#### Bioinformatics CS300

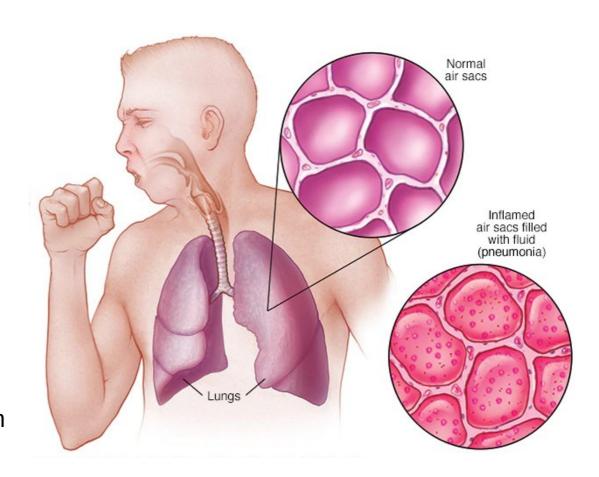
Blast, Substitution Matrices and Protein Alignments (Chap 4 and 5 in textbook)

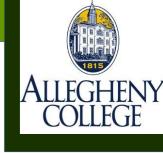
Fall 2019
Oliver BONHAM-CARTER



#### Pneumonia

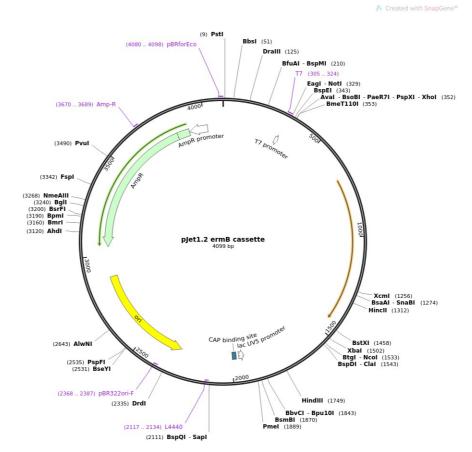
- Pneumonia is an infection that inflames the air sacs in one or both lungs. The air sacs may fill with fluid or pus (purulent material), causing cough with phlegm or pus, fever, chills, and difficulty breathing. A variety of organisms, including bacteria, viruses and fungi, can cause pneumonia.
- A classic sign of bacterial pneumonia is a cough that produces thick, blood-tinged or yellowish-greenish sputum with pus.





#### Human Pathogen Inquiry: The *ermB* gene

 An erythromycin-resistance gene from Streptococcus agalactiae, a gram-positive bacterial species commonly associated with the udders of cows, causing mastitis (i.e., inflammation of breast tissue that sometimes involves an infection and may cause fever)





#### Pneumonia and ermB

- Drug resistant: Erythromycin is a macrolide antibiotic used to treat bacterial infections
- Resistance is due to the *ermB* gene which has been noted in the bacteria, *Streptococcus* pneumonia – a common cause of bacterial pneumonia.

#### Horizontal Gene Transfer?



- This type of pneumonia is not believed to have always been resistant to drugs.
- Could the resistance gene have come from another bacteria via HGT?
- How could we check what other bacterial organisms have a specific allele for the gene that effectively resists drugs?
- We will use Blast for this task.

BLAST

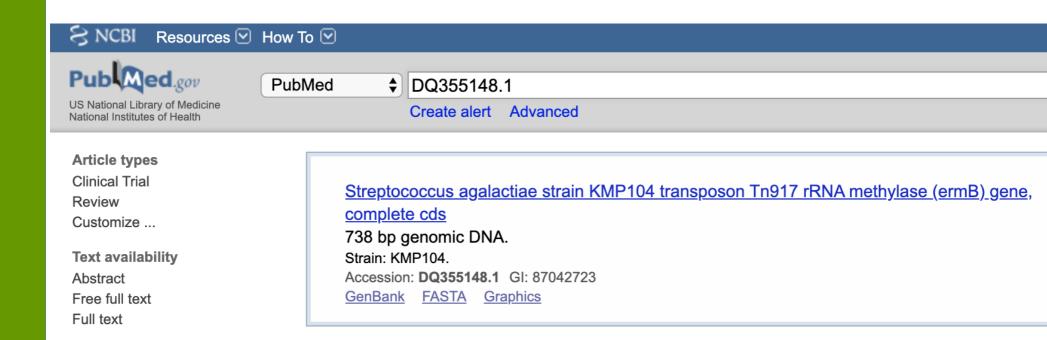
BLAST

BLAST



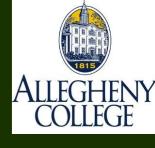


- Locate the Accession number, DQ355148.1, on http://www.pubmed.gov
- Streptococcus agalactiae strain KMP104 transposon Tn917 rRNA methylase (ermB) gene, complete cds



https://www.ncbi.nlm.nih.gov/nuccore/87042723/





GenBank -

Send to: -

#### Streptococcus agalactiae strain KMP104 transposon Tn917 rRNA methylase (ermB) gene, complete cds

GenBank: DQ355148.1

FASTA Graphics

#### Go to: 🔽

LOCUS DQ355148 738 bp DNA linear BCT 13-FEB-2006

DEFINITION Streptococcus agalactiae strain KMP104 transposon Tn917 rRNA

methylase (ermB) gene, complete cds.

