

Manufacturing Engineering  
Laboratory



NIST  
National Institute of  
Standards and Technology

July 24, 2006

# Ontologies for Data Integration: *The Unified Medical Language System*



*Olivier Bodenreider*

Lister Hill National Center  
for Biomedical Communications  
Bethesda, Maryland - USA

# Outline

- ◆ From terminology integration to information integration  
*Unified Medical Language System (UMLS)*
- ◆ UMLS in use:  
Mapping across terminologies

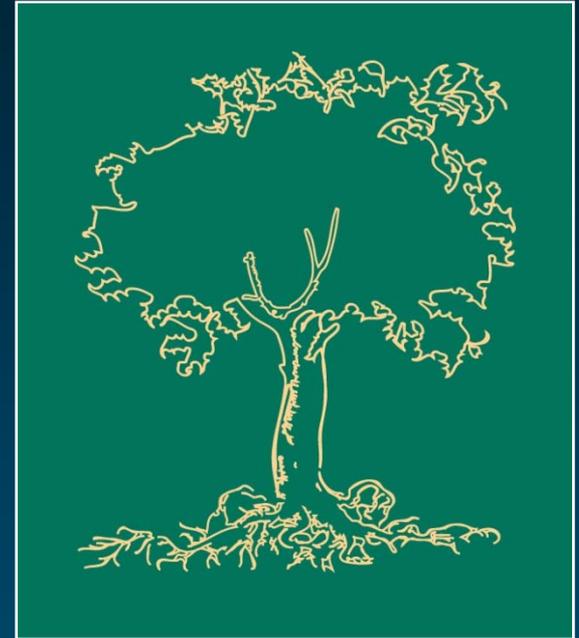


From terminology integration  
to information integration

*Unified Medical Language System (UMLS)*

# What does UMLS stand for?

- ◆ Unified
- ◆ Medical
- ◆ Language
- ◆ System



UMLS<sup>®</sup>  
Unified Medical Language System<sup>®</sup>  
UMLS Metathesaurus<sup>®</sup>



# Motivation

- ◆ Started in 1986
- ◆ National Library of Medicine
- ◆ “Long-term R&D project”

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

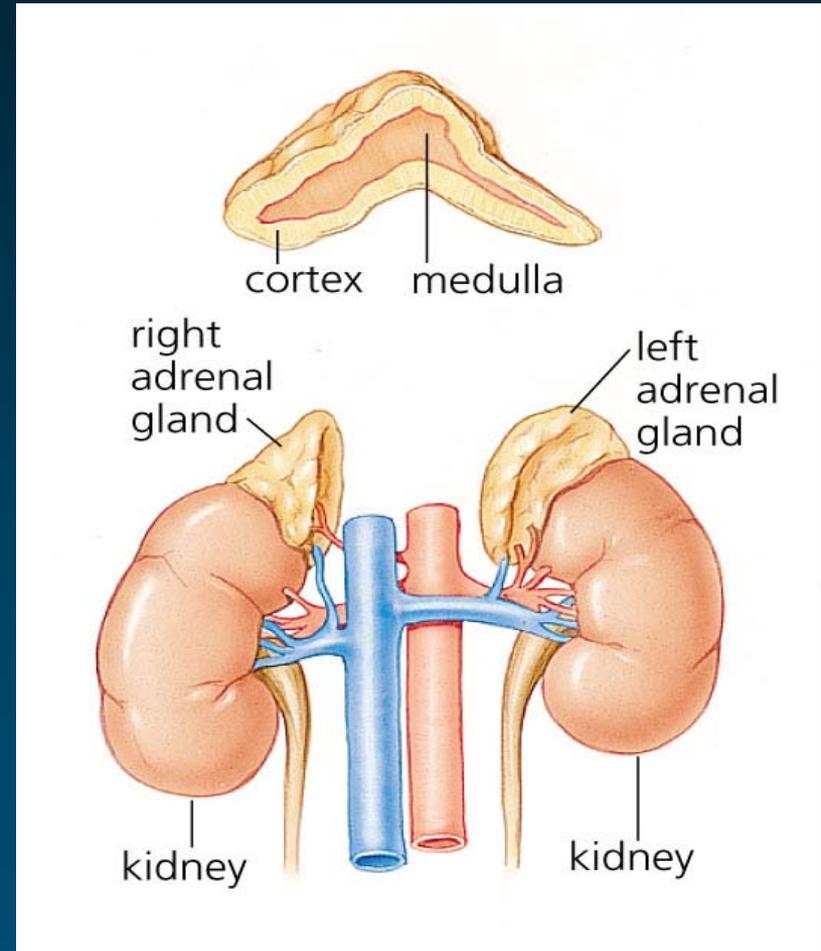
- The first is **the variety of ways the same concepts are expressed** in different machine-readable sources and by different people.
- The second is the **distribution** of useful information among many disparate databases and systems.»



Overview through an example

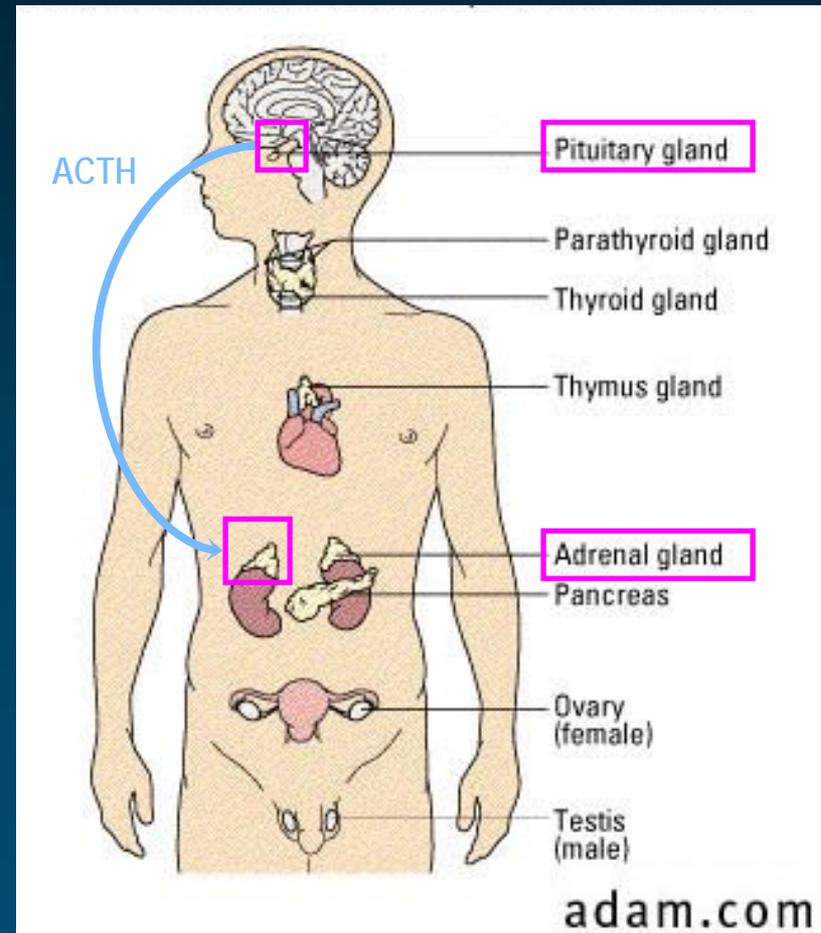
# Addison's disease

- ◆ Addison's disease is a rare endocrine disorder
- ◆ Addison's disease occurs when the adrenal glands do not produce enough of the hormone cortisol
- ◆ For this reason, the disease is sometimes called chronic adrenal insufficiency, or hypocortisolism



# Adrenal insufficiency Clinical variants

- ◆ Primary / Secondary
  - Primary: lesion of the adrenal glands themselves
  - Secondary: inadequate secretion of ACTH by the pituitary gland
- ◆ Acute / Chronic
- ◆ Isolated / Polyendocrine deficiency syndrome



# Addison's disease: Symptoms

- ◆ Fatigue
- ◆ Weakness
- ◆ Low blood pressure
- ◆ Pigmentation of the skin (exposed and non-exposed parts of the body)
- ◆ ...

# AD in medical vocabularies

## ◆ Synonyms: different terms

- Addisonian syndrome
  - Bronzed disease
  - Addison melanoderma
  - Asthenia pigmentosa
  - Primary adrenal deficiency
  - Primary adrenal insufficiency
  - Primary adrenocortical insufficiency
  - Chronic adrenocortical insufficiency
- )} eponym  
)} symptoms  
)} clinical variants

## ◆ Contexts: different hierarchies



# Organize terms

- ◆ Synonymous terms clustered into a concept
- ◆ Preferred term
- ◆ Unique identifier (CUI)

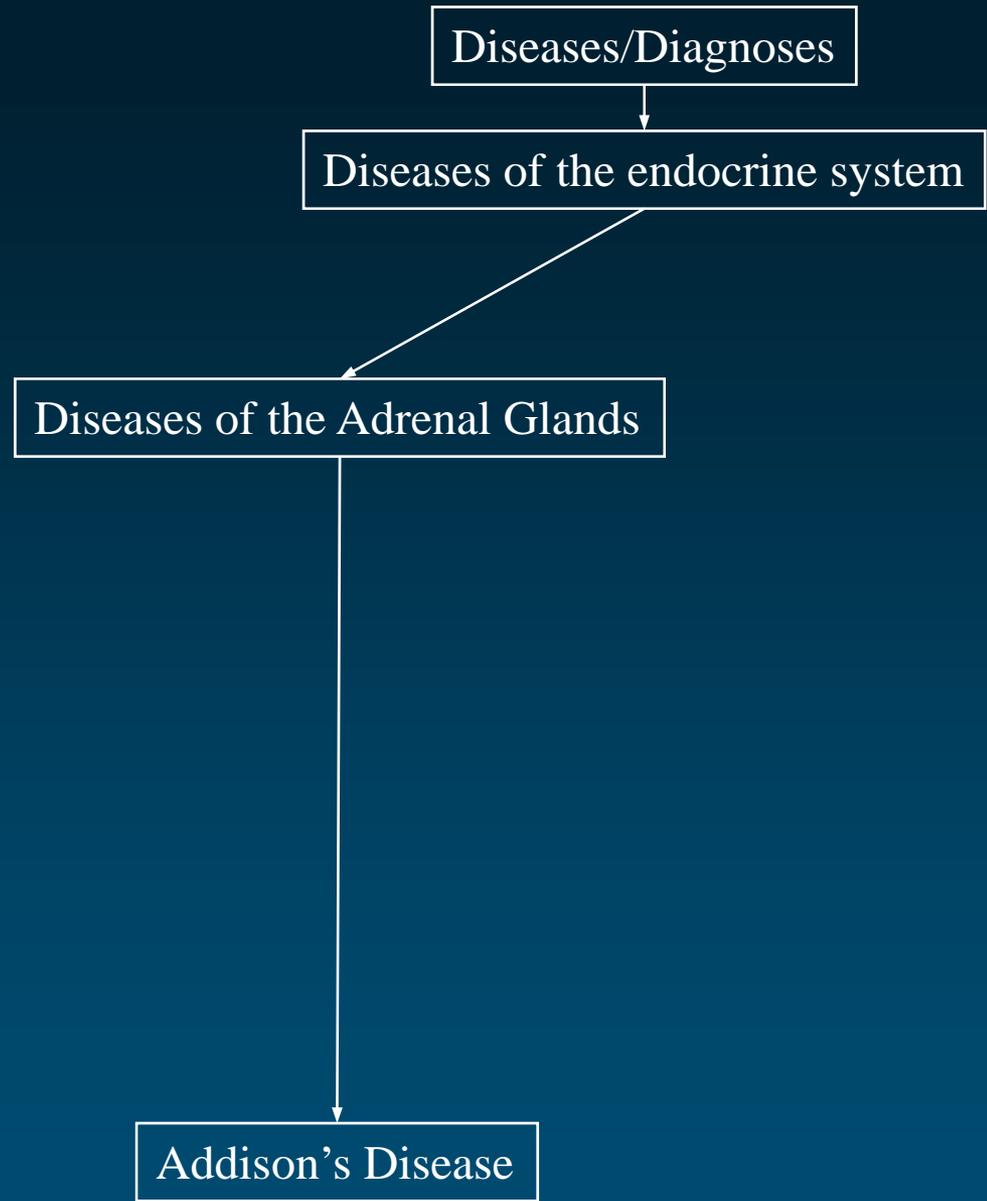
Addison Disease	MeSH	D000224
Primary hypoadrenalism	MedDRA	10036696
Primary adrenocortical insufficiency	ICD-10	E27.1
Addison's disease (disorder)	SNOMED CT	363732003

