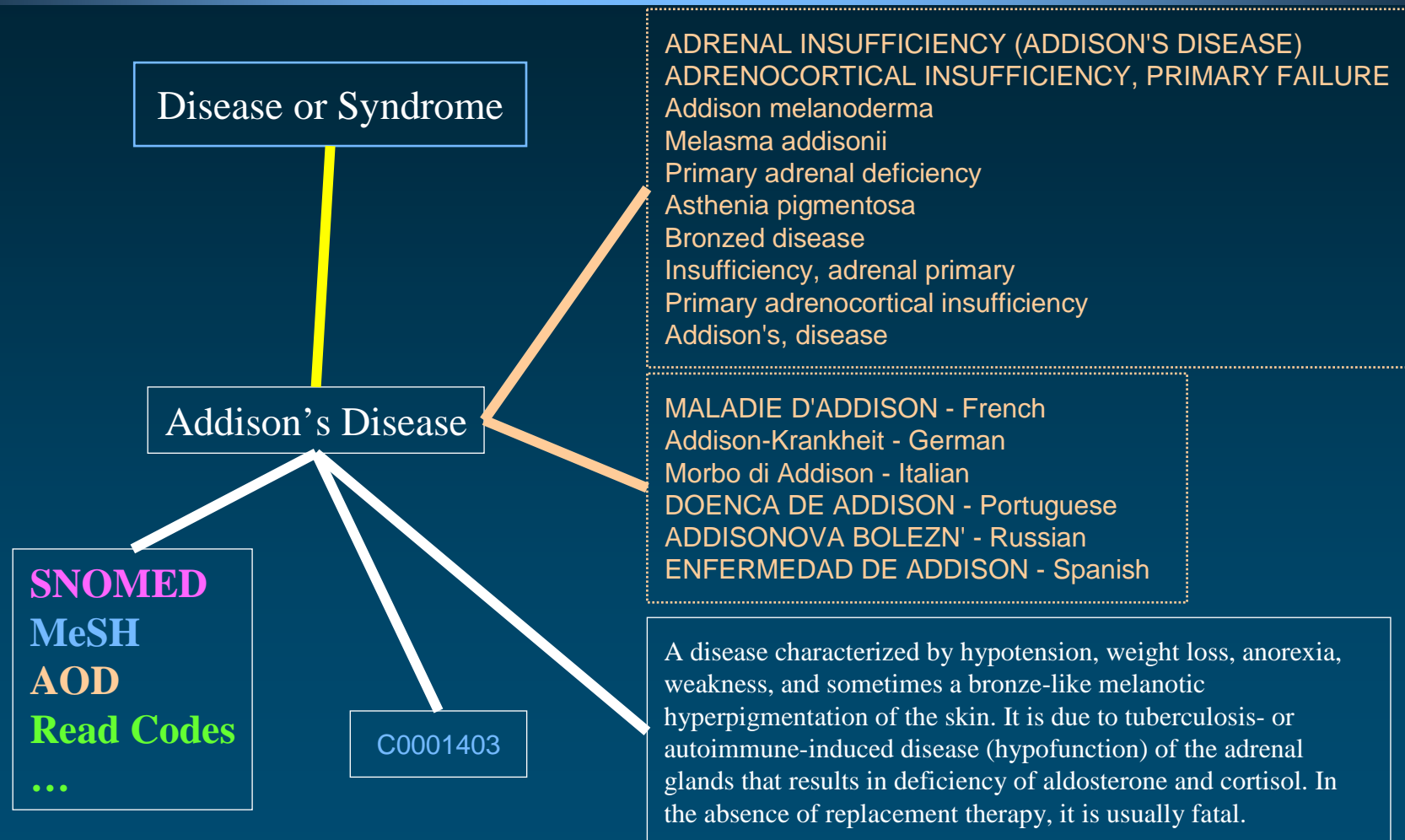


# UMLS: 3 components

- ◆ Metathesaurus
  - Concepts
  - Inter-concept relationships
- ◆ Semantic Network
  - Semantic types
  - Semantic network relationships
- ◆ Lexical resources
  - SPECIALIST Lexicon
  - Lexical tools



# Addison's Disease: Concept



# Metathesaurus Concepts (2003AA)

## ◆ Concept: Cluster of synonymous terms

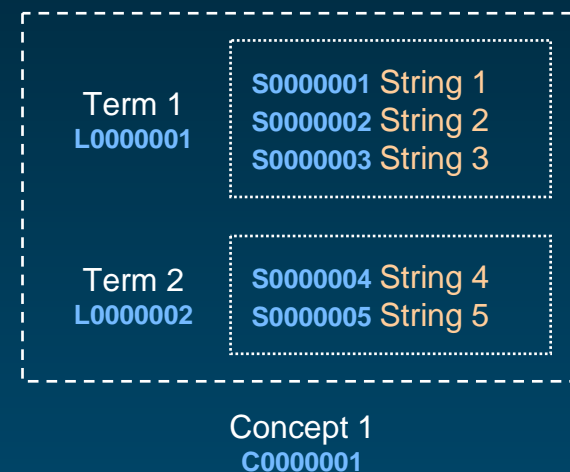
- ~875,000 concepts
- identified by a **CUI**

## ◆ Term: Set of lexical variants

- ~1.8 M terms
- identified by a **LUI**

## ◆ String: Concept name

- ~2.1 M strings
- identified by a **SUI**



# Cluster of synonymous terms

Concept  
C0001621

|                  |  |
|------------------|--|
| Term<br>L0001621 | <p>S0011232 <i>Adrenal Gland Diseases</i></p> <p>S0011231 Adrenal Gland Disease</p> <p>S0000441 Disease of adrenal gland [...]</p> <p>S0481705 Disease of adrenal gland, NOS</p> <p>S0220090 Disease, adrenal gland</p> <p>S0044801 Gland Disease, Adrenal</p> |
| Term<br>L0041793 | <p>S0860744 <i>Disorder of adrenal gland, unspecified</i></p> <p>S0217833 Unspecified disorder of adrenal glands</p>   |
| Term<br>L0161347 | <p>S0225481 <i>ADRENAL DISORDER</i> [...]</p> <p>S0627685 DISORDER ADRENAL (NOS)</p>   |
| Term<br>L0181041 | <p>S0632950 <i>Disorder of adrenal gland</i> [...]</p> <p>S0354509 Adrenal Gland Disorders</p>   |
| Term<br>L0368399 | <p>S0586222 <i>Adrenal disease</i> [...]</p> <p>S0466921 ADRENAL DISEASE, NOS</p>  |
| Term<br>L1279026 | <p>S1520972 <i>Nebennierenkrankheiten</i> GER</p>  |
| Term<br>L0162317 | <p>S0226798 <i>SURRENALE, MALADIES</i> FRE [...]</p>   |



