

551-1119-00L Microbial Community Genomics

Lecture:

Methods on computational genome mining

GOAL

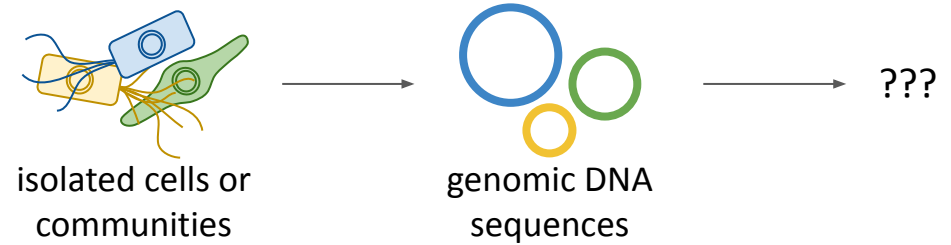
Understand the **different sequence algorithms** that can be applied to **genomes** providing **mechanistic** and **functional** information about the biological system

1. Introduction: the genomics rationale
2. Gene annotation
3. *Ab initio* gene annotation
 - a. Sequence content
 - b. Genetic elements
 - c. Evaluation of sequence motifs
4. Evolutionary conservation: sequence alignment
5. Evolutionary conservation: HMMs
6. Sequence features for annotation
7. Structures biology
8. Closing remarks

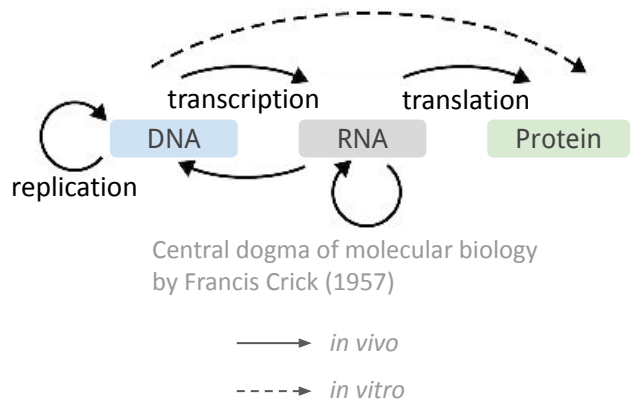
1. Introduction || The genomics rationale

1. Introduction || The genomics rationale

What sequencing provides so far:



Genomes are a valuable source of **biological** and **functional** information
 The final goal in a genomics study usually covers the **genotype** ↔ **phenotype**



polymer	Deoxyribonucleic acids (DNA) - ACGT	Ribonucleic acids (RNA) - ACGU	20 amino acids
unit	gene	mRNA, tRNA, rRNA, ncRNA...	protein
set	genome	transcriptome	proteome
function	information	intermediary & regulation	structural & biochemical

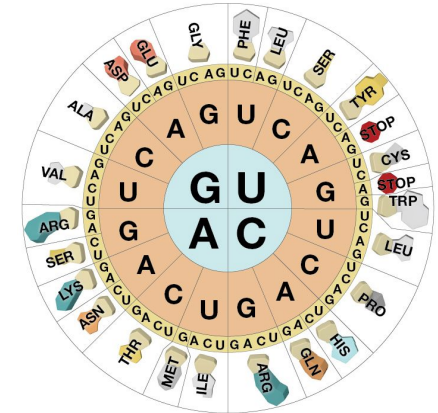
Understanding these processes allow to understand **regulation** and **function** in organisms (transcriptome and proteome) from **genomic** information

2. Gene annotation || ORF scanning

2. Gene annotation | | ORF scanning

Gene annotation is a primary step that relies on the “Open Reading Frame (ORF) scanning” process:

1. 6 ORFs in a genome → why this number?
 - To cover 20 amino acids + stop → $4^1; 4^2; 4^3 = 64$
 - Evolutionary process selecting the codons as nucleotide triplets
 - Genetic code = correspondence between codon - aa
 - It is “universal” and “degenerate”
2. Looking for every start-stop codon sequence:
 - Start codon encode for methionine (e.g. AUG)
 - Stop codon block translation (e.g. UAG, UAA, UGA)

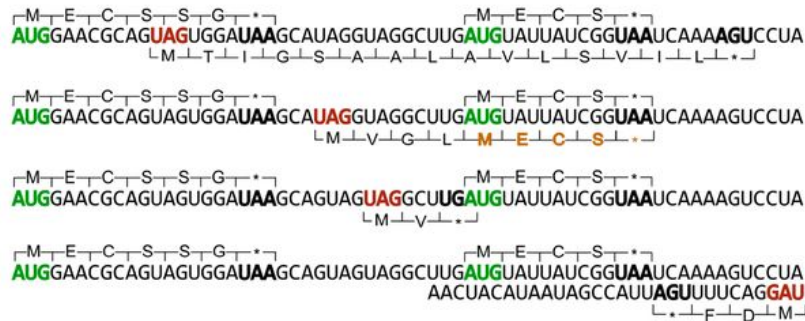


Genetic code in a codon table

Cases

1. UAG codon in different reading frame
2. Intragenic UAG codon in same reading frame
3. Intragenic UAG codon in different reading frame
4. UAG codon on reverse strand

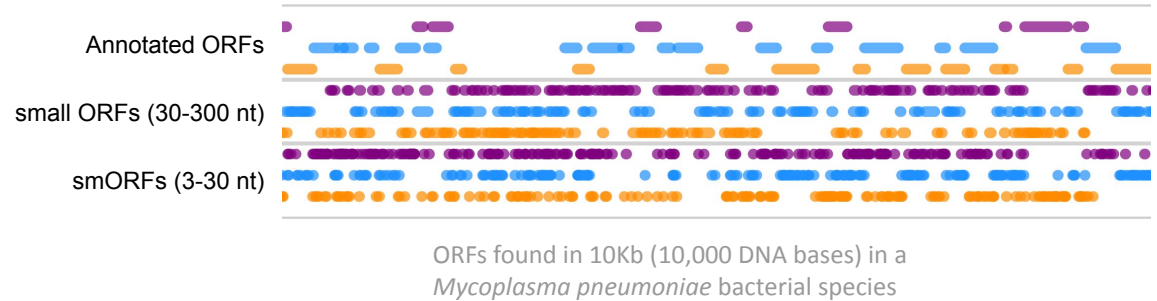
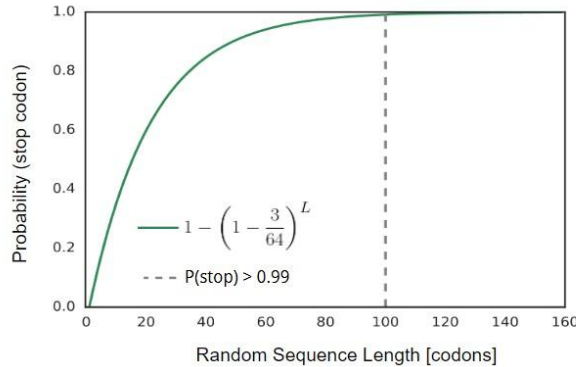
Examples



Complex for humans, very easy task for a computer

2. Gene annotation | | ORF scanning

3. Any sequence larger than 300 nucleotides can be considered to be a gene



4. Additional **features** need to be considered to accurately annotate every gene

- Genes that are smaller than 300 nt are tricky, as there are many more ORFs than protein-coding ORF sequences (referred to as 'CDS'). For example, antimicrobial and signalling proteins tend to be ≤ 100 aa
- Even large ORFs could not be encoding for proteins, for example:
 - long non-coding RNAs
 - pseudogenes \rightarrow when a protein-coding gene regulation is mutated (no expression) or it translates to a non-functional protein due to mutations

Which features can we consider?

2. Gene annotation | | Software tools approaches

Ab initio:



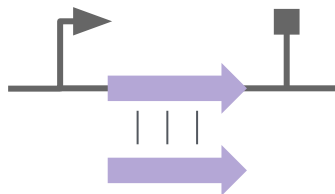
- Sequence content (SC) comparative between **Coding vs. non-coding** in terms of:
 - GC content, Codon Adaptation...
- Genetic **signals**
 - Promoters, Ribosome Binding Sites...
 - Alternative splicing (only eukaryotes)

Sequence Homology (SH):



- Coding sequences are **conserved**
- **Alignment** against DBs (known genes, expressed RNAs, function clusters...)

Combination (CM):



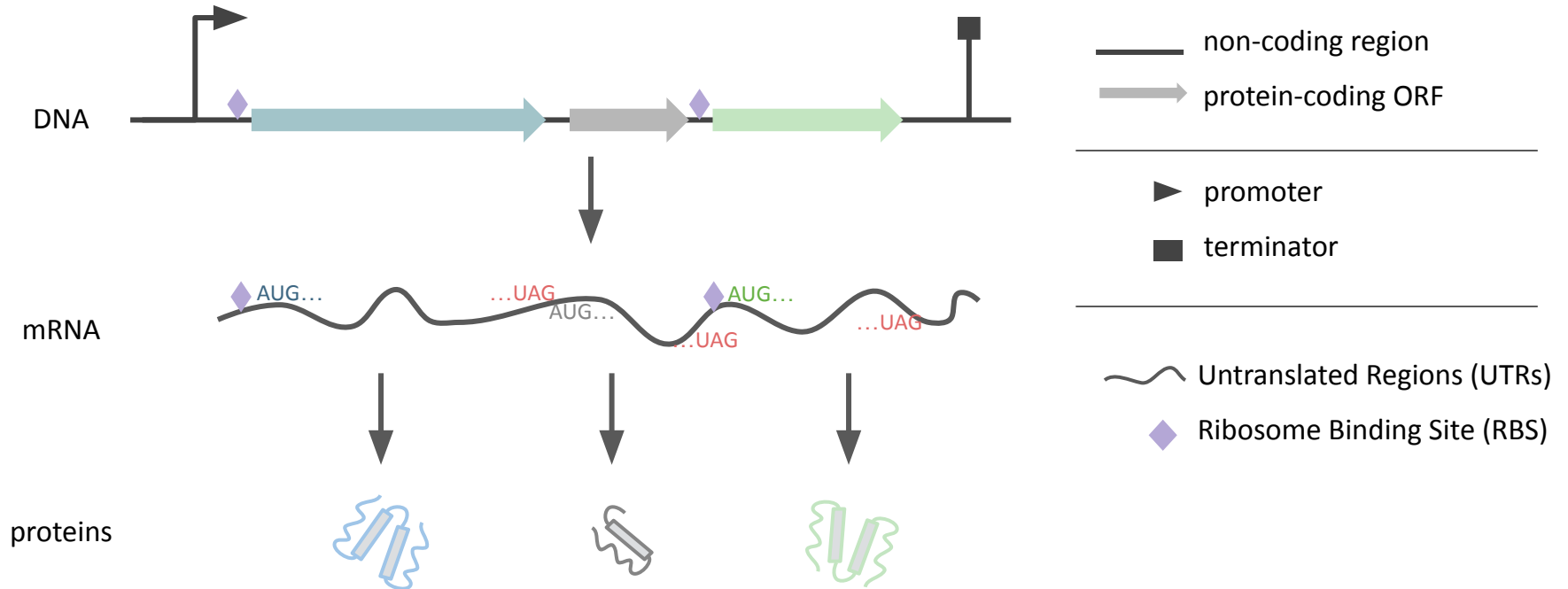
- Widely used in **genomic databases**
- NCBI Prokaryotic Genome Annotation Pipeline (PGAP) is the tool that runs when we submit a genome to NCBI

