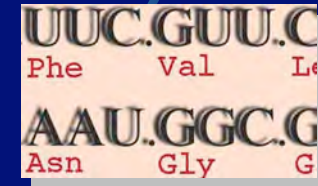


# Exploration of neighbourhoods for inductive reasoning



# Authors



## in silico

- ➔ Eduardo Rocha
- ➔ Ivan Moszer
- ➔ Claudine Médigue

## in vivo / in vitro

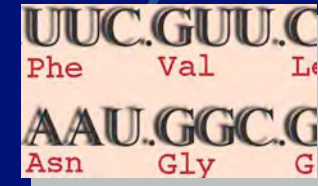
- ➔ Agnieszka Sekowska
- ➔ Anne Marie Gilles
- ➔ Octavian Barzu

## Collective

- ➔ Stanislas Noria



# A Chinese view for ....



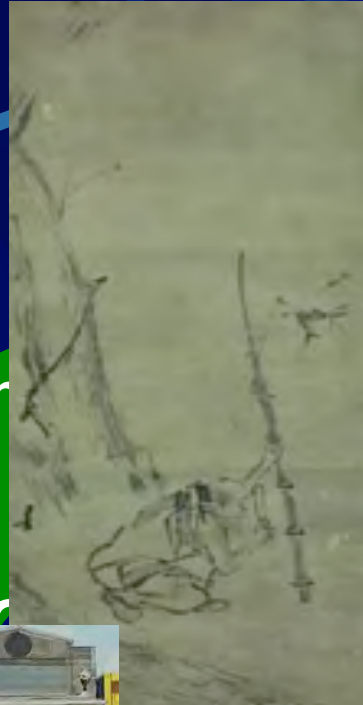
# a virtuous circle

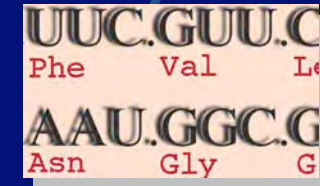
- Context
- Data
- Hypotheses => Today's presentation



UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G

# « Bombardment of the Embassy in Belgrade »



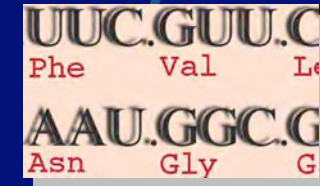


# Data vs Hypotheses

**What biological  
question are you  
asking?**



**Empedocle / Maupertuis / Malthus / Darwin**



**Variation / Selection / Amplification**

**Evolution**



*creates*

**Function**



*recruits*

**Structure**

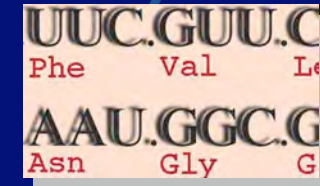


*coding process*

**Sequence**



# What is Life?

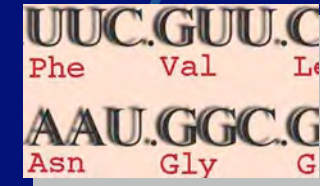


➔ **Physics: *matter, energy, time***

➔ **Biology: *Physics + information, coding, control...***



# What functions for Life? An extension of Cuvier's view....

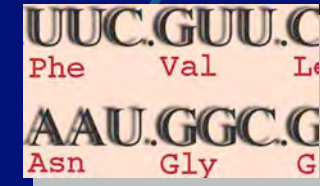


- Physical stability ([cyto]skeleton)
- Reproduction
- Respiration
- Locomotion
- Perception
- Transport (import / export)
- Circulation (internal fluxes)
- Digestion and recycling
- Assimilation
- Accommodation (regulation)
- Maintenance (repair)
- Etc...





# What is Life?



**Three processes are needed for Life:**

→ **Information transfer (Living Turing Machines)**

Driving force for a coupling between the genome structure and the structure of the cell:

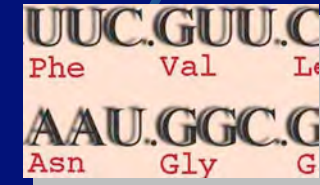
→ **Metabolism (Internal organisation)**

→ **Compartmentalization (General structure)**

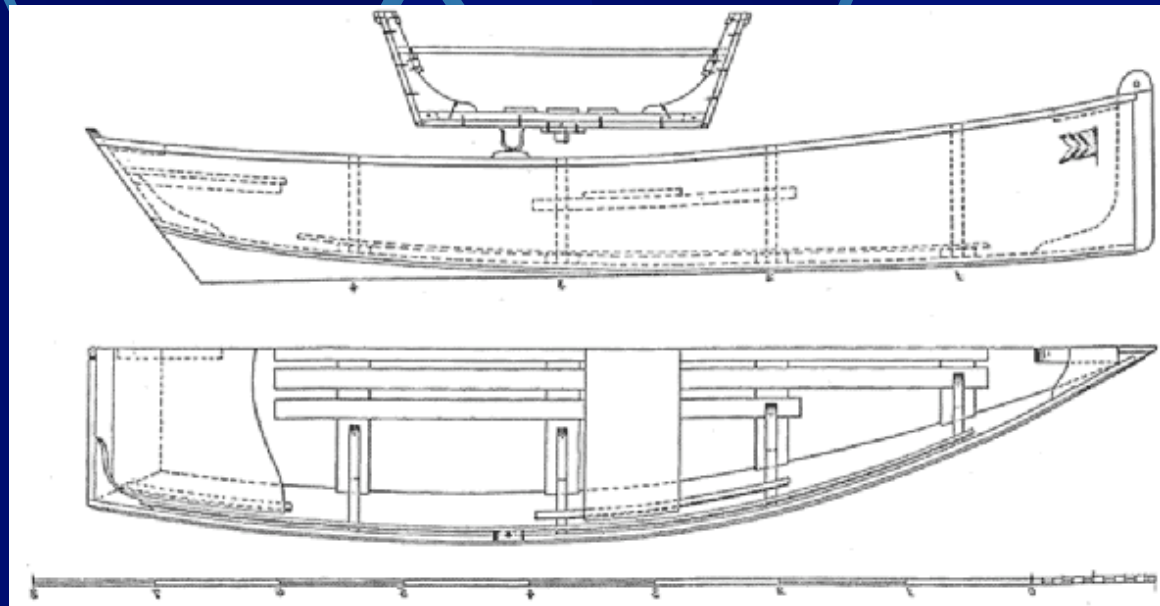
Because of these two processes, note that “concentration” usually does not have a meaning inside a cell



# Inductive strategy: exploring “neighborhoods”



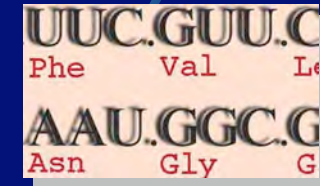
- Genes do not operate in isolation
- Proteins are part of complexes, as are parts in an engine
- ↳ It is important to understand their relationships, as those in the planks which make a boat



*The Delphic Boat*: Harvard University  
Press, february 2003



# Induction: exploring neighborhoods

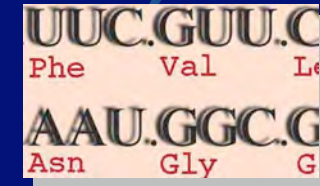


To make discoveries we explore the general « neighborhoods » of genes of interest: proximity in the chromosome, in evolution, **in the literature**, in biochemical complexes, in metabolism etc.

Comparative genomics is essential, hence the use of « subtractive » genomics (comparison of pairs or larger sets of similar genomes)



## From sequence to function

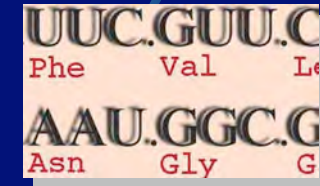


Combining genome sequence data and *in silico* prediction (bioinformatics) we test our hypotheses using large scale genomics techniques (transcriptome and proteome analysis) as well as other types of neighborhoods, such as common electric charge or codon usage bias.