# Metathesaurus Relationships

- ◆ Symbolic relations: ~5 M pairs of concepts
  - ◆ Statistical relations : ~6.5 M pairs of concepts  
(co-occurring concepts)
- 
- ◆ Categorization: Relationships between concepts and semantic types from the Semantic Network

# Symbolic relations

## ◆ Relation

MRREL

- Pair of concept identifiers
- Type
- Attribute (if any)
- List of sources (for type and attribute)

## ◆ Semantics of the relationship: defined by its *type* [and *attribute*]



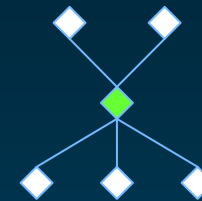
# Symbolic relationships Type

## ◆ Hierarchical

- Parent / Child
- Broader / Narrower than

PAR / CHD

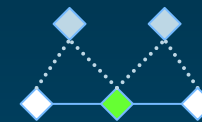
RB / RN



## ◆ Derived from hierarchies

- Siblings (children of parents)

SIB



## ◆ Associative

- Other

RO



## ◆ Various flavors of near-synonymy

- Similar
- Source asserted synonymy
- Possible synonymy

RL

SY

RQ

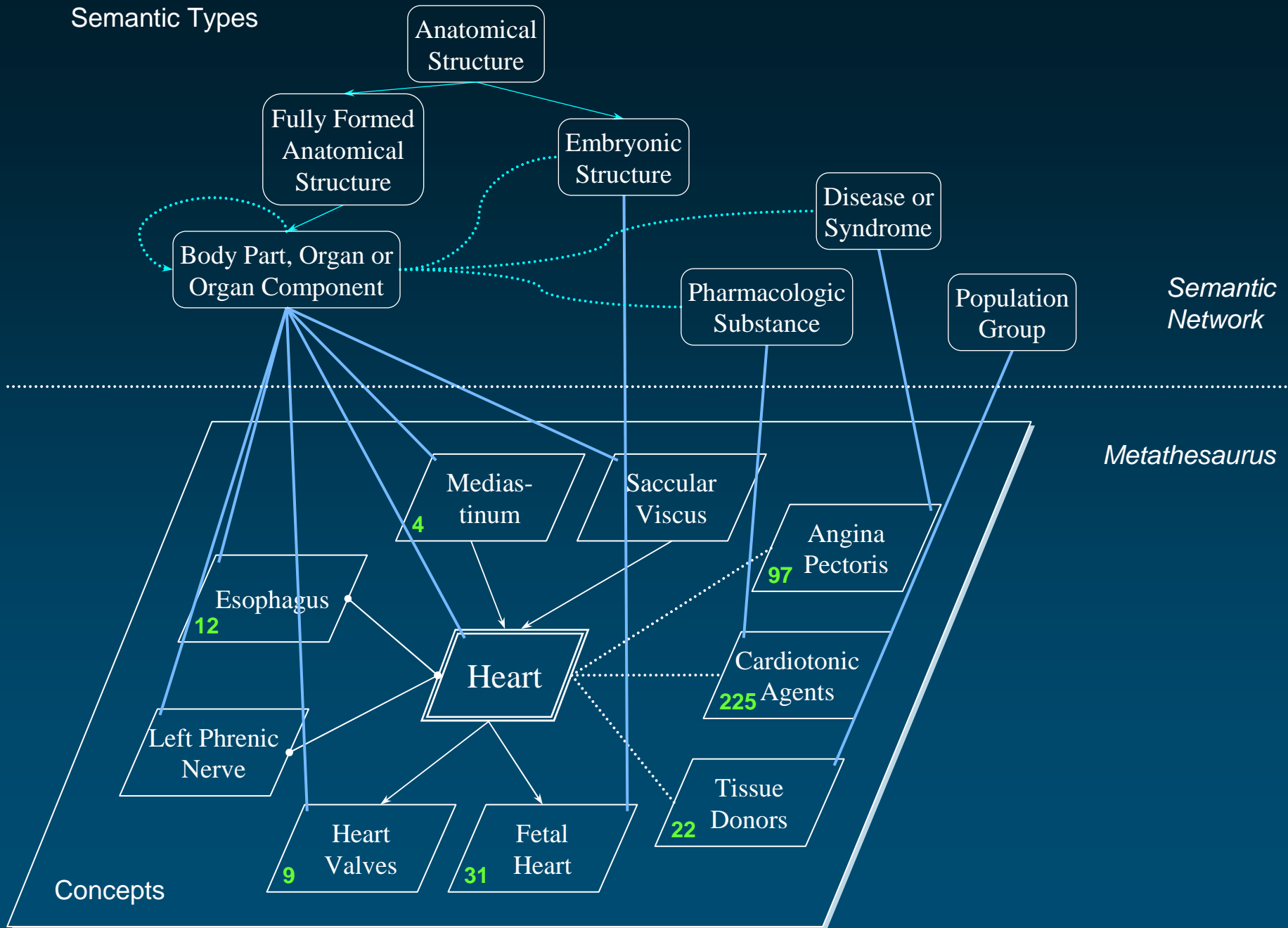




# Symbolic relationships Attribute

- ◆ Hierarchical
  - isa (is-a-kind-of)
  - part-of
- ◆ Associative
  - location-of
  - caused-by
  - treats
  - ...
- ◆ Cross-references (mapping)