Tool	Year	Type	Signals	Dependencies
GeneMark	1992	SC	-	-
GeneMark.hmm	1998	SC	-	-
Glimmer	1998	SC	-	-
ORPHEUS	1998	CM	RBS	DPS alignments
BLAST	1999	SH	-	-
COGs	2001	SH	-	-
AMIGene	2003	SC	-	-
GeneMarkS	2005	SC	5'-UTR	-
BASys	2005	CM		Glimmer, BLAST
Glimmer3	2007	SC	RBS	-
ProtClustDB	2009	SH	-	BLAST
Prodigal	2010	SC	RBS	-
FGENESB	2011	SC	-	-
Prokka	2014	CM	RBS	Prodigal, BLAST
ZCURVE	2015	SC	RBS	-
PGAP	2016	CM	RBS	BLAST, COGs, ProtClustDB, Glimmer, GeneMarkS
CPC2	2017	CM	RBS	BLAST

3. *Ab initio* | | Annotation “from the beginning”

3. *Ab initio* | | Annotation “from the beginning”

Genes are not expressed by default, they are often **regulated** by different sequence elements



Sequence content and genetic features can all be explored at the DNA level and provide additional genetic insights

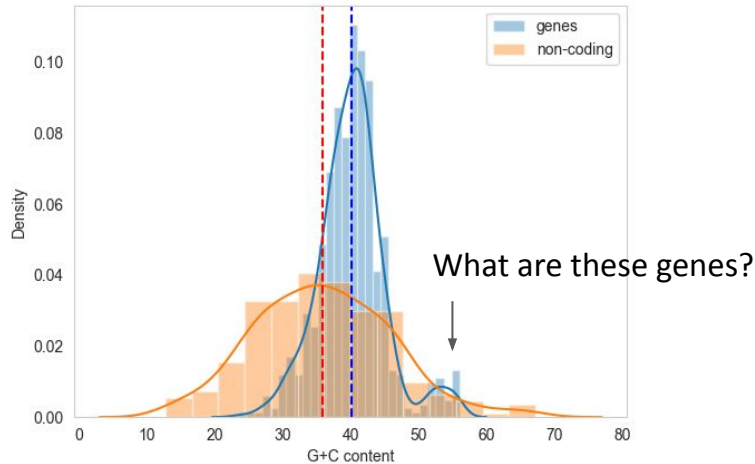
3. *Ab initio* | | Sequence composition: GC content

General idea: sequence composition differs between coding and non-coding regions

- Evolutionary biases can be used to distinguish genes in a genome
 - **Non-coding** regions will present '**random**' nucleotide compositions
 - **Coding** regions will **bias** towards combinations of **nucleotides** that give required amino acids in **proteins**

G + C content (also referred as GC%) describes the guanine and cytosine content of a biological sequence and has historically been reported to range **between 25% and 75%** for bacterial genomes

- GC% varies between coding and non-coding regions



Example of *M. pneumoniae*, a low GC content organism

Other implications:

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A positive correlation between GC content and growth temperature in prokaryotes

[En-Ze Hu](#), [Xin-Ran Lan](#), [Zhi-Ling Liu](#), [Jie Gao](#) & [Deng-Ke Niu](#) ✉

Not trivial to extrapolate mechanistic features...

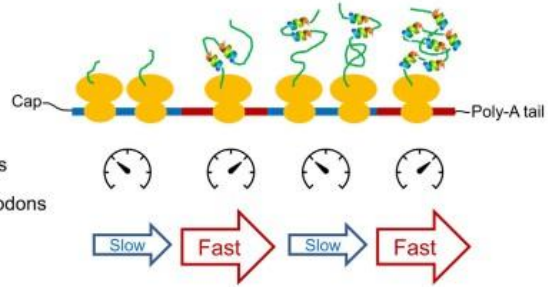
3. *Ab initio* | | Sequence composition: Codon composition

Codon usage bias refers to differences in the **frequency of occurrence of synonymous codons** in coding DNA

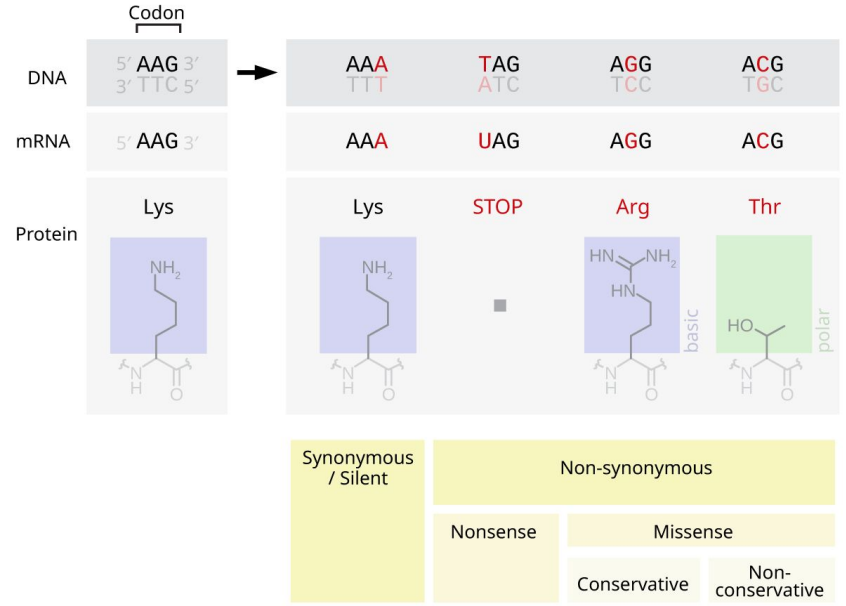
- Codon Adaptation Index (**CAI**) is a metric for codon biases that uses a set of reference genes in an organism, generally highly expressed, to measure how well other genes follow the same trend
 - Non-coding regions will present low CAIs
- Strong **correlation** with **GC%** and **tRNAs** abundances
- **Mechanistic** implications

Arg codon frequencies in 4 model organisms

Codon	<i>E. coli</i>	<i>B. subtilis</i>	<i>S. cerevisiae</i>	<i>H. sapiens</i>
CGU	38	18	14	8
CGC	40	21	6	19
CGA	6	10	7	11
CGG	10	16	4	22
AGA	4	26	48	20
AGG	2	9	21	20



Mutation types:

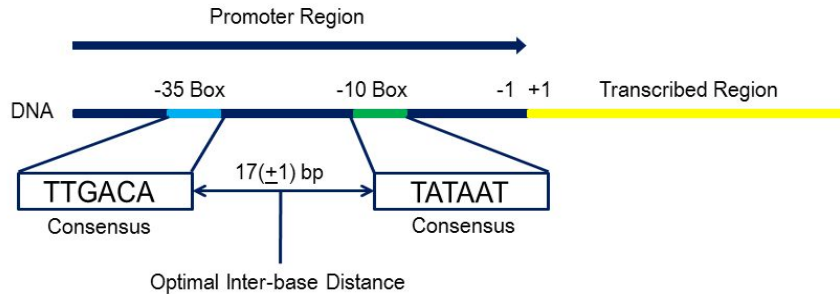


Note: mutations in the 3rd base of codon tend to be less 'harmful' as rarely induce nonsense mutation. The opposite happens with the 1st base

From: Codon Usage Influences the Local Rate of Translation Elongation to Regulate Co-translational Protein Folding - Molecular Cell (2015)

3. *Ab initio* | | Regulatory elements example: Promoters

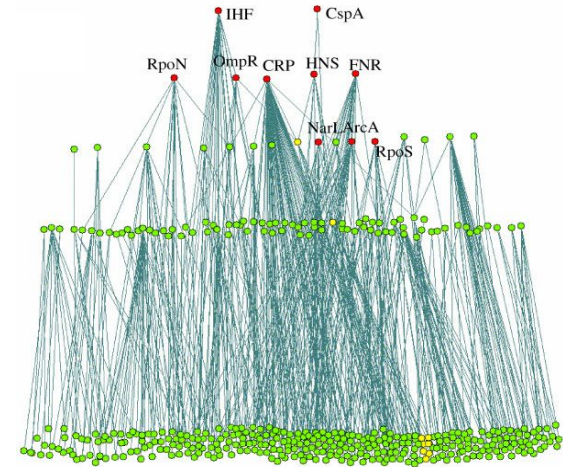
A **promoter** is a sequence of DNA to which proteins bind to initiate transcription of a single RNA transcript



Promoters regulate downstream ≥ 1 protein-coding genes and also functional RNAs

- Genes expressed under the same promoter \rightarrow **operon**
 - Corregulation of similar functions
 - 1st example Lac operon by Jacob & Monod

Additionally, there are several **Transcription Factors (TFs)** that can modulate the coexpression of different genes even if they are not in the same operon



Transcriptional regulatory network in *Escherichia coli*

Certain TF are active under specific conditions (e.g., cold-shock, heat-shock, osmotic stress...)

