### Introduction to basic bioinformatics

- 1) Online databases
- Making biological sense of DNA sequences: finding and predicting function of protein coding genes
- 3) Using NCBI
- 4) What is BLAST?
- 5) Using BLAST for sequence analysis

www.ncbi.nlm.nih.gov

#### Guide to readings on bioinformatics:

- 1) 19 MC4 Bioinformatics
  - Intro
  - The UCSC Genome Browser
  - Algorithms, portals and methods
  - BLAST and ClustalW
  - Motif finding
- 2) Margaret Dayhoff, pioneer of bioinformatics (2019)
- 3) The beginners guide to genome annotation (2012)
- 4) BLOSUM 62: How this homology search algorithm works.
- 5) 2019-nCoV: sequencing, and two perspectives articles
- 6) Web sites (referred to in the notes)

# Bioinformatics: storage and analysis of biological information

- Nucleotide and protein sequence
- Macromolecular structures
- Gene expression patterns
- Biochemical pathways
- Evolutionary relationships
- Sorting/visualizing large data sets

# Bioinformatics databases: repositories for biological information

# Primary sequence databases:

- NCBI/Genbank
- DNA Databank of Japan (DDBJ)
- European Molecular Biology Laboratory (EMBL)

### Annotated protein sequence databases:

- SWISS-PROT (most accurate annotation: structures, functions, protein families, with references)
- TrEMBL (most current, but not fully annotated)

Protein structure: The Protein Databank (pdb.org)

Many other databases exist, e.g ENCODE, UCSC genomes, etc. <a href="https://academic.oup.com/nar/issue/49/D1">https://academic.oup.com/nar/issue/49/D1</a>

# Genome sequencing projects

JGI: the Joint Genome Initiative at the US Dept. of Energy (DOE)

https://genome.jgi.doe.gov/portal/

# The genome annotation pipeline

- 1. Make sure the genome assembly is ready. N50 scaffold length should be at least the median size of a gene.
- 2. Find repeat sequences and mask them (mark as repeats)
- 3. Gene prediction:
  - Align known proteins and ESTs (Expressed Sequence Tags) to the sequence to identify exons. Then identify splice sites
  - Also us ab initio gene identification software
- 4. Gene identification:
  - Automated annotation: multiple gene finders are run, and the consensus is used
  - Alignment data can be used to improve results
  - Manual curation (evidence-based decisions)
- 5. Assess the quality of annotation
  - Number of protein domains
  - Agreement of annotation with RNA info (EST, seq)
- 6. Visualize, share, and *update* the annotation

# A genome annotation is continuously updated as new experiments are done

Many predicted genes have unknown functions

Many genome features are difficult to annotate

- Regulatory regions: promoters, DNA binding sites
- Non-coding RNAs
- Transposons
- Pseudogenes

"Like parenthood, annotation responsibilities do not end with birth. Incorrect and incomplete annotations poison every experiment that makes use of them."

Yandell and Ence (2012) "A beginner's guide to eukaryotic genome annotation"

Genome annotation in the news: nCoV-2, the virus causing COVID-19

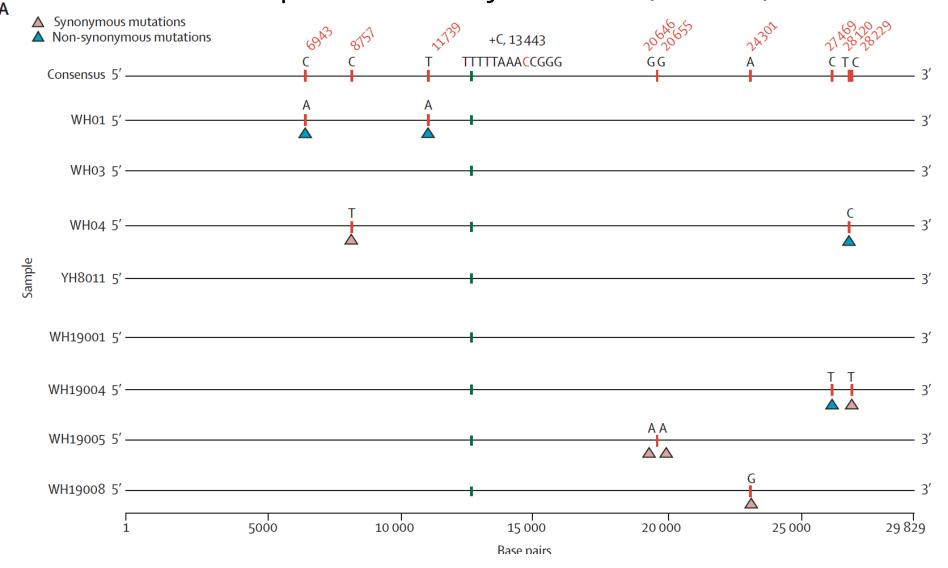
# Genomic characterisation and epidemiology of 2019 novel coronavirus: implications for virus origins and receptor binding

Roujian Lu\*, Xiang Zhao\*, Juan Li\*, Peihua Niu\*, Bo Yang\*, Honglong Wu\*, Wenling Wang, Hao Song, Baoying Huang, Na Zhu, Yuhai Bi, Xuejun Ma, Faxian Zhan, Liang Wang, Tao Hu, Hong Zhou, Zhenhong Hu, Weimin Zhou, Li Zhao, Jing Chen, Yao Meng, Ji Wang, Yang Lin, Jianying Yuan, Zhihao Xie, Jinmin Ma, William J Liu, Dayan Wang, Wenbo Xu, Edward C Holmes, George F Gao, Guizhen Wu¶, Weijun Chen¶, Weifeng Shi¶, Wenjie Tan¶

www.thelancet.com Vol 395 February 22, 2020

- Sequences of samples from 9 patients, several of whom had onset of symptoms in late December 2019
- Sequences were made freely available in January 2020