ACCESSION DQ355148 VERSION DO355148.1

KEYWORDS

SOURCE Streptococcus agalactiae
ORGANISM Streptococcus agalactiae

Bacteria; Firmicutes; Bacilli; Lactobacillales; Streptococcaceae;

Streptococcus.

REFERENCE 1 (bases 1 to 738)

AUTHORS Puopolo, K.M., Klinzing, D.C., Lin, M.P., Yesucevitz, D.L. and

Cieslewicz, M.J.

TITLE A Composite Transposon Responsible for ErmB-Mediated Erythromycin

Resistance in Group B Streptococcus

JOURNAL Unpublished

REFERENCE 2 (bases 1 to 738)

AUTHORS Puopolo, K.M., Klinzing, D.C., Lin, M.P., Yesucevitz, D.L. and

Cieslewicz,M.J.

TITLE Direct Submission

JOURNAL Submitted (06-JAN-2006) Channing Laboratory, Brigham and Women's

Hospital, 181 Longwood Avenue, Boston, MA 02115, USA

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GenBank -

#### Streptococcus agalactiae strain KMP104 transposon Tn917 rRNA (ermB) gene, complete cds

GenBank: DQ355148.1

FASTA Graphics

#### Go to: ✓

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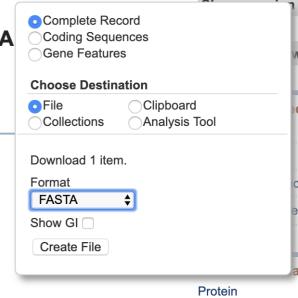
AUTHORS Puopolo, K.M., Klinzing, D.C., Lin, M.P., Yesucevitz, D.L. and

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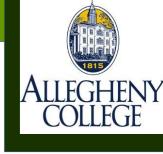
PubMed (Weighte

Taxonomy



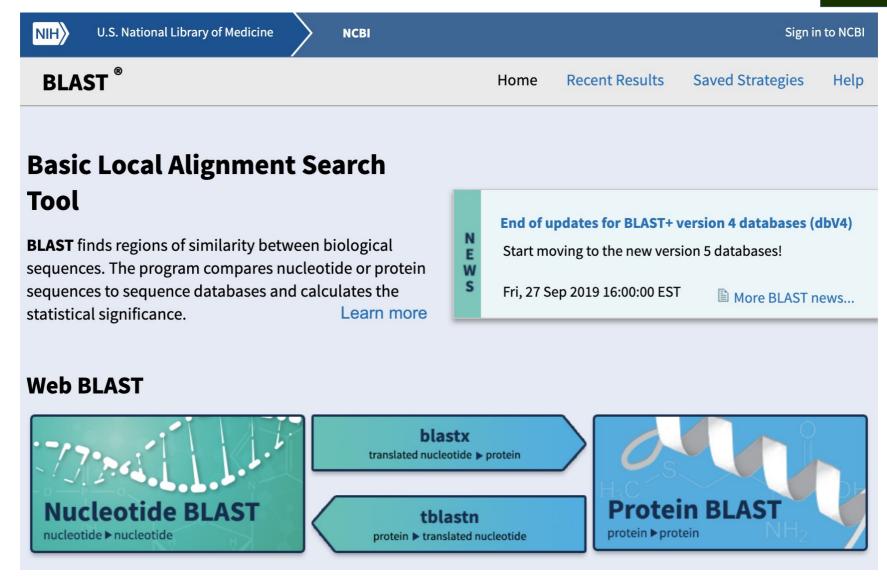






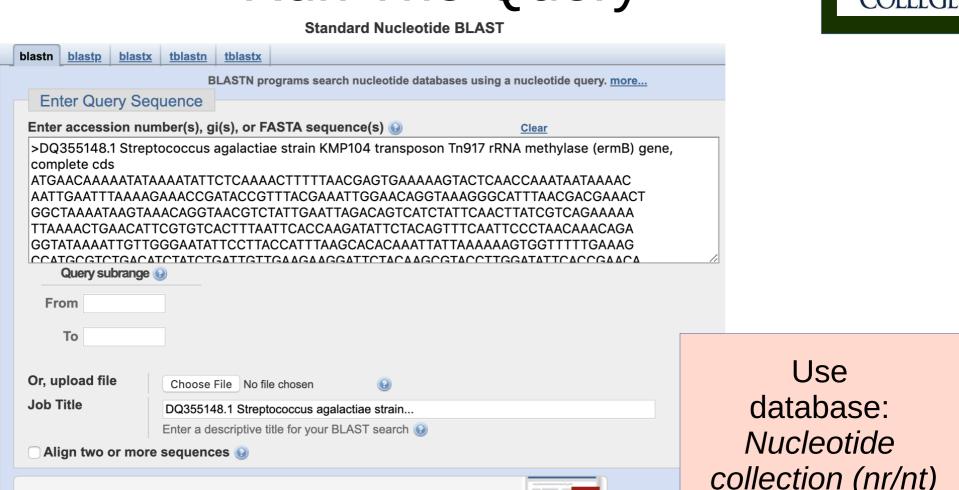






https://blast.ncbi.nlm.nih.gov/Blast.cgi





BLAST results will be displayed in a new format by default You can always switch back to the Traditional Results page.