↓ Note that **regulation evolves much faster** than all other processes



# Genome organisation



Is the gene order random in the chromosomes?

At first sight, despite different DNA management processes not much is conserved, and horizontally transferred genes are distributed throughout genomes

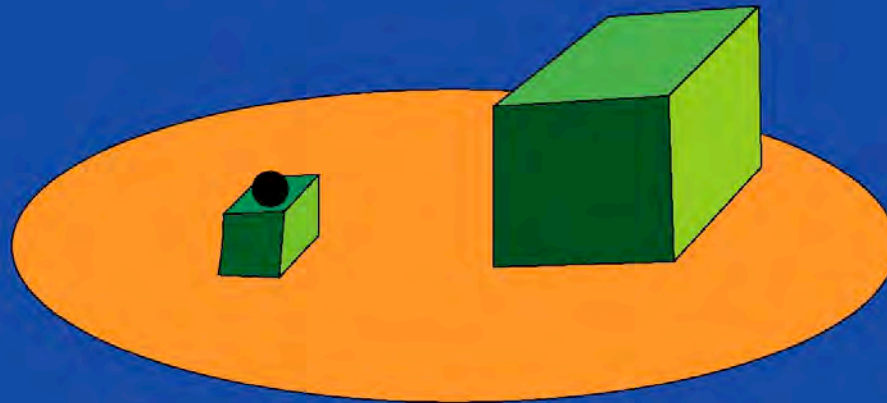
However, groups of genes, such as **operons** or **pathogenicity islands** tend to cluster in specific places, and they code for proteins with common functions

**A question: where are located repeats?**



# Caveat: Repeats are meaningful

UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G



What does the smaller cube the round support supports support?

A ball.



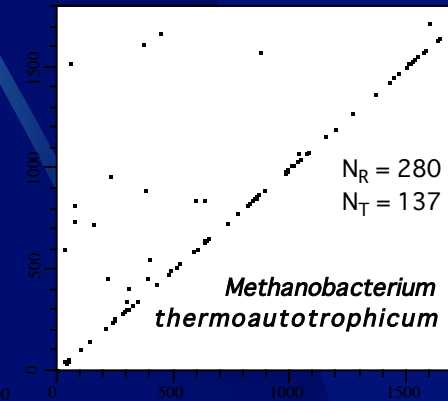
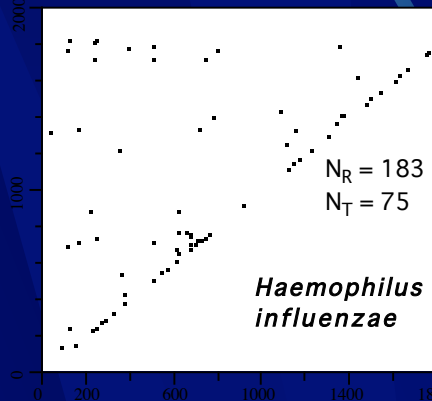
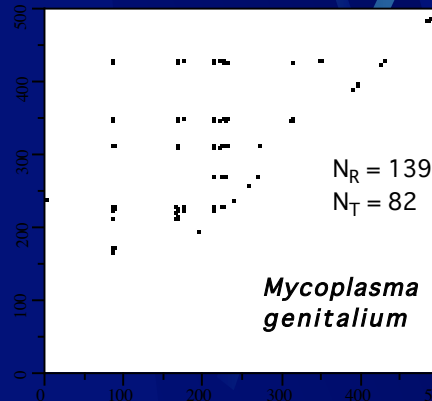
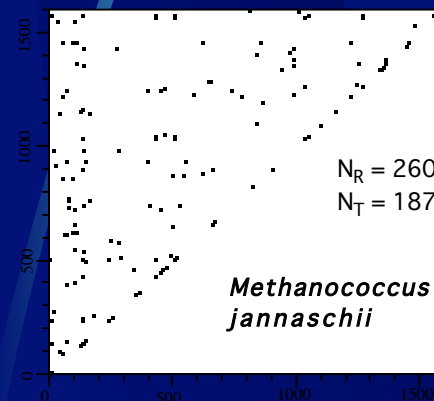
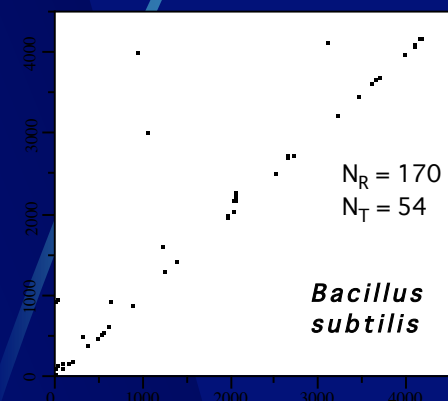
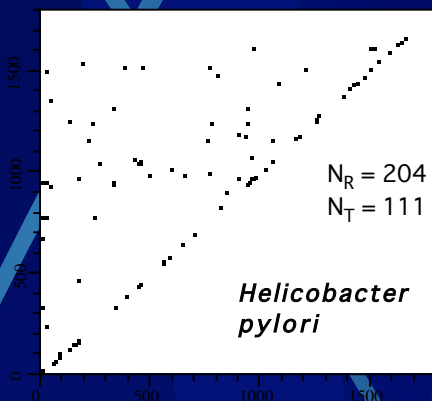
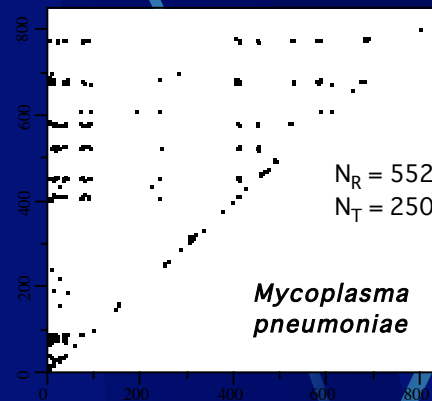
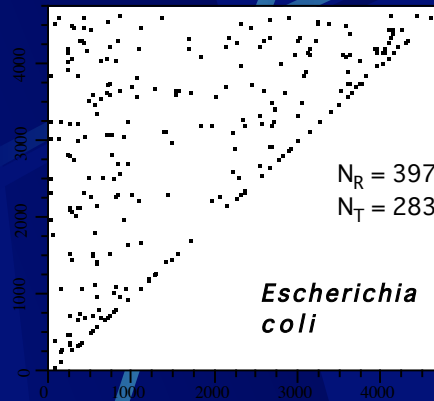
Remember also:

This clock has a  
minute minute  
hand



# DNA management: Repeats in genomes

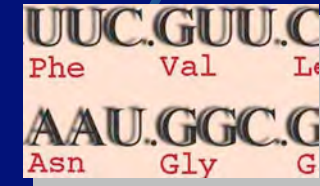
UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G



E. Rocha, A. Viari & A. Danchin Analysis of long repeats in bacterial genomes reveals alternative evolutionary mechanisms in *Bacillus subtilis* and other competent prokaryotes. *Mol. Biol. Evol.* (1999) **16**: 1219-1230