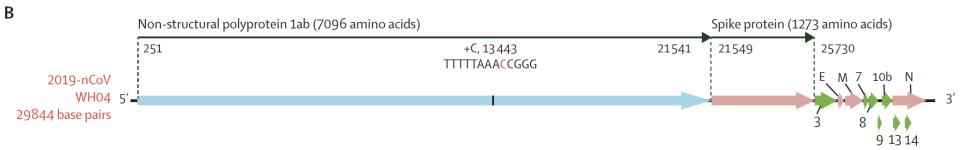
# 2019 nCoV-2 sequences: nearly identical (99.98%)



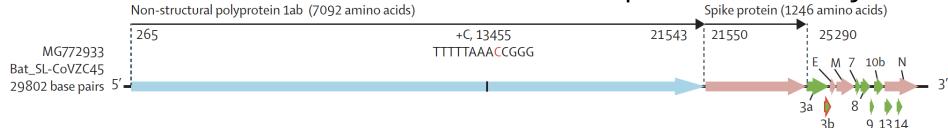
 therefore the virus has only made a recent entry into human populations

# The viral genes were identified and the sequences compared with other coronaviral genomes

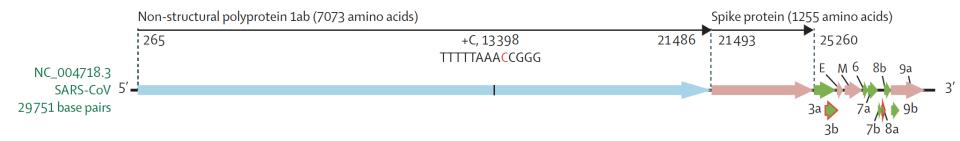
# 2019-nCoV genetic map



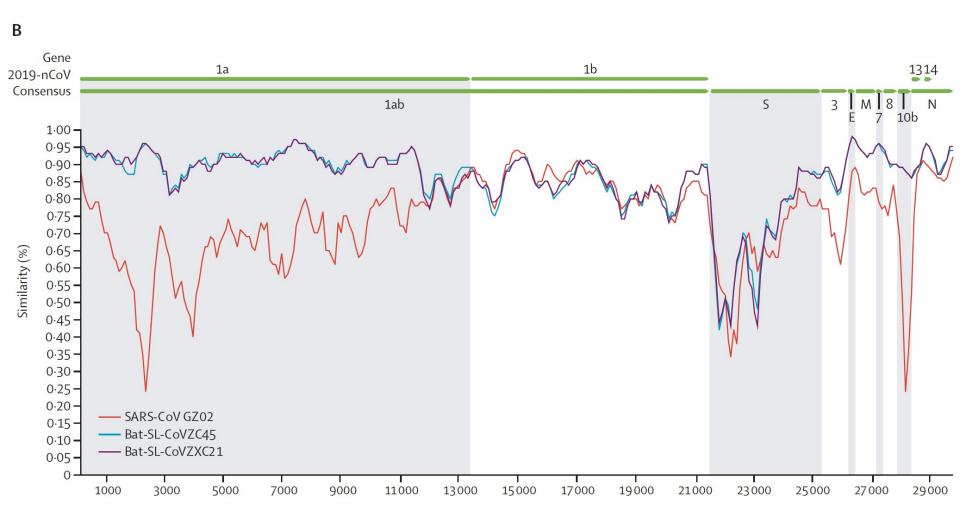
### Bat SARS-like Beta coronavirus (88% sequence similarity)