collection (nr/nt)

**Choose Search Set** 

**Database** 

Human genomic + transcript Mouse genomic + transcript Others (1)

Nucleotide collection (nr/nt)

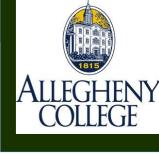




#### Results

**Descriptions Graphic Summary Alignments Taxonomy** 100 🗸 **Download** Y Manage Columns Y Show Sequences producing significant alignments select all 100 sequences selected Distance tree of results GenBank **Graphics** Query Е Max Total Per. Description Accession Score Score Cover value Ident **~** Staphylococcus aureus strain VGC1 chromosome, complete genome 1363 1363 100% 0.0 100.00% CP039448.1 100% 100.00% Enterococcus durans strain VREdu plasmid pSULI, complete sequence 1363 1363 0.0 CP043327.1 **~** 100.00% CP042597.1 1363 100% Enterococcus durans strain VREdu chromosome 1363 0.0 Enterococcus faecalis EnGen0107 strain B594 plasmid p2, complete sequence 1363 1363 100% 0.0 100.00% CP041740.1 **\*** Enterococcus faecalis strain 4928STDY7071263 genome assembly, chromosome: 1 1363 1363 100% 0.0 100.00% LR607346.1 **~** Enterococcus faecium strain N56454 plasmid unnamed, complete sequence 1363 1363 100% 0.0 100.00% CP040905.1 V 1363 100% 100.00% 1363 0.0 CP034168.1 Enterococcus avium strain 352 plasmid unnamed, complete sequence **~** Listeria monocytogenes hypothetical protein, IS1216 transposase, 3-aminoglycoside o-phosp 1363 1363 100% 0.0 100.00% MK490828.1 1363 100% 100.00% LR536659.1 Enterococcus faecium isolate E8407 genome assembly, plasmid: 2 1363 0.0 **V** Enterococcus faecium SMVRE20 plasmid pSMVRE20S DNA, complete genome 1363 1363 100% 0.0 100.00% AP019410.1 Enterococcus faecium strain 37BA plasmid pEf37BA, complete sequence 1363 1363 100% 0.0 100.00% MG957432.1 Enterococcus faecium strain FSIS1608820 plasmid pFSIS1608820, complete sequence 1363 2668 100% 0.0 100.00% CP028728.1 Streptococcus pneumoniae isolate GPS HK 21-sc-2296565 genome assembly, chromosome 1363 1363 100% 0.0 100.00% LR216058.1 Synthetic construct clone pEP1237, complete sequence 1363 1363 100% 0.0 100.00% MH626525.1

#### Scores



#### Max Score

- The score of the best matching segment for local alignment, not global

#### Total Score

 The total scores of all matching segments found (same as max score if there is only one matching segment)

#### Query Coverage

- The percentage of the query sequence that aligned to some part of the match.

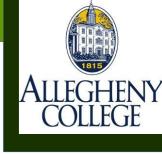
#### E-Value

 A statistical measure evaluating how likely it is that a match this good could occur by chance. Lower e-scores indicate that both sequences are truly similar and are not similar by chance alone. Identical sequences have e-scores of zero.

#### Max Indent

- The percentage of nucleotides that are identical between the query and the target sequences within the matching regions.