[SAPPHIRE \(kuleuven.be\)](http://SAPPHIRE.kuleuven.be)

[BPROM - Prediction of bacterial promoters \(softberry.com\)](http://BPROM-softberry.com)

[Online Analysis Tools - Promoters \(molbiol-tools.ca\)](http://molbiol-tools.ca)

3. *Ab initio* | | Evaluating sequence motifs

A **Position Weight Matrix** (PWM) quantitatively evaluates how well a given sequence matches a given sequence “motif”.

These can include:

- Promoters: TATAAT (also referred to as TATA-box or Pribnow sequence)
 - Each transcription factor have a specific sequence motif as well
 - Terminators:
 - Hairpin (measured by RNA folding) + poly-U
 - Rho binding sites
 - RBS: AGGAGG (Shine-Dalgarno motif)
- These motifs may vary between species → evolution as driving force
- **Distance** between the regulatory motif and the regulated gene also matters

A	0.1	0.8	0	0.7	0.5	0
C	0	0.1	0.3	0.1	0.2	0.3
G	0	0	0.2	0.1	0.1	0.1
T	0.9	0.1	0.5	0.1	0	0.6

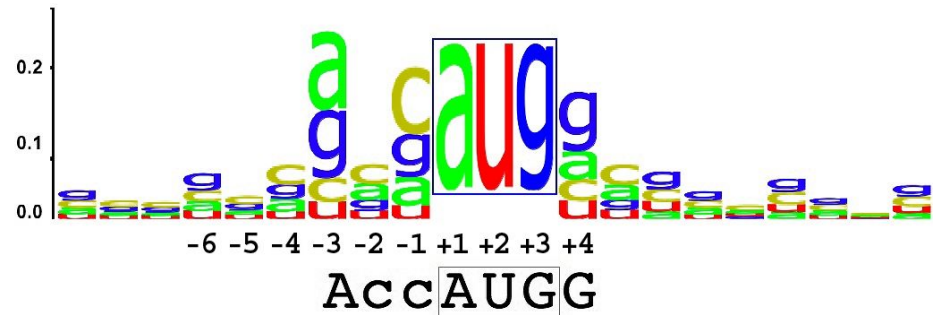
Product accumulated score:

TATAAT = 0.076

TACCCT = 0.002

CAACTT = 0

Bit score logos can be used to graphically represent a motif



This same approach works with amino acid sequences

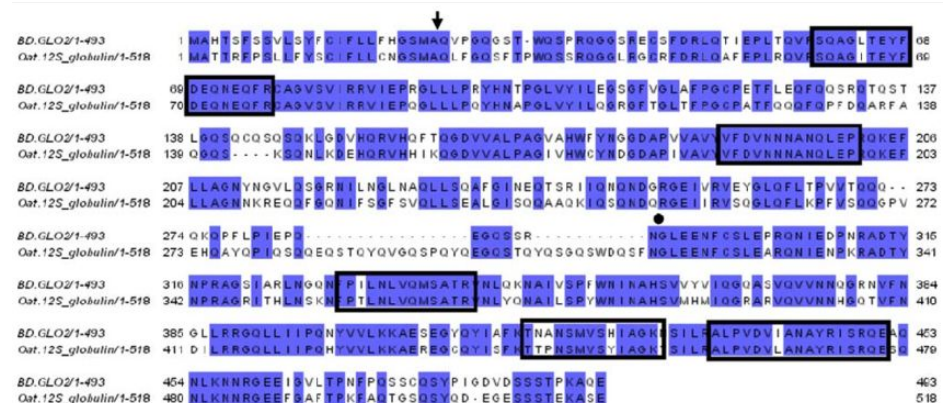
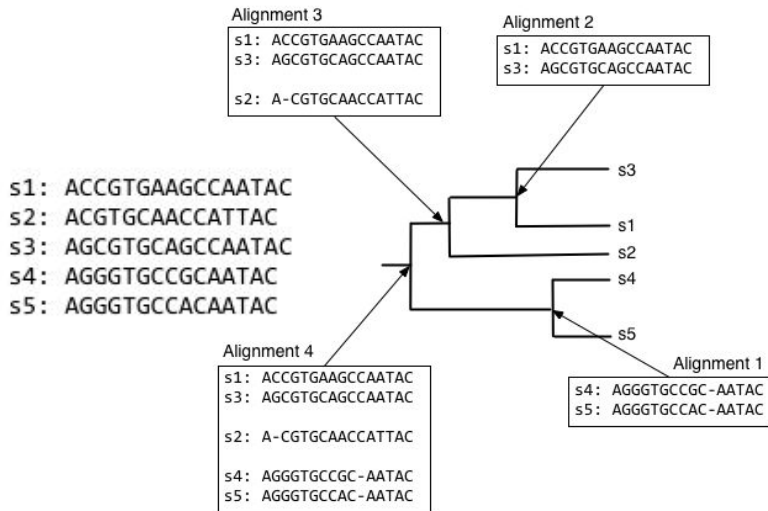
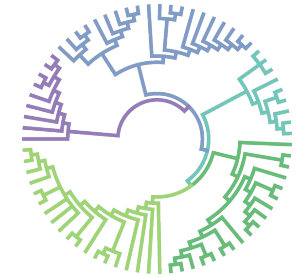
4. Evolutionary conservation || sequence alignment

4. Homology | | Sequence alignment rationale

A **sequence alignment** is a way of arranging the sequences of DNA, RNA, or protein to identify regions of similarity that may be a consequence of functional, structural, or evolutionary relationships between the sequences

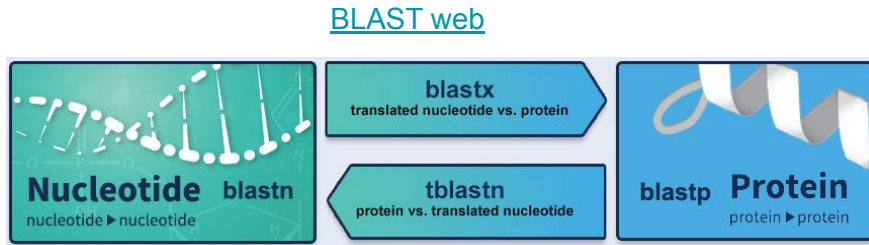
Main idea:

- Score positively the matches, penalizing mismatches and/or gaps
- Residues (aa) relevant for a function are evolutionary “conserved”, for example:
 - Promoters of housekeeping genes (essential for cell maintenance processes)
 - Protein domains important for a function are generally conserved
 - Zinc fingers, Disulfide bonds
 - Phosphorylation-related domains
- Alignments can be used to reconstruct the **phylogeny** of a set of species (evolutionary tree)

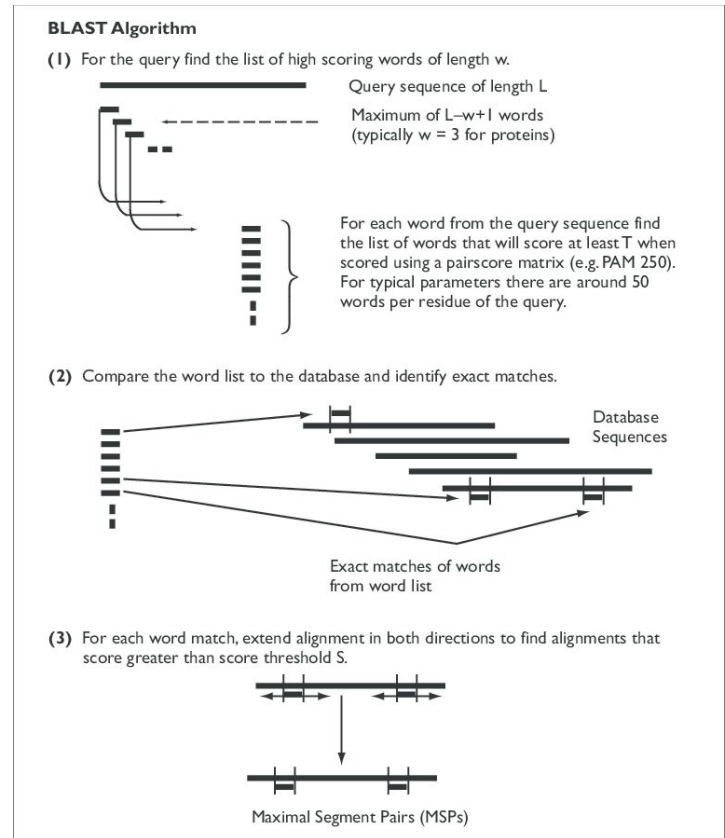


4. Homology | | BLAST algorithm

- Alignment of a sequence against annotated sequences databases
 - **Same sequence = same structure = same function**



- Importance of the DB used:
 - RefSeq
 - PDB
 - Curated databases (e.g., PlasticDB, etc)
 - OMD, motus-db
 - etc

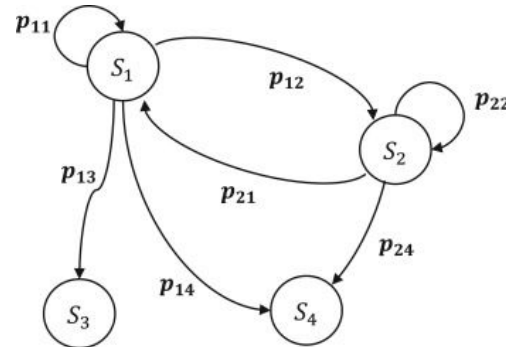
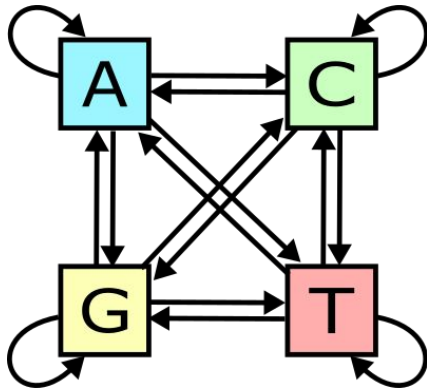


5. Evolutionary conservation || HMMs

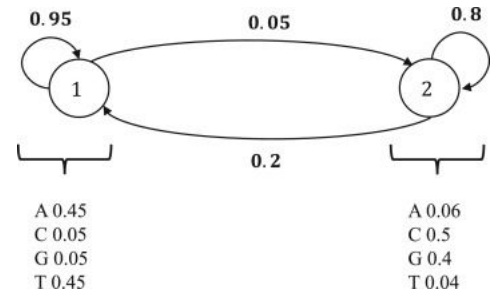
5. HMMs | applications in biology

HMMs are often preferred over BLAST in biology because they better detect distant homologs, use profile-based matching to capture conserved sequence motifs, and offer greater accuracy in functional annotation through probabilistic modeling.