# Genome organisation

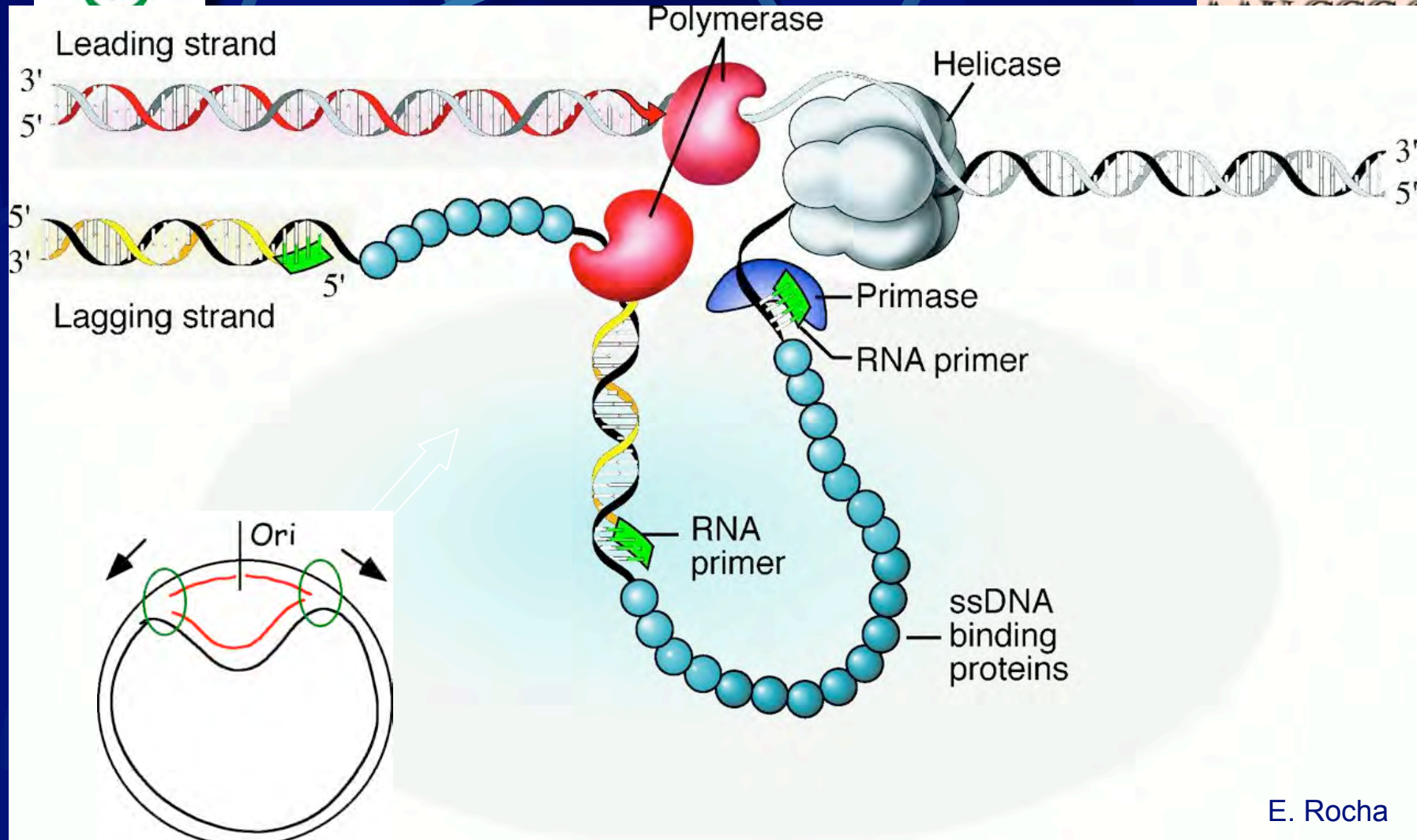


The genome organisation is so rigid that the overall result of selection pressure on DNA is visible in the genome text, which differentiates the leading strand from the lagging strand

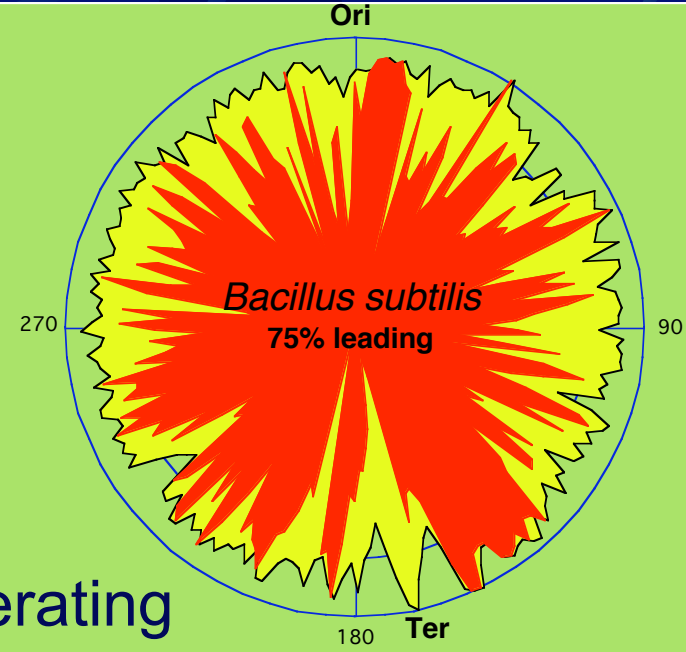
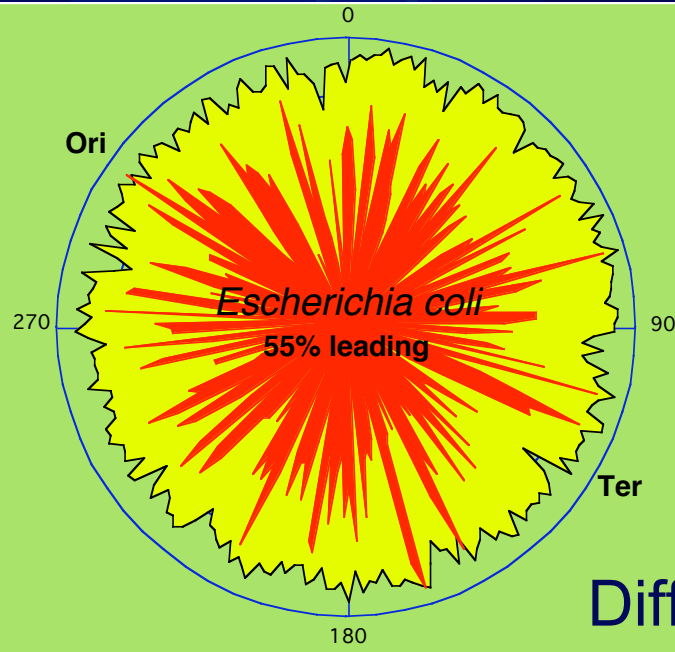




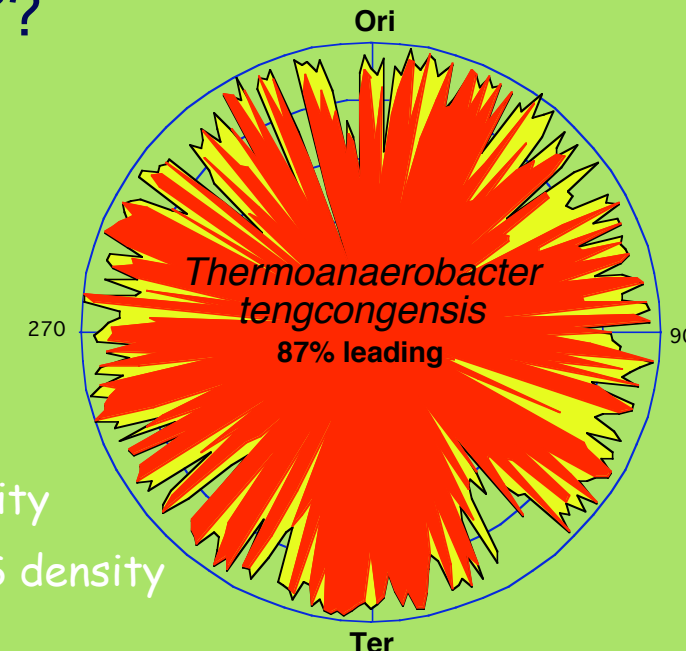
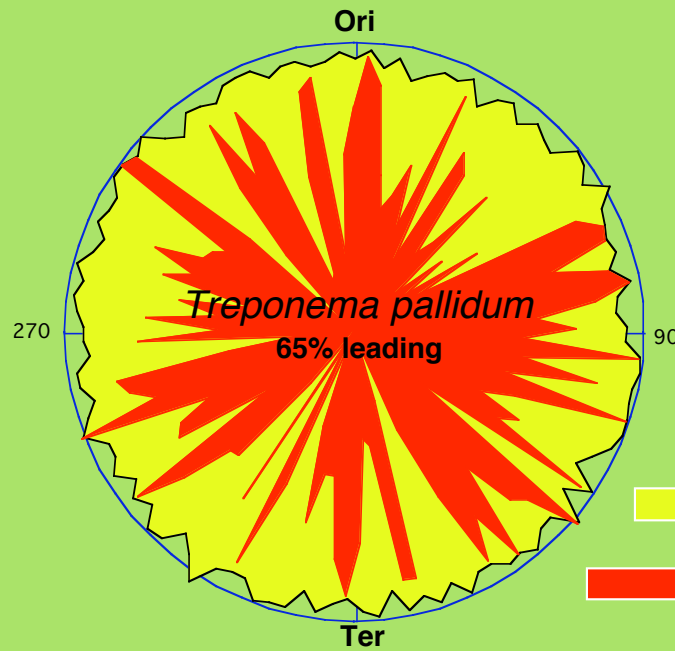
UUC.GUU.C  
Phe Val Le  
A T T C C C C G