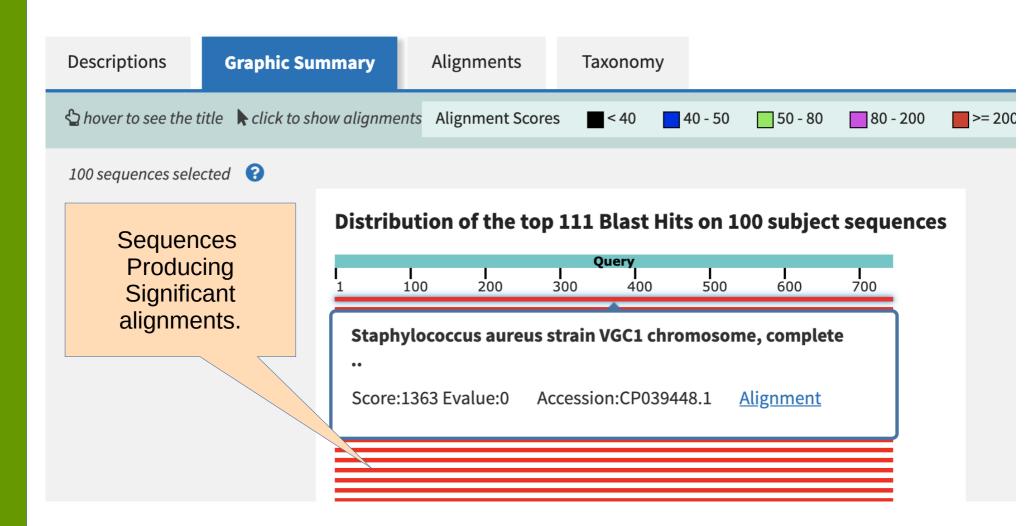
#### Results



| Descriptions         | Graphic Sur        | nmary       | Α               | lignments       | Ta              | axonomy                         |                 |                 |                 |    |
|----------------------|--------------------|-------------|-----------------|-----------------|-----------------|---------------------------------|-----------------|-----------------|-----------------|----|
| ♠ hover to see the t | itle 🗼 click to sh | ow alignmen | nts             | Alignment Sc    | ores            | < 40                            | 40 - 50         | 50 - 80         | 80 - 200        | >= |
| 100 sequences sele   | cted 😯             |             |                 |                 |                 |                                 |                 |                 |                 |    |
|                      |                    | Distrib     | utio            | on of the to    | p 111           | l Blast H                       | its on 100      | ) subject       | sequences       |    |
|                      |                    | 1<br>1      | <b>I</b><br>100 | <b>I</b><br>200 | <b>]</b><br>300 | <b>Query</b><br> <br> <br>  400 | <b>I</b><br>500 | <b>I</b><br>600 | <b>I</b><br>700 |    |
|                      |                    |             |                 |                 |                 |                                 |                 |                 |                 |    |
|                      |                    |             |                 |                 |                 |                                 |                 |                 |                 |    |
|                      |                    |             |                 |                 |                 |                                 |                 |                 |                 |    |
|                      |                    |             |                 |                 |                 |                                 |                 |                 |                 |    |
|                      |                    |             |                 |                 |                 |                                 |                 |                 |                 |    |









#### Results

#### **Streptococcus suis strain SC216 ICESsuSC216 sequence**

Sequence ID: MK359991.1 Length: 54396 Number of Matches: 2

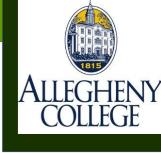
|               | Range 1          | ange 1: 15998 to 16451 GenBank Graphics |    |             |            |            |            |  |  |  |  |
|---------------|------------------|---|----|-------------|------------|------------|------------|--|--|--|--|
|               | Score            |   |    | Expect      | Identities |            | Gaps       | Strand   |  |  |  |
|               | 839 bits         | s(454                                   | )  | 0.0         | 454/454(10 | 0%)        | 0/454(0%)  | Plus/Plus                                      |  |  |  |
|               | Query            | 1                                       | 1  | AACAGGTAACG | TGAAT      | TAGACAGTCA | TCTATTCAAC | TTATCGTCAGAAA <i>I</i>                         |  |  |  |
| An Id         | entica           | J                                       | 00 | TAACO       | TCTATTGAAT | TAGACAGTCA | TCTATTCAAC | TTATCGTCAGAAAA                                 |  |  |  |
| seque<br>anot | ence ir<br>her's |   | 58 |             |            |            |            | CAGTTTCAATTCCC1<br>        <br>CAGTTTCAATTCCC1 |  |  |  |
| gen           | ome              |   |    | AACAGAGGTAT | AAAATTGTTG | GGAATATTCC | TTACCATTTA | AGCACACAAATTATI                                |  |  |  |
|               | Sbjct            | 161                                     | 18 | AACAGAGGTAT | AAAATTGTTG | GGAATATTCC | TTACCATTTA | AGCACACAAATTATI                                |  |  |  |
|               | Query            | 181                                     |    | AAGTGGTTTT  | GAAAGCCGTG | CGTCTGACAT | CTATCTGATT | GTTGAAGAAGGATT(                                |  |  |  |
|               | Sbjct            | 161                                     | 78 | AAGTGGTTTT  | GAAAGCCGTG | CGTCTGACAT | CTATCTGATT | GTTGAAGAAGGATT(                                |  |  |  |
|               | Query            | 241                                     |    | AGCGTACCTTC | GATATTCACC | GAACACTAGG | GTTGCTCTTG | CACACTCAAGTCTCC                                |  |  |  |
|               | Sbjct            | 162                                     | 38 | AGCGTACCTTC | GATATTCACC | GAACACTAGG | GTTGCTCTTG | CACACTCAAGTCTC                                 |  |  |  |
|               | Query            | 301                                     |    | AGCAATTGCTT | AAGCTGCCAG | CGGAATGCTT | TCATCCTAAA | CCAAAAGTAAACAG1                                |  |  |  |
|               | Sbjct            | 162                                     | 98 | AGCAATTGCT  | AAGCTGCCAG | CGGAATGCTT | TCATCCTAAA | CCAAAAGTAAACAGI                                |  |  |  |



#### Back to HGT?

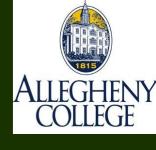
- Typically, researchers allow for a 95% similarity between genes found between *unrelated* organisms.
- Here, we may conclude that HGT is a good hypothesis but more research must be done to determine whether there was a chance for two organisms to be close enough to each other to share genetic material.