# SARS-CoV (79% sequence similarity)

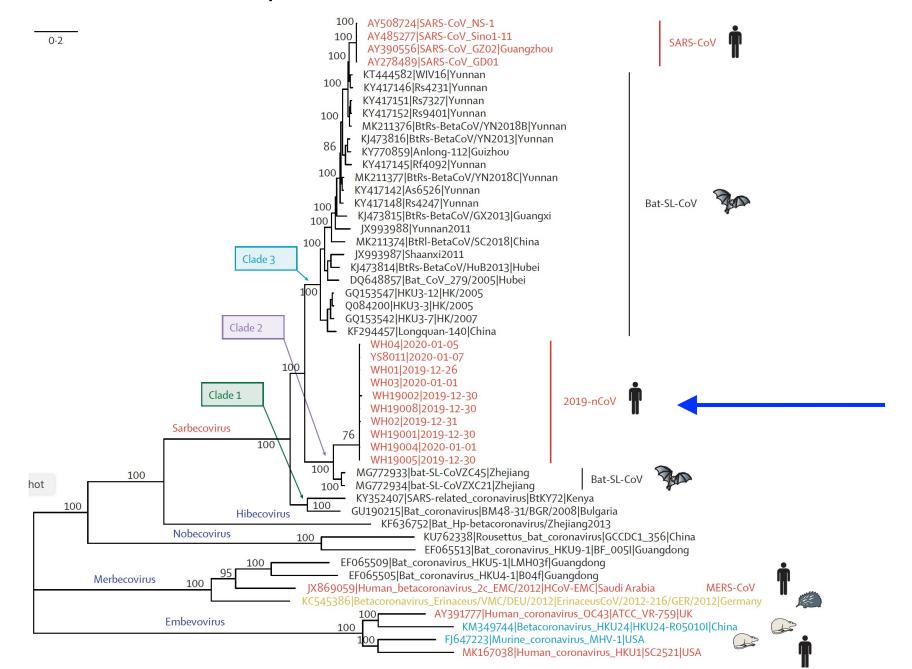


# Sequence similarity of related viruses to 2019-nCov

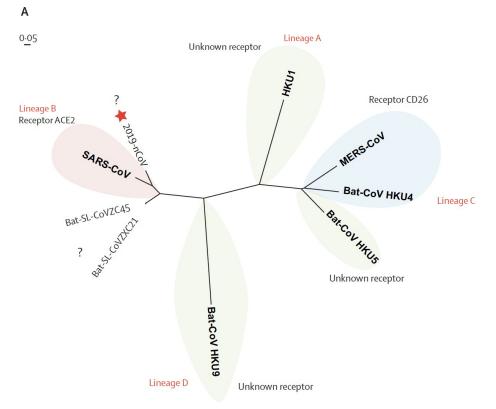


The lowest similarity with Bat CoV is in 'spike' protein

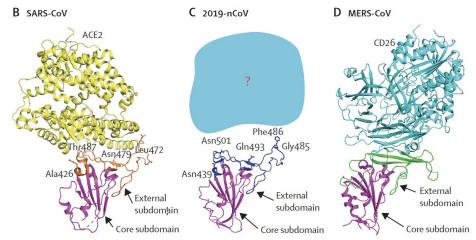
# 2019 nCoV-2 sequences are closest to bat CoV



#### How does 2019-nCoV attach to human cells?



Receptor binding domain of spike protein closely related to SARS and bat CoV



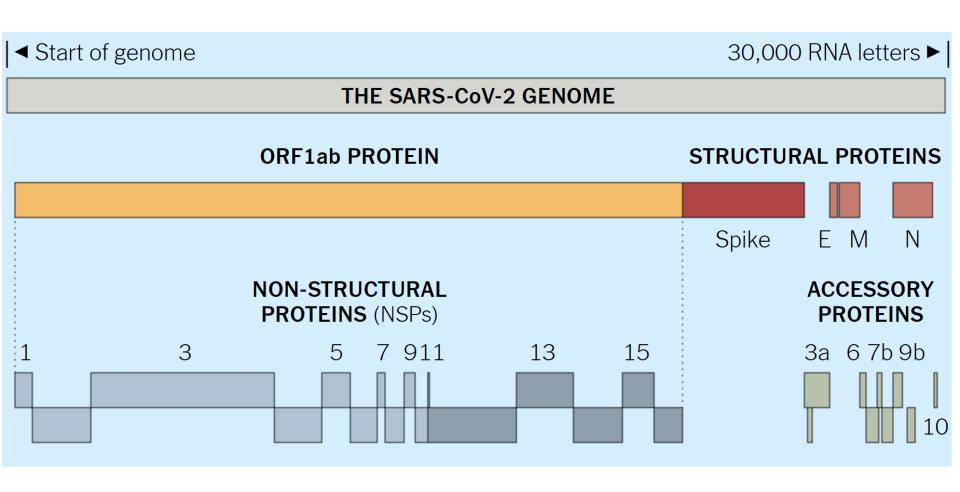
SARS CoV interacts with human ACE2 receptor, likely same for 2019-nCov

# Takeaways from the 2019-nCoV sequence and annotation

- Single strand RNA genome -- 29,829 bases in length
- Single introduction of the virus into humans, and then human to human spread
- Most similar to bat beta coronaviruses, but may not have come directly from bats, but instead from intermediary species
- The spike protein may interact with human ACE2 receptor protein (this is supported by recent structural work)

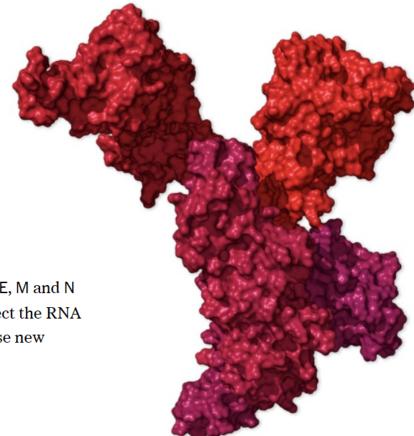
#### An annotation of 2019-nCoV

'Bad news wrapped in protein' Corum & Zimmer 4/3/20



Each protein-coding sequence is discussed in order

# Protein structures can be predicted by comparison to closely related examples, as can functions

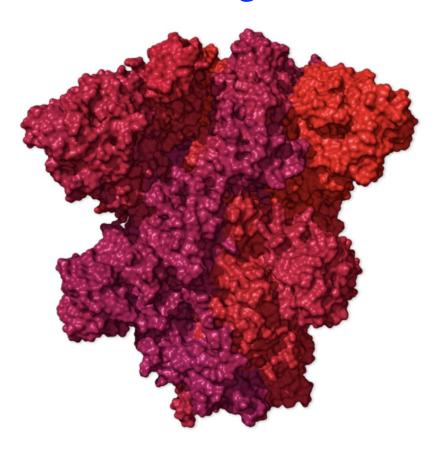


Spike Protein · S

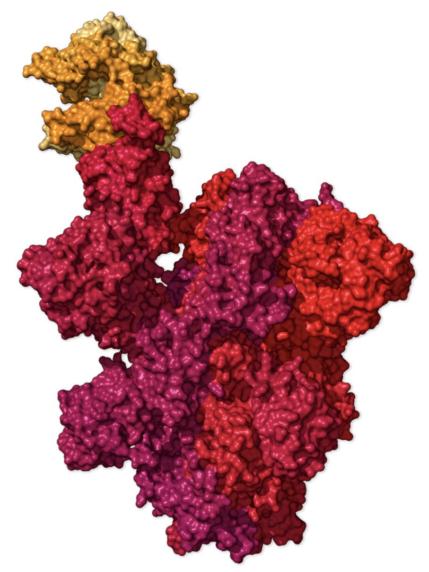
The spike protein is one of four structural proteins — S, E, M and N — that form the outer layer of the coronavirus and protect the RNA inside. Structural proteins also help assemble and release new copies of the virus.

