



# Introduction to Bioinformatics

BS (CS – 460)

Lecture Set 02

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# Topics

1. Gene Ontology Classification Scheme
2. Introduction to Sequence Alignment

# What is an Ontology?

- An **ontology** is a formal explicit description of concepts in a domain of discourse, properties of each concept describing various features and attributes of the concept and restrictions on them.
- An ontology together with a set of individual **instances** of classes (concepts) constitutes a **knowledge base**.

# Ontology why develop it?

## ■ Why develop an ontology:

1. To share common understanding of the structure of information among people or software agents
2. To enable reuse of domain knowledge
3. To make domain assumptions explicit
4. To separate domain knowledge from the operational knowledge
5. To analyze domain knowledge

# Why Gene Ontology?

- Elusive (undescribable) nature of protein functions.
- Protein function is an umbrella term for all types of activities that a protein is involved in, be it **cellular**, **molecular** or **physiological**.
- The three categories are not independent, but rather are hierarchically related.
- The need for a standardized functional labeling scheme was paramount, and several groups responded to this need with very innovative proposals.

# Gene Ontology (GO)

- URL: <http://www.geneontology.org/>
- Gene Ontology is
  - A hierarchy of **roles of genes and gene products**, independent of any organism.
  - Composed of three ***independent*** ontologies: **molecular function, biological process, cellular component**
  - GO itself ***does not contain*** any information on genes or gene products

# GO annotations

- <http://www.geneontology.org/GO.current.annotations.shtml>
- Curators annotate their findings of genes (known as **annotations**) by utilizing GO for various organisms (about 20 of them).
- Different kinds of evidence codes
  - Annotations with IEA (inferred from electronic annotation) evidence code are not manually verified (**Least reliable**)

# Properties of Gene Ontology?

- (1) **Wide coverage:** This is the most important property, since any functional scheme should cover as many of the functional phenomena across as many the organisms as possible.
- (2) **Standardized format:** Having minimal variability in the functional labels and adopting a standard data structure for the scheme makes the scheme easily readable by computer programs and significantly enhances their impact.
- (3) **Hierarchical structure:** Protein functions do not form a flat list, but are instead arranged hierarchically at a conceptual level. Functional classes range from specific functions to very general functional categories, thus allowing a researcher to choose the appropriate level(s) for his analysis.



# Properties of Gene Ontology? (Contd...)

- (4) **Disjoint categories:** Functions can be of different types, such as **cellular component**, **molecular function** and **biological process**. A separate hierarchy allows the choice of the appropriate type of function to be studied.
- (5) **Multiple functions:** In order to model the biological possibility of a protein being involved in multiple biological processes depending on the context, it is necessary for a functional scheme to allow the labeling of a single protein with multiple functions.
- (6) **Dynamic nature:** Last but not the least, the scheme should not be static, but should be modified as and when new functional knowledge is discovered.

# GO Molecular Function Ontology

- Describes activities, such as catalytic or binding activities, that can be performed by individual gene products or assembled complexes of gene products **at the molecular level.**

- Example of activities

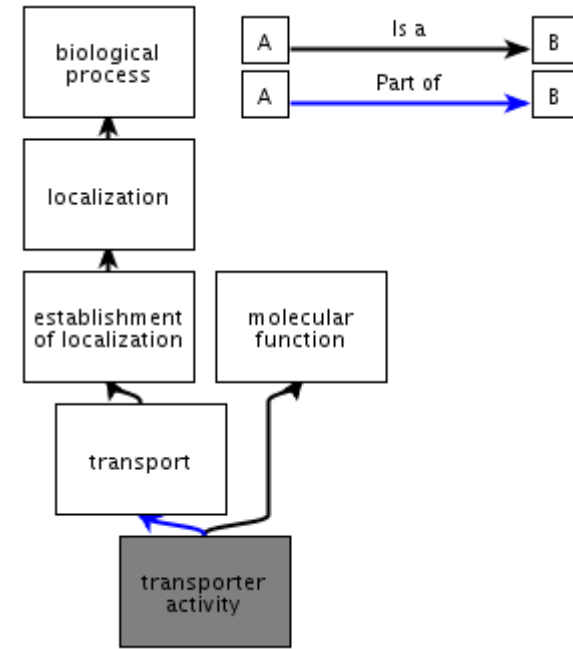
- transporter activity

- Genes that enable the directed movement of substances (such as macromolecules, small molecules, ions) into, out of, within or between cells.

- Example of binding

- insulin receptor binding

- Genes that interact with insulin receptors

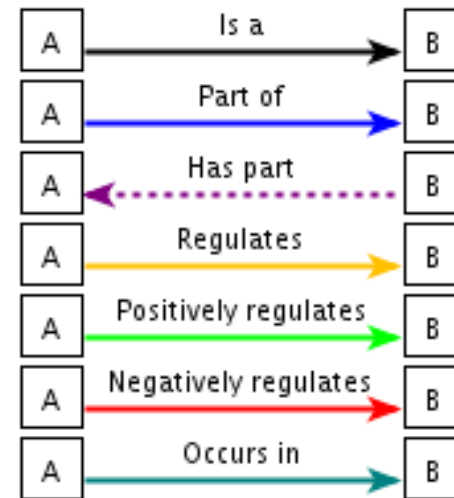
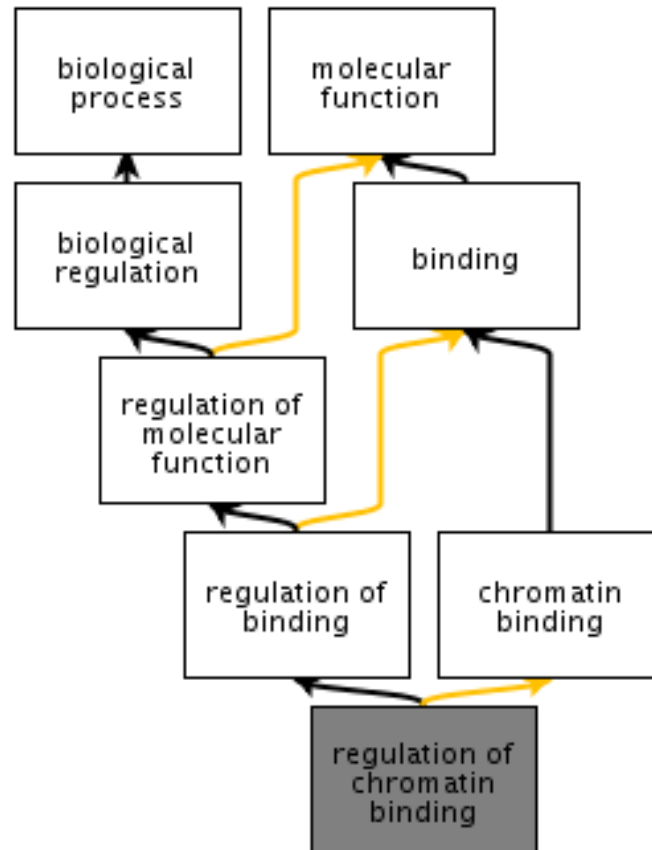


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# GO Biological Process Ontology

- Defined as a **biological objective to which the gene or gene product contributes.**
- Examples
  - Cell Proliferation
    - Genes that are responsible for the multiplication or reproduction of cells, resulting in the rapid expansion of a cell population.
  - Regulation of Chromatin Binding
    - Genes that enable regulation and processing of chromatin binding.