E. Rocha



Different "Operating Systems"?

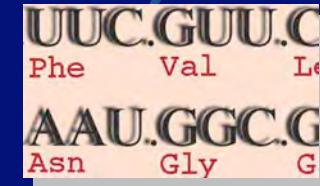


CDS density  
 Leading CDS density

(updated from Kunst et al , Nature, 97)



## To lead or to lag...



Is it possible to see whether the position of genes in the chromosome is randomly distributed on the leading and lagging strand?

Choosing arbitrarily an origin of replication and a property of the strand (base composition, codon composition, codon usage, amino acid composition of the coded protein...) one can use discriminant analysis to see whether the hypothesis holds.

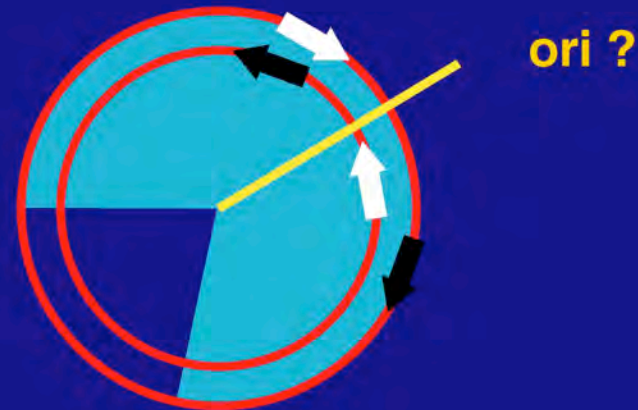


# To lag or to lead...

UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G

Choosing arbitrarily an origin of replication and a property of the strand (base composition, codon composition, codon usage, amino acid composition of the coded protein...) one can use discriminant analysis to see whether the hypothesis holds.