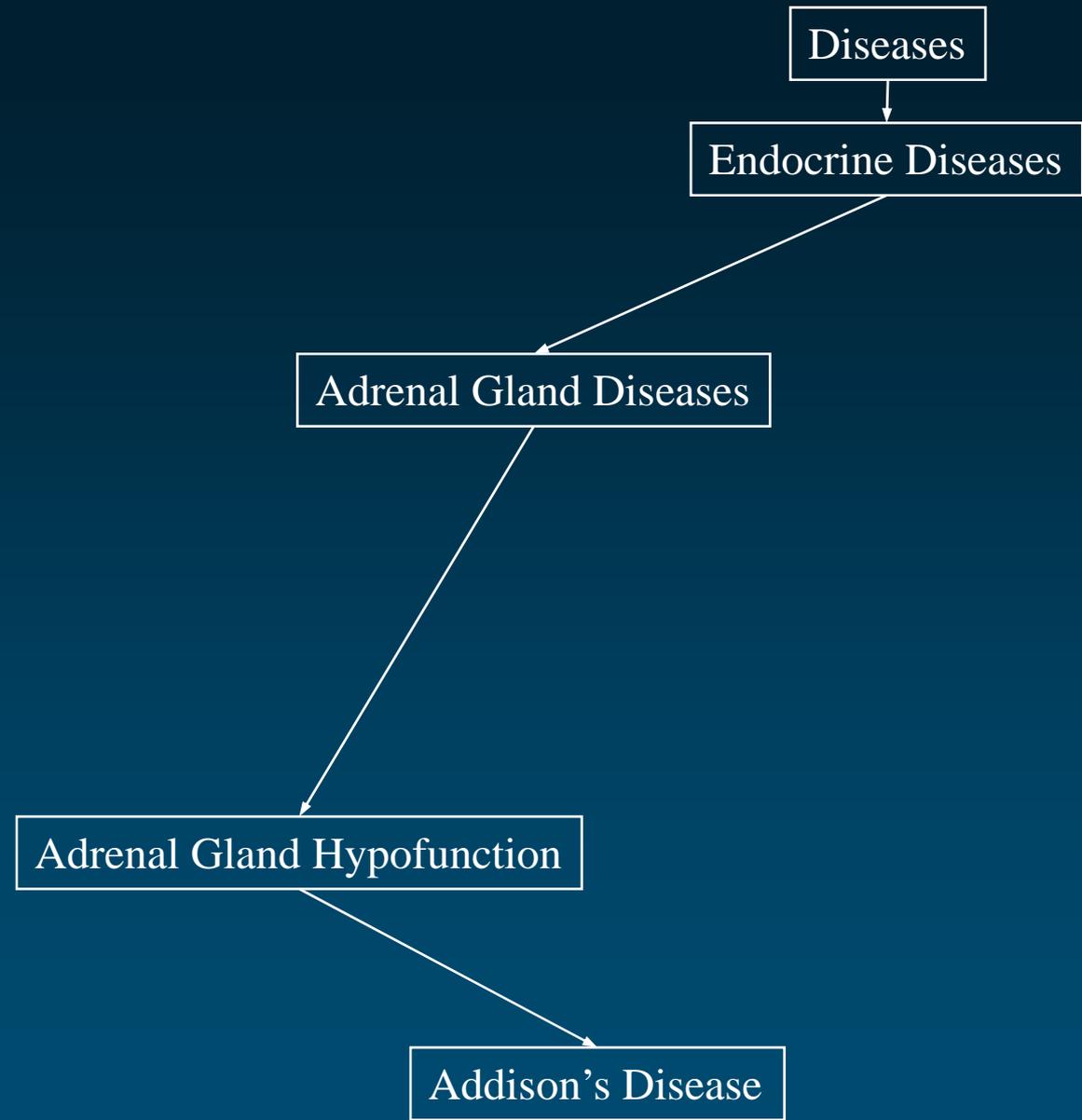
C0001403

Addison's disease

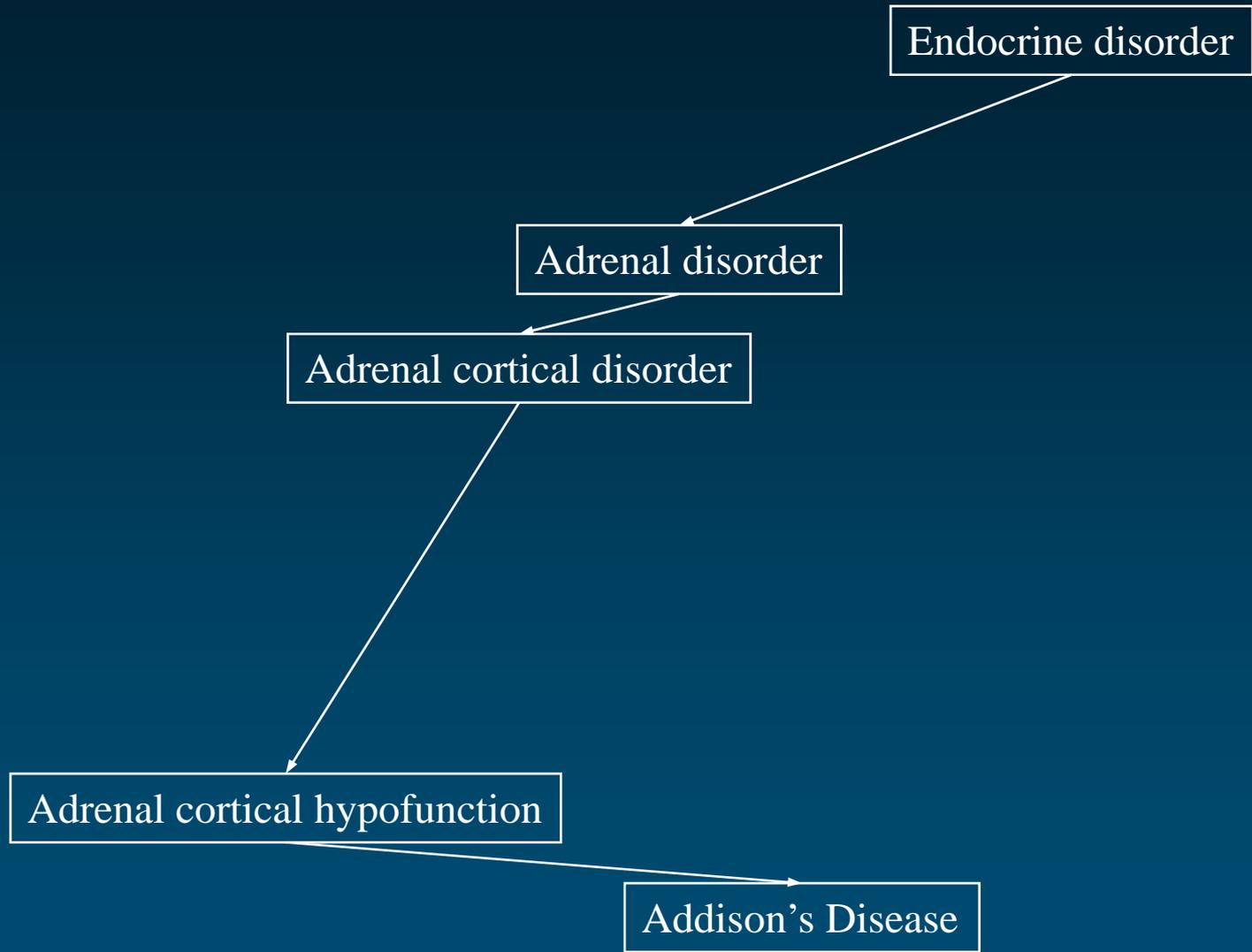


# SNOMED International

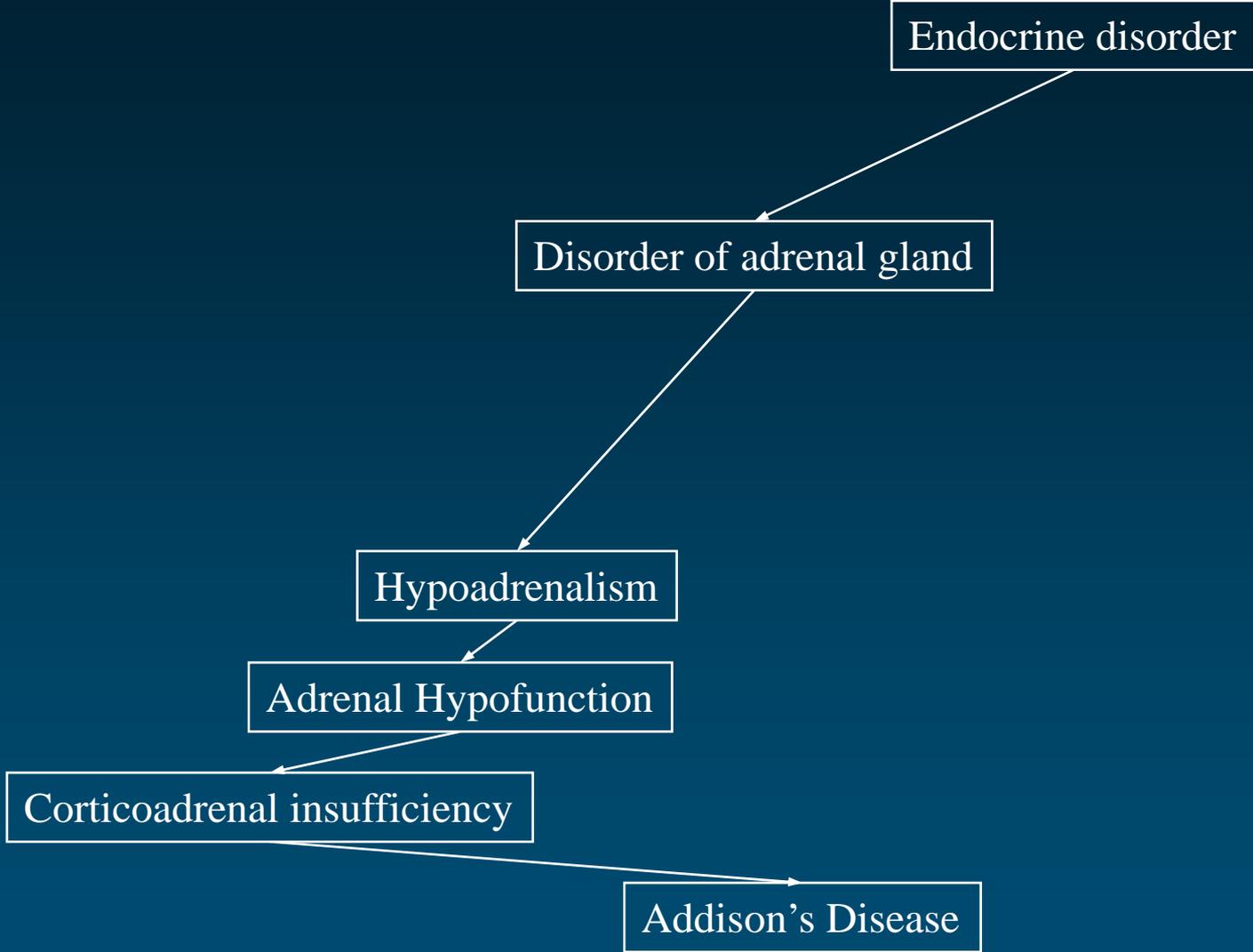




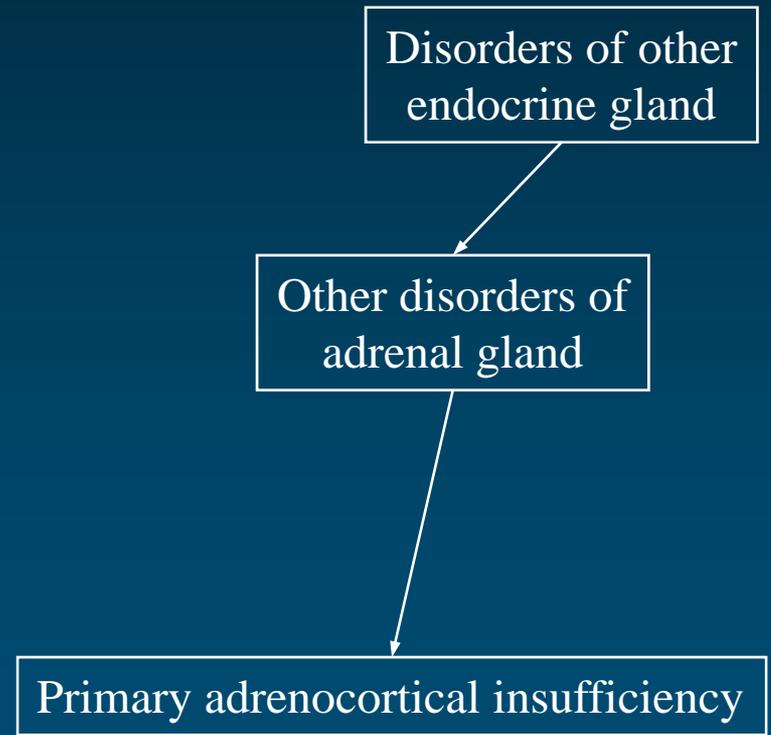
# AOD



# Read Codes

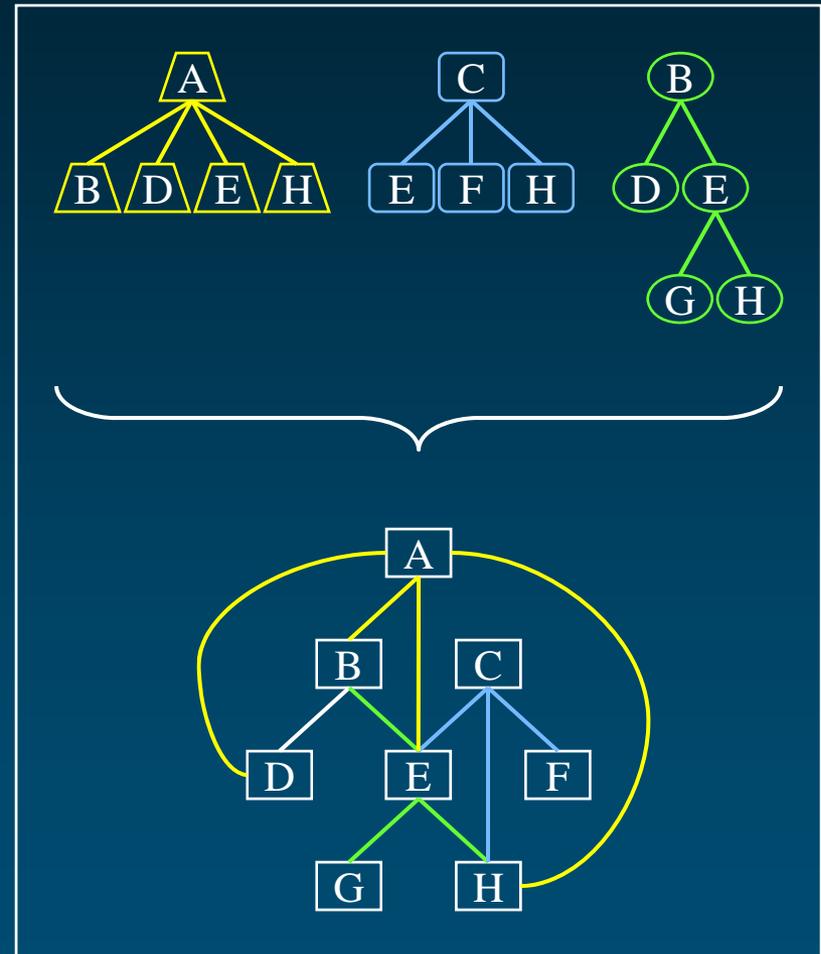


# ICD-10



# Organize concepts

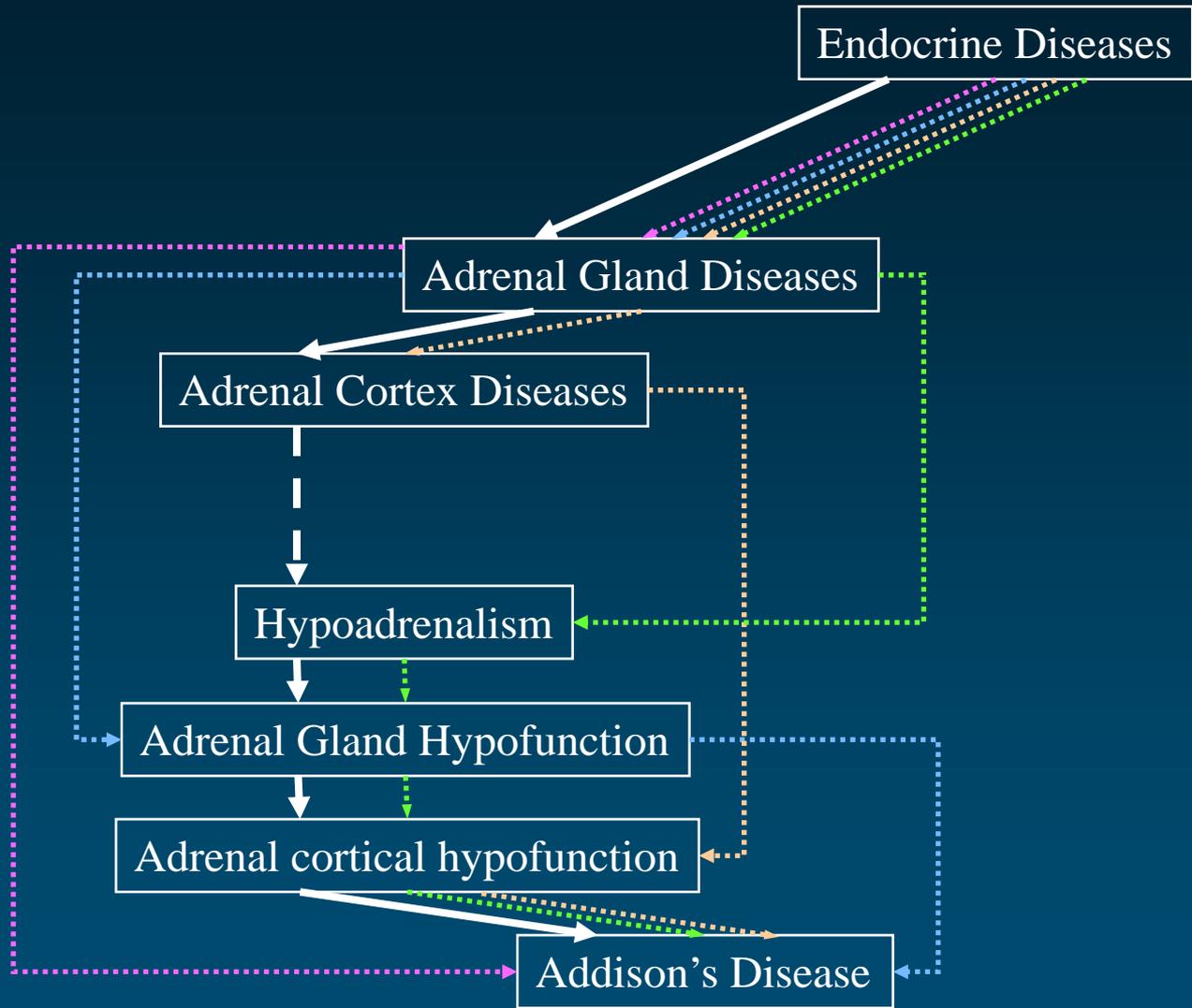
- ◆ Inter-concept relationships: hierarchies from the source vocabularies
- ◆ Redundancy: multiple paths
- ◆ One graph instead of multiple trees (multiple inheritance)



*organize concepts*