# GO Biological Process Ontology



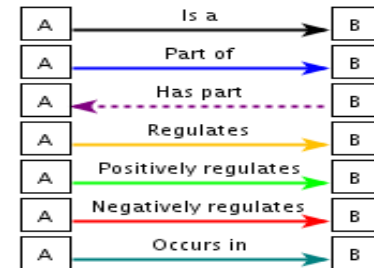
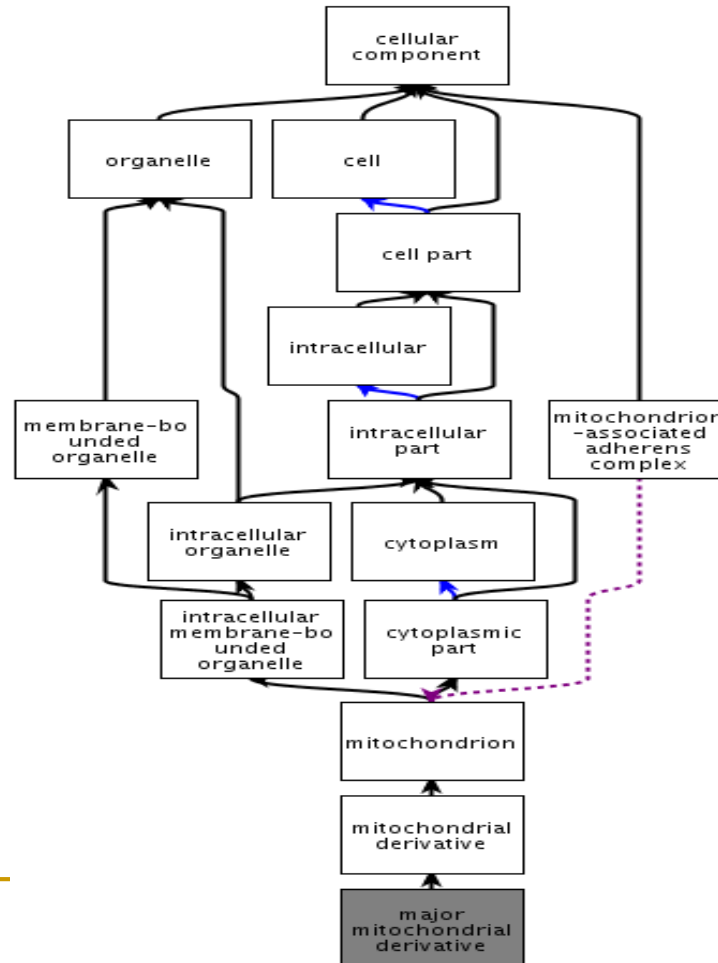
QuickGO - <http://www.ebi.ac.uk/QuickGO>

# GO Cellular Component Ontology

- Refers to the place in the cell where the gene product is active.

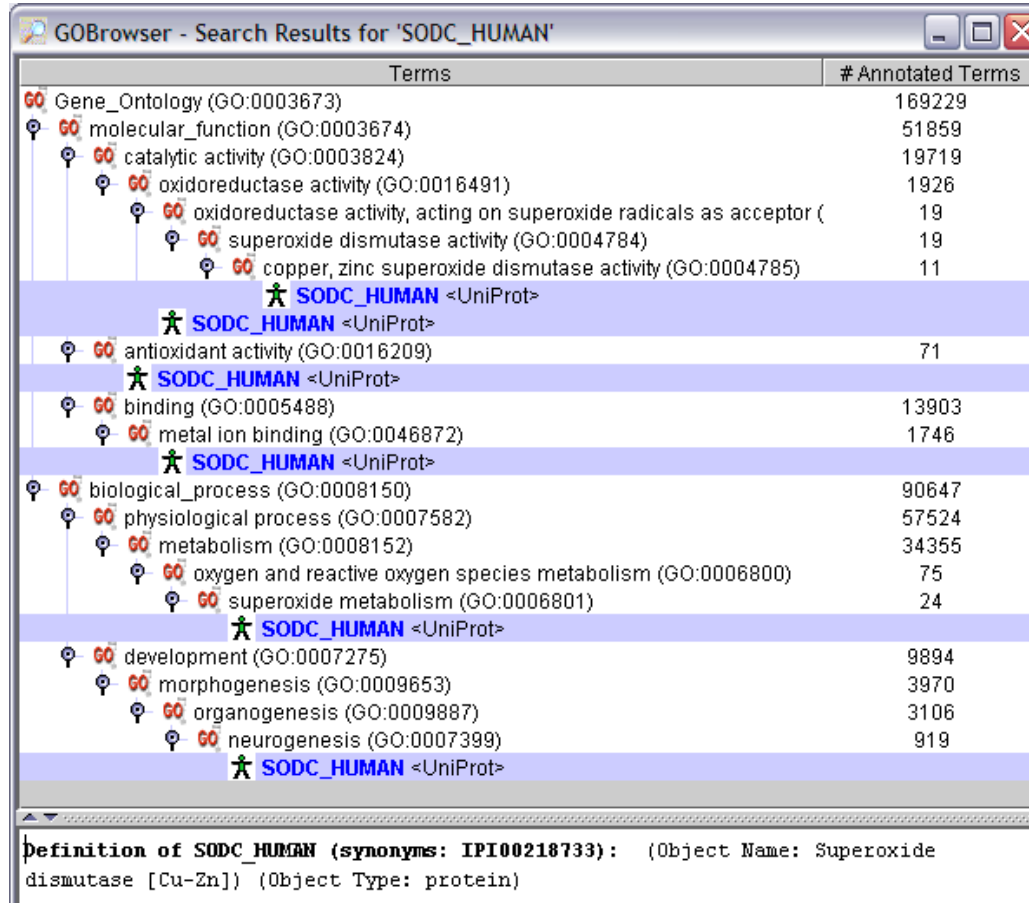
- Examples

- mitochondria
- nucleus
- cell membrane



# Example of a gene product

- A gene product has one or more molecular functions and is used in one or more biological processes; it might be associated with one or more cellular components.



The screenshot shows the GOBrowser interface with search results for 'SODC\_HUMAN'. The results are organized into a hierarchical tree structure. The top level is 'Gene\_Ontology (GO:0003673)' with 169,229 annotated terms. Below it, the hierarchy branches into 'molecular\_function (GO:0003674)' (51,859 terms) and 'biological\_process (GO:0008150)' (90,647 terms). The 'molecular\_function' branch further includes 'catalytic activity (GO:0003824)' (19,719 terms), which leads to 'oxidoreductase activity (GO:0016491)' (1,926 terms), and finally to 'oxidoreductase activity, acting on superoxide radicals as acceptor (GO:0004784)' (19 terms). The 'biological\_process' branch includes 'physiological process (GO:0007582)' (57,524 terms), which leads to 'metabolism (GO:0008152)' (34,355 terms), and finally to 'oxygen and reactive oxygen species metabolism (GO:0006800)' (75 terms). The 'SODC\_HUMAN' protein is highlighted in blue at several points in the hierarchy, indicating its association with those specific GO terms. At the bottom, the definition of SODC\_HUMAN is provided: 'Definition of SODC\_HUMAN (synonyms: IPI00218733): (Object Name: Superoxide dismutase [Cu-Zn]) (Object Type: protein)'.