## REPLICATION BIASES IN BACTERIA



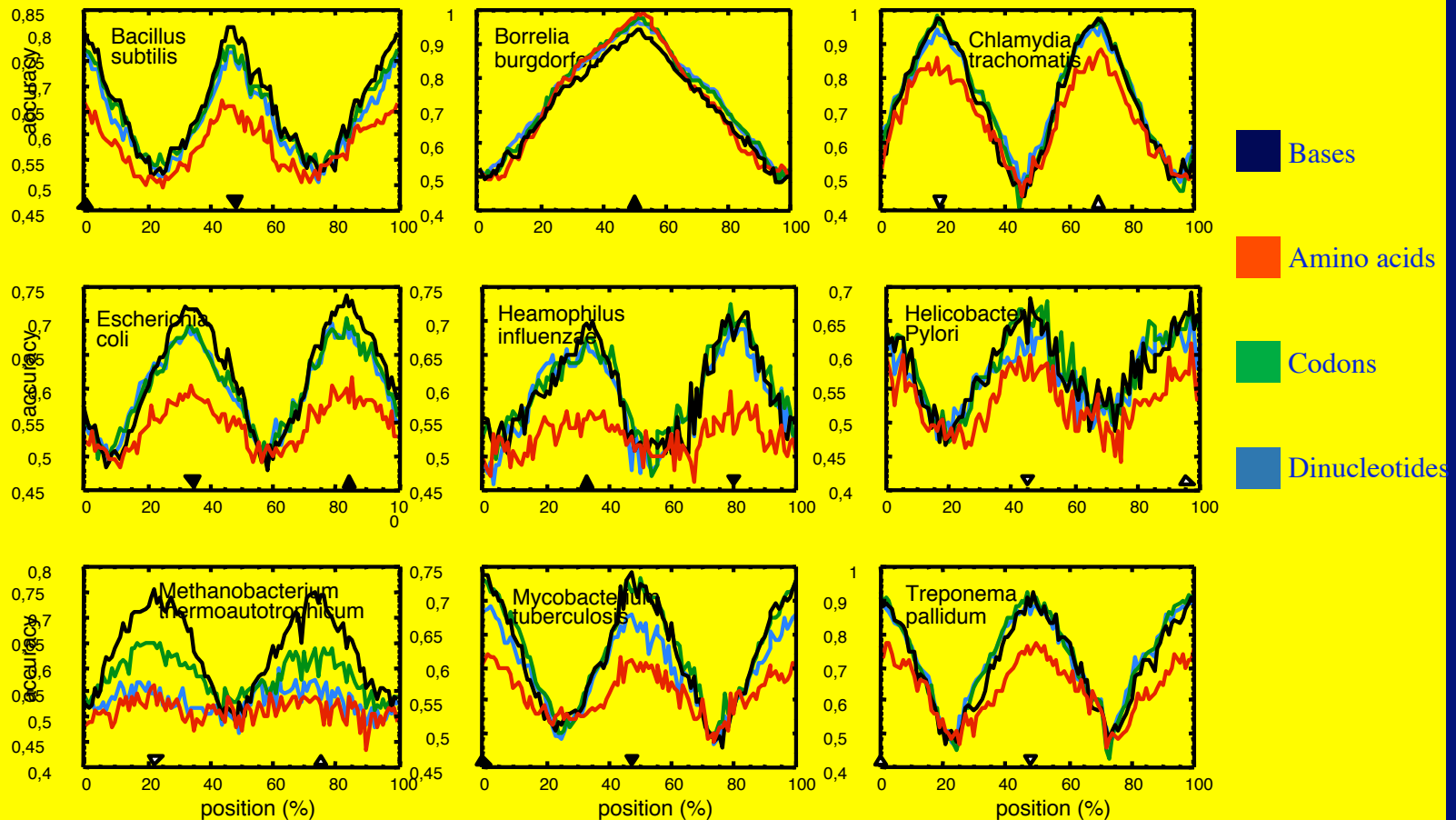
Genomes in silico



E. Rocha, A. Danchin & A. Viari Universal replication biases in bacteria. Mol. Microbiol. (1999) 32: 11-16

# To lag or to lead, that is the question

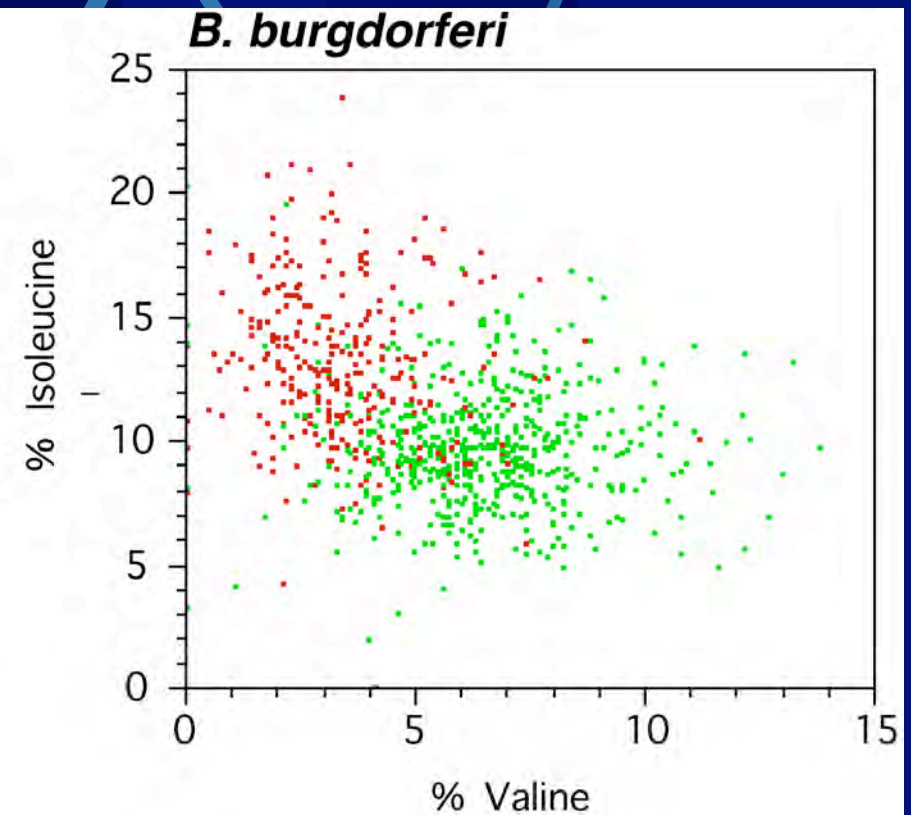
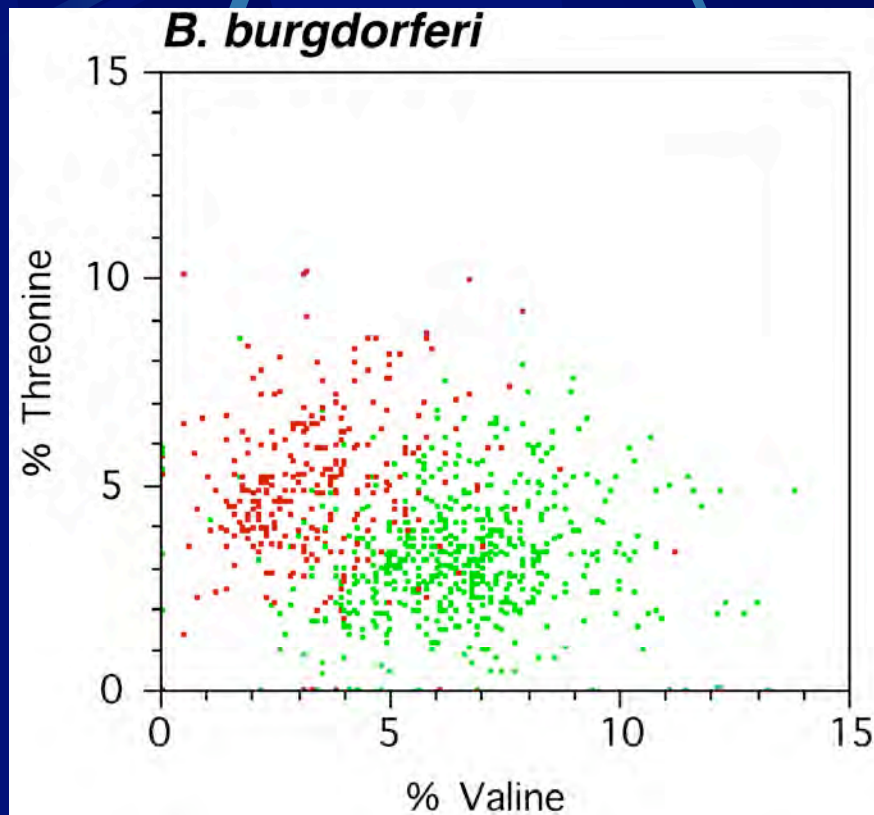
UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G





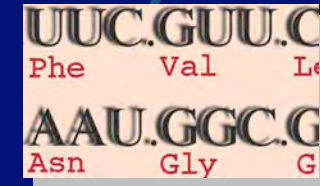
# Visible even in proteins...

UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G





# Replication transcription conflicts

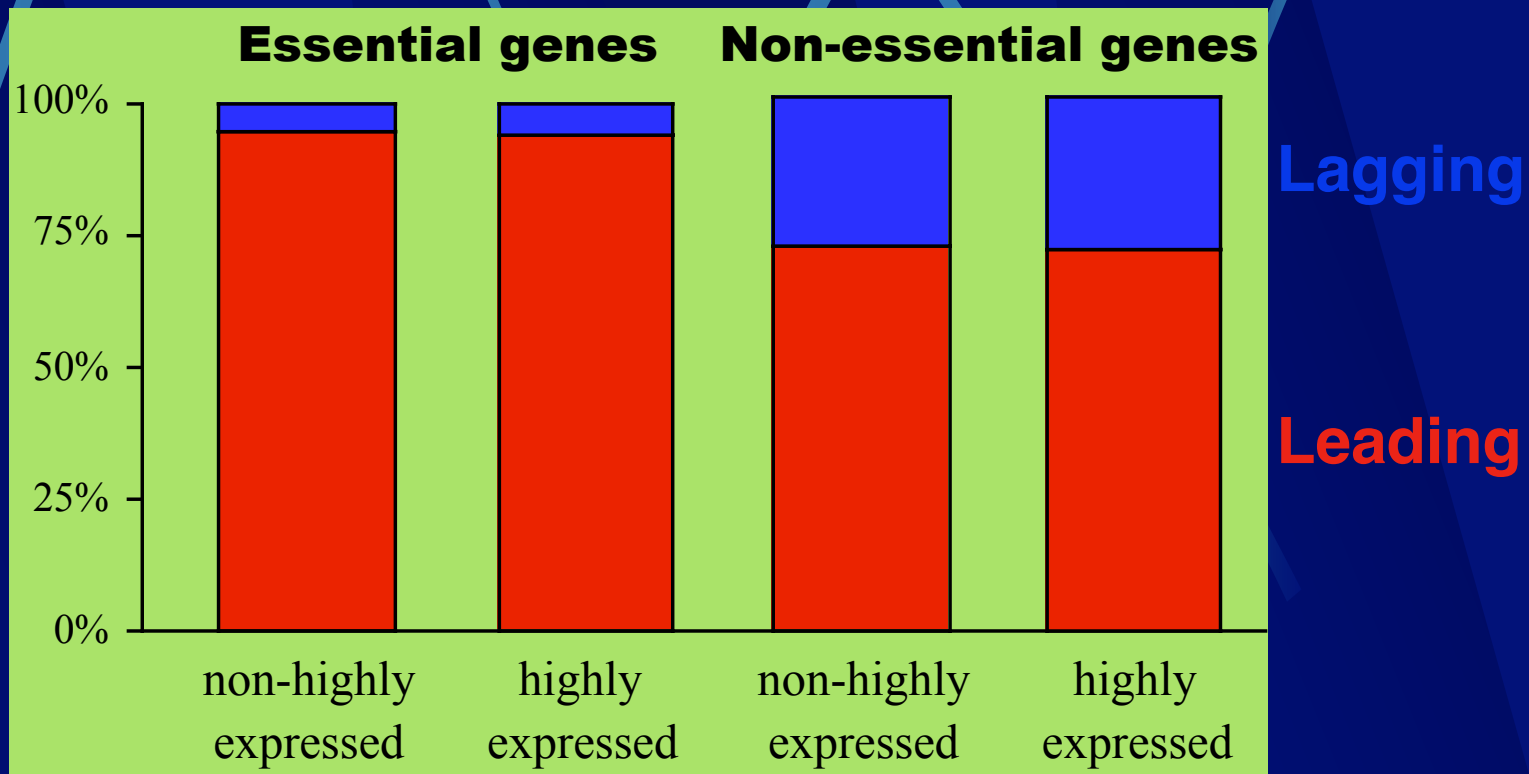
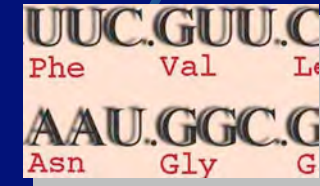


- Transcription may proceed opposite to the movement of the replication fork movement
- This will abort transcription, leading to truncated mRNA
- If translated truncated mRNA may lead to truncated proteins, this will become negative dominant if in complexes...