- In HMMs, the "hidden" states represent unknown biological properties (e.g., functional domains in a protein sequence), while the "observations" are the actual sequence elements (like nucleotide or amino acid residues). The model probabilistically associates these observable elements with specific hidden states, helping predict or annotate parts of the sequence.
- Aid in tasks like gene prediction, protein family classification, and functional annotation.
- Tools like HMMER use HMMs to scan large databases, identifying sequences that match known biological profiles, even with slight variations.



transitions



Transitions + emissions

5. HMMs | | Pfam

Pfam 37.0 (21,979 entries, 709 clans)

The Pfam database is a large collection of protein families, each represented by *multiple sequence alignments* and *hidden Markov models (HMMs)*.

[Less...](#)

Proteins are generally composed of one or more functional regions, commonly termed *domains*. Different combinations of domains give rise to the diverse range of proteins found in nature. The identification of domains that occur within proteins can therefore provide insights into their function.

Pfam also generates higher-level groupings of related entries, known as *clans*. A clan is a collection of Pfam entries which are related by similarity of sequence, structure or profile-HMM.

The data presented for each entry is based on the [UniProt Reference Proteomes](#) but information on individual UniProtKB sequences can still be found by entering the protein accession. Pfam *full* alignments are available from searching a variety of databases, either to provide different accessions (e.g. all UniProt and NCBI GI) or different levels of redundancy.

QUICK LINKS YOU CAN FIND DATA IN PFAM IN VARIOUS WAYS...

[SEQUENCE SEARCH](#) Analyze your protein sequence for Pfam matches

[VIEW A PFAM ENTRY](#) View Pfam annotation and alignments

[VIEW A CLAN](#) See groups of related entries

[VIEW A SEQUENCE](#) Look at the domain organisation of a protein sequence

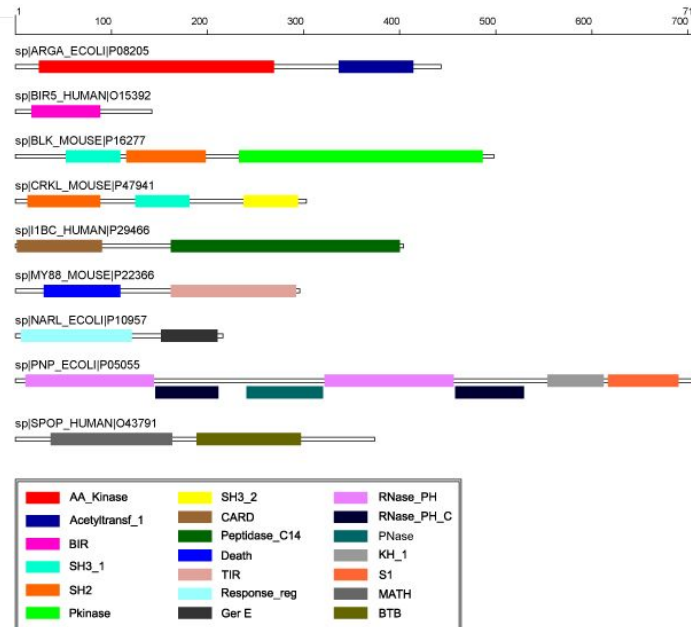
[VIEW A STRUCTURE](#) Find the domains on a PDB structure

[KEYWORD SEARCH](#) Query Pfam by keywords

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Enter any type of accession or ID to jump to the page for a Pfam entry or clan, UniProt sequence, PDB structure, etc.

Or view the [help](#) pages for more information

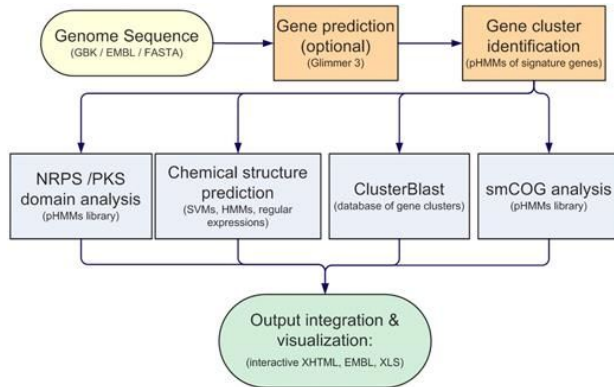


[Pfam is now hosted by InterPro](#)

5. Advance models || antiSMASH

Metabolic gene clusters or **biosynthetic gene clusters (BGCs)** are tightly linked sets of (mostly) non-homologous genes participating in a **common, discrete metabolic pathway or biological process**.

- their expression is often coregulated (same operon, same TFs, etc.)
- Other factors such as cluster completion needs to be considered



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Biosynthetic potential of the global ocean microbiome

[Lucas Paoli](#), [Hans-Joachim Ruscheweyh](#), [Clarissa C. Forneris](#), [Florian Hubrich](#), [Satria Kautsar](#), [Agneya Bhushan](#), [Alessandro Lotti](#), [Quentin Clayssen](#), [Guillem Salazar](#), [Alessio Milanese](#), [Charlotte I. Carlström](#), [Chrysa Papadopoulos](#), [Daniel Gehrig](#), [Mikhail Karasikov](#), [Harun Mustafa](#), [Martin Larralde](#), [Laura M. Carroll](#), [Pablo Sánchez](#), [Ahmed A. Zayed](#), [Dylan R. Cronin](#), [Silvia G. Acinas](#), [Peer Bork](#), [Chris Bowler](#), [Tom O. Delmont](#), ... [Shinichi Sunagawa](#) [+ show authors](#)

- **40,000 putative new BGCs**
- **High discover potential**
 - New drugs
 - Novel biotechnological applications
 - New biological paradigms
 - etc.

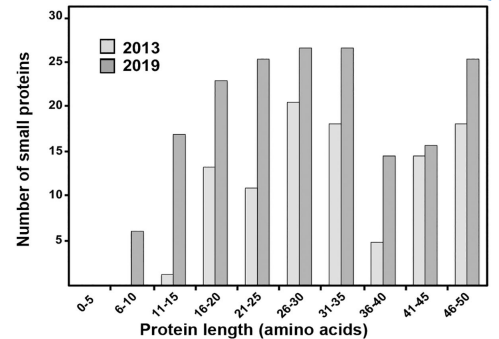
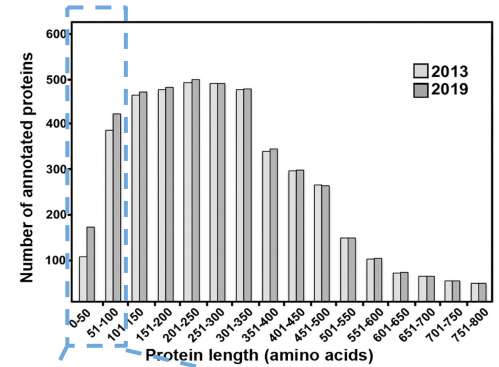
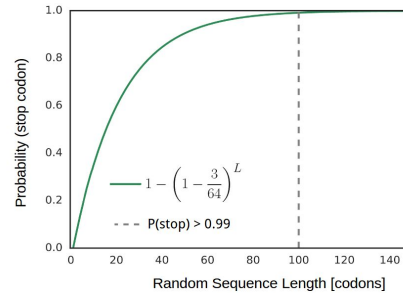
[TAOJ22-1 SAMN27365860_MAG_00000152](#)
[- 55 region\(s\) - antiSMASH results](#)