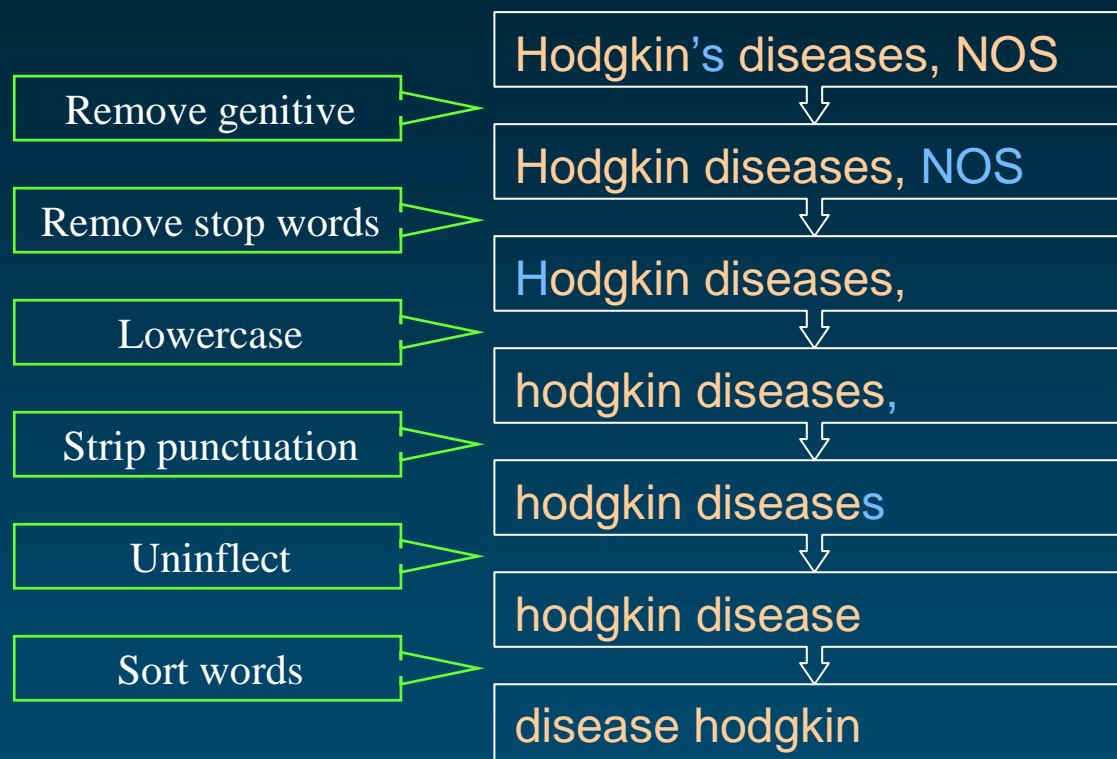
## Semantic Types



# Lexical tools

- ◆ To manage lexical variation in biomedical terminologies
- ◆ Major tools
  - Normalization
  - Indexes
  - Lexical Variant Generation program (lvg)
- ◆ Based on the SPECIALIST Lexicon
- ◆ Used by noun phrase extractors, search engines

# Normalization



# Normalization: Example

Hodgkin Disease  
HODGKINS DISEASE  
Hodgkin's Disease  
Disease, Hodgkin's  
Hodgkin's, disease  
HODGKIN'S DISEASE  
Hodgkin's disease  
Hodgkins Disease  
Hodgkin's disease NOS  
Hodgkin's disease, NOS  
Disease, Hodgkins  
Diseases, Hodgkins  
Hodgkins Diseases  
Hodgkins disease  
hodgkin's disease  
Disease, Hodgkin

normalize

disease hodgkin



# Information integration

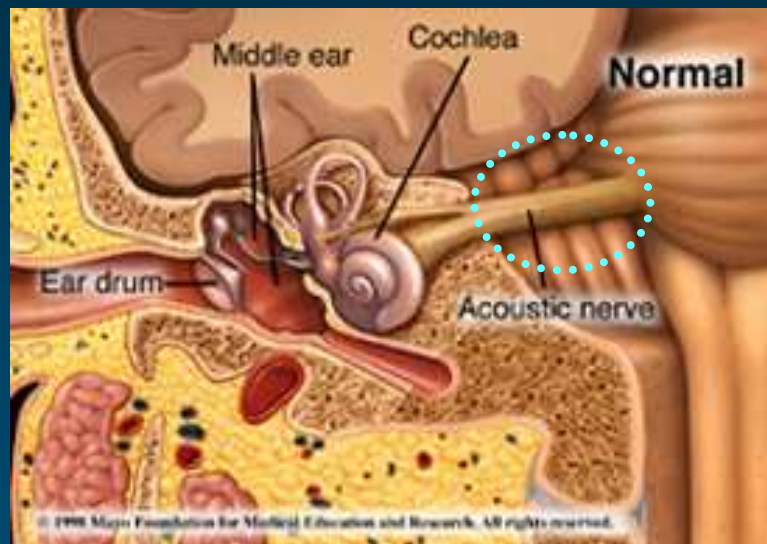
*Genetics as an example*

# NF2 Gene, protein, and disease

**Neurofibromatosis 2** is an autosomal dominant disease characterized by tumors called **schwannomas** involving the acoustic nerve, as well as other features. The disorder is caused by mutations of the **NF2** gene resulting in absence or inactivation of the protein product. The protein product of NF2 is commonly called **merlin** (but also **neurofibromin 2** and **schwannomin**) and functions as a tumor suppressor.



# Schwannoma (acoustic neuroma)



<http://www.mayoclinic.com>



{UMLS\_2003} UMLS@ Semantic Navigator [2.10] - Netscape

{UMLS\_2003} UMLS@ Semantic Navigator ...

### Siblings

#### Disorders

- Cerebellopontine Angle Acoustic Neuroma ✖
- Diffuse neurofibroma ✖
- Melanocytic Vestibular Schwannoma ✖
- Neurofibromatosis (nonmalignant) ✖
- Neurofibromatosis 1 ✖
- neurofibromatosis 1 and 2 (NF1 and NF2) ✖
- Neurofibromatosis 3 ✖
- Neurofibromatosis type 3 ✖
- NEUROFIBROMATOSIS TYPE IV, OF RICCARDI ✖
- Neuroma, Acoustic, Unilateral ✖
- Segmental neurofibromatosis ✖

(11 siblings)

[direct children and narrower concepts of direct parents and broader concepts]

```
graph TD; A[Tumor of acoustic vestibular nerve] --> E[Neurofibromatosis 2]; B[Benign neoplasm of cranial nerves] --> E; C[Neoplastic Syndromes, Hereditary] --> E; D[Skin tumor of neural c] --> E; E --> F([Neuroma, Acoustic, Bilateral]); E --> G([Schwannoma, Acoustic, Bilateral]);
```

### Other Related Concepts

#### Anatomy

- Acoustic Nerve ✖

#### Chemicals & Drugs

- Neurofibromin 2 ✖

#### Disorders

- Familial Acoustic Neuromas ✖
- Neoplasm of uncertain behavior NOS ✖
- Neurofibromatoses ✖
- Neurofibromatosis ✖

#### Neurofibromatosis

- Nerve Sheath Tumors [4] ✖
- Nervous System Neoplasms [6] ✖
- Neurilemmoma [35] ✖
- Neurofibromatosis 1 [38] ✖
- Neuroma, Acoustic [26] ✖
- Peripheral Nervous System Diseases [3] ✖
- Peripheral Nervous System Neoplasms [6] ✖
- Postoperative Complications [9] ✖
- Retinal Diseases [6] ✖
- Skin Neoplasms [9] ✖

### Neurofibromatosis 2

BCI

Start again Apply new parameters

Restrict to vocabulary: Show all

Highlight vocabulary: Nothing

UMLS data: UMLS\_2003

Type of hierarchical rel: ☒ All ☐ Parent/Child only ☐ Broader/Narrower only

#### Similar Concepts

(none)