E.P.C. Rocha & A. Danchin Essentiality, not expressiveness, drives gene-strand bias in bacteria. Nature Genetics (2003) 34 : 377-378



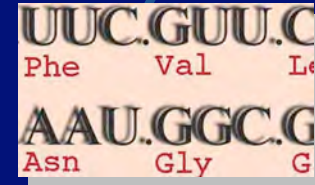
# Essentiality in *B. subtilis*



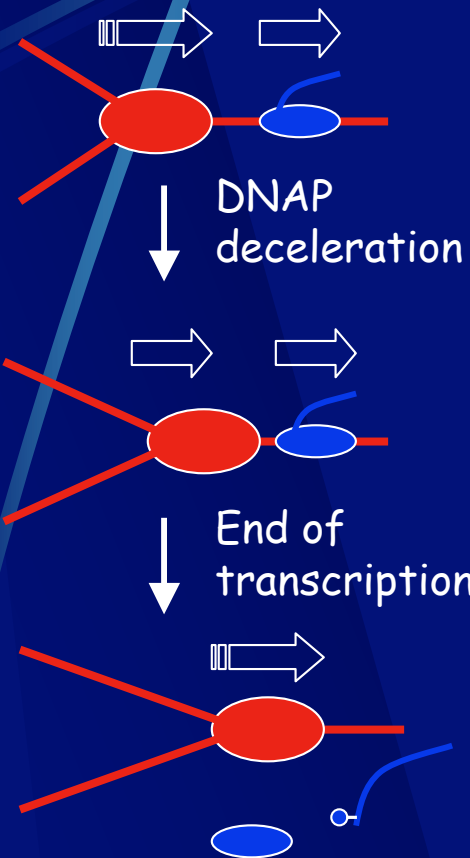




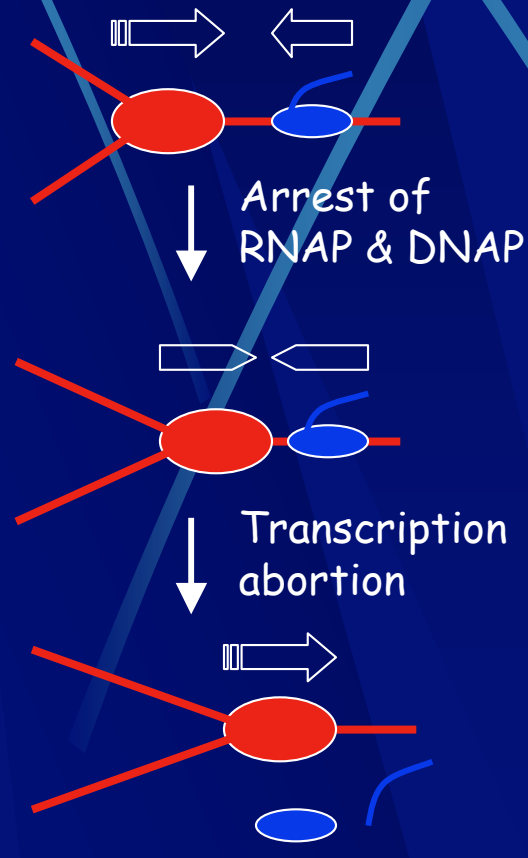
# When polymerases collide (II)



## Co-oriented



## Head-on



### Consequences:

1. Replication slow-down
2. Loss of transcripts

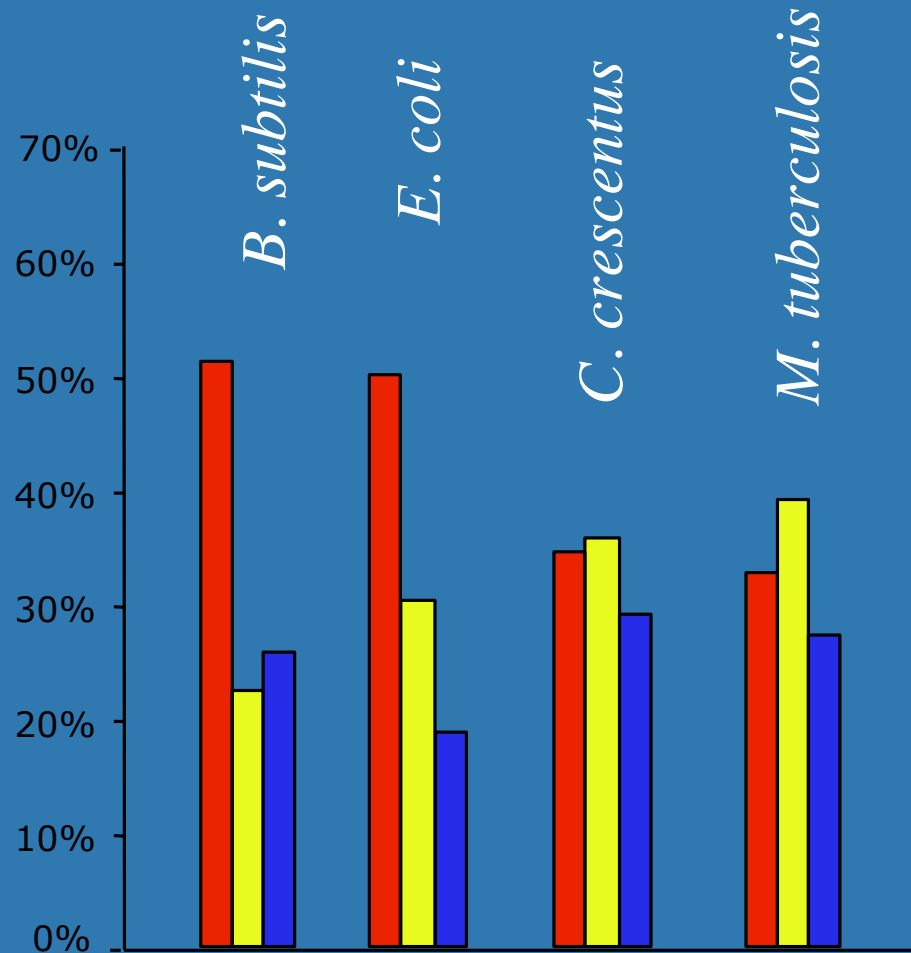
### Consequences:

1. Aborted transcripts
2. Truncated essential proteins

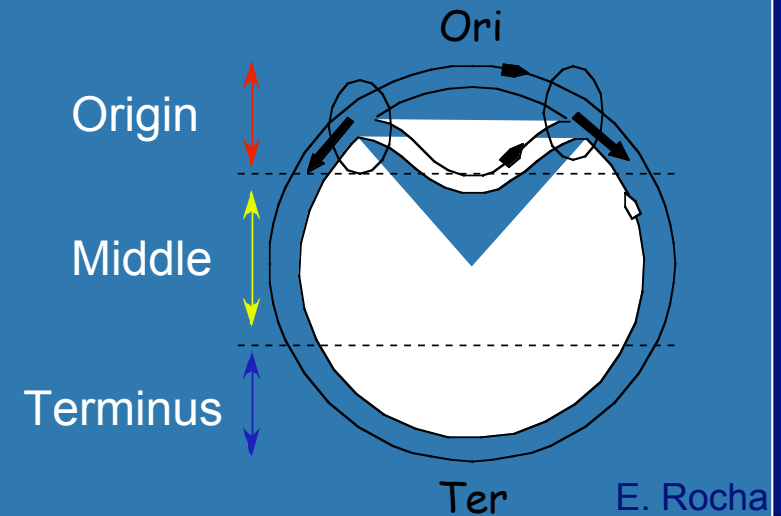
E. Rocha

# Distribution of highly expressed genes

Fast growers | Slow growers



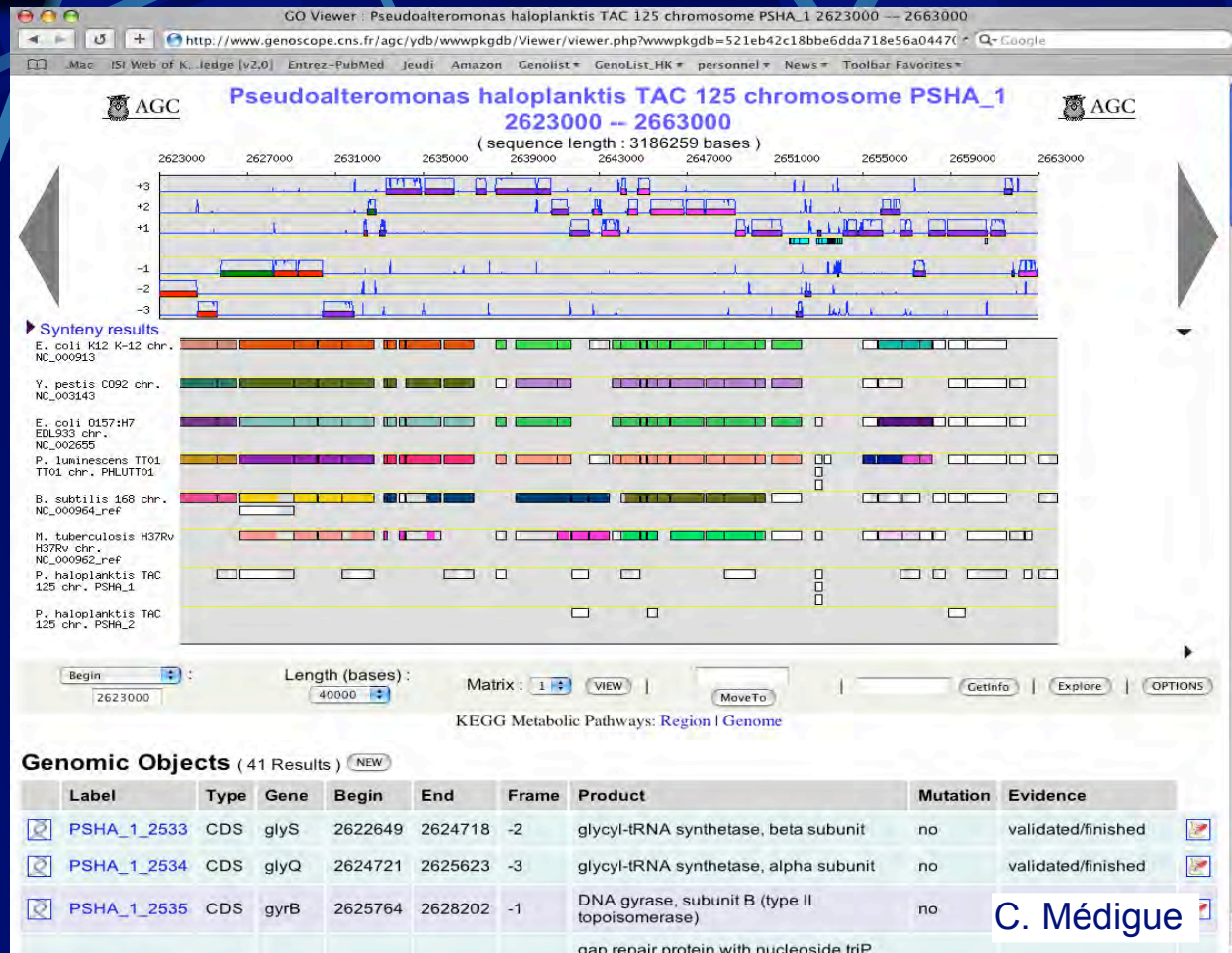
Highly expressed genes cluster near the origin in fast-growing bacteria





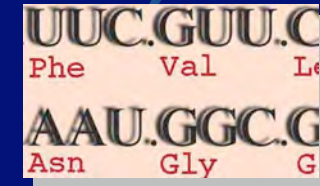
# Gene vicinity: synteny

UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G





# Multivariate Analyses



In contrast to standard genetics, genomics analyses large collections of genes and gene products.

Multivariate analyses try to extract information by simplifying the number of relevant descriptors in the objects of interest.

**Principal Component Analysis** uses the centered average and a simple distance (identity); it is the reference method.

**Correspondence Analysis** belongs to the same family, but it uses the  $\chi^2$  measure as a distance. This allows the user not only to work with highly heterogeneous objects but also to work simultaneously on the space of objects and on the space of descriptors.

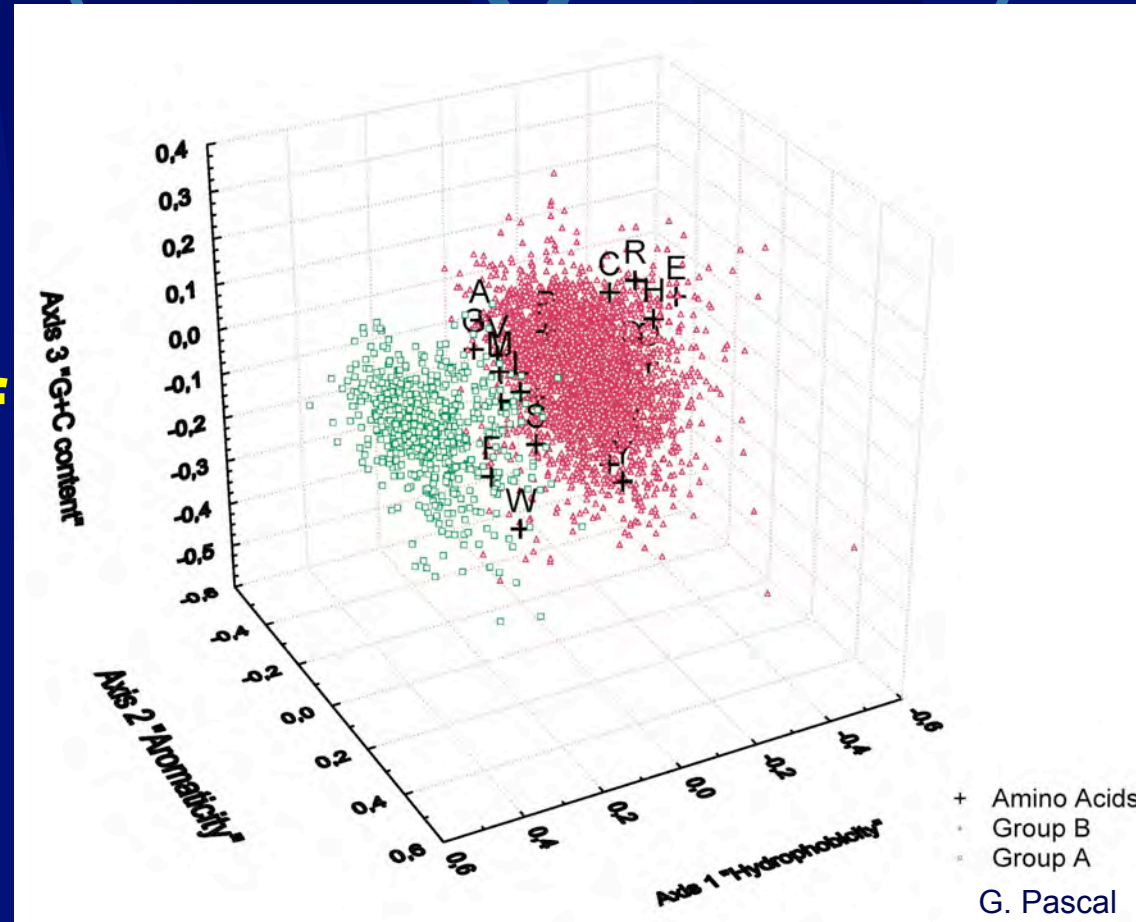
**Independent Component Analysis** uses the non gaussian character of the values associated to descriptors