The S proteins form prominent spikes on the surface of the virus by arranging themselves in groups of three. These crownlike spikes give coronaviruses their name.

# The spike protein is a target for the immune system, as well as for design of one class of antiviral therapies



Part of the spike can extend and attach to a protein called ACE2 (in yellow below), which appears on particular cells in the human airway. The virus can then invade the cell.



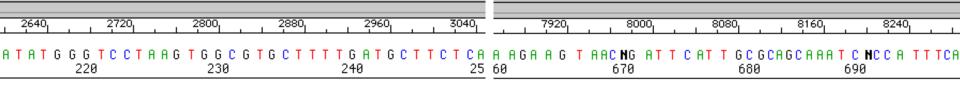
The spike protein changes conformation to interact with ACE2

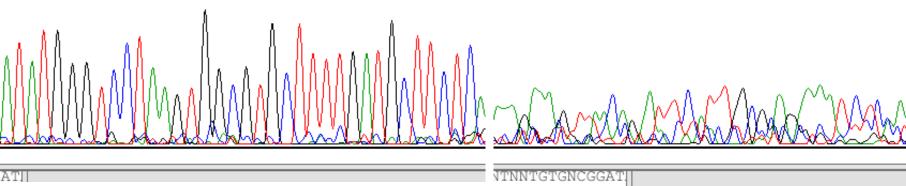
# What's in a genome?

- 1) Genes
  - a) Protein-coding
    - Where are the open reading frames?
    - What are the ORFs most similar to? (What is the function/structure/evolution history?)
  - b) RNA
- 2) Non-genes
  - a) Regulation: promoters and factor-binding sites
  - b) Transactions: replication, repair, and segregation, DNA packaging (chromatin)

# Sequence output

#### Raw data





#### Computer calls

# What does this sequence do?

Perhaps it encodes a protein...

# Does the DNA encode a protein? Find an open reading frame (ORF) using "ORF Finder"

# https://www.ncbi.nlm.nih.gov/orffinder/

- a graphical analysis tool which finds all open reading frames of a selectable minimum size in a user's sequence or in a sequence already in the database
- Identifies all open reading frames using the standard or alternative genetic codes
- Deduced amino acid sequence can be searched against other sequence databases, e.g. using the WWW BLAST server

Look up the orfs using NCBI ORF finder:

# ORF identification: things to consider

- The identification of ORFs catches most, but not all protein coding genes
- Not all genes initiate with ATG, e.g. in certain microbes (e.g. archaea)
- What is the shortest possible length of a real ORF? 100 amino acids is the typical boundary, but:
  - There are many ORFs of 100-150 codons that don't encode proteins
  - There are some ORFs of less than 100 codons that do encode proteins
- In eukaryotes, identifying the full protein coding region is complicated by the presence of introns

### What is the function of the ORF?

### Classical methods (slow, but reliable)

- mutate gene, observe phenotype for clues to function (genetics)
- purify protein product, test activity in vitro (biochemistry)

# Similarity of ORF to other genes

- if a gene has been previously studied, you want to know right away!
- gene sequences that have high sequence identity often have the same or similar functions

# Homology of proteins

Homology: similarity of biological structure, physiology, development, and evolution, <u>based on common ancestry</u>

Homologous proteins: statistically similar sequence *may* indicate similar function

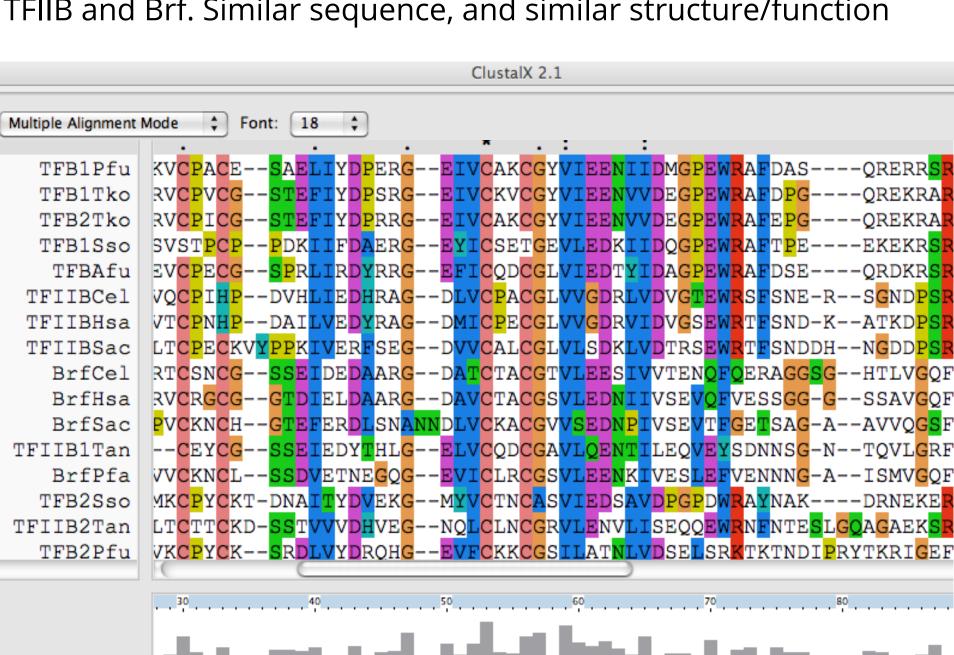
# Alignment of sequences

The principle: two homologous sequences derived from the same ancestral sequence will have at least some identical (similar) amino acid residues that allow them to be aligned