#### Allegedly Synonyms

- Neurofibromatosis (neoplasm) ✖

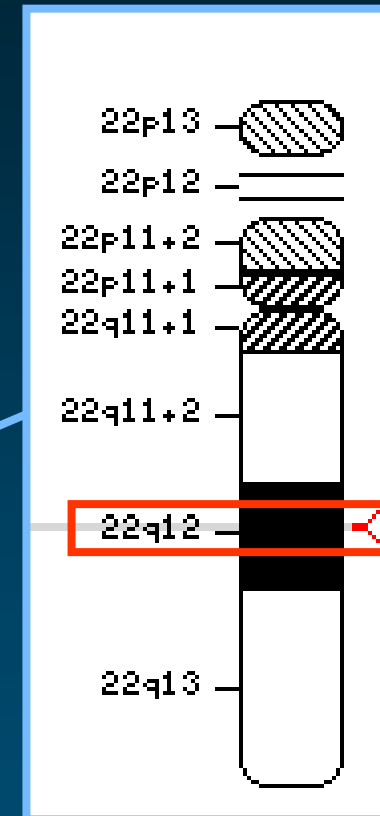
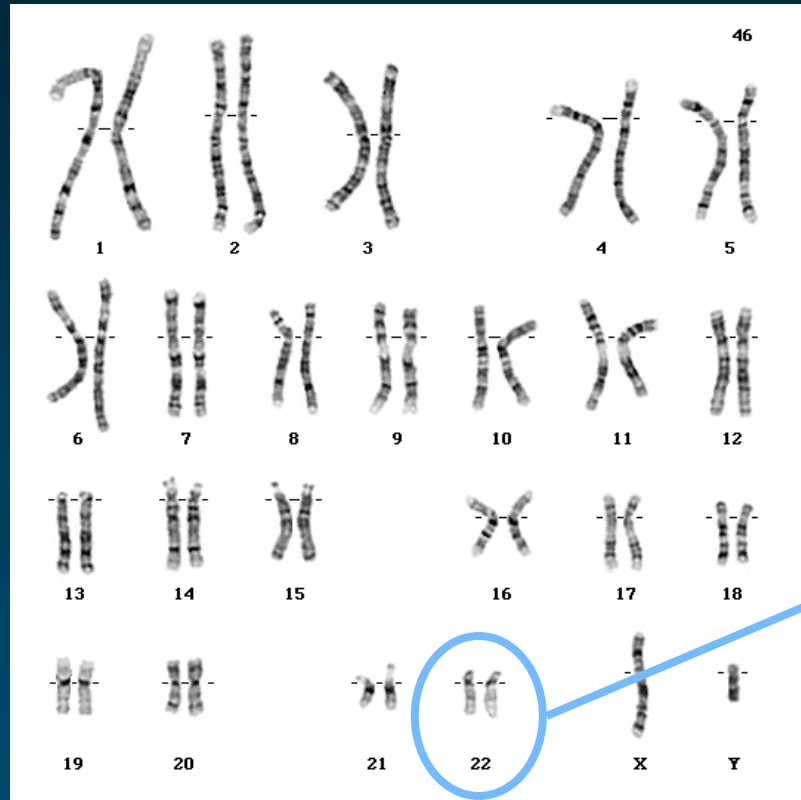
#### Closest MeSH Terms

##### Main Headings

- Neurofibromatosis 2

##### Subheadings

# NF2 gene



<http://staff.washington.edu/timk/cyto/human/>

<http://www.ncbi.nlm.nih.gov/mapview/>



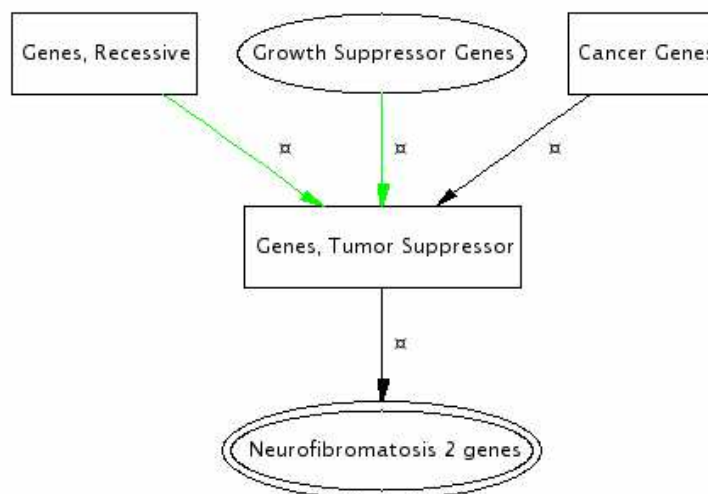
## Siblings

### Chemicals & Drugs

- ADAM11 protein, human ✕
- DLG5 protein, human ✕
- DPM3 protein, human ✕
- HCCS-1 protein, human ✕
- hssh3bp1 protein, human ✕
- HUGL protein, human ✕
- LAPSER1 protein, human ✕
- mitochondria proteolipid-like protein, human ✕
- MRG protein, human ✕
- p53 gene/protein ✕
- PLAGL1 protein, human ✕
- RARRES3 protein, human ✕
- SEZ6L protein, human ✕
- TES protein, human ✕

### Genes & Molecular Sequences

- APC Gene ✕
- BAX Gene ✕
- brca gene ✕
- CDH1 gene ✕
- CHES1 Gene ✕
- cyclin-dependent kinase inhibitor 2A ✕



## Other Related Concepts

### Chemicals & Drugs

- Neurofibromin 2 ✕

### Disorders

- Neurofibromatosis 2 ✕

(2 other related concepts)

- Chromosome Deletion [7] ✕
- Ependymoma [4] ✕
- Glioma [4] ✕
- Loss of Heterozygosity [7] ✕
- Meningeal Neoplasms [25] ✕
- Meningioma [30] ✕
- mesothelioma <1> [4] ✕
- Neoplasms [4] ✕
- Neurilemmoma [20] ✕
- Neurofibromatosis 2 [64] ✕
- Neuroma, Acoustic [5] ✕
- Spinal Cord Neoplasms [3] ✕

BCI

Neurofibromatosis 2 genes

LEGEND \*

Start again

Apply new parameters

Restrict to vocabulary: Show all

Highlight vocabulary: Nothing

UMLS data: UMLS\_2003

Type of hierarchical rel: ☒ All ☐ Parent/Child only ☐ Broader/Narrower only

### Similar Concepts

(none)

### Allegedly Synonyms

(none)

### Closest MeSH Terms

#### Main Headings

- Genes, Neurofibromatosis 2

#### Subheadings

# Merlin

## ◆ Synonyms

- Neurofibromin 2
- Schwannomin
- Schwannomerlin
- Neurofibromatosis-2

## ◆ 10 isoforms

## ◆ Annotations

- Negative regulation of cell proliferation
- Cytoskeleton
- Plasma membrane





{UMLS\_2003} UMLS® Semantic Navigator [2.10] - Netscape

{UMLS\_2003} UMLS® Semantic Navigator ...