6. Sequence feature-based annotation || SEPs, AMPs and signal peptides

6. Sequence feature-based || SEPs

Gene annotation tools initial step: Open Reading Frame scanning

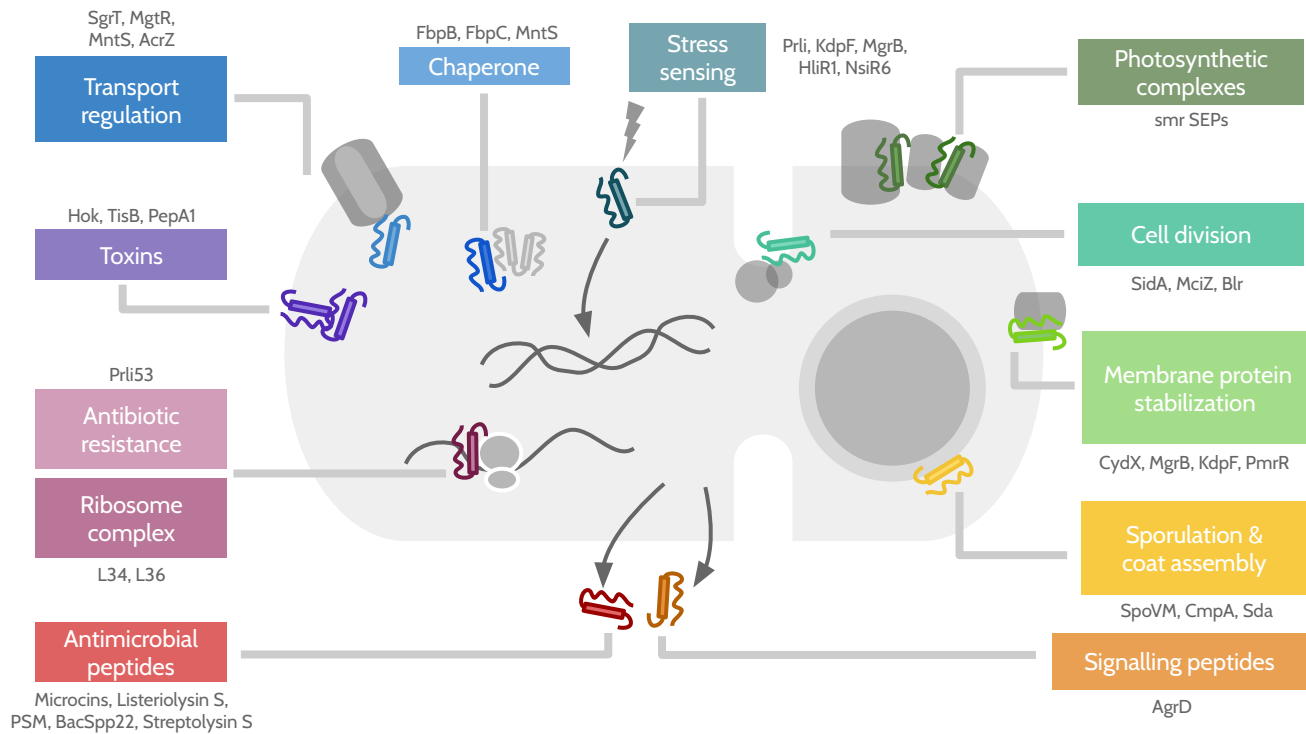
- Arbitrary threshold in 100 aa
 - Large % of small-ORFs will be non-coding
- small ORF-Encoded Proteins (SEPs, ≤ 100 aa)
- Experimental approaches overlook SEPs
 - Under-representation in databases
 - Discovered by serendipity in screening assays
 - Epitope/Tag approaches → case by case Van Orsdel, CE. et al. (Proteomics, 2018)
 - Transcriptomics / RiboSeq Weaver, J. et al. (mBIO, 2019)
 - mRNAs translation but no frame information
 - Mass Spectrometry as top contributor Ahrens, CH. et al. (J. Bacteriol. Res., 2022)



Functional? Translational noise?

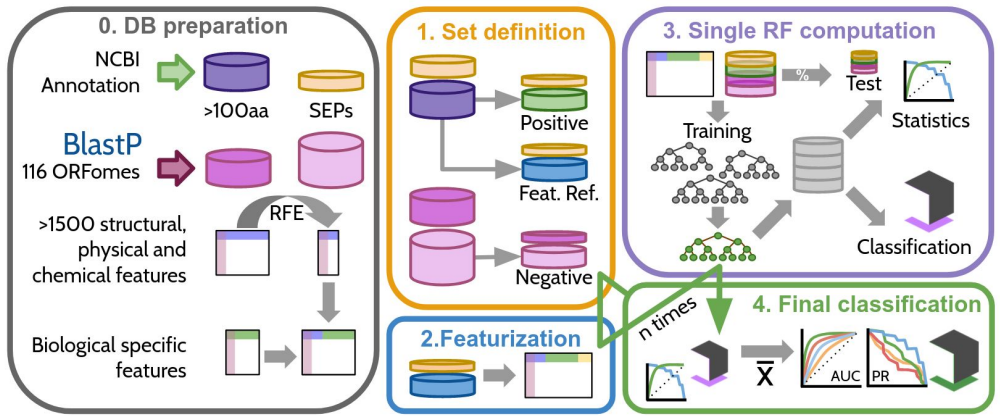
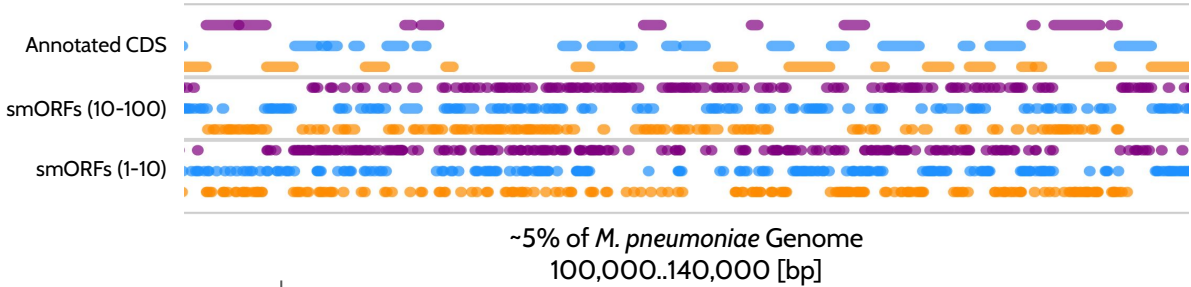
Total number of new SEPs doubled number in *E. coli*. Adapted from Hemm MR, et al. (EcoSal Plus 2020)

6. Sequence feature-based || SEPs



From 'Development of computational and experimental tools for the identification of small proteins in bacterial genomes' - S Miravet-Verde (2021) <https://www.tdx.cat/handle/10803/671772>

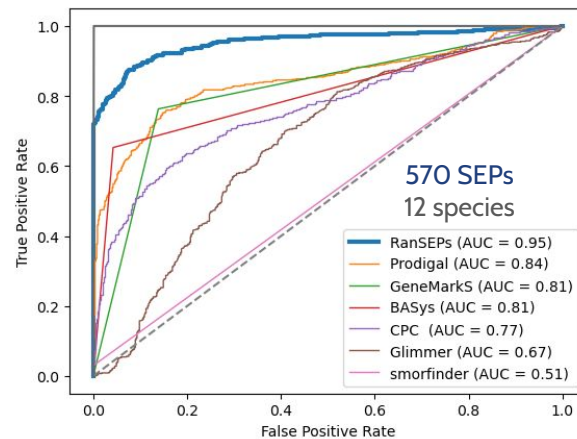
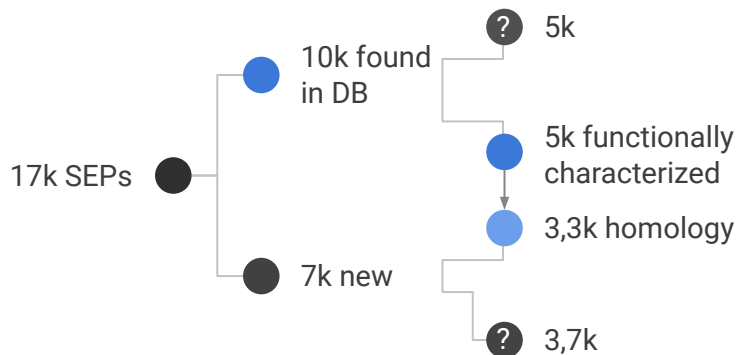
6. Sequence feature-based || SEPs



6. Sequence feature-based || SEPs

- Findings

- + 4k in human-gut Sberro H, et al. (Cell, 2019)
- + 40k in phages Fremin BJ, et al. (Cell Rep., 2022)
- limited discovery
- 50% no associated function



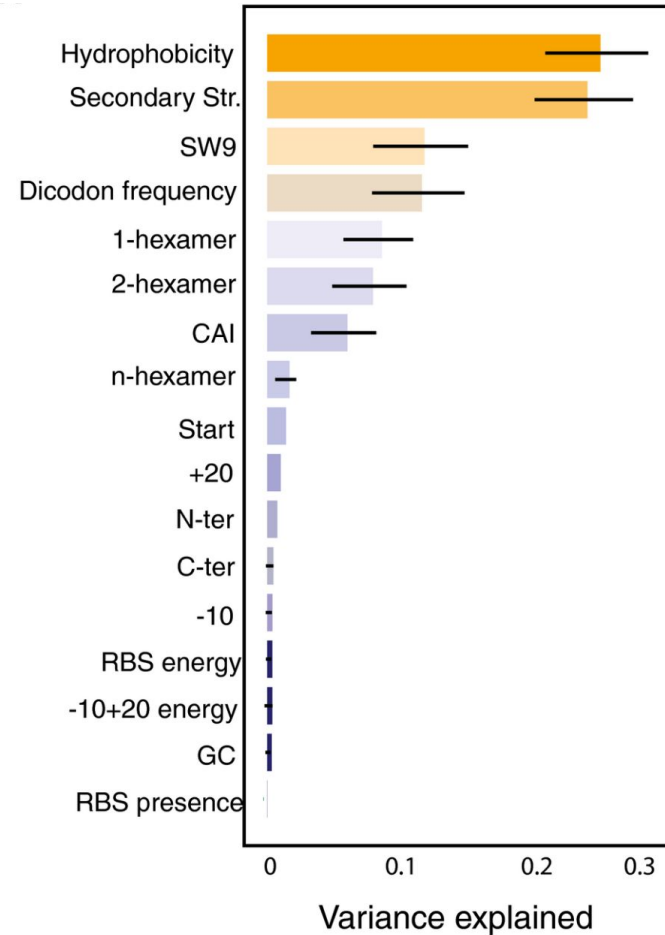
Secreted/exposed SEPs are enriched:

- 25% AMPs
- 10% signal peptides
- 15% transmembrane motif

6. Sequence feature-based || SEPs

- Can we predict in an species-agnostic manner?
 - ~80% of the variance explained by species-independent features
 - Testing:
 - Training without species consideration
 - Evaluate prediction accuracy
 - Consider using pre-computed databases

species-specific



6. Sequence feature-based || AMPs

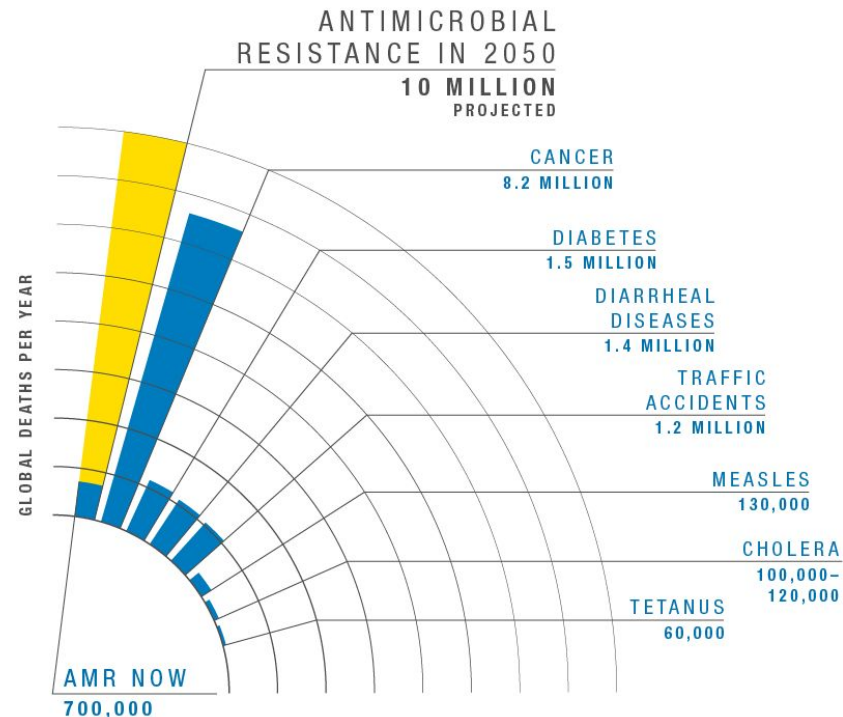


We need to broaden the search for novel bioactive compounds

new environments

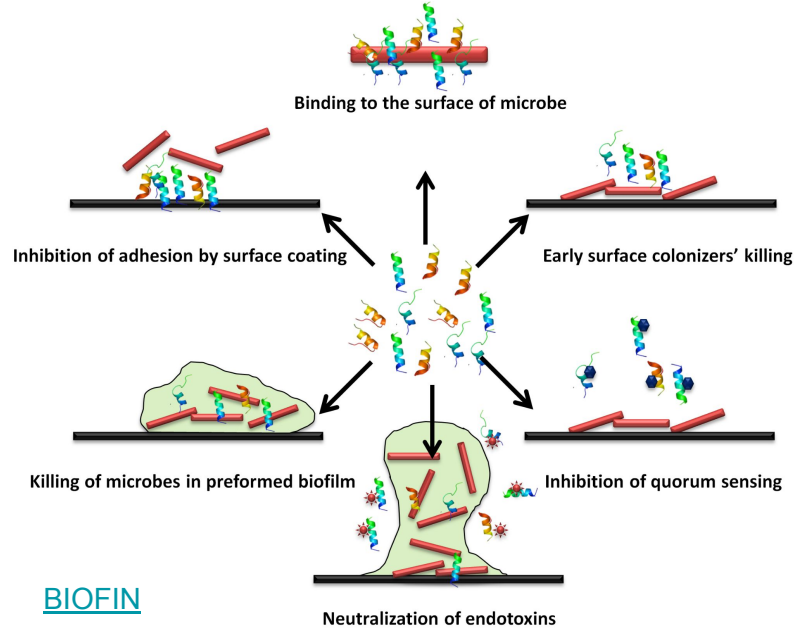
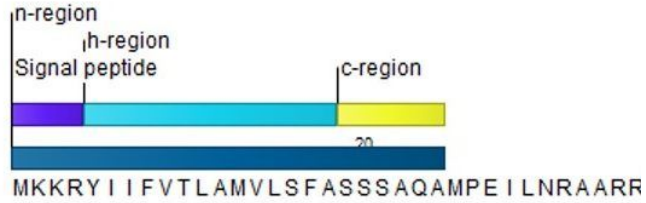
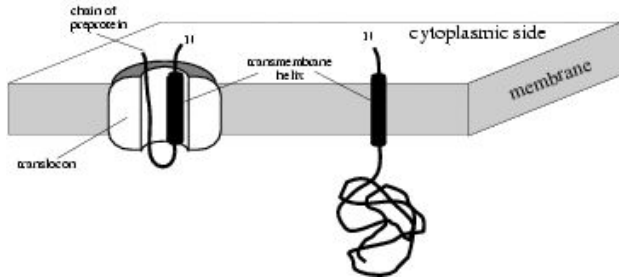
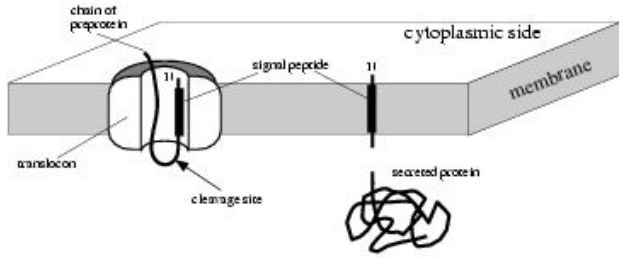
new functions

- Traditional methods to identify novel bioactive compounds (e.g., antimicrobials):
 - economically and timewise expensive
 - cultivability required
 - $P(\text{re-identification}) > P(\text{discovery})$



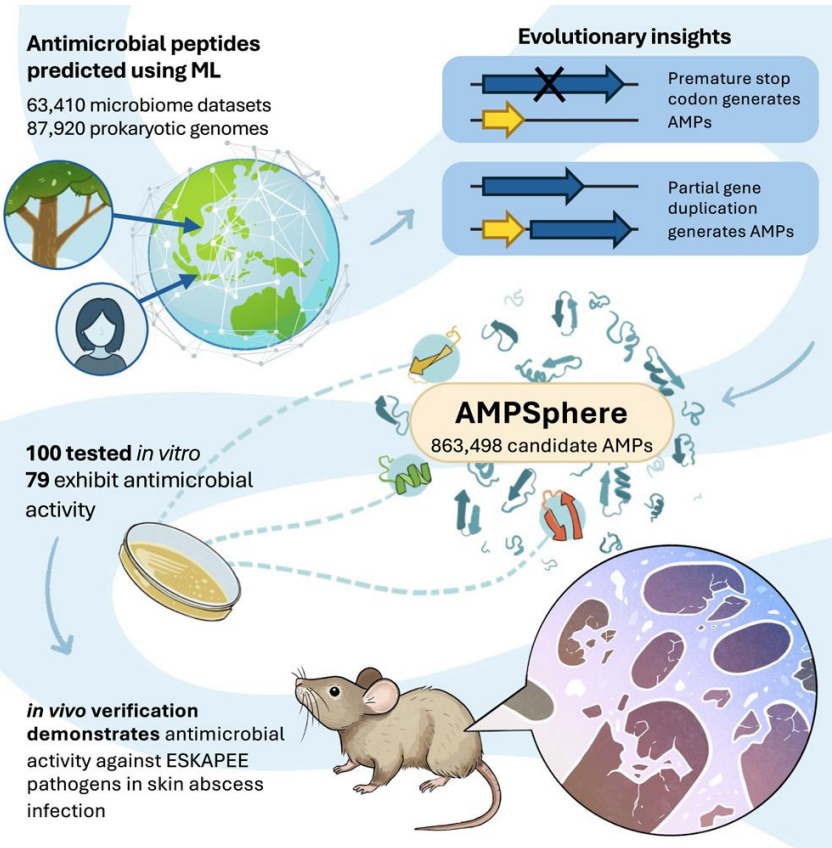
“Environmental genomics-mediated discovery”