Alignment quality is judged by three things:

- 1) Percent identity: fraction of <u>identical amino acids</u> as a measure of structural/functional similarity
- 2) Similarity score: amino acids that have similar physical/chemical properties are more likely to substitute for each other in important functional regions, therefore contribute to alignment quality
- 3) Gaps in similar/homologous sequences are infrequent, and are cause penalty scores in alignment

# Alignment of specified sequences: archaeal TFB and eukaryotic TFIIB and Brf. Similar sequence, and similar structure/function



# NCBI: National Center for Biotechnology Information

NCBI home page -- Go to www.ncbi.nlm.nih.gov for the following (and much, much more)

<u>PubMed, PubMed Central:</u> search tool for scientific literature--search by author, subject, title words, etc.

**BLAST:** Basic Local Alignment Search Tool

Nucleotide, Genome, Gene, Protein: databases for each

OMIM: Online Mendelian Inheritance in Man

**Bookshelf:** many online textbooks available

<u>GEO:</u> Gene Expression Omnibus, for analysis of microarray and related data

<u>PubChem:</u> Information of biological activities of small molecules

Guide to NCBI: see first entry at this link <a href="https://academic.oup.com/nar/issue/49/D1">https://academic.oup.com/nar/issue/49/D1</a>

# Using NCBI: Education and Tutorials pages

" The Handbook" : <a href="https://www.ncbi.nlm.nih.gov/books/NBK143764/">https://www.ncbi.nlm.nih.gov/books/NBK143764/</a>

Video guides and tutorials: <a href="https://www.ncbi.nlm.nih.gov/home/learn/">https://www.ncbi.nlm.nih.gov/home/learn/</a>

Other training and tutorials: https://www.ncbi.nlm.nih.gov/guide/training-tutorials/

Help manual: https://www.ncbi.nlm.nih.gov/books/NBK3831/

BLAST guide: ftp://ftp.ncbi.nih.gov/pub/factsheets/HowTo\_BLASTGuide.pdf

Note: Lots of other non-NCBI servers exist for bioinformatics tools, see index at: https://academic.oup.com/nar/issue/49/D1

# What does BLAST do?

- Searches the chosen sequence database and identifies sequences with similarity to test sequence
- 2) <u>Ranks</u> similar sequences by degree of homology (E value)
- 3) Illustrates <u>alignment</u> between test sequence and similar sequences

# Programs available for BLAST searches

#### Protein sequence

blastp--compares an amino acid query sequence against a protein sequence database

tblastn--compares a protein query sequence against a nucleotide sequence database translated in all reading frames

#### **DNA** sequence

blastn--compares a nucleotide query sequence against a nucleotide sequence database

blastx--compares a nucleotide query sequence translated in all reading frames against a protein sequence database

tblastx--compares the six-frame translations of a nucleotide query sequence against the six-frame translations of a nucleotide sequence database.

# How a protein BLAST search works

A query protein sequence is first converted into overlapping segments (words)

Synonyms for each query word are located in a sequence database, with "scores" for each, based on a Dayhoff matrix (e.g. BLOSUM 62: BLOcks of amino acid SUbstitution Matrix)

```
Arg
Synonym values over a T, or threshold value, are cys of the same of the words, and similarity an
                                                                                                                                                Synonym values over a T, or threshold value, are
Met -1 -1 -2 -3 -1
Ser 1 -1 1 0 -1 0 0 0 -1 -2 -2 0 -1 -2 -1
Thr 0 -1 0 -1 -1 -1 -1 -2 -2 -1 -1 -1 -1 -2 -1
Trp -3 -3 -4 -4 -2 -2 -3 -2 -2 -3 -2 -3 -1 1 -4
                                                                           -2 -3 -2 -1 -2 -3 2 -1 -1 -2 -1
Tyr -2 -2
                       Ala Arg Asn Asp Cys Gln Glu Gly His Ile Leu Lys Met Phe Pro Ser Thr Trp Tyr Val
```

### Margaret Dayhoff, founder of bioinformatics



https:// www.whatisbiotechnolog y.org/index.php/people/ summary/Dayhoff

https:// www.smithsonianmag.c om/science-nature/howmargaret-dayhoffhelped-bring-computingscientific-research-180971904/

- **1948**: PhD in quantum chemistry
- 1961 and onward: worked as evolutionary biologist, and developed the <u>first substitution matrices</u> used to judge the significance of alignments between protein sequences

These are the PAM matrices (Position Accepted Mutation), available today for your BLAST searches

- <u>Invented the single letter codes</u> for amino acids (very important for computation)
- 1965: Initiated <u>first collection of protein sequences</u>, "Atlas of Protein Sequences and Structure"
- 1966: with Richard Eck, created first computationally derived <u>phylogenetic tree</u> reconstruction
- **1971**: Created <u>first computer database for protein sequences</u> (the Protein Information Resource)
- **1980**: made <u>largest nucleotide sequence database</u> <u>freely available</u> by telephone network

# Where did the BLOSUM62 alignment score matrix come from?

Sean R Eddy

NATURE BIOTECHNOLOGY VOLUME 22 NUMBER 8 AUGUST 2004

" ...details in BLOSUM62 that may seem counterintuitive at first glance. For instance, tryptophan (W/W) pairs score +11, while leucine (L/L) pairs only score +4; why shouldn' t all identities get the same score? The rarer the amino acid is, the more surprising it would be to see two of them align together by chance. In the homologous alignment data that BLOSUM62 was trained on, leucine/leucine (L/L) pairs were in fact more common than tryptophan/tryptophan (W/W) pairs (pLL =0.0371, pWW = 0.0065), but tryptophan is a much rarer amino acid (fL = 0.099, fW = 0.013). Run those numbers (with BLOSUM62) 's original  $\lambda$  = 0.347) and you get +3.8 for L/L and +10.5 for W/W, which were rounded to +4 and +11."