### Siblings

#### Chemicals & Drugs

- (LA)12 peptide ✕
- (methyl)ammonium uptake carrier, Corynebacterium ✕
- 120-kDa hemocyte-specific membrane protein, flesh fly ✕
- 15a protein, Aedes aegypti ✕
- 22.6-kDa antigen, Schistosoma japonicum ✕
- 36-kDa vesicular integral membrane protein ✕
- 38L protein ✕
- 5-lipoxygenase-activated protein ✕
- 59 kDa dystrophin-associated protein ✕
- A-1 antigen ✕
- A-kinase anchor protein 149 ✕
- A-kinase anchor protein 15 ✕
- A-kinase anchor protein 200 ✕
- A-kinase anchor protein KL ✕
- A14.5L protein ✕
- A15 protein ✕
- ABC-me protein ✕
- ABU-1 protein, C. elegans ✕
- AcfB protein ✕
- ACR3 protein ✕

```

graph TD
    A[proteins by body part] --> B[Membrane Proteins]
    B --> C[Neurofibromin 2]
    D([Growth Suppressor Proteins]) --> C
    E[Cell Cycle Proteins] --> F[Tumor Suppressor Proteins]
    G[Neoplasm Proteins] --> F
    F --> C
    C --> H([merlin, Drosophila])
  
```

### Other Related Concepts

#### Disorders

- Neurofibromatosis 2 ✕

#### Genes & Molecular Sequences

- Neurofibromatosis 2 genes ✕

(2 other related concepts)

### Co-occurring Concepts

#### Anatomy

- Arachnoid [1] ✕
- Cell Membrane [1] ✕
- Cerebellum [1] ✕
- Chromosomes, Human, Pair 22 [1] ✕
- Cytoplasm [1] ✕
- Cytoskeleton [2] ✕
- Microfilaments [1] ✕
- Purkinje Cells [1] ✕
- Schwann Cells [1] ✕
- Stem Cells [1] ✕

**BCI** **Neurofibromin 2** **LEGEND \***

Start again Apply new parameters

Restrict to vocabulary: Show all

Highlight vocabulary: Nothing

UMLS data: UMLS\_2003

Type of hierarchical rel.: ☒ All ☐ Parent/Child only ☐ Broader/Narrower only

Similar Concepts (none)

Allegedly Synonyms (none)

Closest MeSH Terms

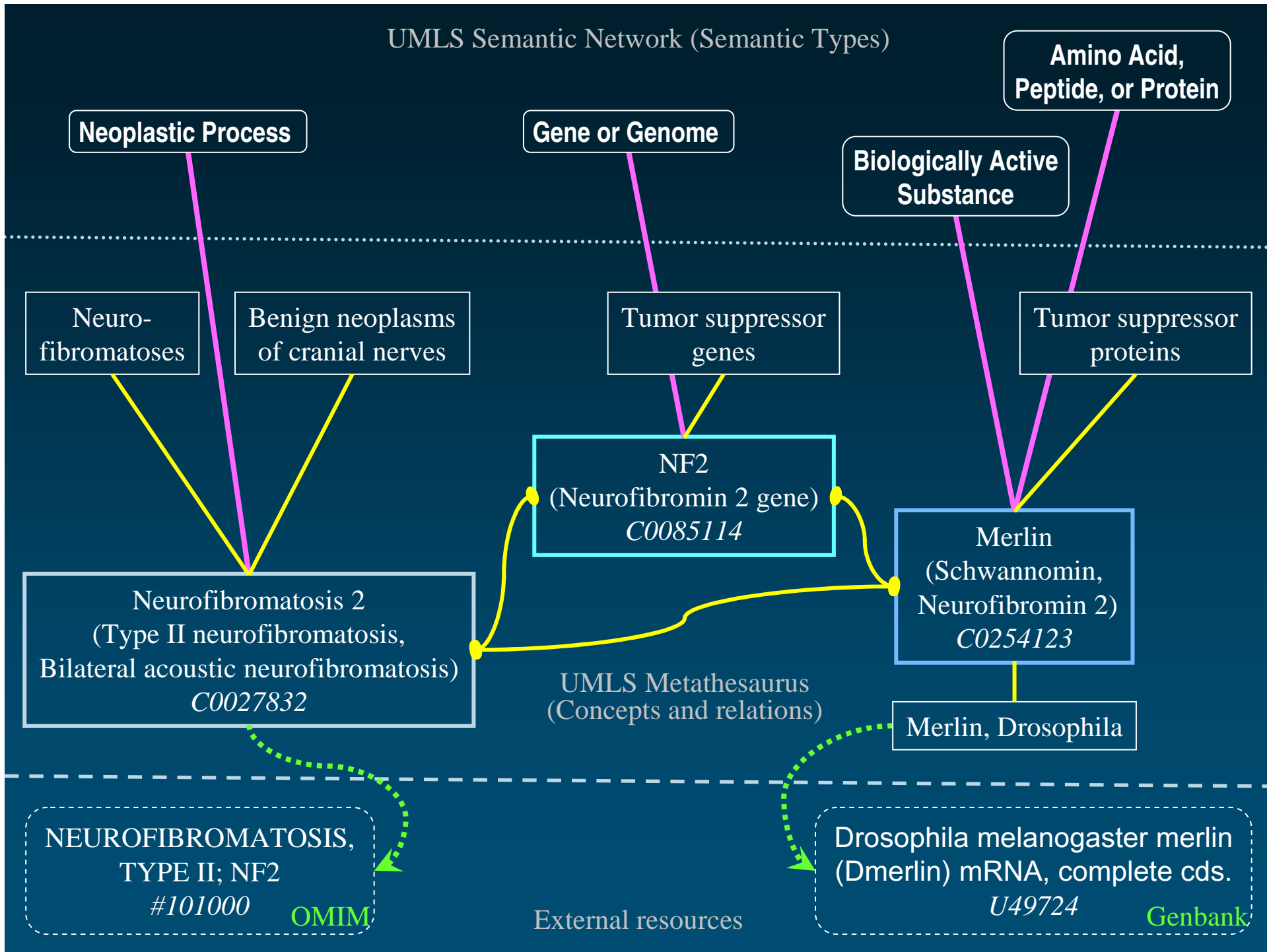
Main Headings

- Neurofibromin 2

Subheadings

Document: Done (2.844 secs)