- Investigate a gene of resistance: ermA
- Questions:
  - What does this gene do? (hint: see Genbank record)
  - About how many other organisms appear to have traces of the same gene sequence?
  - What is the closest match? Which organism? What e-score?





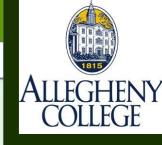
GitHub Activity Repository:

https://classroom.github.com/a/DuBJW7yi

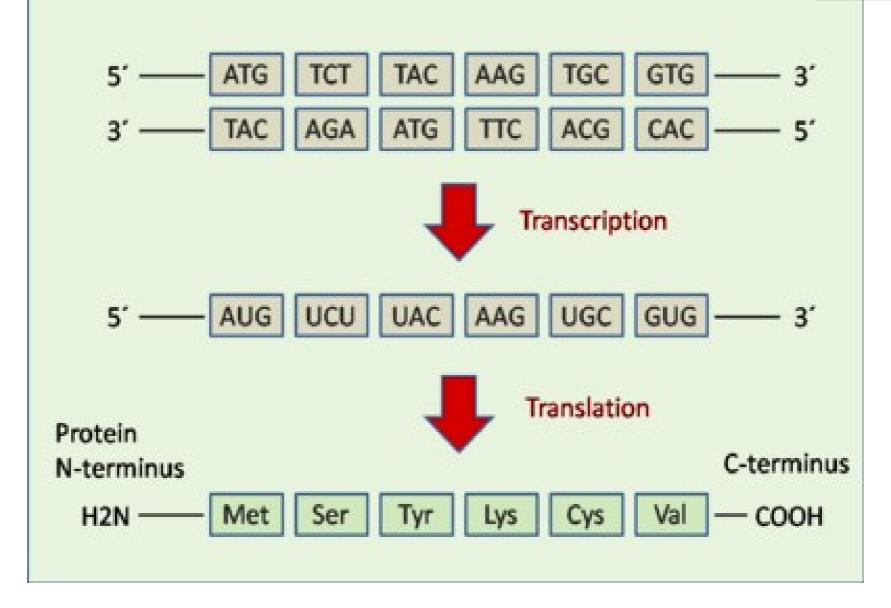
Due at 12:15 on 17 Oct. 2019

Make a directory: act1

Workfile: act1/blastWork.md



#### The central dogma of molecular biology

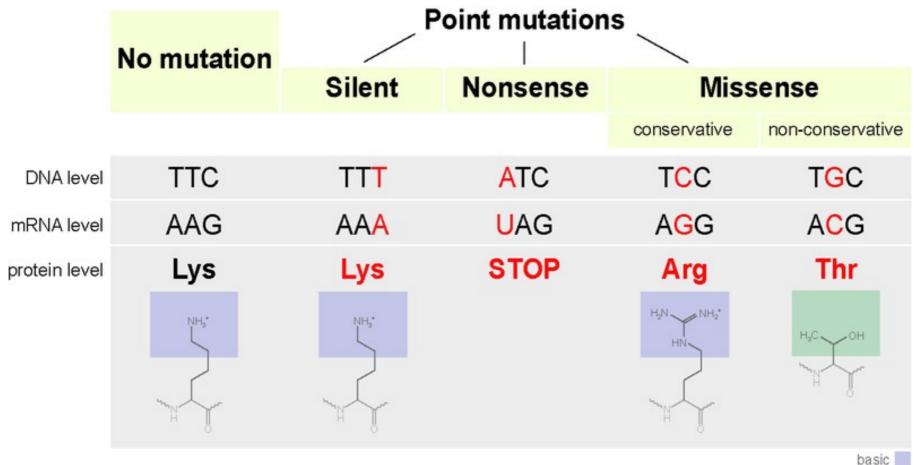




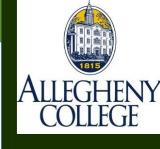
polar

#### More About Silent Mutations

 Redundant codons mean ~1/3 of DNA mutations often do not alter protein sequence

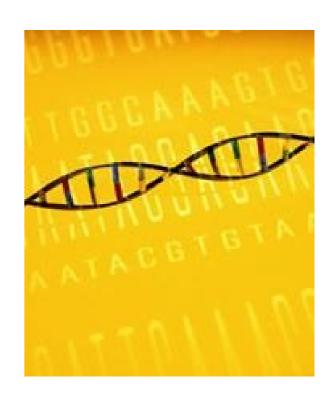


https://en.wikipedia.org/wiki/Silent\_mutation



#### Silent Mutations

- Are these mutations really so subtle?
- Are there dangers involved?
  - While the protein may be fine, the RNA has still has dangerous folding issues
- Nature: Silent Mutations Speak Up: Overlooked genetic changes could impact on disease
  - http://www.nature.com/news/2006 /061221/full/news061218-12.html