# **BLAST** scores

In any given alignment:

- matches (identical or similar) RAISE score
- mismatches LOWER score
- gaps LOWER score

Three criteria are used in the display of the highest scoring ('best') sequences:

- 1) percent identity
- 2) similarity score
- 3) E-value--probability that two sequences will have the similarity they have by chance (lower numbers mean a higher probability of evolutionary homology, and so a higher probability of similar function)

# What is the E-value? (https://youtu.be/nO0wJgZRZJs)

The E value (also called Expect value) represents the chance that the similarity is random and therefore insignificant.

...the E value describes the random background noise that exists for matches between sequences. For example, an E value of 1 assigned to a hit can be interpreted as meaning that in a database of the current size one might expect to see 1 match with a similar score simply by chance.

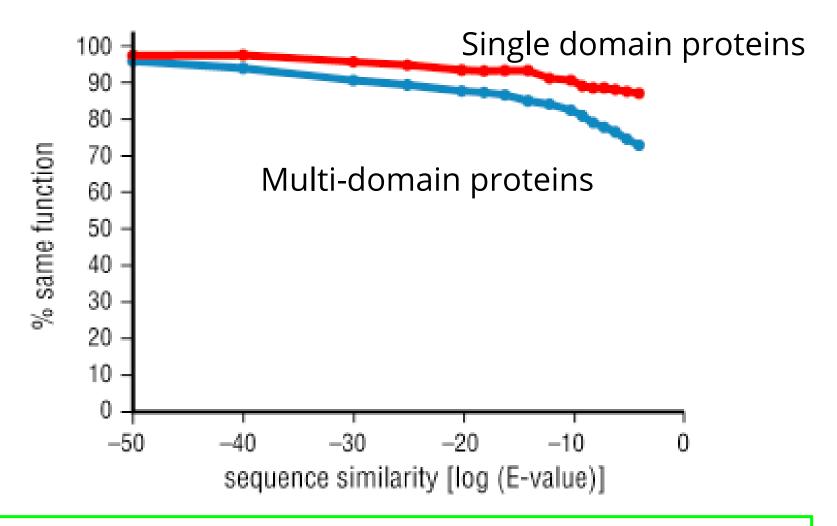
You can change the Expect value threshold on most main BLAST search pages. When the Expect value is increased from the default value of 10, a larger list with more low-scoring hits will be listed.

## E values (continued)

From the BLAST tutorial:

Although hits with E values much higher than 0.1 are unlikely to reflect true sequence relatives, it can be useful to examine hits with lower significance (E values between 0.1 and 10) for short regions of similarity. In the absence of longer similarities, these short regions may allow the tentative assignment of biochemical activities to the ORF in question. The significance of any such regions must be assessed on a case by case basis.

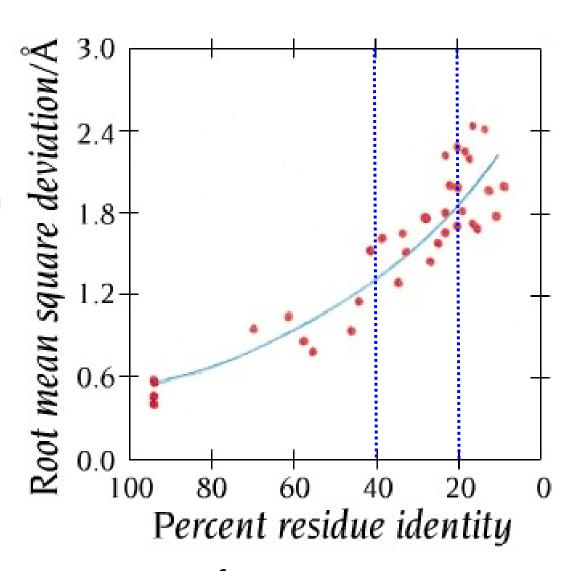
#### Relationship between E-value and function



E value greater than 10<sup>-10</sup>, could be a similar structure but may have a different function

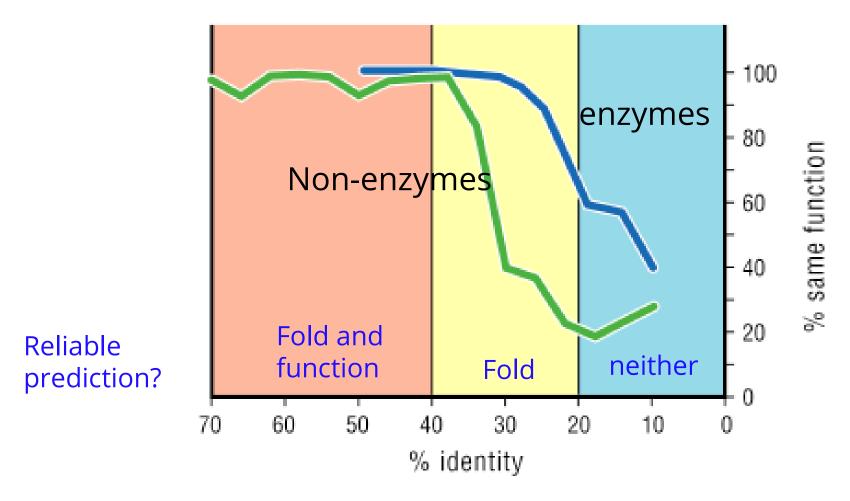
## Similar sequence = similar structure

Deviation in main chain atoms in protein cores increases as percent identity of protein sequence decreases