**SNOMED**  
**MeSH**  
**AOD**  
**Read Codes**

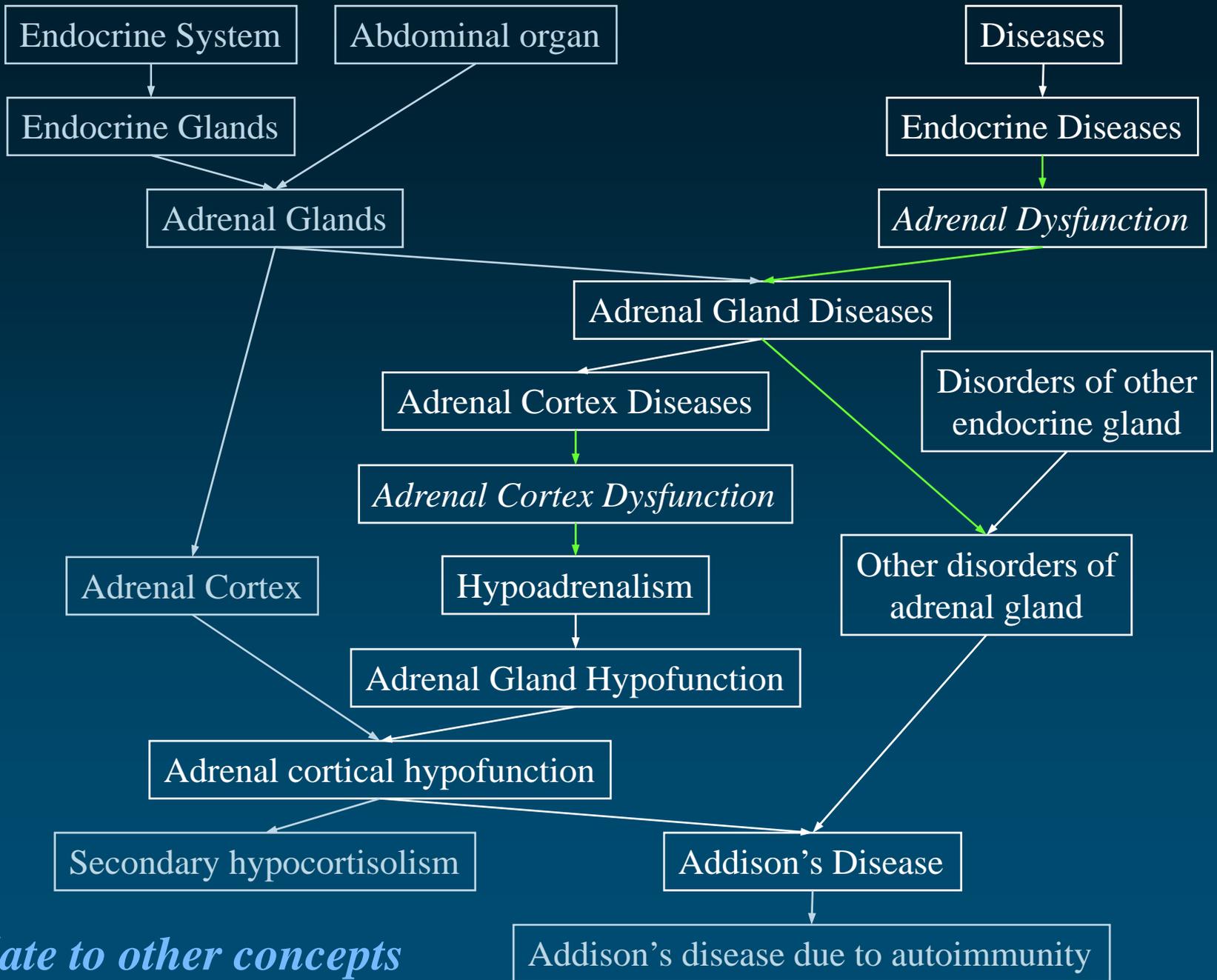
**UMLS**



# Relate to other concepts

- ◆ Additional hierarchical relationships
  - link to other trees
  - make relationships explicit
- ◆ Non-hierarchical relationships
- ◆ Co-occurring concepts
- ◆ Mapping relationships

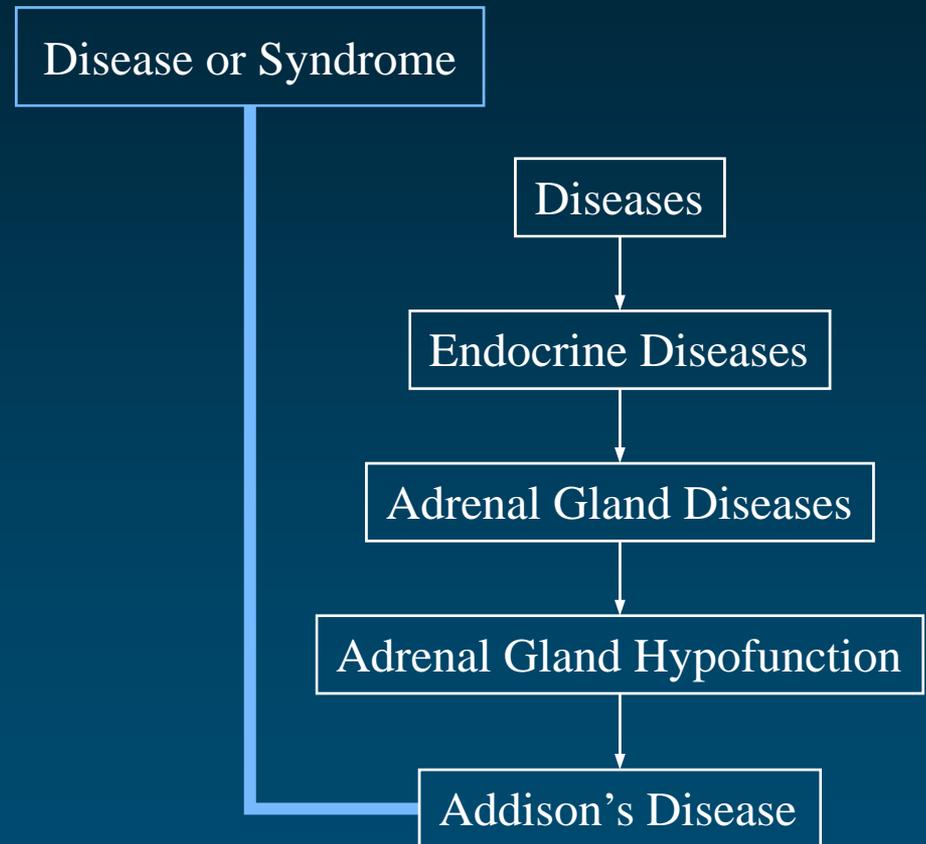




*relate to other concepts*

# Categorize concepts

- ◆ High-level categories (semantic types)
- ◆ Assigned by the Metathesaurus editors
- ◆ Independently of the hierarchies in which these concepts are located