Third letter

#### Second letter

|   | U                         | С                        | Α                             | G                        |                  |
|---|---------------------------|--------------------------|-------------------------------|--------------------------|------------------|
| U | UUU } Phe UUA } Leu UUG } | UCU UCC Ser UCA UCG      | UAU Tyr UAC Stop UAG Stop     | UGU Cys UGC Stop UGG Trp | U C A G          |
| С | CUU<br>CUC<br>CUA<br>CUG  | CCU CCC Pro              | CAU His CAC Gln CAG           | CGU<br>CGC<br>CGA<br>CGG | U<br>C<br>A<br>G |
| Α | AUU AUC Blle AUA AUG Met  | ACU<br>ACC<br>ACA<br>ACG | AAU ASn<br>AAA AAA Lys        | AGU   Ser AGA   Arg      | U C A G          |
| G | GUU<br>GUC<br>GUA<br>GUG  | GCU<br>GCC<br>GCA<br>GCG | GAU Asp<br>GAC Asp<br>GAA Glu | GGU<br>GGC<br>GGA<br>GGG | U<br>C<br>A<br>G |

First letter

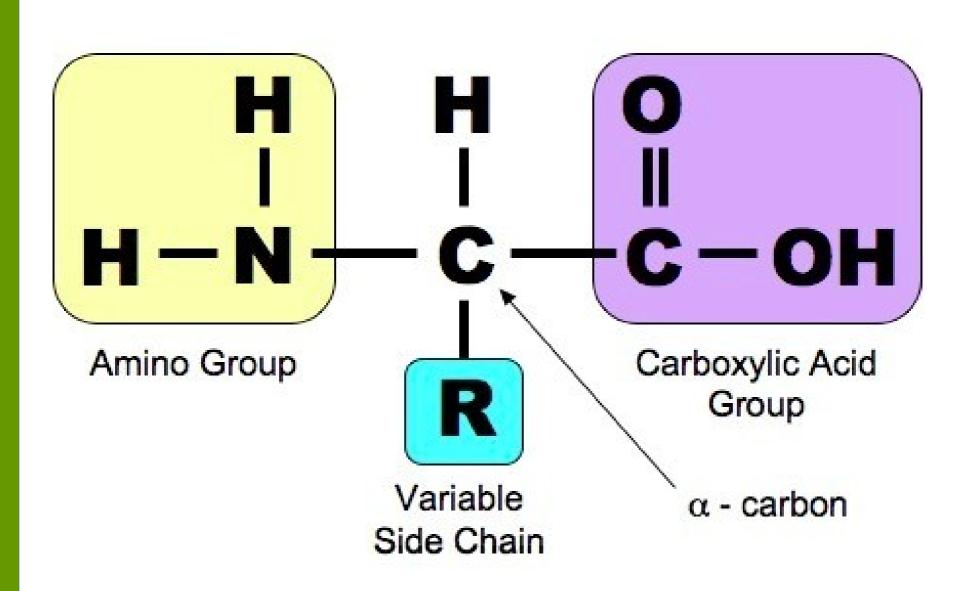


#### Alphabetical Interests

- With a larger protein "alphabet" (20 amino acids), it is much less likely to get matches by chance.
- Matches are likely to be statistically significance
- Amino acid changes are not equally harmful to protein structure
  - Chemical complexes being replaced by similar chemical complex.
  - Ex: Arginine (Arg) and Lysine (Lys)



#### **Amino Acid Substitutions**







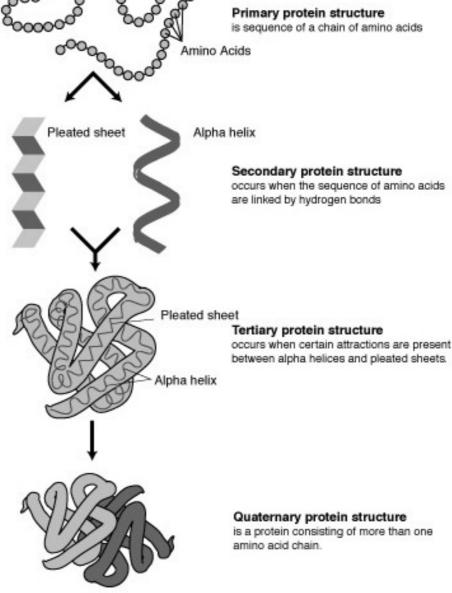


#### **Amino Acid Components**

- Similarity of amino acids means
  - Similar physicochemical properties (Physics + chemistry)
    - Polar vs nonpolar
    - Hydrophobic vs hydrophilic
    - Positive electric charge vs negative electric charge
    - Basic vs Acidic
- Amino Acid Table: <a href="http://www.bio.davidson.edu/courses/genomics/jmol/aatable.html">http://www.bio.davidson.edu/courses/genomics/jmol/aatable.html</a>
- Roles in Protein Structures
- http://www.proteinstructures.com/Structure/Structure/amino-acids.html



# Amino Acids Determine Protein's Shape and Function



The hierarchy of protein structure. Public domain image from The National Genome Research Institute



#### Scoring Amino Acid Substitutions

 Could we quantify sequence by physicochemical properties? (yes!)