Terms	# Annotated Terms
Gene_Ontology (GO:0003673)	169229
molecular_function (GO:0003674)	51859
catalytic activity (GO:0003824)	19719
oxidoreductase activity (GO:0016491)	1926
oxidoreductase activity, acting on superoxide radicals as acceptor (GO:0004784)	19
superoxide dismutase activity (GO:0004784)	19
copper, zinc superoxide dismutase activity (GO:0004785)	11
★ SODC_HUMAN <UniProt>	
antioxidant activity (GO:0016209)	71
★ SODC_HUMAN <UniProt>	
binding (GO:0005488)	13903
metal ion binding (GO:0046872)	1746
★ SODC_HUMAN <UniProt>	
biological_process (GO:0008150)	90647
physiological process (GO:0007582)	57524
metabolism (GO:0008152)	34355
oxygen and reactive oxygen species metabolism (GO:0006800)	75
superoxide metabolism (GO:0006801)	24
★ SODC_HUMAN <UniProt>	
development (GO:0007275)	9894
morphogenesis (GO:0009653)	3970
organogenesis (GO:0009887)	3106
neurogenesis (GO:0007399)	919
★ SODC_HUMAN <UniProt>	

Definition of SODC\_HUMAN (synonyms: IPI00218733): (Object Name: Superoxide dismutase [Cu-Zn]) (Object Type: protein)

**An example showing all occurrences of SODC protein in the Gene Ontology from the human annotation.**

# Common applications of GO

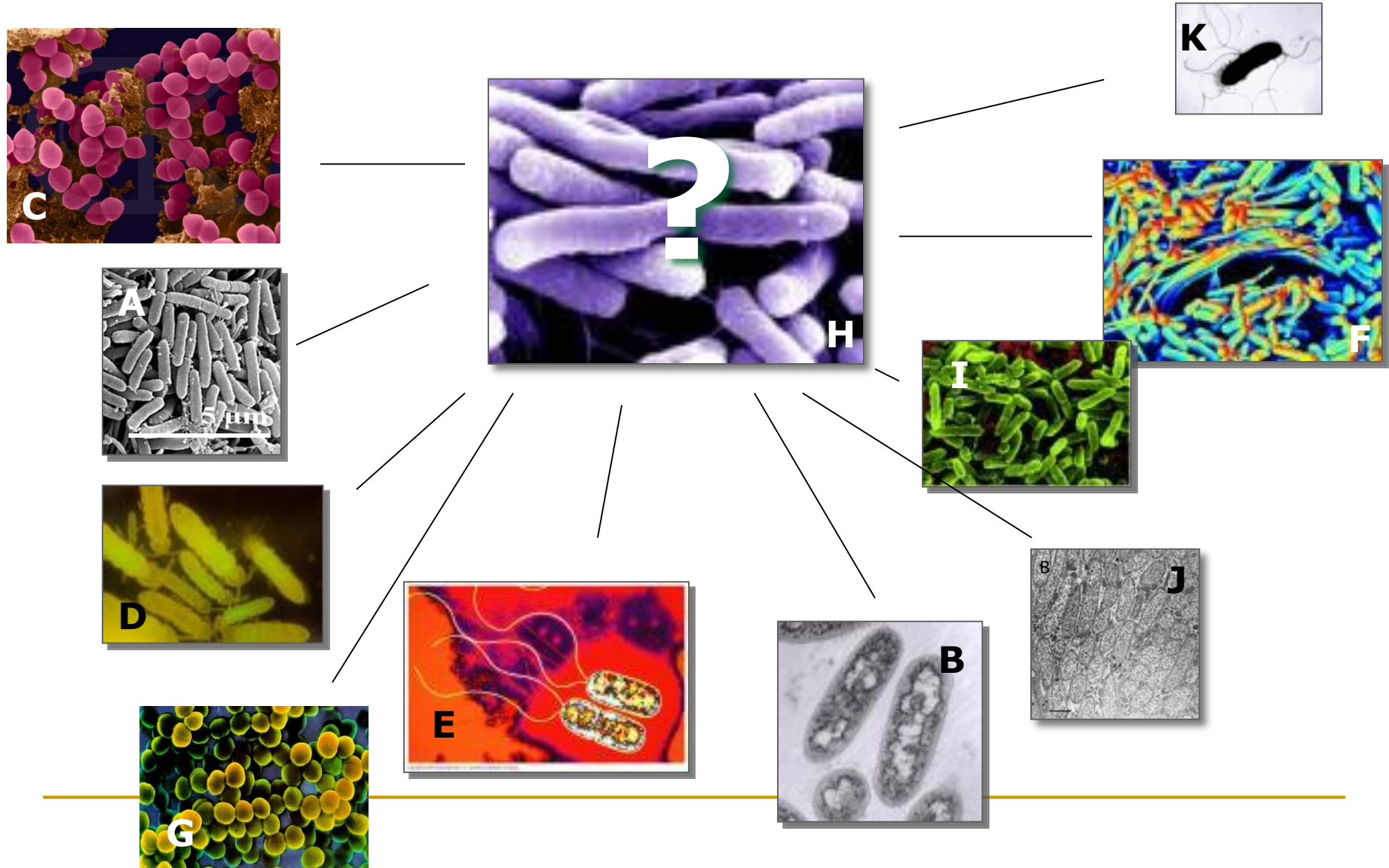
- Analysis of microarray data
  - Finding genes with similar functions
  - Utilize **biological process** ontology
- Evaluation of protein-protein interactions
  - Proteins are likely to interact if they are in the same location
  - Utilize **cellular component** ontology
- Studying Protein Binding Sites
  - Utilize **molecular function** ontology

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# Homology and Sequence Alignment



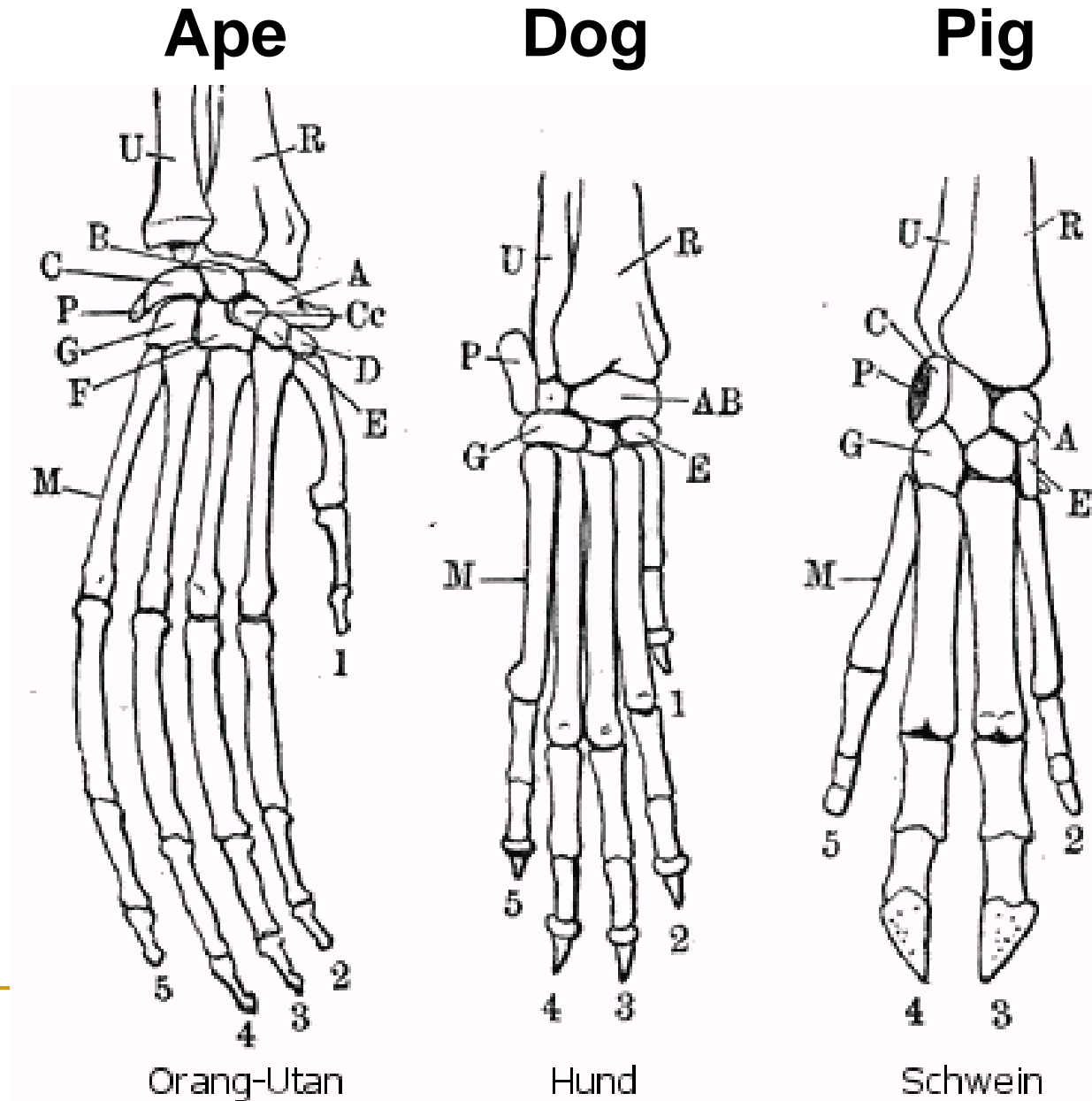
# How is this organism related to other species?