# How do they do that?

---

- ◆ Lexical knowledge
- ◆ Semantic pre-processing
- ◆ UMLS editors

# Lexical knowledge

Adrenal gland diseases

Adrenal disorder

Disorder of adrenal gland

Diseases of the adrenal glands

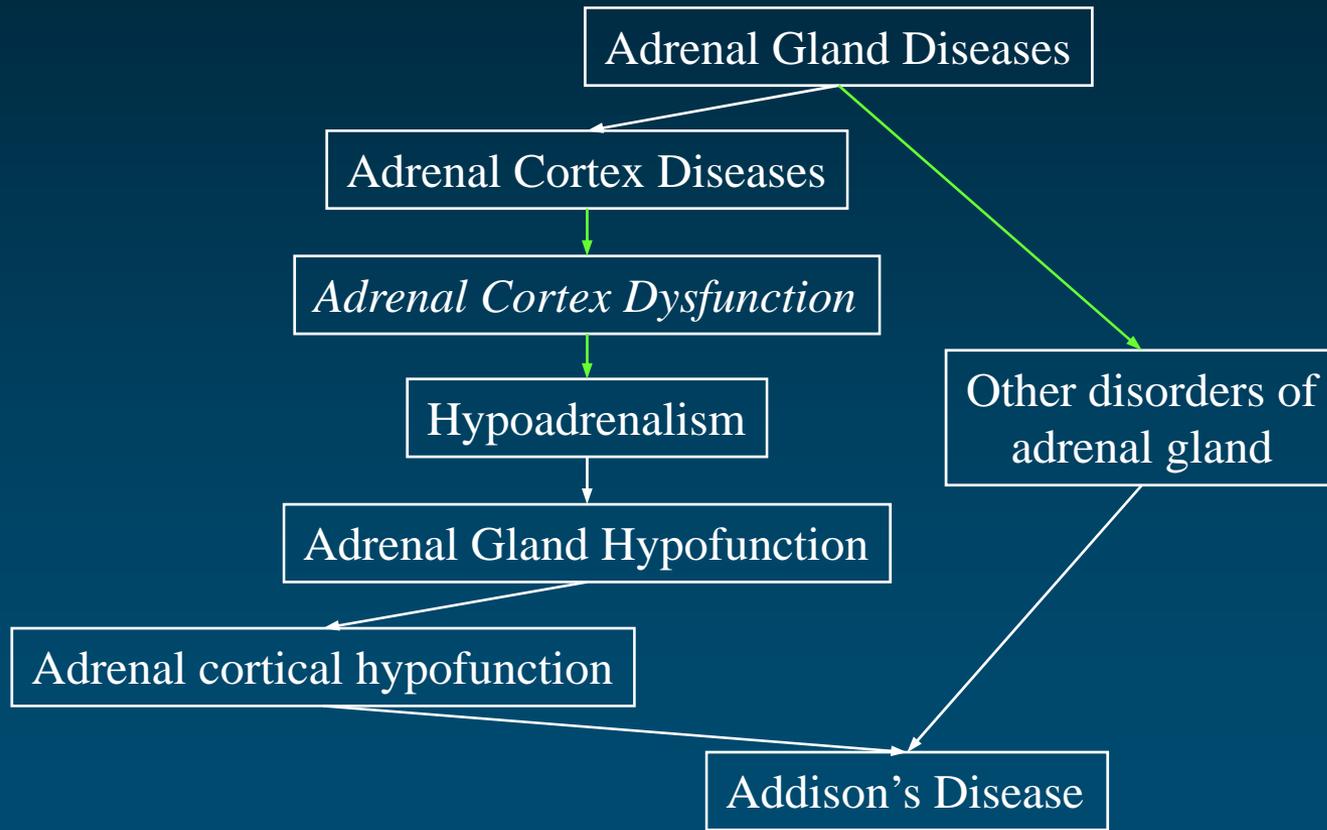
C0001621



# Semantic pre-processing

- ◆ Metadata in the source vocabularies
- ◆ Tentative categorization
- ◆ Positive (or negative) evidence for tentative synonymy relations based on lexical features

# Additional knowledge: UMLS editors



# UMLS: 3 components



## ◆ SPECIALIST Lexicon

- 200,000 lexical items
- Part of speech and variant information

## ◆ Metathesaurus

- 5M names from over 100 terminologies
- 1M concepts
- 16M relations

## ◆ Semantic Network

- 135 high-level categories
- 7000 relations among them

Lexical  
resources

Terminological  
resources

Ontological  
resources



# UMLS Metathesaurus

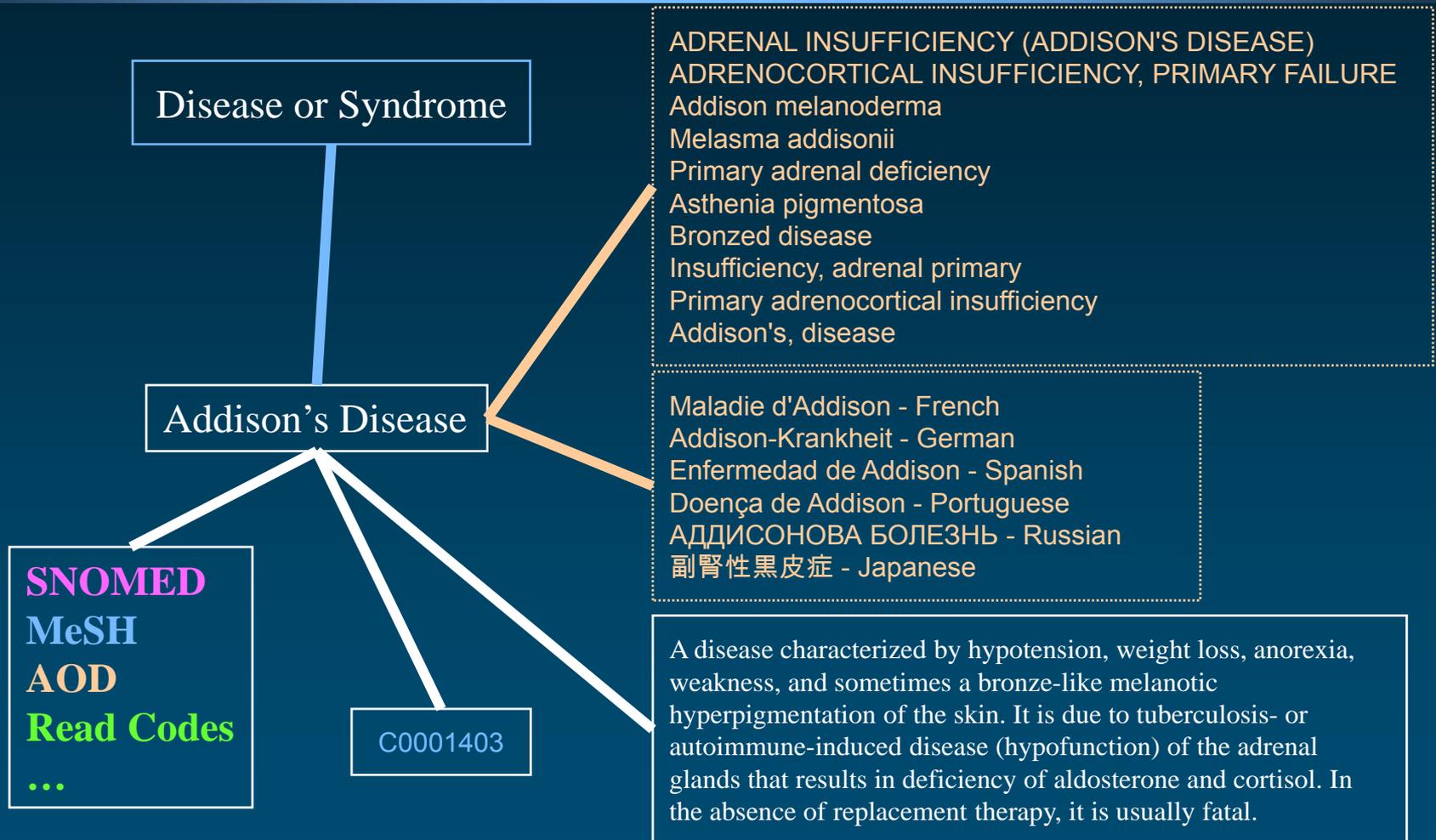


# Source Vocabularies

(2006AC)

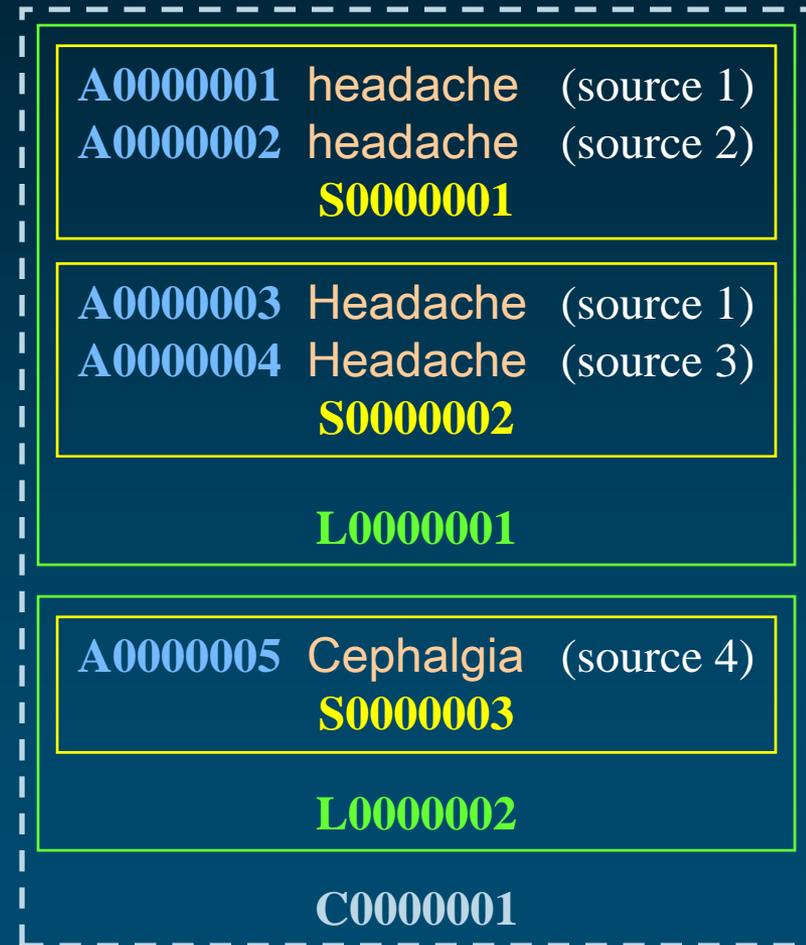
- ◆ 138 source vocabularies
  - 17 languages
- ◆ Broad coverage of biomedicine
  - 5.3M names
  - 1.3M concepts
  - 16M relations
- ◆ Common presentation

# Addison's Disease: Concept



# Metathesaurus Concepts (2006AC)

- ◆ Concept (> 1.3M) CUI
  - Set of synonymous concept names
- ◆ Term (> 4.7M) LUI
  - Set of normalized names
- ◆ String (> 5.3M) SUI
  - Distinct concept name
- ◆ Atom (> 6.4M) AUI
  - Concept name in a given source



# Cluster of synonymous terms

Concept  
C0001403

Term L0001403	<p><b>S0354372</b> <i>Addison's disease</i></p> <p><b>S0010794</b> Addison's Disease</p> <p><b>S0010792</b> Addison Disease</p> <p><b>S0010796</b> Addisons Disease</p> <p><b>S0033587</b> Disease, Addison</p> <p><b>S0469271</b> Addison's disease, NOS</p>	[...]
Term L0494940	<p><b>S5907336</b> <i>Primary Adrenocortical Insufficiency</i></p> <p><b>S5901878</b> Insufficiencies, Primary Adrenocortical</p>	
Term L0494851	<p><b>S5907334</b> <i>Primary Adrenal Insufficiency</i></p> <p><b>S5924573</b> Adrenal Insufficiency, Primary</p>	[...]
Term L0585243	<p><b>S5907343</b> <i>Primary Hypoadrenalism</i></p> <p><b>S0718109</b> Primary hypoadrenalism</p>	[...]
Term L3541031	<p><b>S4115514</b> <i>primary; hypoadrenocorticism</i></p> <p><b>S4090095</b> hypoadrenocorticism; primary</p>	[...]
Term L1229627	<p><b>S1471573</b> <i>Addison-Krankheit</i></p>	GER
Term L5345155	<p><b>S6107160</b> <i>Maladie d'Addison</i></p>	FRE



# Metathesaurus Evolution over time

- ◆ Concepts never die (in principle)
  - CUIs are permanent identifiers
- ◆ What happens when they do die (in reality)?
  - Concepts can merge or split
  - Resulting in new concepts and deletions



# Metathesaurus Relations

- ◆ Symbolic relations: ~9 M pairs of concepts
  - ◆ Statistical relations : ~7 M pairs of concepts  
(co-occurring concepts)
  - ◆ Mapping relations: 100,000 pairs of concepts
- 

- ◆ Categorization: Relations between concepts and semantic types from the Semantic Network

# Symbolic relations

## ◆ Relation

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

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

Source transparency: the information  
is recorded at the “atom” level



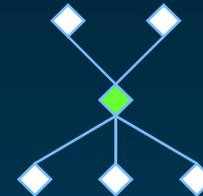
# Symbolic relationships Type

## ◆ 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)





# UMLS Semantic Network

# Semantic Network

- ◆ Semantic types (135)
  - tree structure
  - 2 major hierarchies
    - Entity
      - Physical Object
      - Conceptual Entity
    - Event
      - Activity
      - Phenomenon or Process