6. Sequence feature-based || Signal peptides

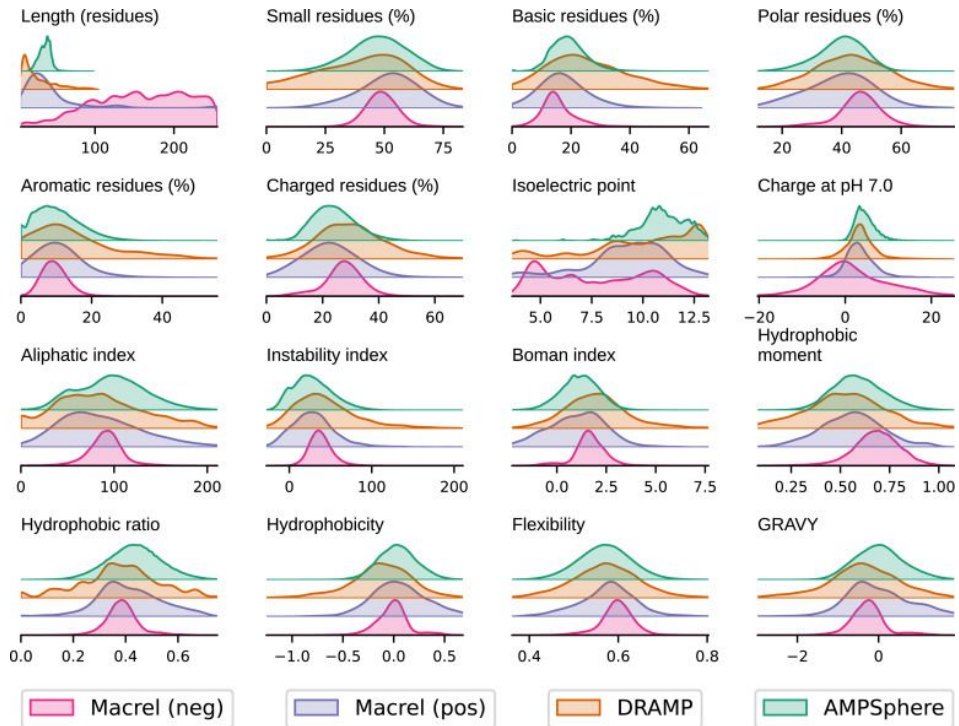


BIOFIN

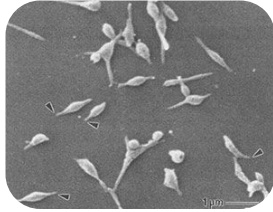
6. Sequence feature-based || AMPs



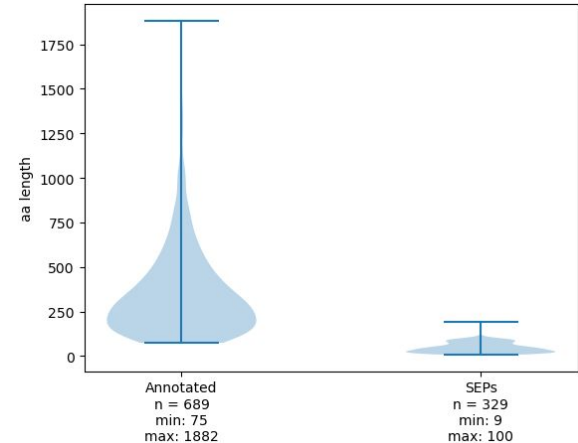
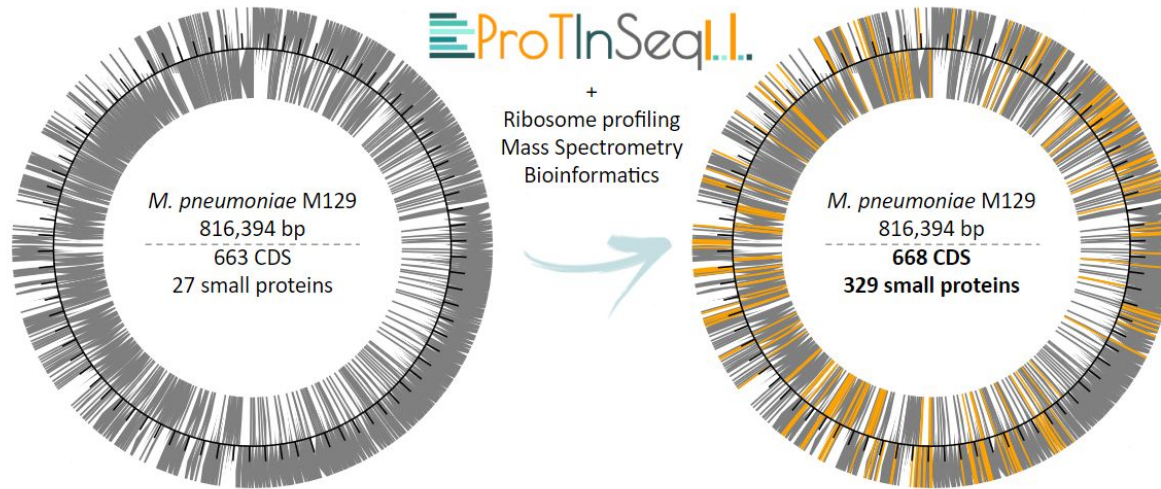
<https://www.cell.com/cell/fulltext/S0092-8674%2824%2900522-1>



Small proteins | | What are we missing?



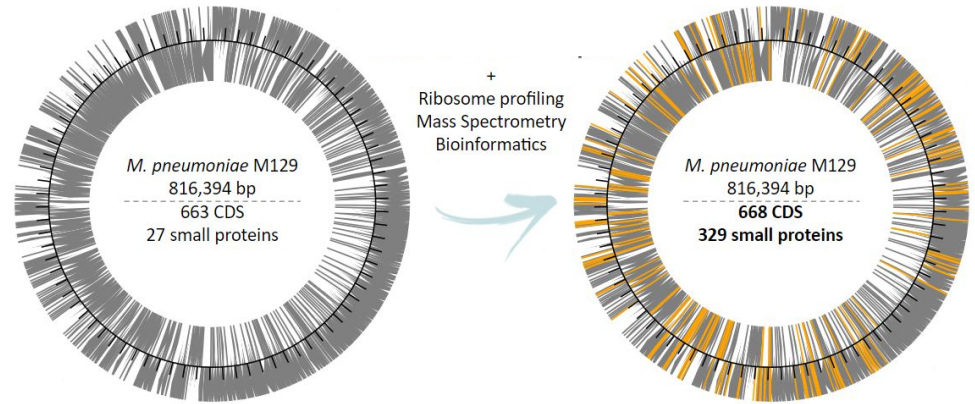
- **Downsized genome (816 kb) → systems and synthetic biology model**
 - 'Simple': 689 protein coding genes annotated (27 SEPs)
 - Weak lung pathogen → biomedical/veterinary applications



'ProTInSeq: TnSeq applied to protein detection, quantification and functional studies' - [S Miravet-Verde, et al. Nat Comm 2024](#)

Discussion || Open questions

- Coding potential
 - *M. pneumoniae* 690 → 997 genes
 - *E. coli* 4,000 → ?
 - Human 20,000 → ?



- Functional characterization is still a **problem**, still great potential for therapeutic/biotechnological applications:
 - ~50% of the identified SEPs are hypothetical or unassigned-function proteins
 - **Secreted** and **membrane** located SEPs
 - Similar results in **metagenomic** studies Sberro H, et al. (Cell, 2019) :
 - >4,000 conserved SEPs families
 - 30% predicted to be secreted and/or transmembrane
 - However, **other ecological niches yet to be addressed** → **ocean?**

7. Protein structures || Latest advances

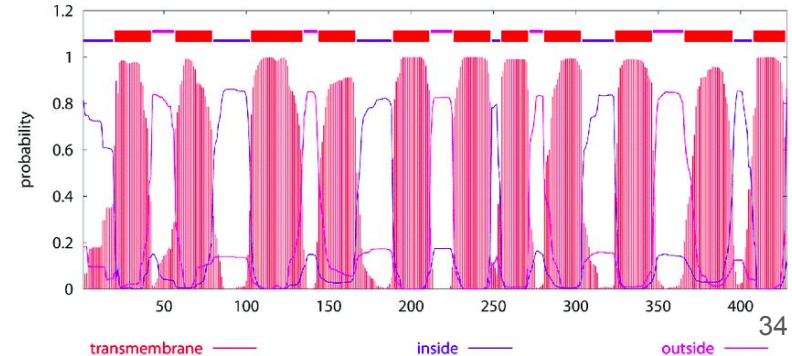
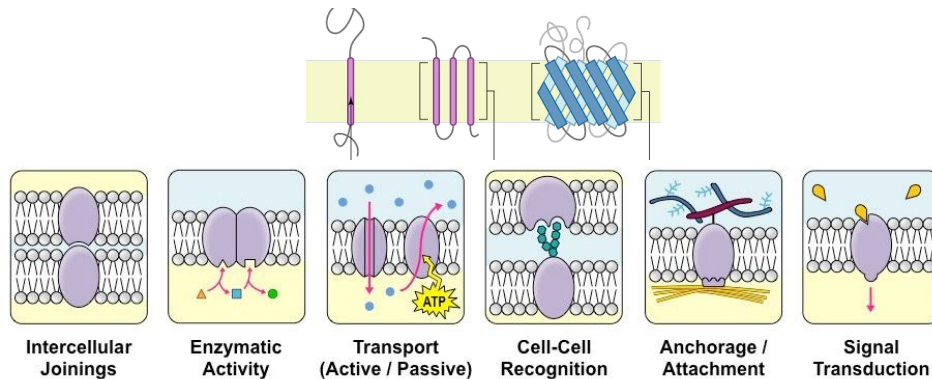
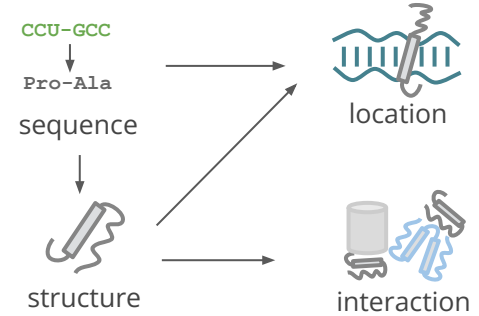
7. Structural biology | | Mechanisms from sequence and structures

Proteins function by **interacting** with other molecules (DNA, RNA, proteins and metabolites)

- **Structural** roles (e.g. collagen)
- **Globular** proteins → they are soluble in water and function in and out the cell
 - Catalytic roles → enzymes
- **Membrane-associated** proteins
 - cell communication and transport
 - protein channels
- **Secreted** proteins to interact with other members in an ecosystem:
 - Signal peptides → communication
 - Antimicrobial peptides → competition

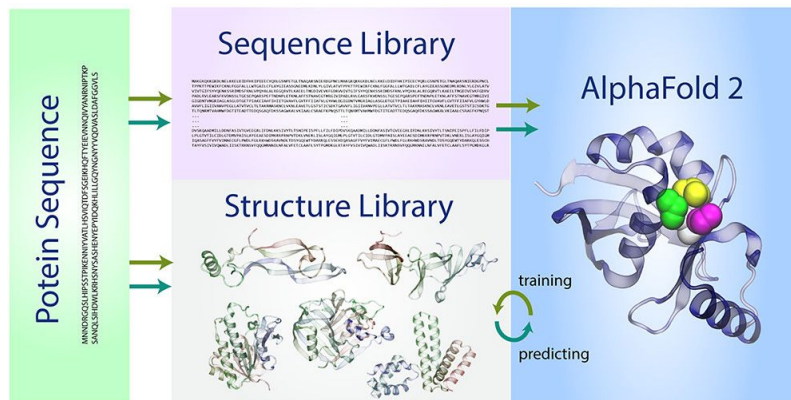
Each of these will present **specific protein domains** and amino acid compositions