# Homology

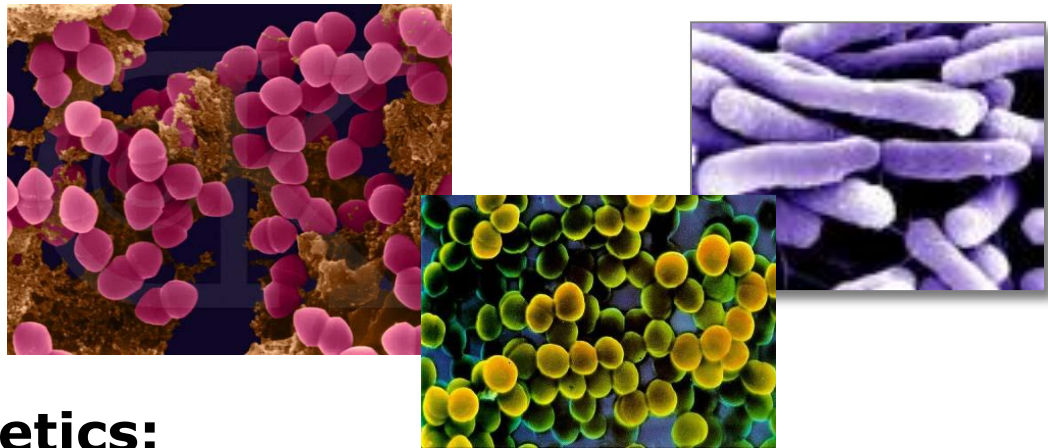
**Homology** =  
Similarity  
between  
objects due to  
a common  
ancestry

Hund = Dog,  
Schwein = Pig  
Orang-Utan=Ape



# DNA sequences provide characters that are:

- Numerous, discrete characters (A, T, C, G)
- Directly comparable across species
- Unlikely to change due to culture conditions



## Molecular phylogenetics:

Inference of evolutionary relationships based on molecular data

```
ACAGATGTCTTGTAATCCGGCCGTTGGTGGCATAGGGAAAGGACATTTAGTGAAAGAAATTGATGCGATGGGTGGATCGATGGCTTATGCTATCGA
TCAATCAGGAATTCAATTTAGAGTACTTAATAGTAGCAAAGGAGCTGCTGTTAGAGCAACACGTGCTCAGGCAGATAAAATATTATATCGTCAAGA
CAGATGTCTTGTAATCCGGCCGTTGGTGGCATAGGGAAAGGACATTTAGTGAAAGAAATTGATGCGATGACAGATGTCTTGTAATCCGGCCGTTGG
TGGCATAGGGAAAGGACATTTAGTGAAAGAAATTGATGCGATGGGTGGATCGATGGCTTATGCTATCGATCAATCAGGAATTCAATTTAGAGTACT
TAATAGTAGCAAAGGAGCTGCTGTTAGAGCAACACGTGCTCAGGCAGATAAAATATTATATCGTCAAGCAATACGTGGTGGATCGATGGCTTATGC
TATCGATCAATCAGGAATTCAATTTAGAGTACTTAATAGTAGCAAAGGAGCTGCTGTTAGAGCAACACGTGCTCAGGCAGATAAAATATTATATCG
TCAAGCAATACGTACAGATGTCTTGTAATCCGGCCGTTGGTGGCATAGGGAAAGGACATTTAGTGAAAGAAATTGATGCGATGGGTGGATCGATG
GCTTATGCTATCGATCAATCAGGAATTCAATTTAGAGTACTTAATAGTAGCAAAGGAGCTGCTGTTAGAGCAACACGTGCTCAGGCAGATAAAATA
TTATATCGTCAAGCAATACGTCAATACGCGTGCTCAGGCAGATAAAATATTA
```

# Sequence homology

Similarity between sequences as a result of common ancestry.

V	L	S	P	A	V	K	W	A	K	V	G	A	H	A	A	G	H	G
V	L	S	E	A	V	L	W	A	K	V	E	A	D	V	A	G	H	G

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# Sequence alignment

**Alignment:** Comparing two (pairwise) or more (multiple) sequences. Searching for a series of identical or similar characters in the sequences.

# Why align?

VLSPAVKWAKV  
| | | | |  
VLSEAVLWAKV

1. To detect if two sequences are homologous. If so, homology may indicate **similarity in function** (and structure).
2. Required for **evolutionary studies** (e.g., taxonomic tree reconstruction).
3. To **detect conservation** (e.g., a tyrosine (Y) amino acid that is evolutionary conserved, is more likely to be a phosphorylation site).
4. Given a sequenced DNA, from an unknown region, **align** it to the genome.

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# Insertions, deletions, and substitutions

## What makes them?

# A Note about Mutations

A **mutation** is a permanent change in the DNA sequence of a gene. Sometimes mutations can be useful but mostly they are harmful as changes in DNA can change the way a cell behaves. As genes are a set of hereditary materials that contain instructions necessary for a cell to work so if some of these instructions go wrong the cell may not know how to function.

Mutations can also be **acquired** depending on what sort of environment a person lives in as some environmental agents can damage the DNA or when mistakes occur during cell division. For example **radiations released during the nuclear disasters** in Hiroshima and Nagasaki and Chernobyl are still affecting and causing mutations in the genetic makeup of the people living in those areas. Moreover, different types of cancers are also caused by mutations.