# UMLS Semantic Network (Semantic Types)



# Limitations

- ◆ Genes not systematically represented
  - Most gene products and diseases are
- ◆ Gene/Gene product-Disease relations
  - Not systematically represented
  - Not explicitly represented (e.g., co-occurrence)
- ◆ Cross-references not systematically represented
- ◆ Naming conventions (genes)

# Applications (1)

*GenesTrace*<sup>TM</sup>

*I.N. Sarkar & al.  
Columbia University*

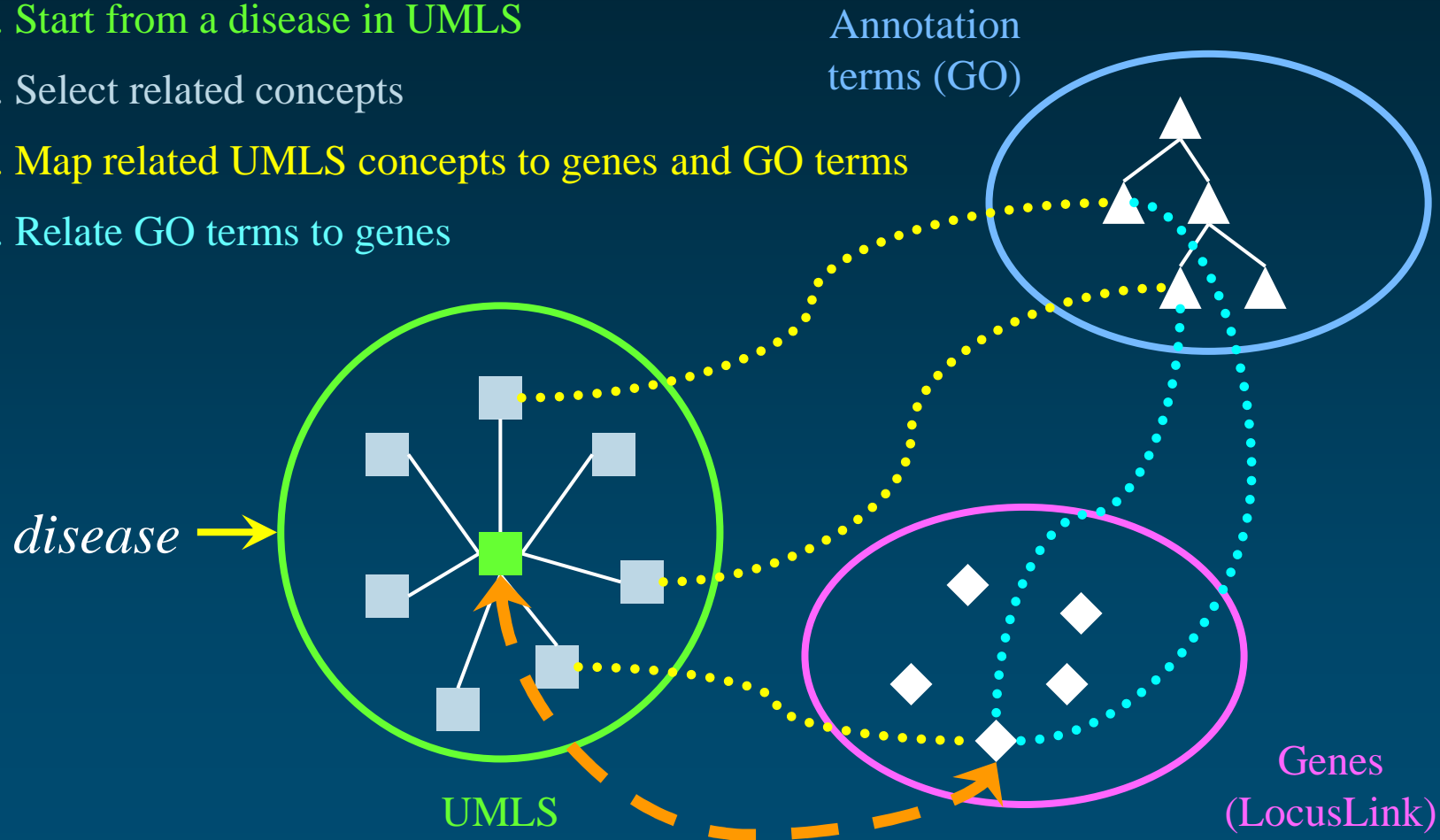


# Objectives

- ◆ Relate diseases to genes through structured, integrated terminologies
- ◆ Biological Knowledge Discovery