(Plot calculated from the known structures of 32 pairs of homologous proteins)

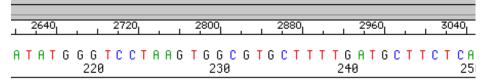
High sequence similarity correlates with functional similarity

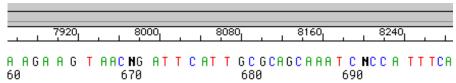


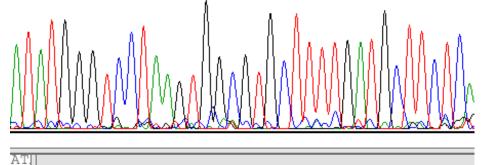
40-20% identity: fold can be predicted by similarity but precise function cannot be predicted (the 40% rule)

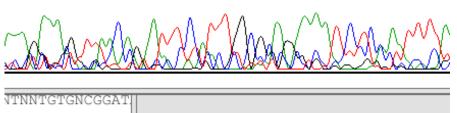
#### Biological function of a new sequence? BLAST.....

#### Raw data









#### Computer calls gnntnntgtgncggatacaattcccctctagaaataatt

TTGTTTAACTTTAAGAAGGAGATATACATATGCACCACCAC

TTCATGACAAGGGGCTTTCAACTGCA

#### Find the open reading frame(s) and translate

MKCPYCKSRDLVYDRQHGEVFCKKCGSILATNLVDSELSRKT
KTNDIPRYTKRIGEFTREKIYRLRKWQKKISSERNLVLAMSE
LRRLSGMLKLPKYVEEEAAYLYREAAKRGLTRRIPIETTVAA
CIYATCRLFKVPRTLNEIASYSKTEKKEIMKAFRVIVRNLNL
TPKMLLARPTDYVDKFADELELSERVRRRTVDILRRANEEGI
TSGKNPLSLVAAALYIASLLEGERRSQKEIARVTGVSEMTVR
NRYKELA

## Query Sequence in FASTA Format

Amino acid sequence of a protein, in FASTA format:

>ribosomal protein L7/L12 [Thiomicrospira crunogena XCL-2]
MAITKDDILEAVANMSVMEVVELVEAMEEKFGVSAAAVAVAGPAGDAGAA
GEEQTEFDVVLTGAGDNKVAAIKAVRGATGLGLKEAKSAVESAPFTLKEG
VSKEEAETLANELKEAGIEVEVK

Nucleotide sequence of a gene, in FASTA format:

#### The FASTA format

" description line" (not read as sequence data)

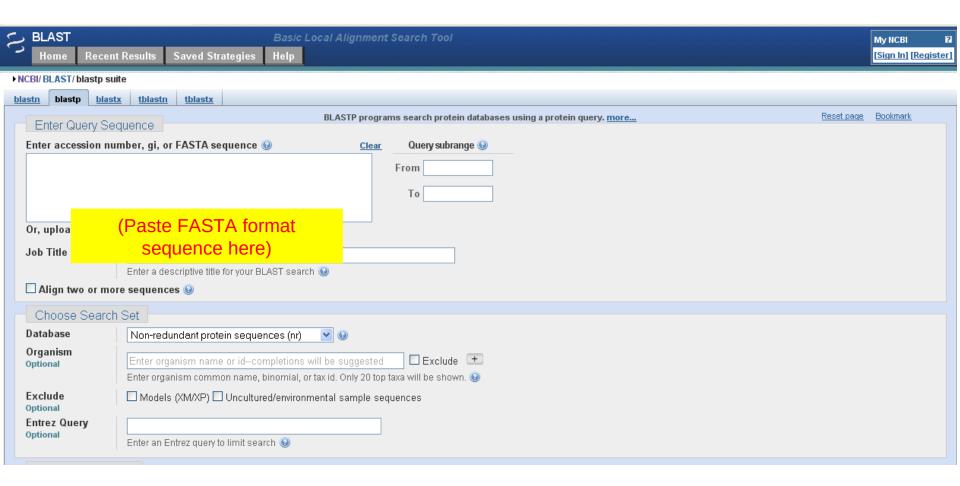
Begins with >

Ends with a hard return

Sequence data (amino acid in this case)

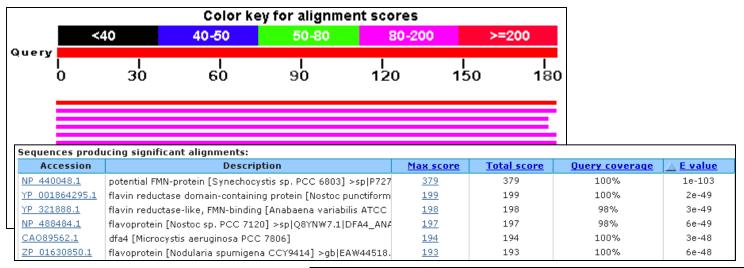
> ribosomal proteinL7/L12
MAITKDDILEAVANMSVMEVVELVEA
MEEKFGVSAAAVAVAGPAGDAGAA
GEEQTEFDVVLTGAGDNKVAAIKAVR
GATGLGLKEAKSAVESAPFTLKEG
VSKEEAETLANELKEAGIEVEVK