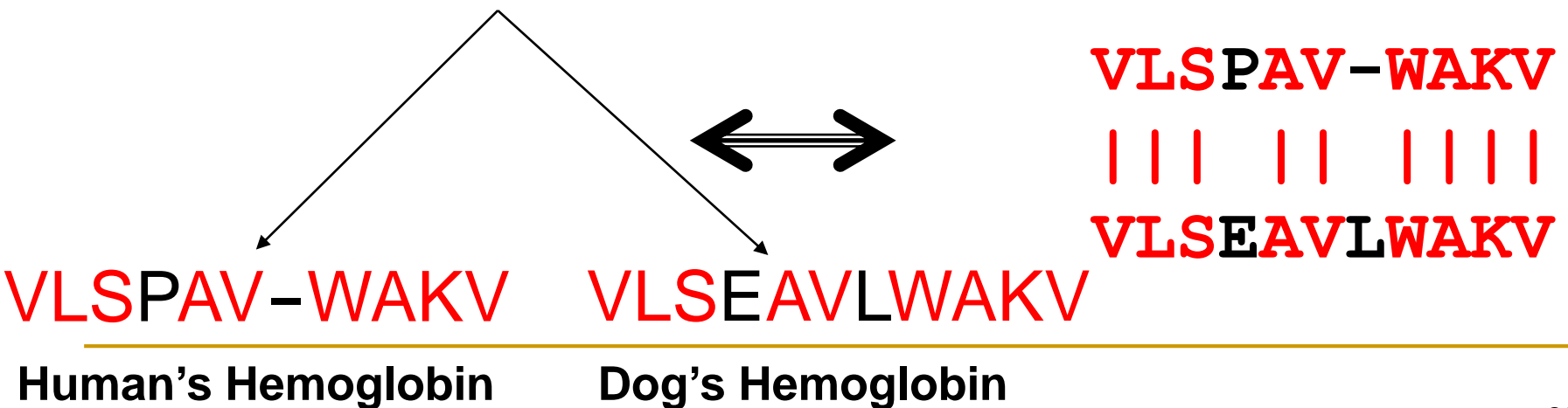
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# A Note about Mutations

Mutations can be **inherited** which means the mutated genetic code can be passed on to the next generations. For example heart disease, diabetes, stroke or high blood pressure, run in the family. If parents suffered from them, their children may also develop them. Ten million men in the U.S. are colour blind but less than 600,000 American women have the same disability. That's because this mutation is located on the X-chromosome. Men only have one X-chromosome, so that one is enough to induce the condition, but women have two X chromosomes, and they require the mutation in double set to experience the condition.

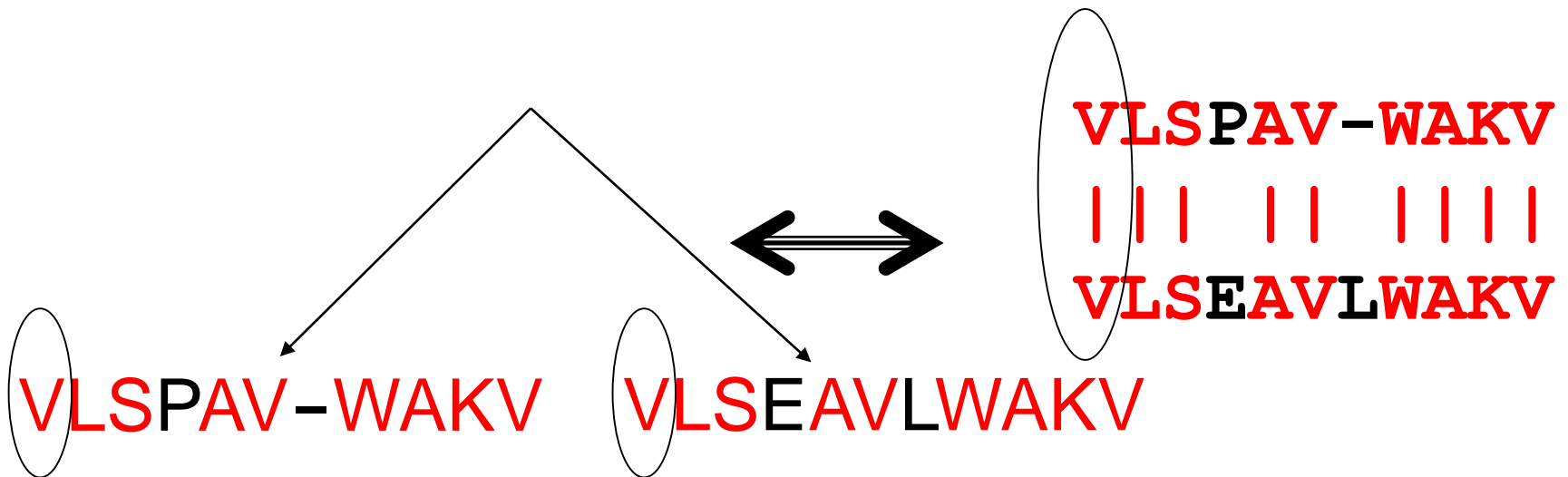
# Sequence alignment

If two sequences share a common ancestor – for example human and dog **hemoglobin**, we can represent their evolutionary relationship using a tree



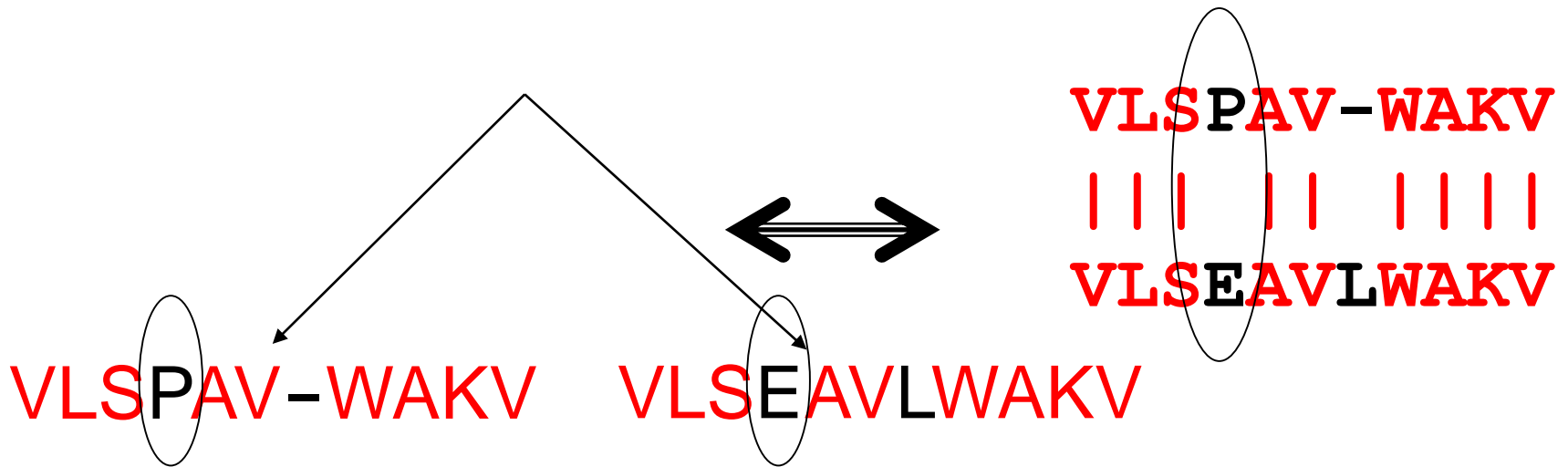
# Perfect match

A perfect match suggests that no change has occurred from the common ancestor (although this is not always the case).