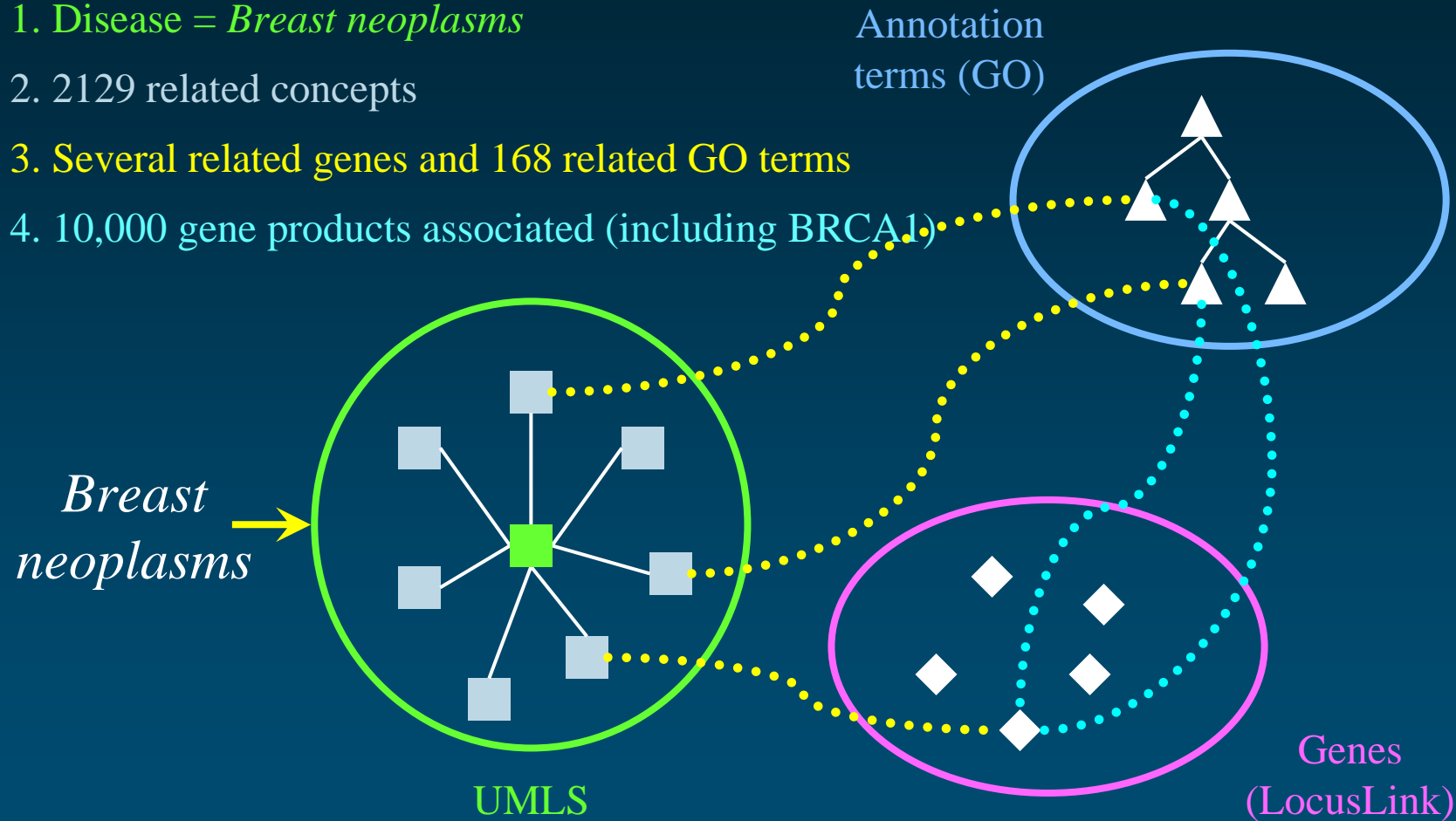
# Resources and Methods

1. Start from a disease in UMLS
2. Select related concepts
3. Map related UMLS concepts to genes and GO terms
4. Relate GO terms to genes



# Validation Breast cancer – BRCA1 association

1. Disease = *Breast neoplasms*
2. 2129 related concepts
3. Several related genes and 168 related GO terms
4. 10,000 gene products associated (including BRCA1)



# Limitations

## ◆ Noise

- Too many non-specific GO terms associated (e.g., *nucleus*)
- Too many genes associated

## ◆ But

- Promising preliminary results
- Room for refinement



# References

- ◆ I. Sarkar, M. Cantor, O. Bodenreider, Y. Lussier. GenesTrace™: Biological knowledge discovery via structured terminology – A feasibility study. Submitted to MEDINFO 2004.

# Applications (2)

*BioMeKe*

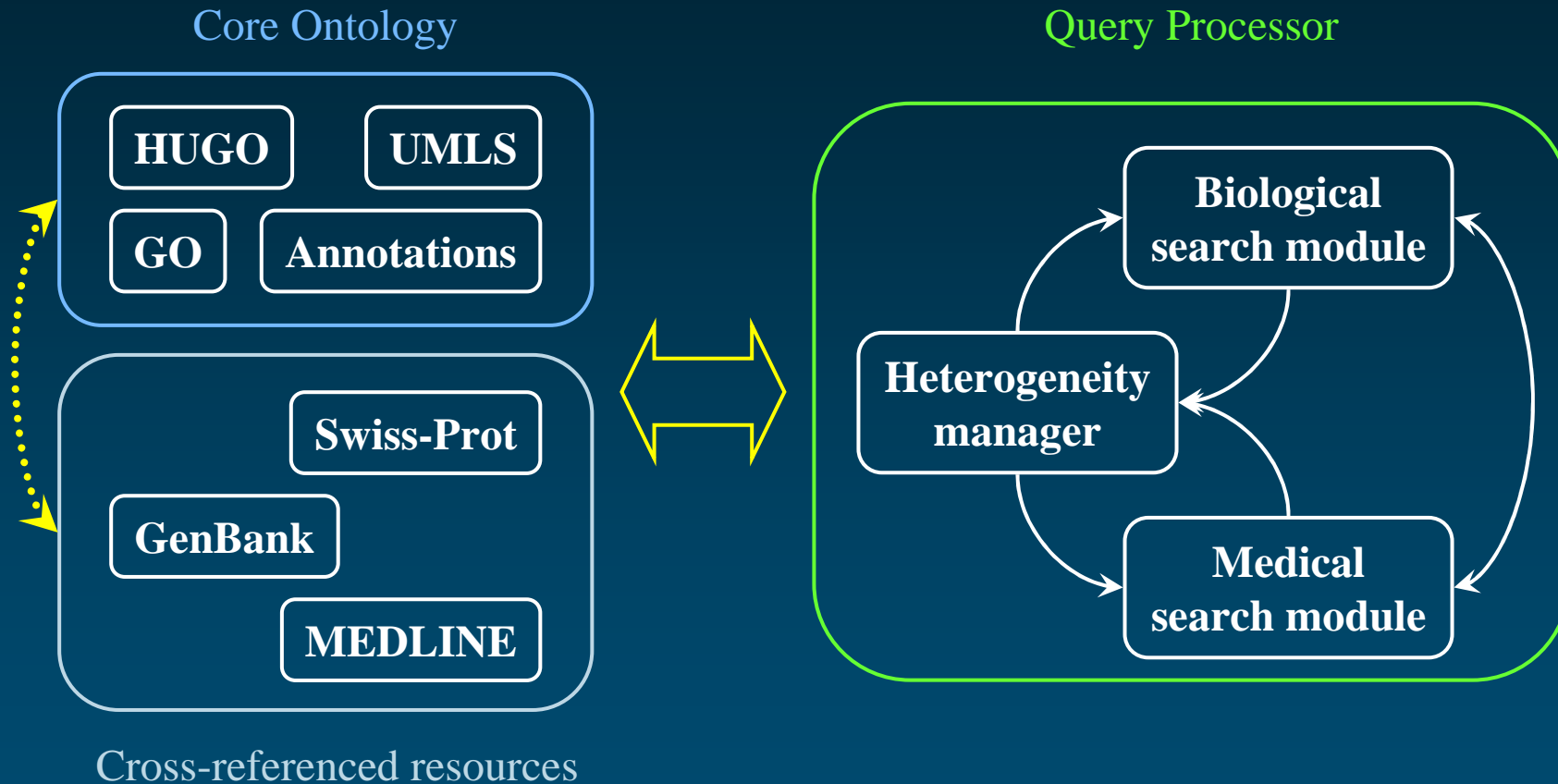
*G. Marquet & al.*

*LIM, Univ. Rennes, France*

# Objectives

- ◆ To develop a knowledge warehouse for transcriptome analysis (liver diseases)
- ◆ Semantic interoperability
  - Medical knowledge bases
  - Molecular biology and genetics knowledge bases