Table 5.1 Hydrophobicity values for the 20 amino acids. A more positive value represents a more hydrophobic amino acid.

| Amino Acid | Hydrophobicity | Amino Acid | Hydrophobicity | Amino Acid | Hydrophobicity |
|------------|----------------|------------|----------------|------------|----------------|
| D          | -3.5           | Υ          | -1.3           | 1          | 4.5            |
| K          | -3.9           | N          | -3.5           | С          | 2.5            |
| Н          | -3.2           | L          | 3.8            | А          | 1.8            |
| T          | -0.7           | E          | -3.5           | S          | -0.8           |
| V          | 4.2            | R          | -4.5           | G          | -0.4           |
| F          | 2.8            | W          | -0.9           | Р          | -1.6           |
| М          | 1.9            | Q          | -3.5           |            |                |



#### Scoring Amino Acid Substitutions

Better to study evolution of real proteins from <u>closely</u> related organisms

Minimizes likelihood that an observed difference represents a series of more than one individual mutations

Species A – Ala

Species B – Ile

No intermediate mutations?

Ala --> Ile : 1 mutation

Ala --> Pro --> Ser --> lle : 3 mutations

A few intermediate mutations?



#### A Model of Evolutionary Change in Proteins, Dayhoff et al., 1978

Global Pairwise Alignment

Observed frequency of each possible amino acid substitution:

$$10 \log_{10} \left( M_{ij} / f_j \right)$$

- $M_{ij}$  the probability of a mutation replacing amino i with j
- f<sub>j</sub> the frequency of amino acid j in a large set of sequences



## A Model of Evolutionary Change in Proteins, Dayhoff et al., 1978

Global Pairwise Alignment

Observed frequency of each possible amino acid substitution:

$$10 \log_{10} \left( M_{ij} / f_j \right)$$

#### **Odds** ratio

- = 1 substitution of j for i is no more likely than the chance of finding j randomly
- > 1 substitution is evolutionarily conserved
- < 1 substitution is selected against



## A Model of Evolutionary Change in Proteins, Dayhoff et al., 1978

Global Pairwise Alignment

Observed frequency of each possible amino acid substitution:

 $10 \log_{10} \left( M_{ij} / f_j \right)$ 

log-odds ratio – easier for scoring

Greater positive for likely (conservative) substitutions

Greater negative for unlikely (non-conservative) substitutions

Multiplied by 10 and rounded to nearest integer

## The PAM Matrix

| 65 |     |   | Α  | R  | N  | D          | С  | Q  | Е          | G  | Н  | 1  | L  | K  | М  | F    | Р  | S  | Т  | W  | Υ  | ١ |
|----|-----|---|----|----|----|------------|----|----|------------|----|----|----|----|----|----|------|----|----|----|----|----|---|
|    | Ala | Α | 2  |    |    |            |    |    |            |    |    |    |    |    |    |      |    |    |    |    |    |   |
|    | Arg | R | -1 | 5  |    |            |    |    |            |    |    |    |    |    |    |      |    |    |    |    |    |   |
|    | Asn | N | 0  | 0  | 3  |            |    |    |            |    |    |    |    |    |    |      |    |    |    |    |    |   |
| ,  | Asp | D | 0  | -1 | 2  | 5          |    |    |            |    |    |    |    |    |    |      |    |    |    |    |    |   |
|    | Cys | С | -1 | -1 | -1 | -3         | 11 |    |            | ļ. |    |    |    |    |    | 0 // |    |    |    |    |    |   |
|    | Gln | Q | -1 | 2  | 0  | 1          | -3 | 5  |            |    |    |    |    |    |    |      |    |    |    |    |    |   |
|    | Glu | Е | -1 | 0  | 1  | 4          | -4 | 2  | 5          |    |    |    |    |    |    |      |    |    |    |    |    |   |
|    | Gly | G | 1  | 0  | 0  | 1          | -1 | -1 | 0          | 5  |    |    |    |    |    |      |    |    |    |    |    |   |
|    | His | Н | -2 | 2  | 1  | 0          | 0  | 2  | 0          | -2 | 6  |    |    |    |    |      |    |    |    |    |    |   |
|    | lle | 1 | 0  | -3 | -2 | -3         | -2 | -3 | -3         | -3 | -3 | 4  |    |    |    |      |    |    |    |    |    |   |
|    | Leu | L | -1 | -3 | -3 | -4         | -3 | -2 | -4         | -4 | -2 | 2  | 5  |    |    |      |    |    |    |    |    |   |
|    | Lys | K | -1 | 4  | 1  | 0          | -3 | 2  | 1          | -1 | 1  | -3 | -3 | 5  |    |      |    |    |    |    |    |   |
|    | Met | М | -1 | -2 | -2 | -3         | -2 | -2 | 3          | 3  | -2 | 3  | 3  | -2 | 6  |      |    |    |    |    |    |   |
|    | Phe | F | -3 | -4 | -3 | -5         | 0  | -4 | <b>-</b> 5 | -5 | 0  | 0  | 2  | -5 | 0  | 8    |    |    |    |    |    |   |
|    | Pro | Р | 1  | -1 | -1 | -2         | -2 | 0  | -2         | -1 | 0  | -2 | 0  | -2 | -2 | -3   | 6  |    |    |    |    |   |
|    | Ser | S | 1  | -1 | 1  | 0          | 1  | -1 | -1         | 1  | -1 | -1 | -2 | -1 | -1 | -2   | 1  | 2  |    |    |    |   |
|    | Thr | Т | 2  | -1 | 1  | -1         | -1 | -1 | -1         | -1 | -1 | 1  | -1 | -1 | 0  | -2   | 1  | 1  | 2  |    |    |   |
|    | Trp | W | -4 | 0  | -5 | <b>-</b> 5 | 1  | -3 | <b>–</b> 5 | -2 | -3 | -4 | -2 | -3 | -3 | -1   | -4 | -3 | -4 | 15 |    |   |
|    | Tyr | Υ | -3 | -2 | -1 | -2         | 2  | -2 | -4         | -4 | 4  | -2 | -1 | -3 | -2 | 5    | -3 | -1 | -3 | 0  | 9  |   |
|    | Val | ٧ | 1  | -3 | -2 | -2         | -2 | -3 | -2         | -2 | -3 | 4  | 2  | -3 | 2  | 0    | -1 | -1 | 0  | -3 | -3 |   |