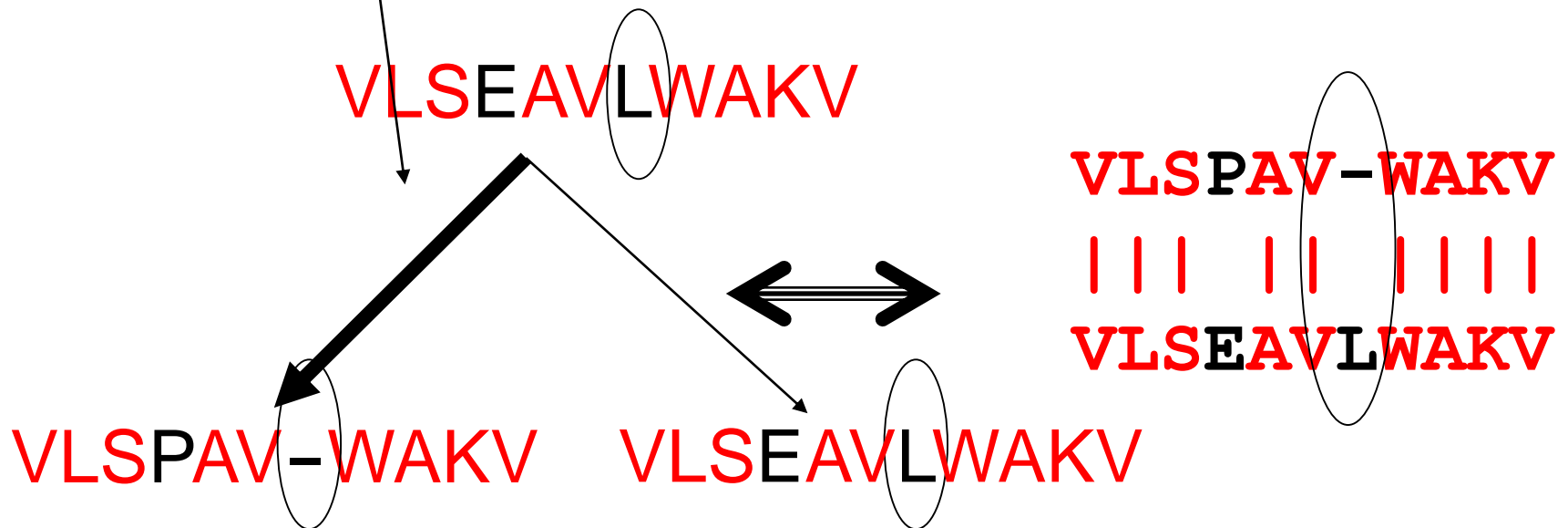
# A substitution

A substitution suggests that at least one change has occurred since the common ancestor (**although we cannot say in which lineage it has occurred**).



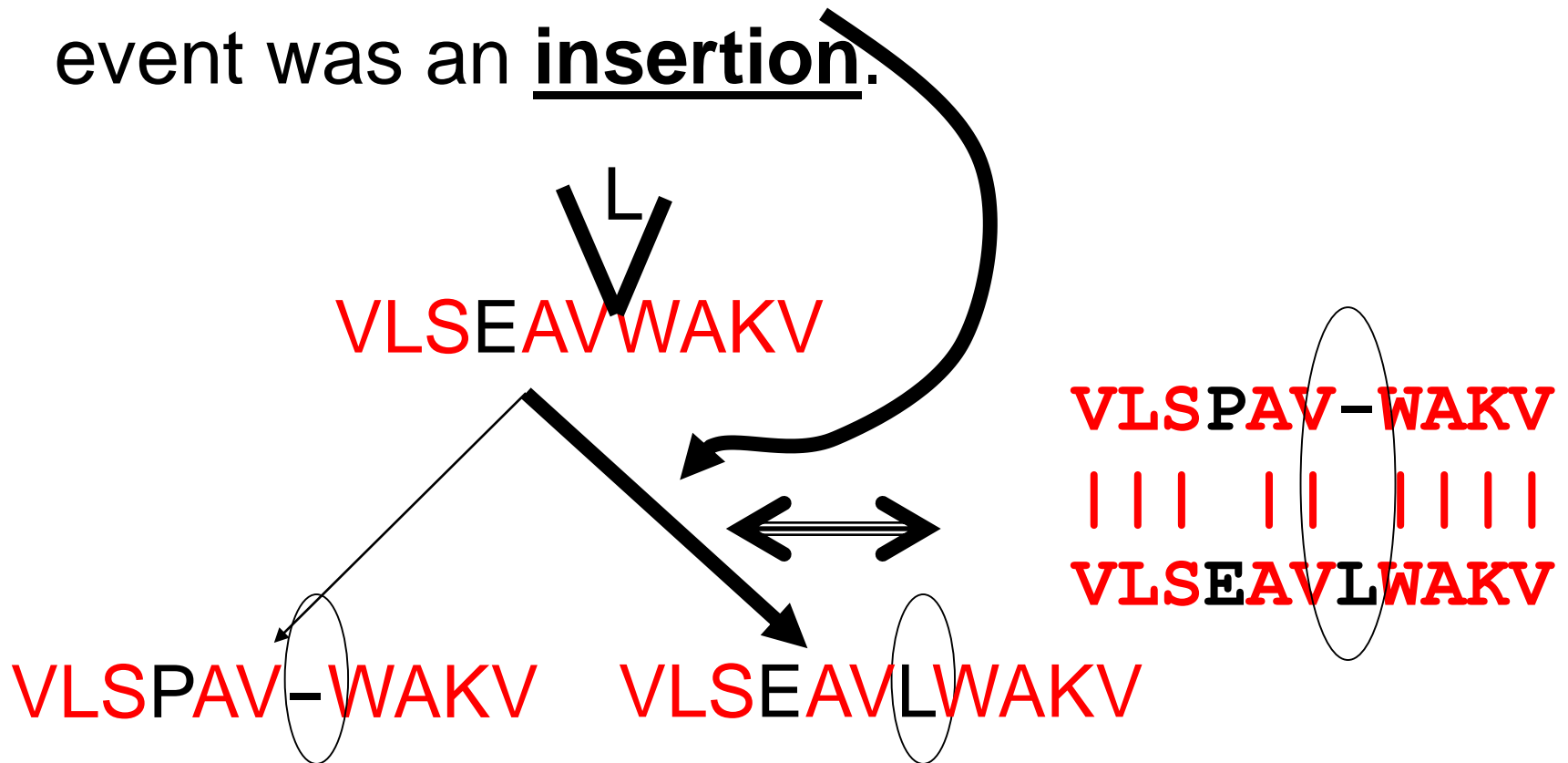
# Indel

Case 01: The ancestor had L and it was lost here. In such a case, the event was a deletion.



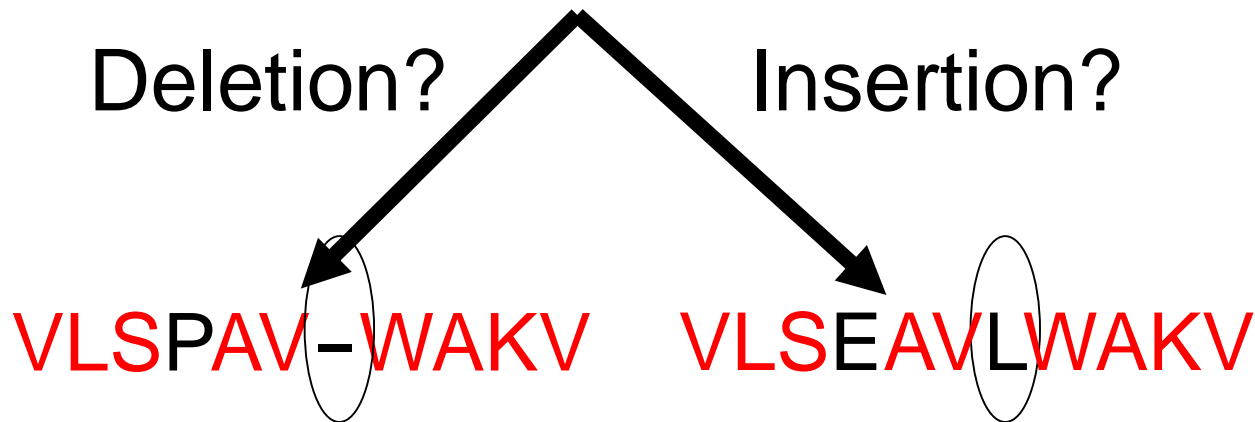
# Indel

Case 02: The ancestor was shorter and the L was inserted here. In such a case, the event was an insertion.