- There are databases to find these motifs in new sequences (PFAM, Uniprot, etc.)
- There are software tools to predict localization and transmembrane domains:



7. Structural biology | | Predicting structures directly from sequence

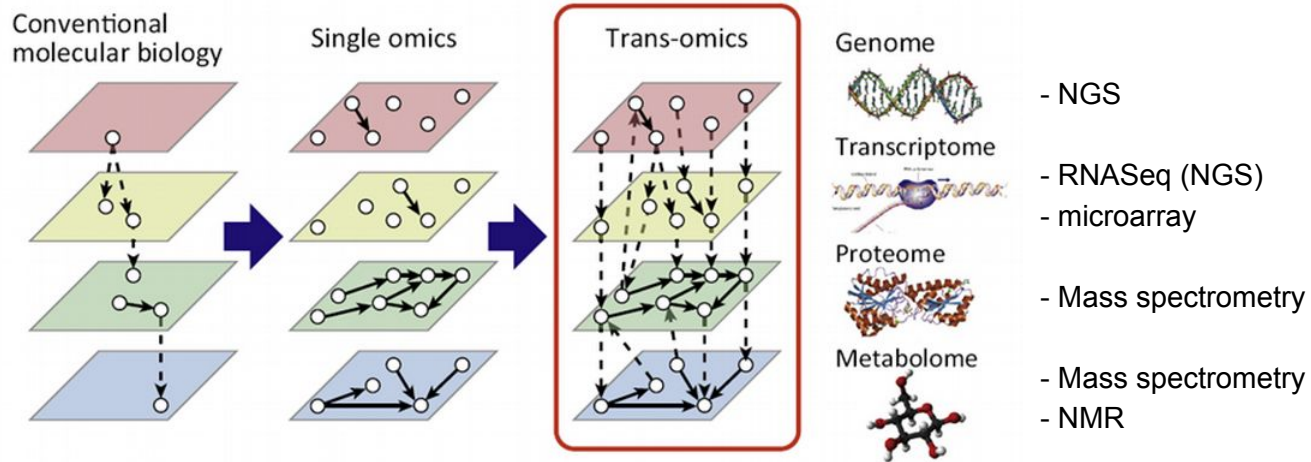
- Alignment + Artificial intelligence models trained with known structures allow now to **predict the structure of proteins**



AlphaFold 2 and 3: Why It Works and Its Implications for Understanding the Relationships of Protein Sequence, Structure, and Function | Journal of Chemical Information and Modeling (acs.org) [<https://pubs.acs.org/doi/10.1021/acs.icim.1c01114>]

8. Closing remarks ||

6. Closing remarks | | Integrative genomics



All these approaches tend to work with databases of already **known genes**

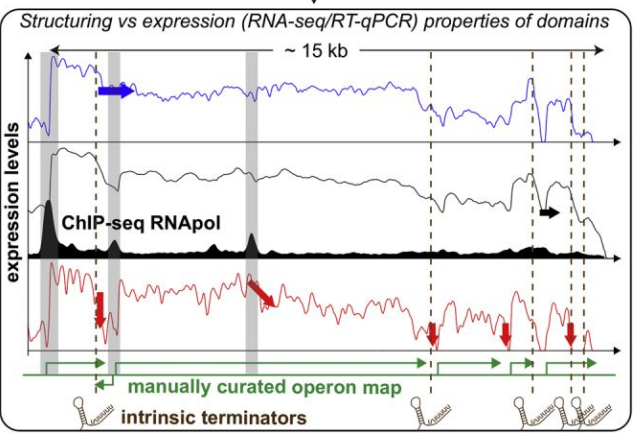
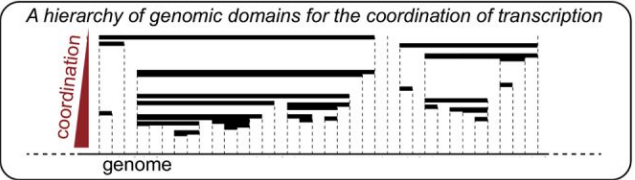
- A big fraction of the genes considered have no function associated → **growing knowledge**
- **Genome** exploration and comparative are grounding sources of **biological information**
 - Can be **extended** and **integrated** with other **omics** studies
- Tons of data (**big data**) → **computers** are essential
- **Bioinformatics** provide the tools required to **evaluate** and **validate**
 - New algorithm approaches, such as using Artificial Intelligence, are providing new paradigms in the way we integrate and understand biological information
- **Researchers** are still the only “machines” capable of **interpreting** this data

0. Extra material ||

3. *Ab initio* | | Regulatory elements: Terminators

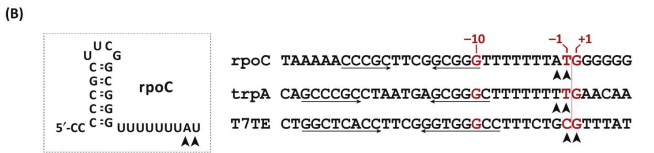
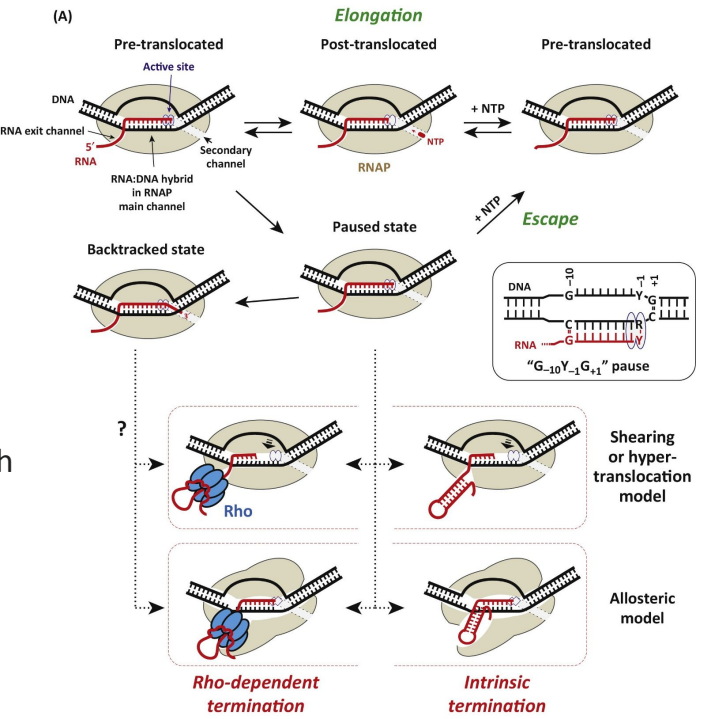
Transcriptional **termination** is associated to two types of processes:

- Factor-independent (also called intrinsic termination):
 - Relies on “**terminators**”, formed by a **secondary structure** in the transcribed RNA and a **poly-U track**
- Rho-dependent
 - Performed by the **Rho protein** which recognizes a GC-rich motif in the transcript



Terminators do not just finish transcription, they can regulate co-expression responding to external factors such as temperature (which affects RNA 2^{ndary} structures)

Insights into the Mechanisms of Basal Coordination of Transcription Using a Genome-Reduced Bacterium - Junier I. et al. (2016)

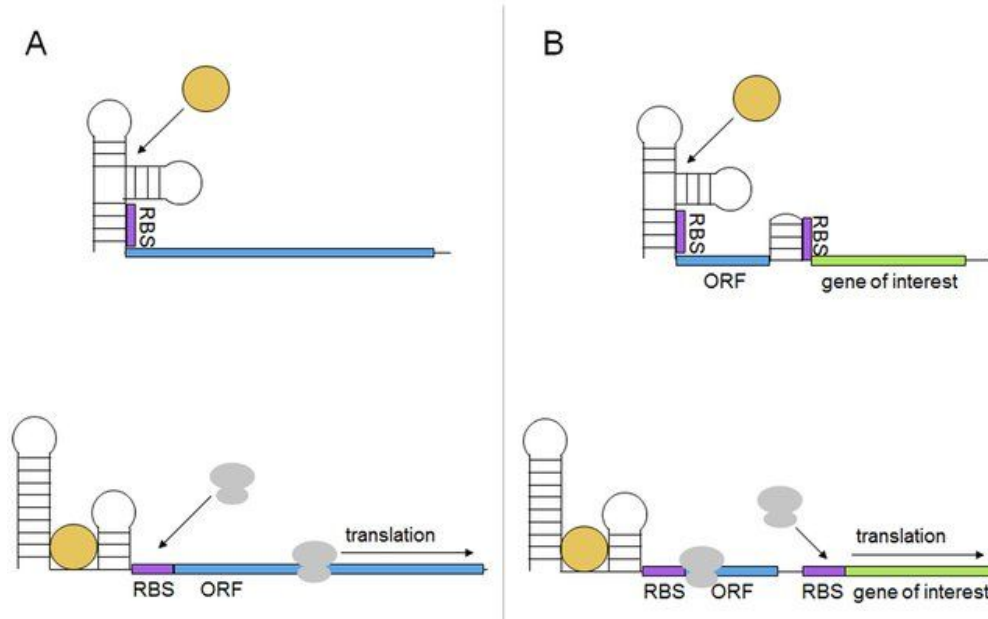


3. *Ab initio* | | Regulatory elements: Ribosome Binding Sites

Ribosome binding sites (RBS) are in charge of recruiting ribosomes to start the translation of a messenger RNA (mRNA)

- They are found ~7 bp upstream a gene start codon (in the Untranslated Region [UTR] of mRNAs)

Additionally, they might be found associated to **Riboswitches**, RNA secondary structures that can interact with certain **metabolites** or **environmental conditions** (e.g. temperature) to hide/expose a RBS to control translation of a certain protein



RNA secondary structures related to terminators and Riboswitches can be predicted computationally:

ARNold
FINDING TERMINATORS

[Riboswitch Scanner \(iiserkol.ac.in\)](http://iiserkol.ac.in)

[Riboswitch Finder \(uni-wuerzburg.de\)](http://uni-wuerzburg.de)