#### PAM matrices

- Point Accepted Mutation
- Family of matrices PAM 1, PAM 80, PAM 120, PAM 250
- The number in the name of a PAM matrix (i.e., the 'n' in PAM n) represents the evolutionary distance between the sequences on which the matrix is based

BLOSUM 80

PAM 1

PAM 120

PAM 250

Less divergent

\*\*More divergent\*\*



#### PAM vs BLOSUM

- General Use
  - PAM 120
  - BLOSUM 62\*
- Closely Related Species
  - PAM 60
  - BLOSUM 80
- Distantly Related Species
  - PAM 250
  - BLOSUM 45

| PAM    | BLOSUM   |
|--------|----------|
| PAM100 | BLOSUM90 |
| PAM120 | BLOSUM80 |
| PAM160 | BLOSUM60 |
| PAM200 | BLOSUM52 |
| PAM250 | BLOSUM45 |

\*BLOSUM 62 – used by BLAST – computed by choosing blocks of local alignments more than 62% identical



#### **Blast Subst Matrices**

- Scoring for possible residue pair alignment
- Different substitution matrices are for detecting similarities according to degrees of divergence.
- BLOSUM-62 matrix good for detecting most weak protein similarities
- Provisional table of recommended substitution matrices and gap costs for various query lengths is

| Query Length | Substitution Matrix | Gap Costs |
|--------------|---------------------|-----------|
| <35          | PAM-30              | (9,1)     |
| 35-50        | PAM-70              | (10,1)    |
| 50-85        | BLOSUM-80           | (10,1)    |
| 85           | BLOSUM-62           | (10,1)    |



#### BLOSUM matrix Heinkoff and Heinkoff, 1992

BLOcks SUbstition Matrix - Blocks of local alignments

$$S_{ij} = \left(\frac{1}{\lambda}\right) \log \left(\frac{p_{ij}}{q_i * q_j}\right)$$

- p<sub>ii</sub> probability j replacing i
- $q_i$  and  $q_j$  probabilities of finding the amino acids i and j in any protein sequence
- $\lambda$  scaling factor, set such that the matrix contains easily computable integer values.
- BLOSUM # # = minimum % similarity of sequences compared





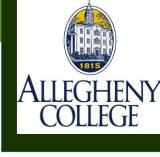
- Create N x M matrix
- Place each sequence along one axis
- Place score 0 at the up-left corner
- Fill in 1<sup>st</sup> row & column with gap penalty multiples
- Fill in the matrix with max value of 3 possible moves:
  - Vertical move: Score + gap penalty
  - Horizontal move: Score + gap penalty
  - Diagonal move: Score + match/mismatch score
- The optimal alignment score is in the lower-right corner
- To reconstruct the optimal alignment, trace back where the max at each step came from, stop when hit the origin.

#### Needleman-Wunsch Algorithm: Protein Alignment – Chap 5



- Create N x M matrix
- Place each sequence along one axis
- Place score 0 at the up-left corner
- Fill in 1<sup>st</sup> row & column with gap penalty multiples
- Fill in the matrix with max value of 3 possible moves:
  - Vertical move: Score + gap penalty
  - Horizontal move: Score + gap penalty
  - Diagonal move: Score + match/mismatch score from sub. matrix
- The optimal alignment score is in the lower-right corner
- To reconstruct the optimal alignment, trace back where the max at each step came from, stop when hit the origin.

#### Blast-Off!!



- Let's blast some protein sequences
- https://blast.ncbi.nlm.nih.gov/Blast.cgi#dtr\_Query\_98931