# Indel

Normally, given two sequences we cannot tell whether it was an insertion or a deletion, so we term the event as an **indel**.



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# Indels in protein coding genes

Indels in protein coding genes are often of 3bp, 6bp, 9bp, etc...

## **Gene Search**

In fact, searching for indels of length  $3K$  ( $K=1,2,3,\dots$ ) can help algorithms that search a genome for coding regions



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# Global and Local pairwise alignments

# Global vs. Local

- **Global alignment** – finds the best alignment across the **entire** two sequences.

```
ADLGAVFALCDRYFQ
|||||      |||||
ADLGRTQN-CDRYYQ
```

Global alignment: forces alignment in regions which differ

- **Local alignment** – finds regions of similar **parts** of the sequences.

```
ADLG      CDRYFQ
|||||    |||||
ADLG      CDRYYQ
```

Local alignment will return only **regions** of good alignment

# Global alignment



human	107	VREKYELAHPPPEWKYELRIRYLPKGFLNQFTEDKPTLNFFYQQVKSDYM	156
rhesus	151	VREKYELAHPPPEWKYELRIRYLPKGFLNQFTEDKPTLNFFYQQVKSDYM	200
human	157	LEIADQVDQEIALKLGCLERRSYWEMRGNALEKKSNYEVLEKDVGLKRF	206
rhesus	201	LEIADQVDQEIALKLGCLERRSYWEMRGNALEKKSNYEVLEKDVGLKRF	250
human	207	FPKSLDSVKAKTLRKLIQQTFRQFANLNREESILKFFEILSPVYRFDKE	256
rhesus	251	FPKSLDSVKAKTLRKLIQQTFRQFANLNREESILKFFEILSPVYRFDKE	300
human	257	CFKCALGSSWIIISVELAIGPEEGISYLTDKGCNPTHLADFTQVQTIQYSN	306
rhesus	301	CFKCALGSSWIIISVELAIGPEEGISYLTDKGCNPTHLADFTQVQTIQYSN	350
human	307	SEDKDRKGMLQLKIAGAPEPLTVTAPSLTIAENMADLIDGYCRLVNGTSQ	356
rhesus	351	SEDKDRKGMLQLKIAGAPEPLTVTAPSLTIAENMADLIDGYCRLVNGASQ	400
human	357	SFIIRPQKEGERALPSIPKLANSEKQGMRTHAVSVSETDDYAEIIDEEDT	406
rhesus	401	SFIIRPQKEGERALPSIPKLANSEKQGMRTHAVSVSETDDYAEIIDEEDT	450
human	407	YTMPSTRDYEIQRERIELGRCIGEGQFGDVHQGIYMSPENPALAVAIKTC	456
rhesus	451	YTMPSTRDYEIQRERIELGRCIGEGQFGDVHQGVYMSPENPALAVAIKTC	500
human	457	KNCTSDSVREKFLQEALTMRQFD-HPHIVKLIGVITENPVWIIIMELCTLG	505
rhesus	501	KNCTSDSVREKFLQEALTMRQFD-HPHIVKLIGVITENPVWIIIMELCTLG	550

PTK2 protein *tyrosine kinase 2* of human and Rhesus monkey

# Global alignment

A “:” Conserved amino acid substitutions are the replacement of an amino acid residue with another one with **similar properties**, such as **aspartate** for **glutamate**. They are both negatively charged amino acids.

A “.” semi-conserved amino acid replaces one residue with another one that has similar **steric conformation**, but does not share chemical properties. An example would be substituting **cysteine** for **alanine** or **leucine**.

Local Alignment: Proteins are comprised of domains

**Human PTK2 :**

Domain A

Domain B



Protein tyrosine  
kinase domain

# Protein tyrosine kinase domain

In Leukocytes, a different gene product for tyrosine kinase domain is expressed.

Domain A

Domain X



Protein tyrosine  
kinase domain

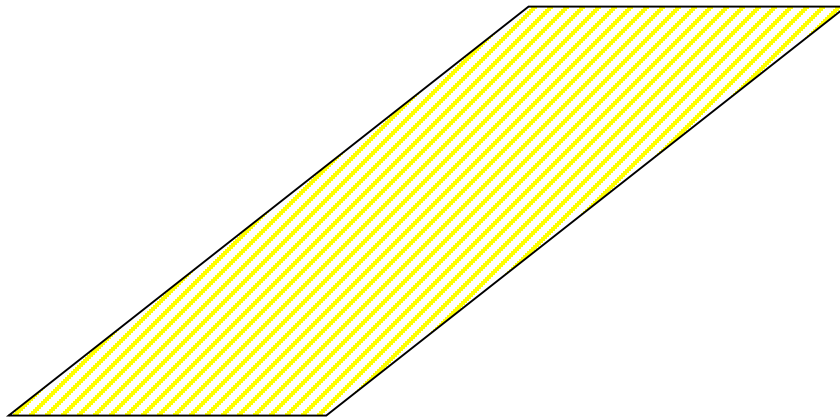
PTK2

The sequence similarity is restricted to a single domain

Domain A

Protein tyrosine  
kinase domain

Domain B



Domain X



Protein tyrosine  
kinase domain

Leukocyte TK

# Global alignment of PTK and LTK



```
human_ptk2      9  -----NLNHTPNSSSTKTHLG-----TGMERSPGAMERVLKVFHYFESN      46
                  |...|...|...|...|...|...|...|...|...|...|...|...|
human_ptk2    251  SPEKLENRSEAPGSGGRGGAAGGGGGWTSRAPSPQAGRSLQEG      300
human_ptk2      9  SEPTTWASI-----IRHGDA      73
                  .||::
human_LTK      9  AWATLGWAAAGGFGGGGGACTAGGGGGGY      342
human_ptk2      9  NGFRLSHLRSEEVHWLHVD      123
                  |...|...|...|...|...|...|...|...|...|...|...|...|
human_LTK    343  -----HPSSE-----      358
human_ptk2    124  LRIR      173
                  :...|...|...|...|...|...|...|...|...|...|...|...|
human_LTK    359  -----AVTENHGE      372
human_ptk2    174  LEIRRSV      223
                  :|||
human_LTK    373  -----      377
human_ptk2      9  MREESILKFFEIL      272
                  :||
human_LTK      9  ---HLN-----NQAEQL      397
human_ptk2      9  A--IGPEEGISYLTDK-GCNPTHLADFTQVQTL      319
                  | :. | ||:....|. .|...|
human_LTK    398  AECLCP-EGMELAVDNVTCMDLH-----      419
human_ptk2    320  IAGAPEPLTVTAPSLTIAENMADLIDGYCRLVNGTSQSFIIR      465
                  ...|...|...|...|...|...|...|...|...|...|...|...|
```