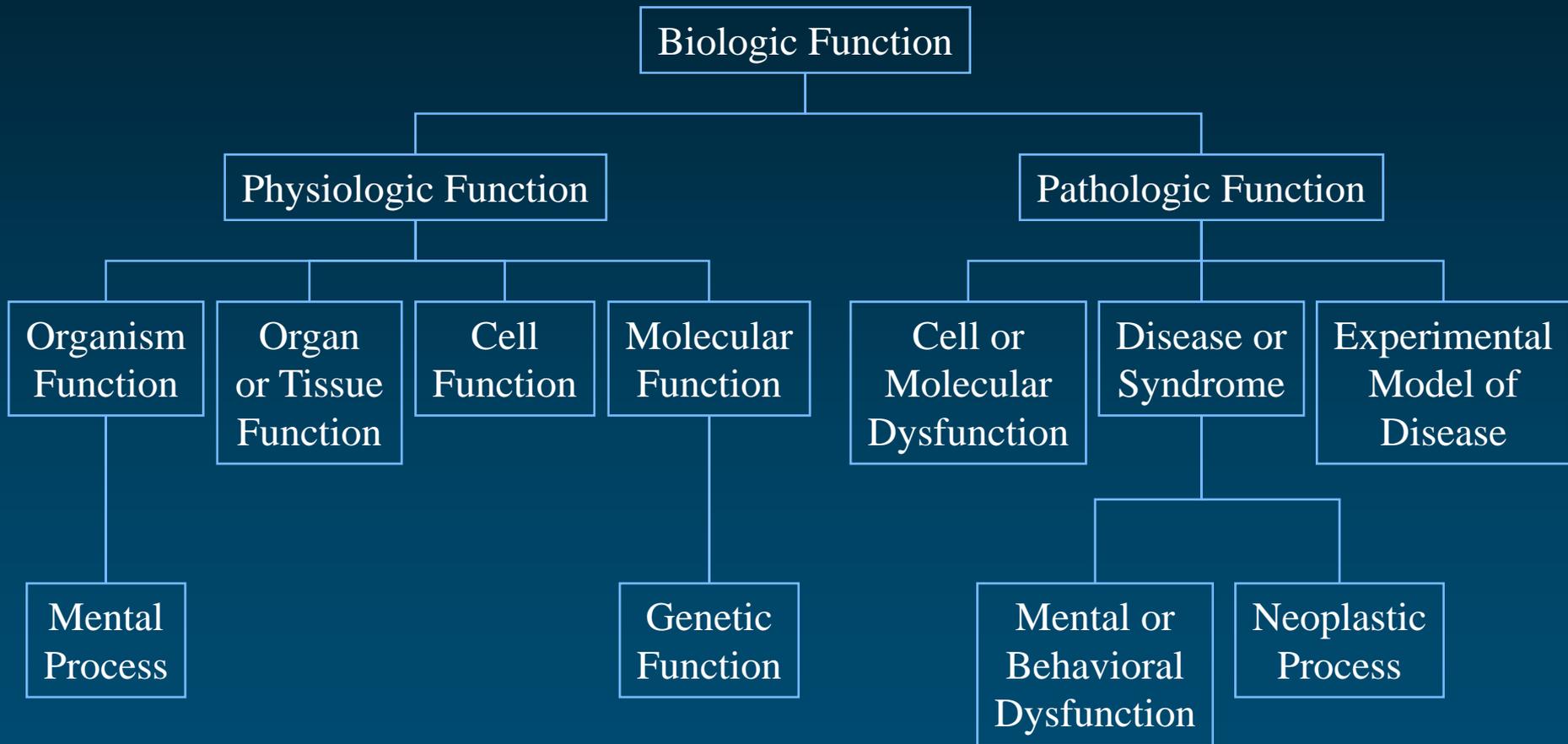
# Semantic Network

## ◆ Semantic network relationships (54)

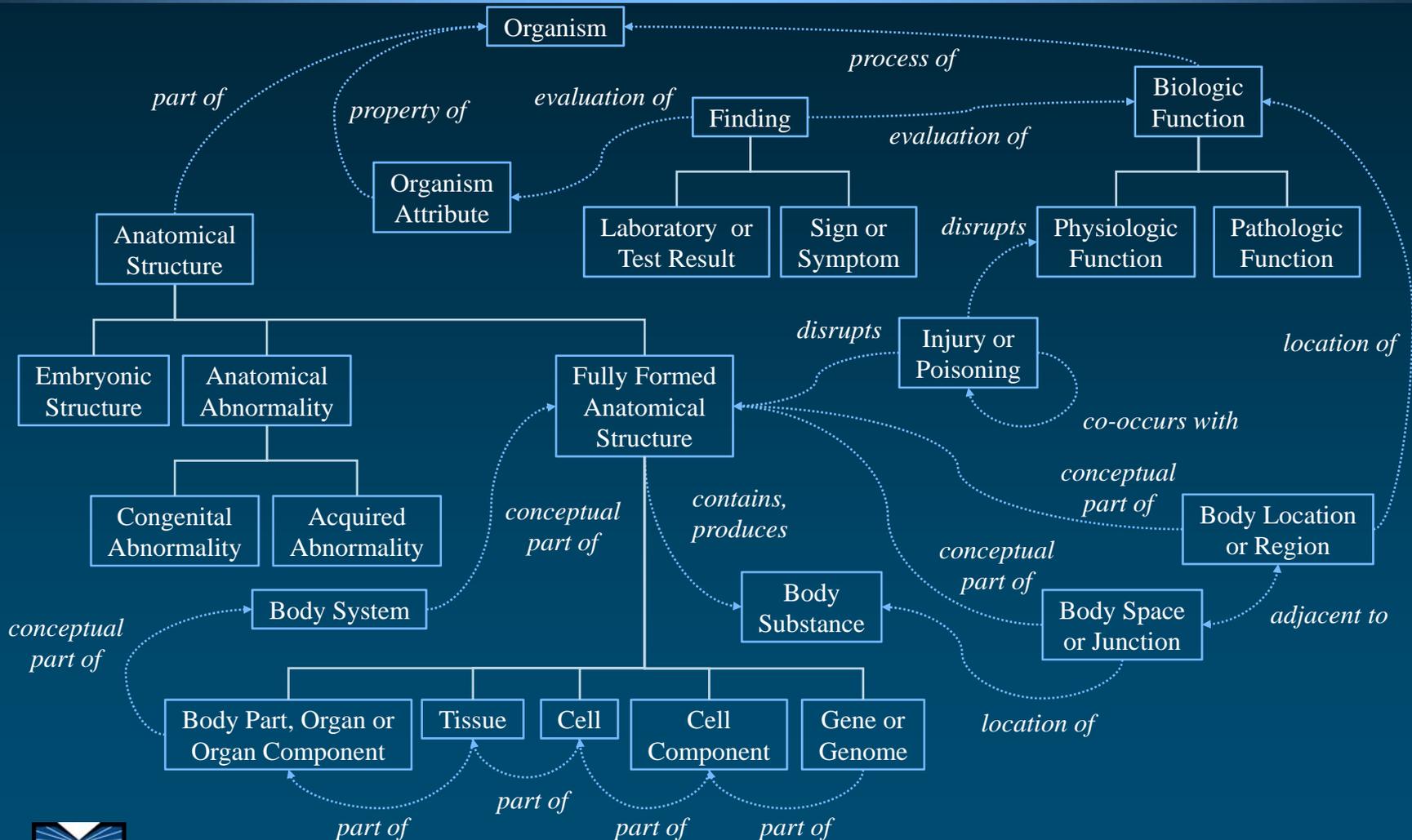
- hierarchical (isa = is a kind of)
  - among types
    - *Animal isa Organism*
    - *Enzyme isa Biologically Active Substance*
  - among relations
    - *treats isa affects*
- non-hierarchical
  - *Sign or Symptom diagnoses Pathologic Function*
  - *Pharmacologic Substance treats Pathologic Function*



# “Biologic Function” hierarchy (isa)



# Associative (non-isa) relationships

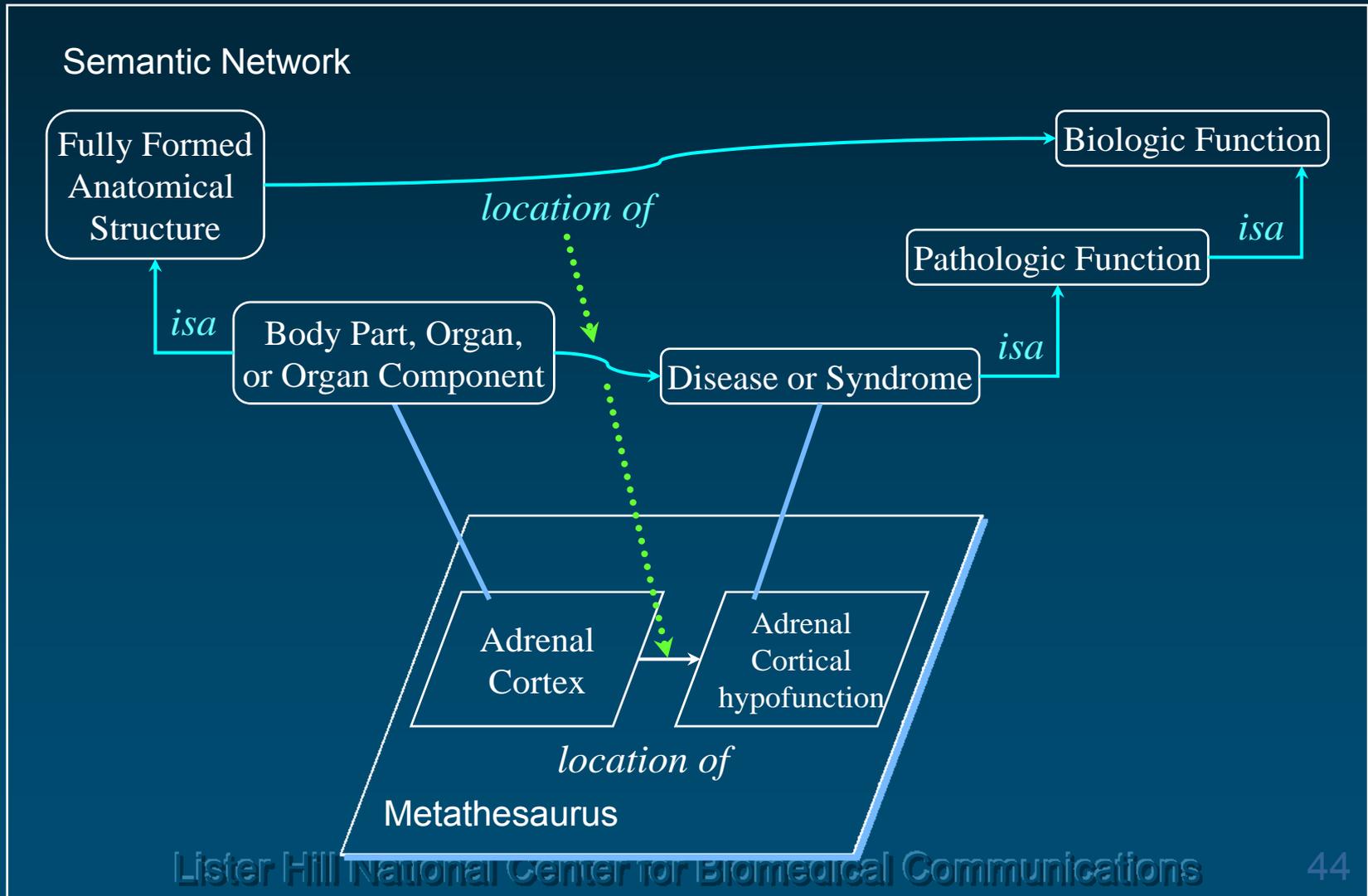


# Why a semantic network?

- ◆ Semantic Types serve as high level categories assigned to Metathesaurus concepts, *independently of their position in a hierarchy*
- ◆ A relationship between 2 Semantic Types (ST) is a possible link between 2 concepts that have been assigned to those STs
  - The relationship may or may not hold at the concept level
  - Other relationships may apply at the concept level