## NCBI BLAST Interface (blastp: Proteins)



## NCBI BLAST Results Page:

## Potential homologs retrieved from database



```
G flavin reductase domain protein FMN-binding [Cyanothece sp. PCC
>Lref|YP 002482587.1|
74251
qb|ACL44226.1| G flavin reductase domain protein FMN-binding [Cyanothece sp. PCC
74251
Length=585
 GENE ID: 7287783 Cyan7425 1859 | flavin reductase domain protein FMN-binding
[Cvanothece sp. PCC 7425]
 Score = 176 bits (446), Expect = 1e-42, Method: Compositional matrix adjust.
 Identities = 95/196 (48%), Positives = 125/196 (63%), Gaps = 16/196 (8%)
            SGANFARQLRTHKRQRIARQATTETQADRTQQAVGRIIGSIGVVTTQTTGRH------
Query 1
            +G++FA+ L+ K+QR RQ+ E Q+DRT+QAVGRIIGS+ V+T +
Sbjet
       393 AGSDFAQVLKKAKKQRSPRQSILEVQSDRTEQAVGRIIGSLCVLTAKQQQTHPHPEVEEP
                                                                          452
            ----QGILTSWVSQASFTPPGIMLAIPGEFDAYGLAGQNKAFVLNLLQEGRSVRRHFDH 107
Query
                   +L SWVSQASF PPG+ +A+ E A GL
                                                     AFVLN+L+EG ++RRHF
            OLEVPTAMLVSWVSOASFNPPGLTIALAKE-RAEGLDHSGDAFVLNVLKEGMNLRRHFSK
                                                                          511
Sbjct
Query
            QPLPKDGDNPFSRLEHYSTQNGCLILAEALAYLECLVQSWSNIGDHVLVYATVQAGQVLQ
                                                                          167
                               +NGC +L + LAYLEC VOS
                                                       GDH L+YATV G+VLO
Sbjct
       512
            SFAP--GEDRFAGLNIQWAENGCPVLQDCLAYLECTVQSRMECGDHWLIYATVNNGKVLQ
                                                                          569
            PNGITAIRHRKSGGQY 183
Query
            P G TA++HRKSG QY
       570 PTGTTAVOHRKSGNOY
Sbict
```

Kerfeld and Scott, PLoS Biology 2011

#### BLAST page: https://blast.ncbi.nlm.nih.gov/Blast.cgi

- -- go to "protein blast"
- -- Program: blastp
- -- Search set: leave blank, or choose taxonomic group (example: archaea) https://www.ncbi.nlm.nih.gov/Taxonomy/Browser/wwwtax.cgi
  - -- choose algorithm: blastp (default)

--PSI-, PHI-, and DELTA-BLAST are variants that can <u>find</u> <u>homologs with relatively low sequence identity</u> (distant homologs), DELTA- is most modern and seems to work best (esp. cross-domain homology)

-- click "BLAST" button

#### View Report:

- Distribution of hits: query sequence followed color-coded positions 'hit' sequences that gave alignments
- 2) Sequences producing significant alignments (sorted by Max score)
  - Accession number (this takes you to the sequence that yielded the hit: gene or contig)
  - Description: gene name, organism
  - Max score, total score, query coverage
  - E-value

#### **DELTA-BLAST:**

- Domain Enhanced Lookup Time Accelerated BLAST
- •The algorithm constructs a specific PSSM (positionspecific scoring matrix) using the results of a Conserved Domain Database (CDD) search
- •A PSSM differs from typical PAM and BLOSUM matrices in which scores are position independent
- •The constructed PSSM is used to search sequence database

### BLAST is good, but not perfect

## **Genome Sizes of Representative Organisms**

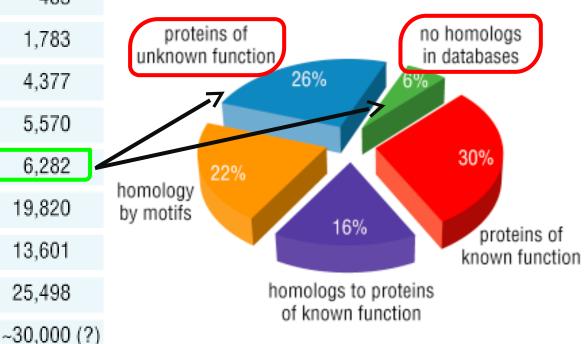
Organism	Genome size (base pairs)	Number of genes
Mycoplasma genitalium	45.8 x 10 <sup>5</sup>	483
Methanococcus jannaschii	1.6 x 10 <sup>6</sup>	1,783
Escherichia coli	4.6 x 10 <sup>6</sup>	4,377
Pseudomonas aeruginosa	6.3 x 10 <sup>6</sup>	5,570
Saccharomyces cerevisiae	1.2 x 10 <sup>7</sup>	6,282
Caenorhabditis elegans	1.0 x 10 <sup>8</sup>	19,820
Drosophila melanogaster	1.8 x 10 <sup>8</sup>	13,601
Arabidopsis thaliana	1.2 x 10 <sup>8</sup>	25,498

Homo sapiens

 $3.3 \times 10^9$ 

## 1) High homology? *function is inferred* but not known

2) Many coding proteins cannot be assigned function based on homology



# Bioinformatics: making sense of biological sequence

 New DNA sequences are analyzed for ORFs (Open Reading Frames: protein)

- Any DNA or protein sequence can then be compared to all other sequences in databases, and similar sequences identified
- There is much more -- a huge number of bioinformatics tools are available