# Local alignment of PTK and LTK

human_ptk2	343	LIDGYCRLVNGTSQSFIIRPQKE----GERALPSIPKLANSEKQGMRTHA	388
		:      : . .  . :..  :      . .     :    ...: . .	
human_LTK	439	LL-----MVCGV---LILVKQKKWQGLQEMRLPS-PEL---ELSKLRTSA	476
human_ptk2	389	VSVSETDDYAEI-IDEEDTYTMPSTRDYEIQRERIELGRCIGEGQFGDVH	437
		:..... ::: :.....::: ....  :.....: . .:. . .  :::	
human_LTK	477	IRTAPNPYYCQVGLGPAQSWPLPPGVT-EVSPANVTLLRALGHGAFGEVY	525
human_ptk2	438	QG--IYMSPENPALAVAIKTCKNCTSDSVREKFLQEALTMRQFDHPHIVK	485
		:    :..... .     ..... ..... . .    :..: . .:. :::	
human_LTK	526	EGLVIGLPGDSSPLQVAIKTLPELCSPQDELDLMEALIISKFRHQNIVR	575
human_ptk2	486	LIGV-ITENPVWIIIMELCTLGELRSFLQVRKYSLD-----LASLILYAY	528
		.. : :... . . ::  :.. :::    :..... .  :... ... .  .	
human_LTK	576	CVGLSLRATPRLILLEMSGGDMKSFLRHSRPHLGQPSPLVMRDLLQLAQ	625
human_ptk2	529	QLSTALAYLESKRFFVHRDIAARNVLVS---SNDCVKLGDFGLSRYMEDST	575
		.....   ... :       . :   :.... :    :: . .....:	
human_LTK	626	DIAQGCHYLEENHFIHRDIAARNCLLSCAGPSRVAKIGDFGMARDIYRAS	675
human_ptk2	576	YY-KASKGKLPIKUMAPESINFRRFTSASDVWMFGVCMWEILMHGVKPFQ	624
		:.....  :    .  :.....   : . .    :    ... . .:.	
human_LTK	676	YYRRGDRALLPVKWPPEAFLEGIFTSKTDSSWSFGVLLWEIFSLGYMPYP	725
human_ptk2	625	GVKMNDVIGRIENGERLPMPNCPPTLYSLMTKCWAYDPSRRPRFTE---	671
		.. : :..... . :.. . .  ... : :    :..: . . . . ..	
human_LTK	726	GRTNQEVLD FVVGGGRMDPPRGCPGPVYRIMTQCWQHEPELRPSFASILE	775

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# Conclusions

Use global alignment when the two sequences share the same overall sequence arrangement.

Use local alignment to detect **regions** of similarity.

# How alignments are computed

# Pairwise alignment

AAGCTGAATTCGAA  
AGGCTCATTCTGA

**One possible alignment:**

AAGCTGAATT-C-GAA  
AGGCT-CATTTCTGA-

AAGCTGAATT-C-GAA  
AGGCT-CATTCTGA-

This alignment includes:

2 mismatches

4 indels (gap)

10 perfect matches

# Choosing an alignment for a pair of sequences

Many different alignments are  
possible for 2 sequences:

```
AAGCTGAATTCGAA
AGGCTCATTCTGA
```

```
A-AGCTGAATTC--GAA
AG-GCTCA-TTTCTGA-
```

```
AAGCTGAATT-C-GAA
AGGCT-CATTCTGA-
```

**Which alignment is better?**

# Scoring system (naïve)

**Perfect match: +1**

**Indel (gap): -1**

**Mismatch: -2**

AAGCTGAATT-C-GAA  
AGGCT-CATTCTGA-

A-AGCTGAATTC--GAA  
AG-GCTCA-TTCTGA-

$$\text{Score:} = (+1) \times 10 + (-2) \times 2 + (-1) \times 4 = 2$$

$$\text{Score:} = (+1) \times 9 + (-2) \times 2 + (-1) \times 6 = -1$$

Higher score → Better alignment

# Alignment scoring - scoring of sequence similarity:

Assumes independence between positions:  
each position is considered separately

## Scores each position:

- Positive if identical (match)
- Negative if different (mismatch or gap)

Total score = sum of position scores  
Can be positive or negative



# Scoring systems

# Scoring system

- In the example above, the choice of +1 for match, -2 for mismatch, and -1 for gap is quite arbitrary
- Different scoring systems → different alignments
- We want a good scoring system...

# Scoring matrix

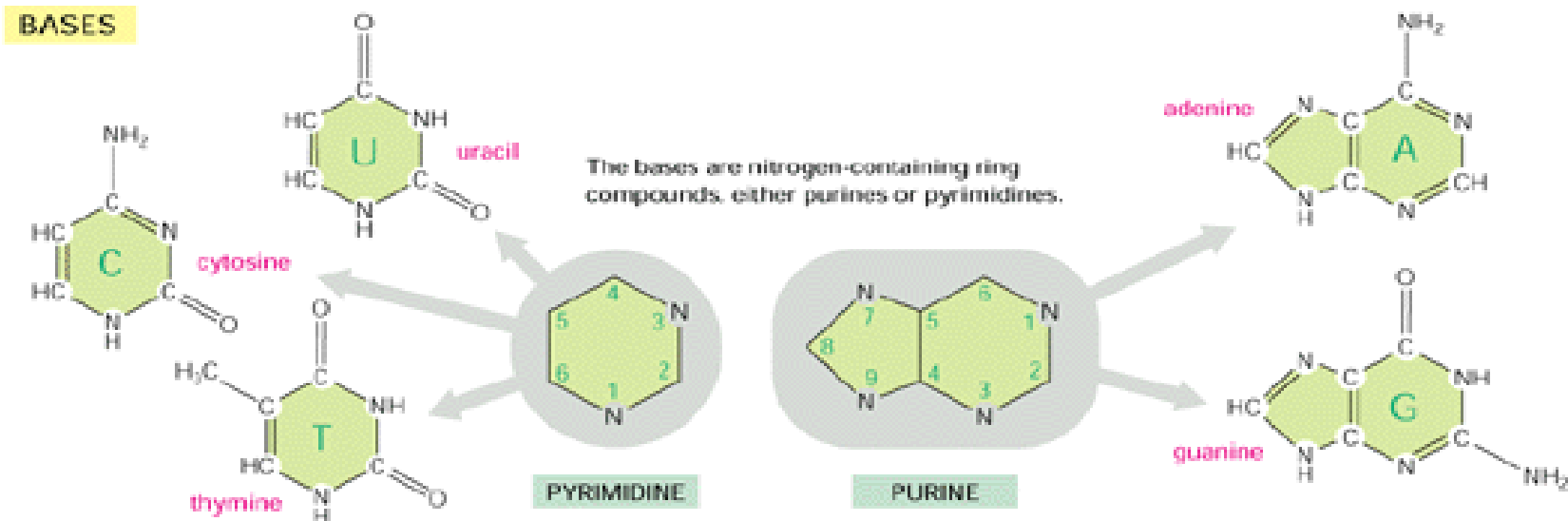
- Representing the scoring system as a table or matrix  $n \times n$  ( $n$  is the number of letters the alphabet contains.  $n=4$  for nucleotides,  $n=20$  for amino acids)
- symmetric

	A	G	C	T
A	2			
G	-6	2		
C	-6	-6	2	
T	-6	-6	-6	2

# DNA scoring matrices

Can take into account biological phenomena such as:

- Transition-transversion



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Thank you for your attention!

Questions?