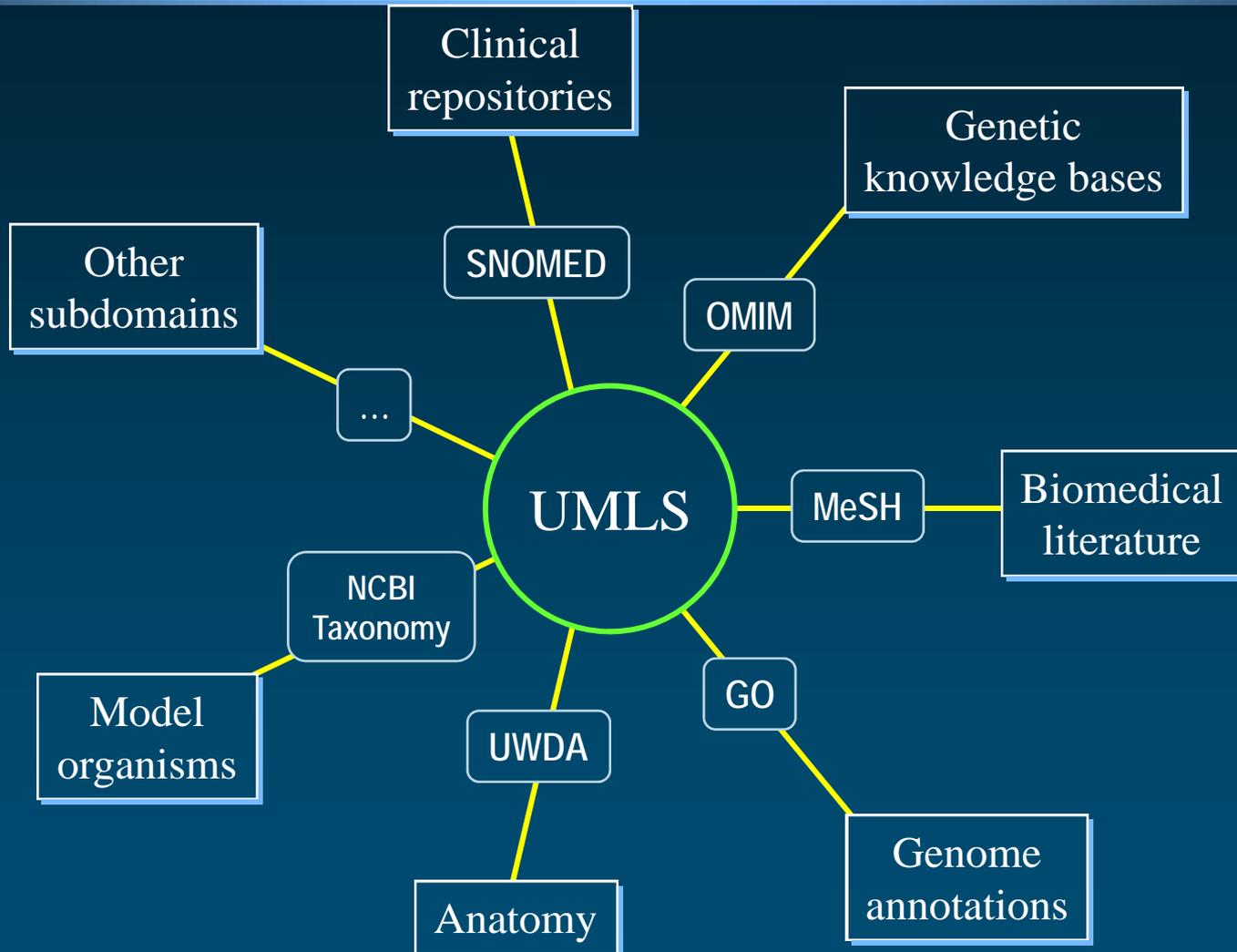
# Relationships can inherit semantics



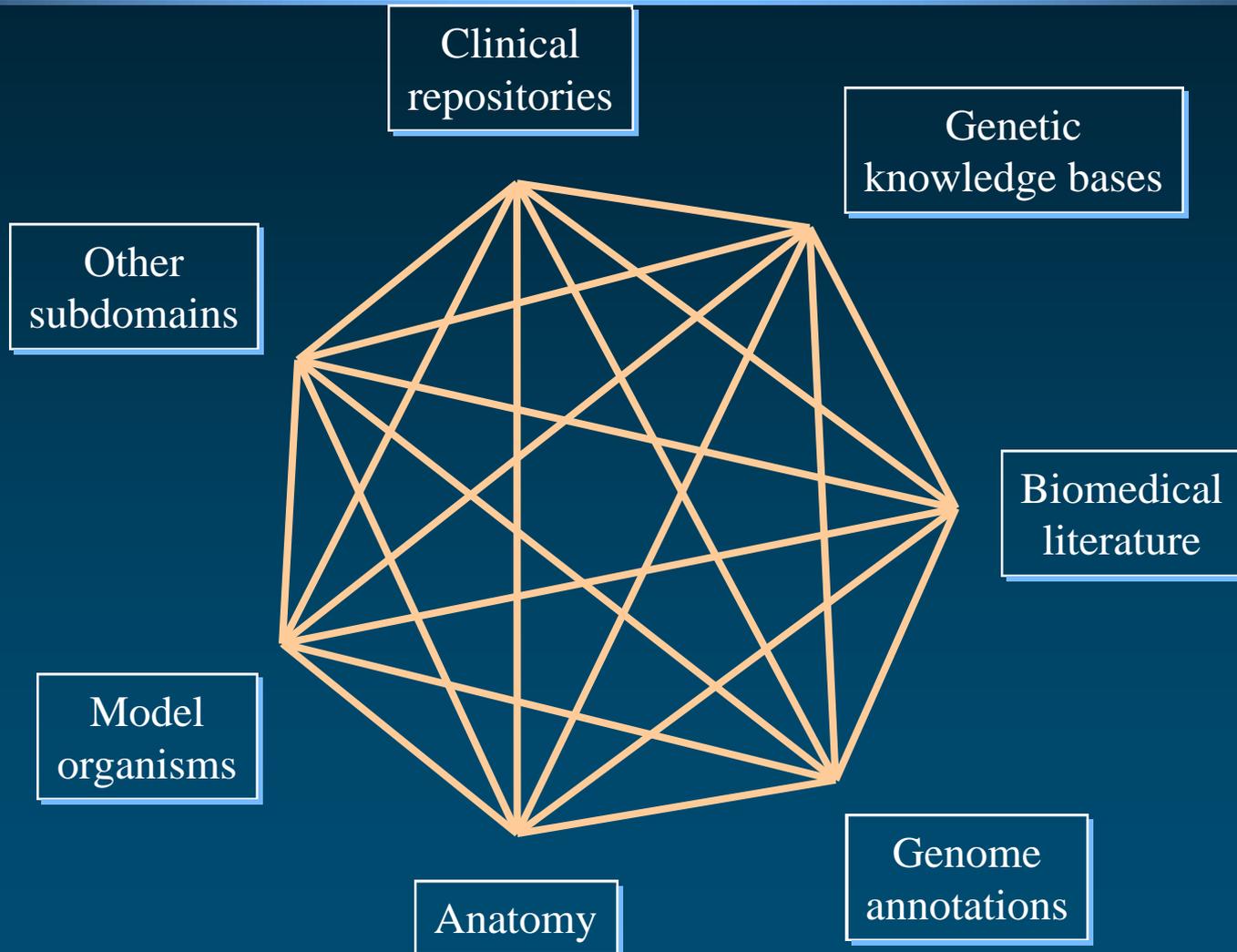
# UMLS Summary

- ◆ Synonymous terms clustered into concepts
- ◆ Unique identifier
- ◆ Finer granularity
- ◆ Broader scope
- ◆ Additional hierarchical relationships
- ◆ Semantic categorization

# Integrating subdomains



# Integrating subdomains



# Information integration

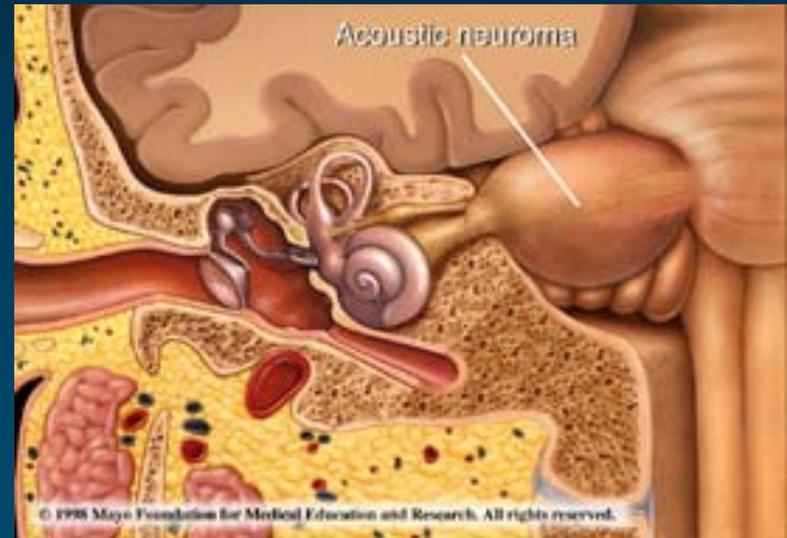
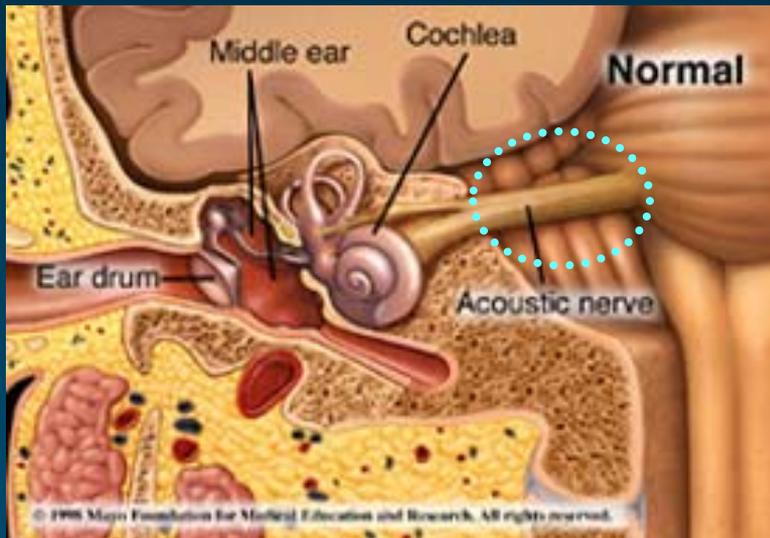
*Genomics as an example*

# 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)

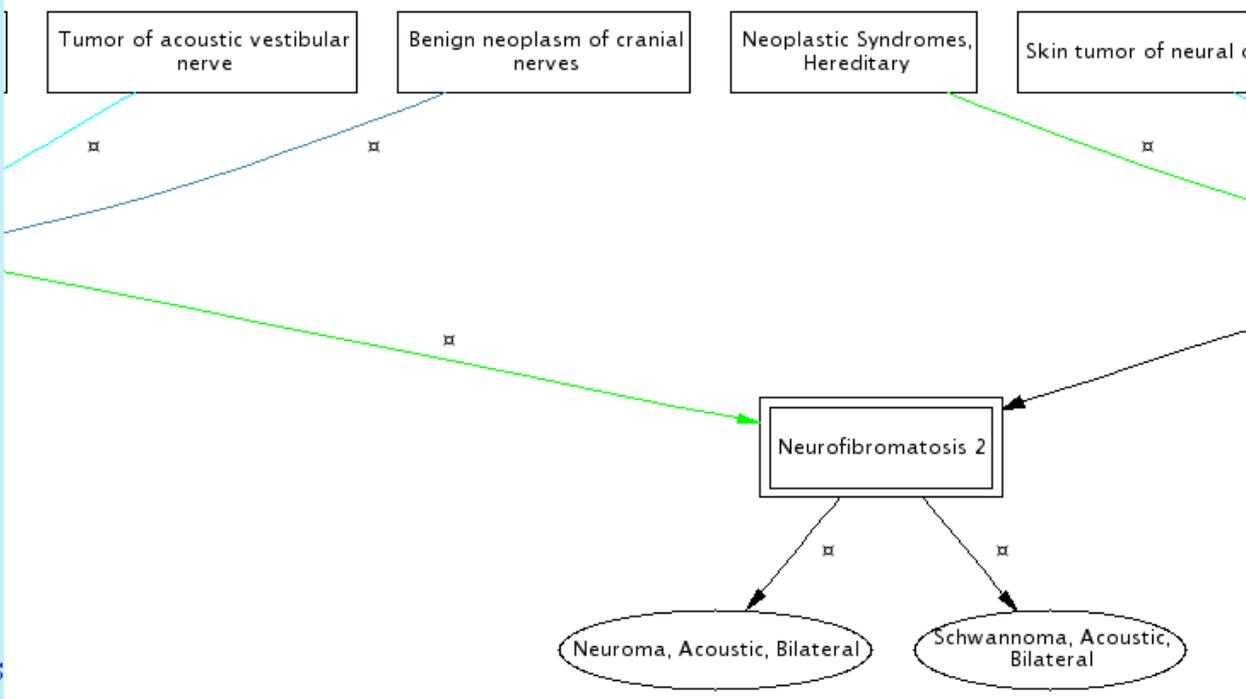


<http://www.mayoclinic.com>

- 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]



- Other Related Concepts**
- Anatomy**
- Acoustic Nerve ✖
- Chemicals & Drugs**
- Neurofibromin 2 ✖
- Disorders**
- Familial Acoustic Neuromas ✖
  - Neoplasm of uncertain behavior NOS ✖
  - Neurofibromatoses ✖
  - 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] ✖