# Components

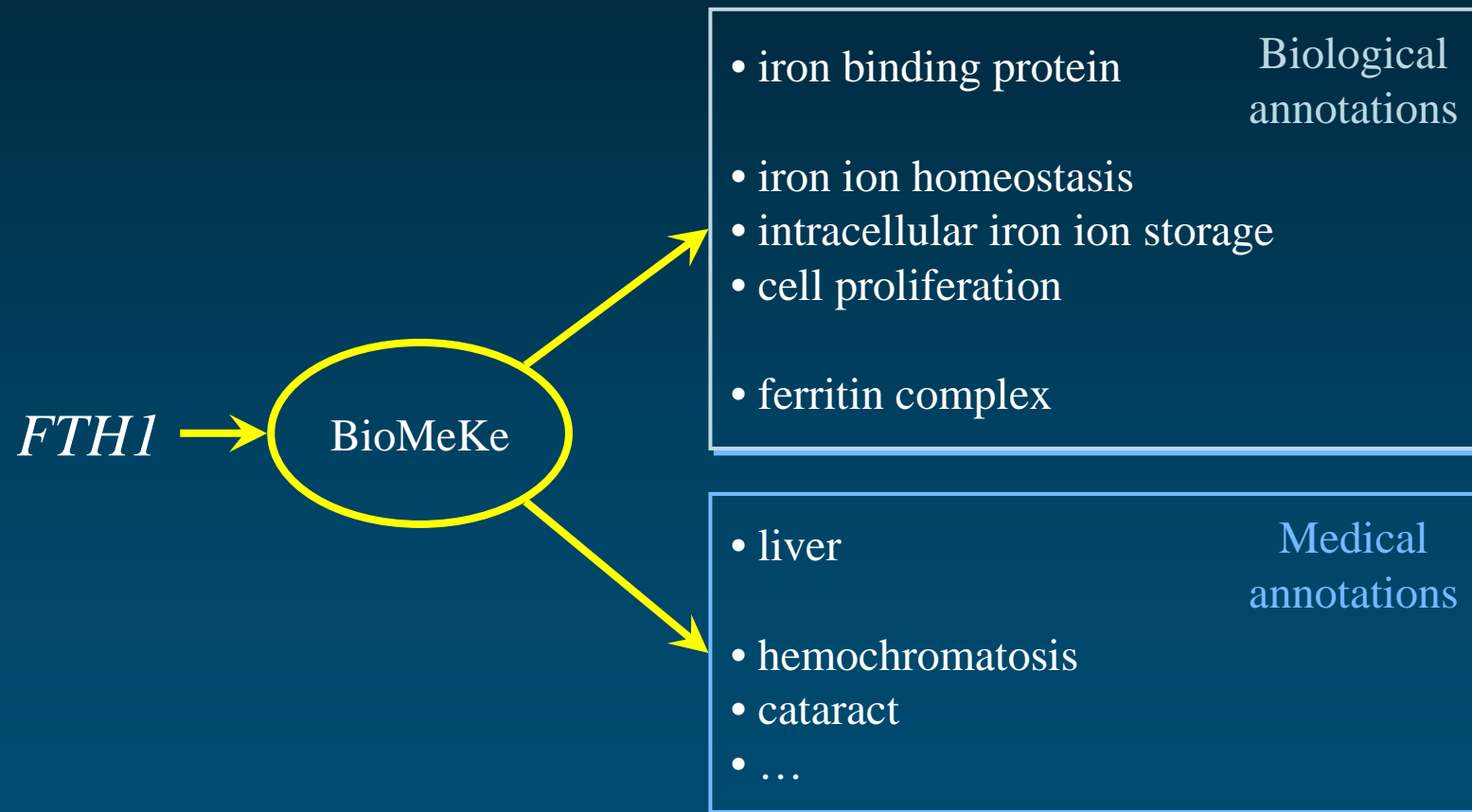




# Example

- ◆ Input: *ferritin, heavy polypedpide 1*
- ◆ Mapping to biological resources
  - Not found in the Core ontology
  - Official name *Ferritin heavy chain* found through Xref
- ◆ Biological information obtained from GOA
- ◆ Mapping to medical resources
  - Not found in UMLS
  - Synonym *Ferritin H* found through Xref (Swiss-Prot)
- ◆ Medical information obtained through co-occurrence of MeSH index terms in MEDLINE

# Results



# Limitations

- ◆ Non-formal ontologies
  - Knowledge may be inconsistently represented
  - Knowledge may be implicit (mappings)
- ◆ Partial automation
  - User input required to select databanks, reformulate queries
- ◆ Semantic integration
  - Naming issues
  - Mappings must be updated regularly

# References

- ◆ G. Marquet, C. Golbreich, A. Burgun.  
From an ontology-based search engine towards a  
more flexible integration for medical and  
biological information.  
Semantic Integration Workshop, ISWC 2003,  
Sanibel, Florida, October 20, 2003;61-67.

# Conclusions

# Conclusions

- ◆ Terminology integration provides some degree of information integration
- ◆ Most terminologies and the cross-referenced databases are readily available
- ◆ Lack of consistent representation

# References

## ◆ UMLS

[umlsinfo.nlm.nih.gov](http://umlsinfo.nlm.nih.gov)

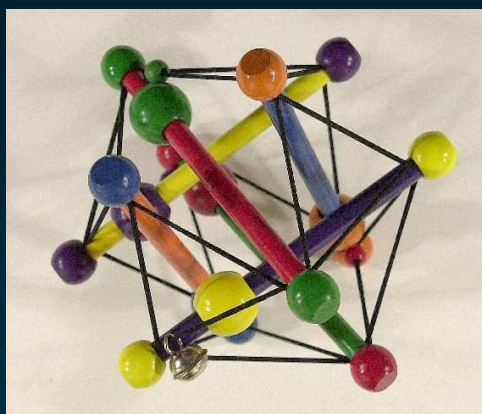
## ◆ UMLS browser

- Knowledge Source Server: [umlsks.nlm.nih.gov](http://umlsks.nlm.nih.gov)
- Semantic Navigator: KSS, under UMLSKS resources
- (free, but UMLS license required)

## ◆ UMLS and information integration

- O. Bodenreider. The UMLS: Integrating biomedical terminology. *Nucl. Acids Res.* 2004;32(1) (*in press*)





# Medical Ontology Research

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Web: [etbsun2.nlm.nih.gov:8000](http://etbsun2.nlm.nih.gov:8000)



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