**BCI** **Neurofibromatosis 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**

- Neurofibromatosis (neoplasm) ✖

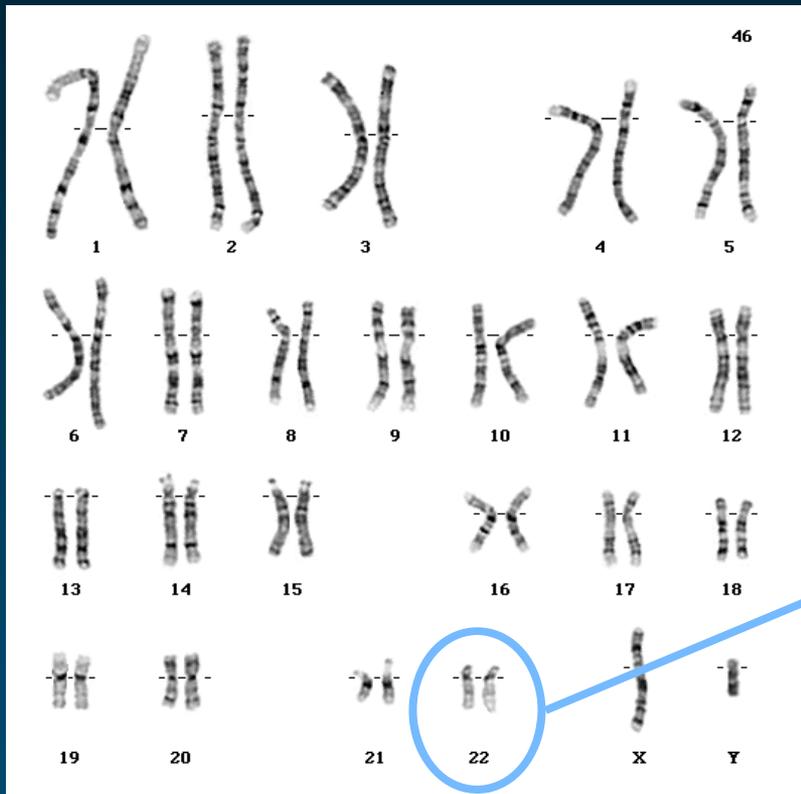
**Closest MeSH Terms**

**Main Headings**

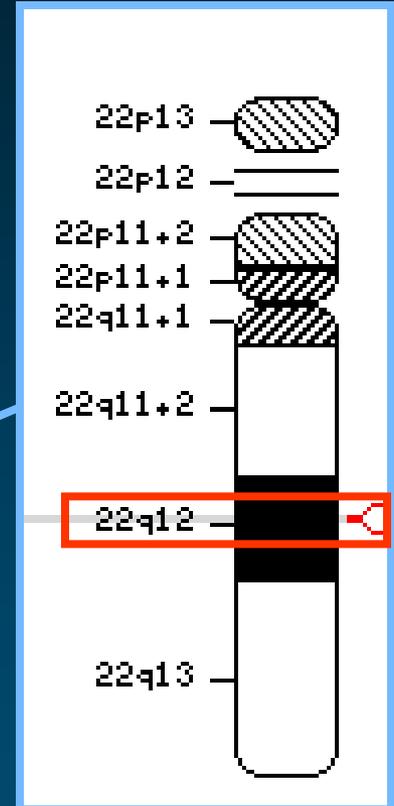
- Neurofibromatosis 2

**Subheadings**

# NF2 gene



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



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



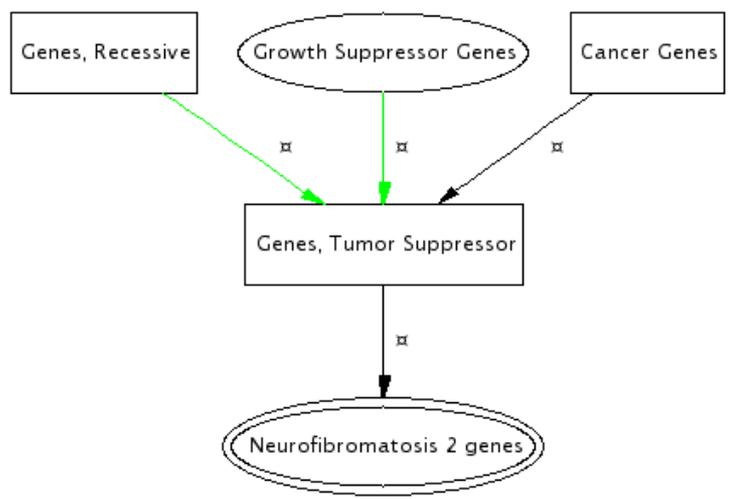
**Siblings**

**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)

**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**

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

# Merlin

## ◆ Synonyms

- Neurofibromin 2
- Schwannomin
- Schwannomerlin
- Neurofibromatosis-2

## ◆ 10 isoforms

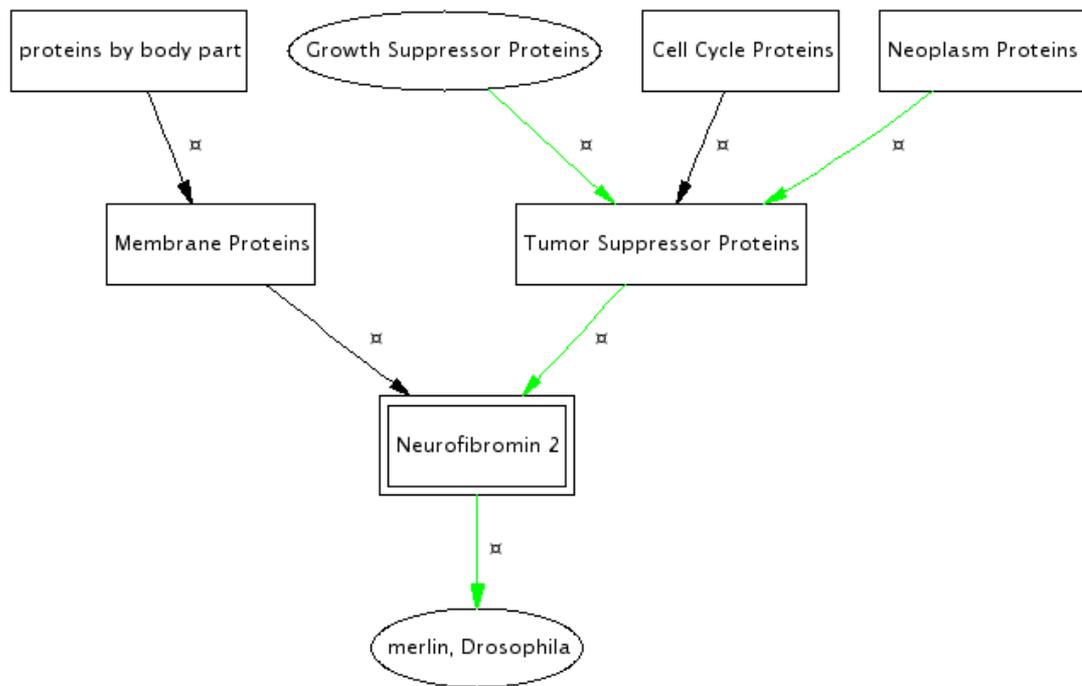
## ◆ Annotations

- Negative regulation of cell proliferation
- Cytoskeleton
- Plasma membrane

### 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 ☒



### 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:

Highlight vocabulary:

UMLS data:

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

**Similar Concepts**  
(none)

**Allegedly Synonyms**  
(none)

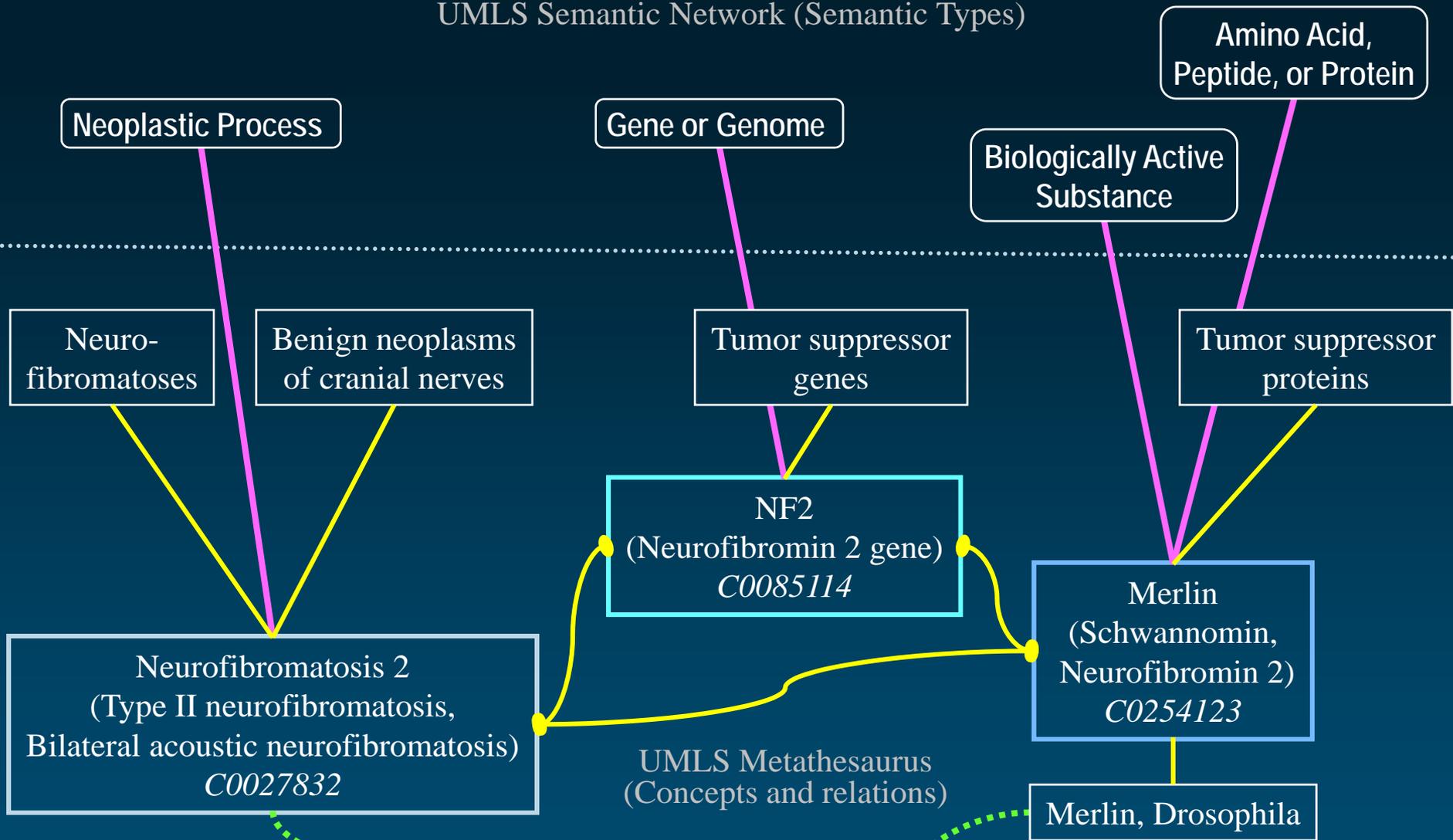
**Closest MeSH Terms**

**Main Headings**

- Neurofibromin 2

**Subheadings**

# UMLS Semantic Network (Semantic Types)



UMLS Metathesaurus  
(Concepts and relations)

NEUROFIBROMATOSIS,  
TYPE II; NF2  
#101000 **OMIM**

External resources

Drosophila melanogaster merlin  
(Dmerlin) mRNA, complete cds.  
U49724 **Genbank**

# 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)

# References

## ◆ UMLS

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

## ◆ UMLS browsers

(free, but UMLS license required)

- Knowledge Source Server: [umlsks.nlm.nih.gov](http://umlsks.nlm.nih.gov)
- Semantic Navigator:  
<http://mor.nlm.nih.gov/perl/semnav.pl>
- RRF browser  
(standalone application distributed with the UMLS)



# References

## ◆ Recent overviews

- Bodenreider O. (2004). The Unified Medical Language System (UMLS): Integrating biomedical terminology. *Nucleic Acids Research*; D267-D270.
- Nelson, S. J., Powell, T. & Humphreys, B. L. (2002 ). The Unified Medical Language System (UMLS) Project. In: Kent, Allen; Hall, Carolyn M., editors. *Encyclopedia of Library and Information Science*. New York: Marcel Dekker. p.369-378.

# References

## ◆ UMLS as a research project

- Lindberg, D. A., Humphreys, B. L., & McCray, A. T. (1993). The Unified Medical Language System. *Methods Inf Med*, 32(4), 281-91.
- Humphreys, B. L., Lindberg, D. A., Schoolman, H. M., & Barnett, G. O. (1998). The Unified Medical Language System: an informatics research collaboration. *J Am Med Inform Assoc*, 5(1), 1-11.

# References

## ◆ Technical papers

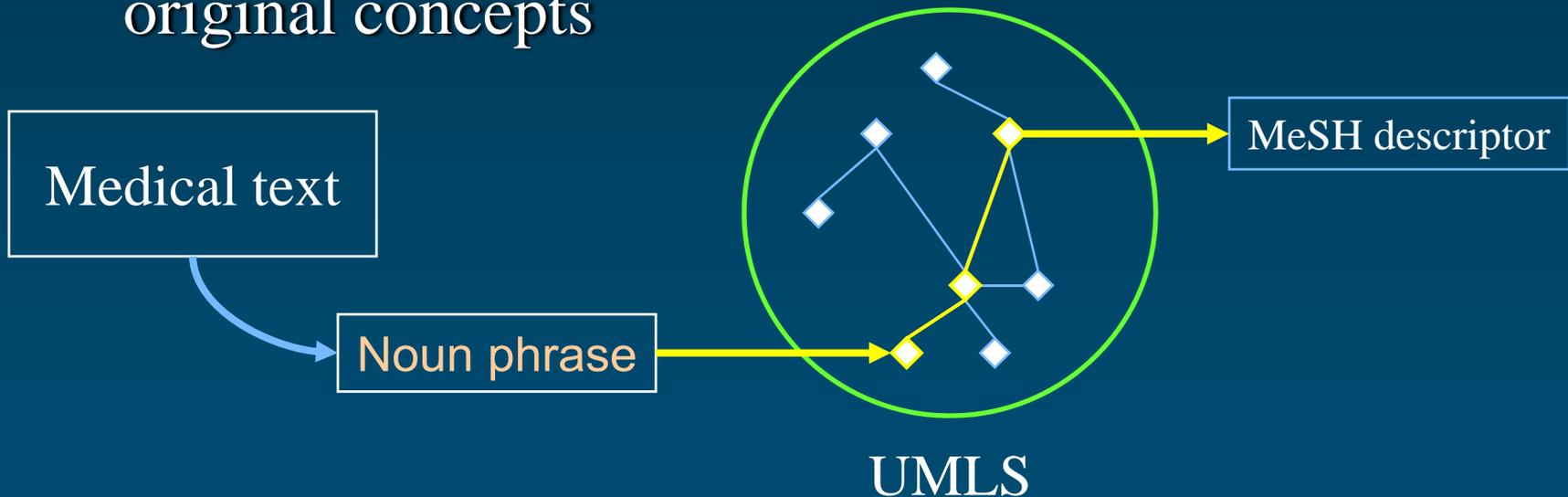
- McCray, A. T., & Nelson, S. J. (1995). The representation of meaning in the UMLS. *Methods Inf Med*, 34(1-2), 193-201.
- Bodenreider O. & McCray A. T. (2003). Exploring semantic groups through visual approaches. *Journal of Biomedical Informatics*, 36(6), 414-432.

# UMLS in Use

## Mapping across Vocabularies

# The problem

- ◆ For noun phrases extracted from medical texts, map to UMLS concepts
- ◆ Then, select from the MeSH vocabulary the concepts that are the most closely related to the original concepts



# Map noun phrases to UMLS

## ◆ Normalization

- normalize noun phrases
- use the normalized string index

## ◆ MetaMap

- approximate matching
- more aggressive approach
  - use derivational variants
  - allow partial matches



# Restrict to MeSH

- ◆ Based on the principle of semantic locality
- ◆ Use different components of the UMLS
- ◆ 4 techniques of increasing aggressiveness
  - Use Synonymy MRCON + MRSO
  - Use Associated expressions (ATXs) MRATX
  - Explore the Ancestors MRREL + SN
  - Explore the Other related concepts MRREL + SN



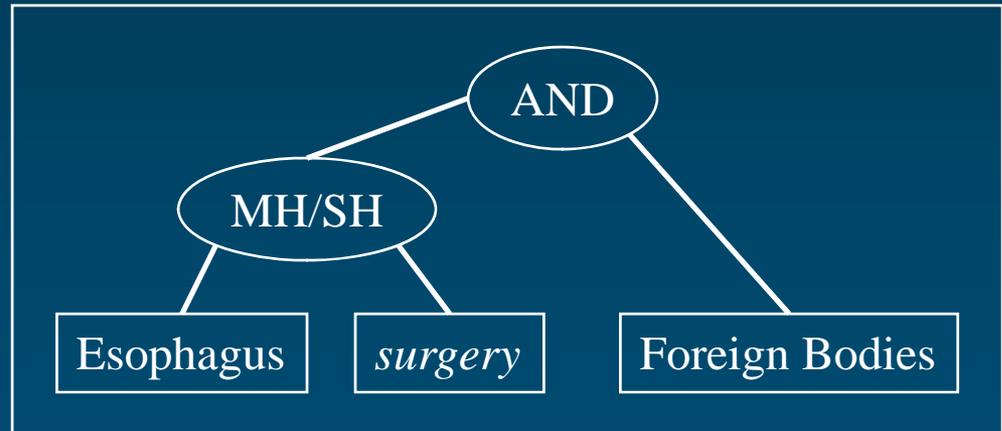
# Restrict to MeSH: Synonymy

- ◆ Term mapped to Source concept
- ◆ For this concept, is there a synonym term that comes from MeSH? (MRSO)

# Restrict to MeSH: Assoc. expressions

- ◆ If not,
- ◆ Is there an associated expression (ATX) that describes this concept using a combination of MeSH descriptors? (MRATX)

Endoscopic removal of intraluminal foreign body from oesophagus without incision



# Restrict to MeSH: Ancestors

- ◆ If not, let us build the graph of the ancestors of this concept
  - using parents and broader concepts (MRREL)
  - all the way to the top
  - excluding ancestors whose semantic types are not compatible with those of the source concept (MRSTY)
- ◆ From the graph, select the concepts that come from MeSH (MRCONSO)
- ◆ Remove those that are ancestors of another concept coming from MeSH

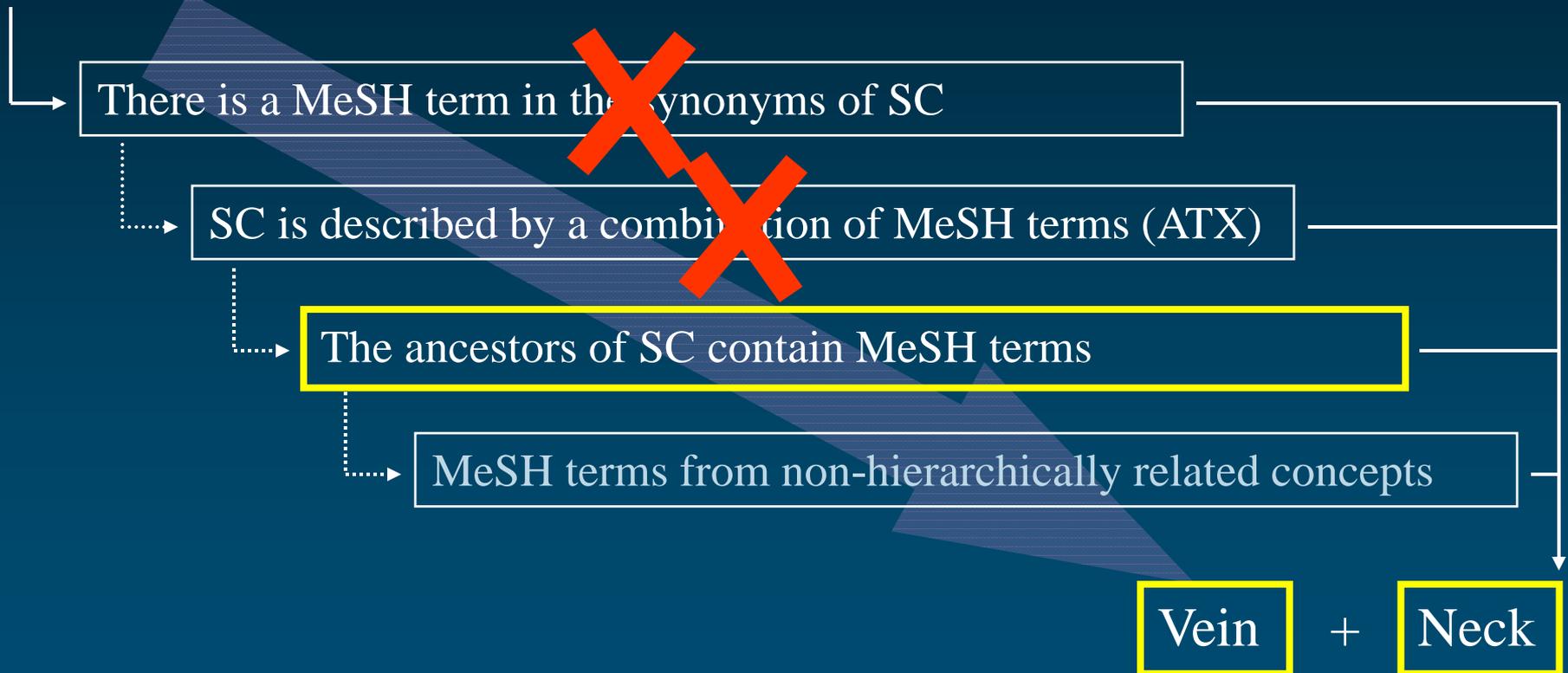


# Restrict to MeSH: Other related concepts

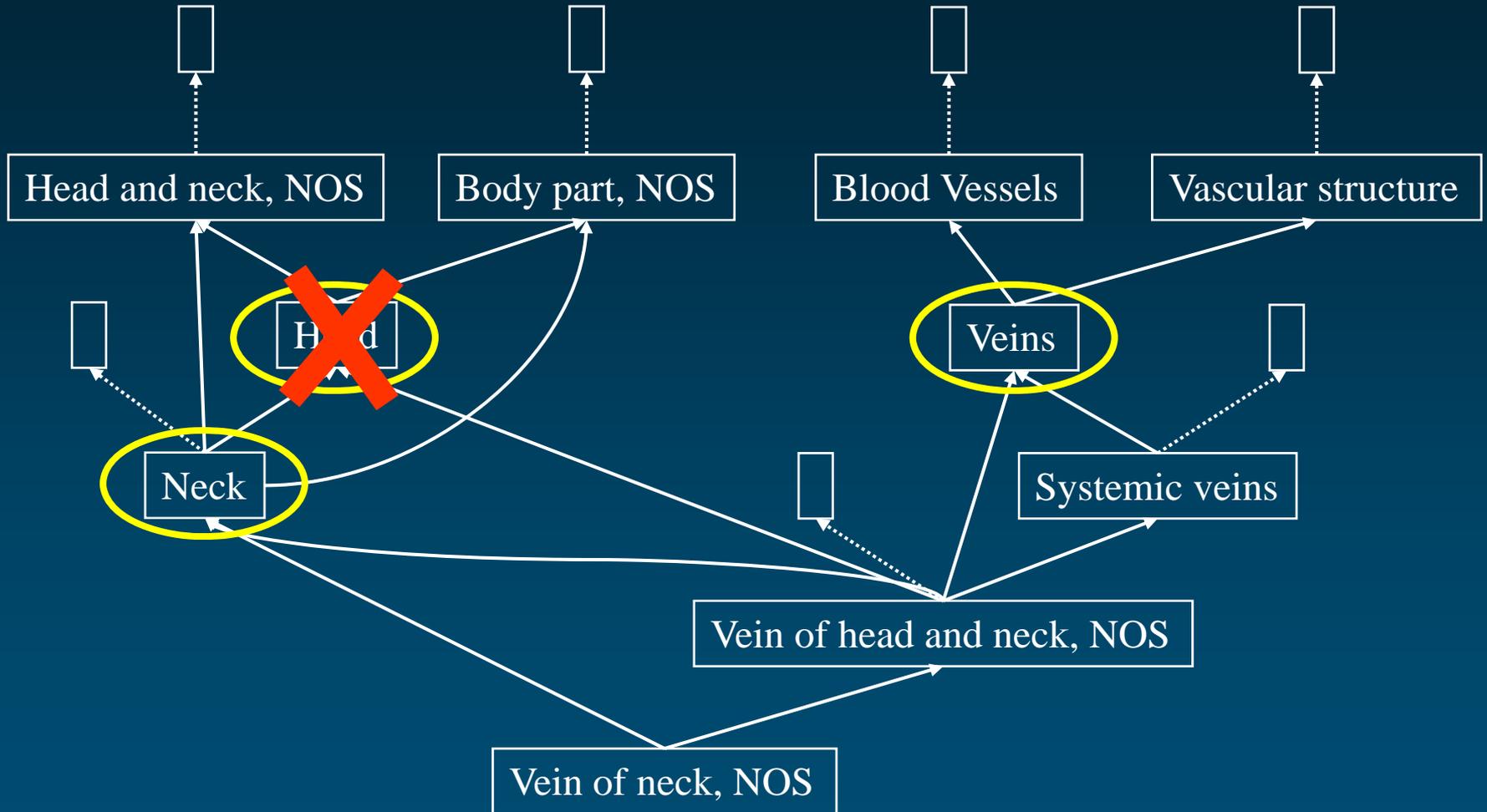
- ◆ If not, explore the other related concepts (**MRREL**) whose semantic types are compatible with those of the source concept (**MRSTY**)
- ◆ From those, select the concepts that come from MeSH (**MRCNSO**)

# Restrict to MeSH: Example

Vein of neck, NOS



# Restrict to MeSH: Example



# Overall results

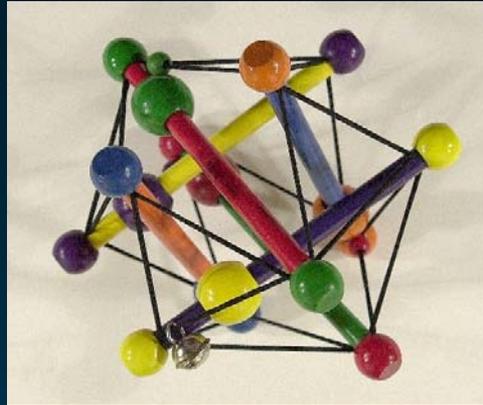
◆ Synonymy:	24%
◆ Built-in mapping:	1%
◆ Ancestors	
● From concept:	49%
● From children:	2%
● From siblings:	1%
◆ Other:	11%
◆ No mapping	12%



# References

- ◆ Bodenreider O, Nelson SJ, Hole WT, Chang HF. *Beyond synonymy: exploiting the UMLS semantics in mapping vocabularies*. Proceedings of AMIA Annual Symposium 1998:815-9.  
<http://mor.nlm.nih.gov/pubs/pdf/1998-amia-ob.pdf>
- ◆ Fung KW, Bodenreider O. *Utilizing the UMLS for semantic mapping between terminologies*. Proceedings of AMIA Annual Symposium 2005:266-270.  
<http://mor.nlm.nih.gov/pubs/pdf/2005-amia-kwf.pdf>





# Medical Ontology Research

Contact: [olivier@nlm.nih.gov](mailto:olivier@nlm.nih.gov)

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



*Olivier Bodenreider*

Lister Hill National Center  
for Biomedical Communications  
Bethesda, Maryland - USA