# Bias in amino acid distribution

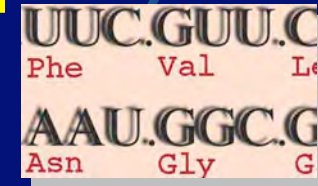
UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G

**Neighborhood:  
distribution of  
amino acids in  
the proteome**





# Universal biases in protein amino acid composition

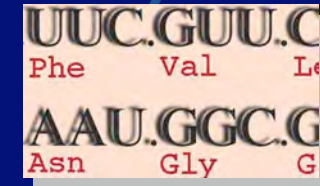


→ **First axis:** separates Integral Inner Membrane Proteins (IIMP) from the rest; driven by opposition between charged and large hydrophobic residues

→ **Second axis:** separates proteins according to an opposition driven by the G+C content of the *first* codon base

→ **Third axis:** separates proteins by their content in aromatic amino acids; enriched in orphan proteins

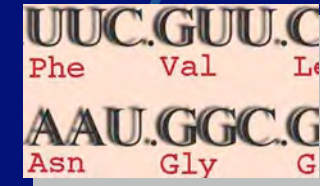
# Temperature-dependent biases in protein amino acid composition



- The amino acid composition of proteins depends heavily on the phylogeny => need to compare organisms related to each other
- The general trend of amino acid composition bias is to avoid some amino acids at higher temperatures
- Mesophilic bacteria belong to at least two different classes (in a 5-clusters analysis)
- Biases are always dominated by the IIMP clustering



# Codon usage biases



- 20 amino acids 61 codons
- Study of the genes in the codon space, using Correspondence Analysis ( $\chi^2$  measure)
- At least three classes of genes, including one corresponding to horizontal transfer

C. Médigue, T. Rouxel, P. Vigier, A. Hénaut & A. Danchin. Evidence for horizontal gene transfer in *Escherichia coli* speciation. J. Mol. Biol. (1991) 222 pp. 851-856





## Gene exchange

Genes expressed at a high level

under exponential growth conditions

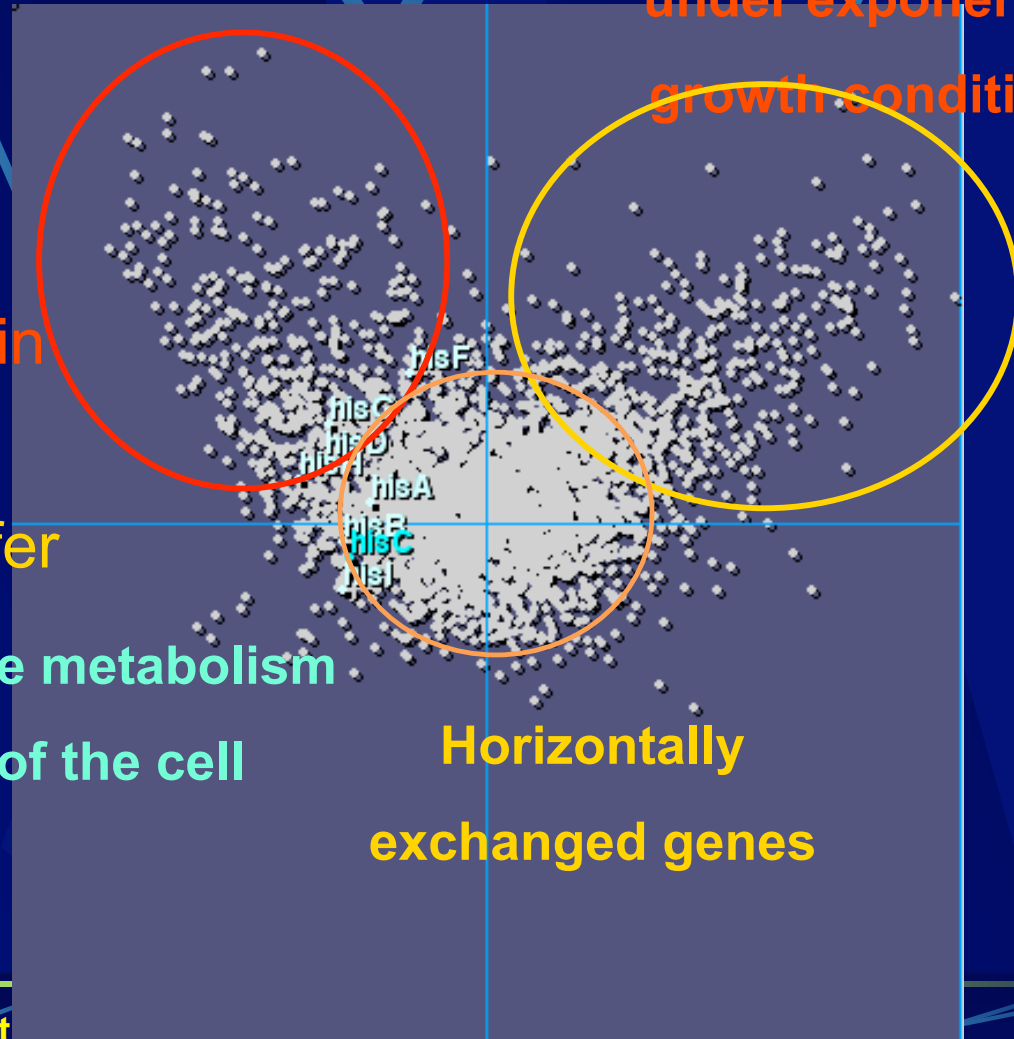
Class I: core metabolism

Class II: high expression in exponential growth

Class III: horizontal transfer

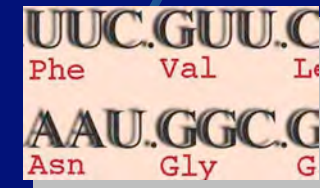
Core metabolism of the cell

Horizontally exchanged genes



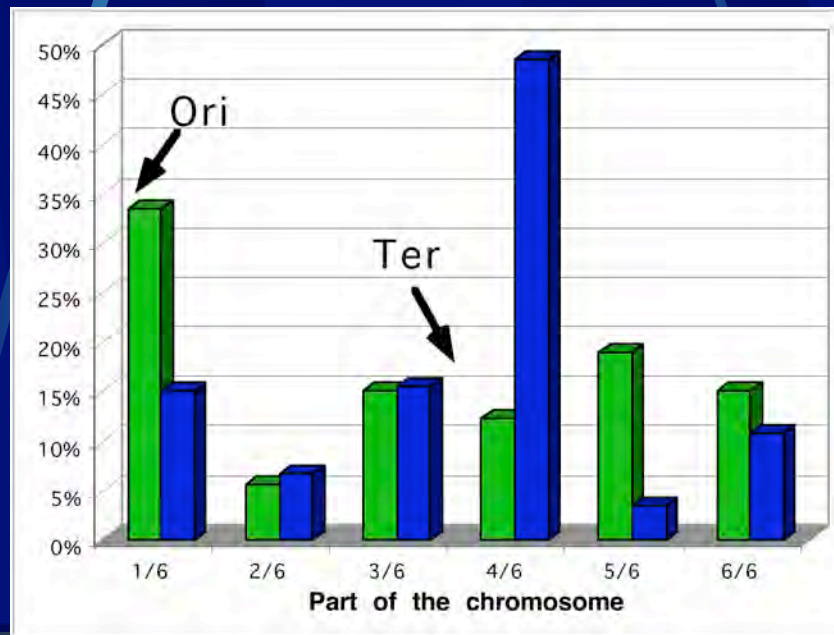
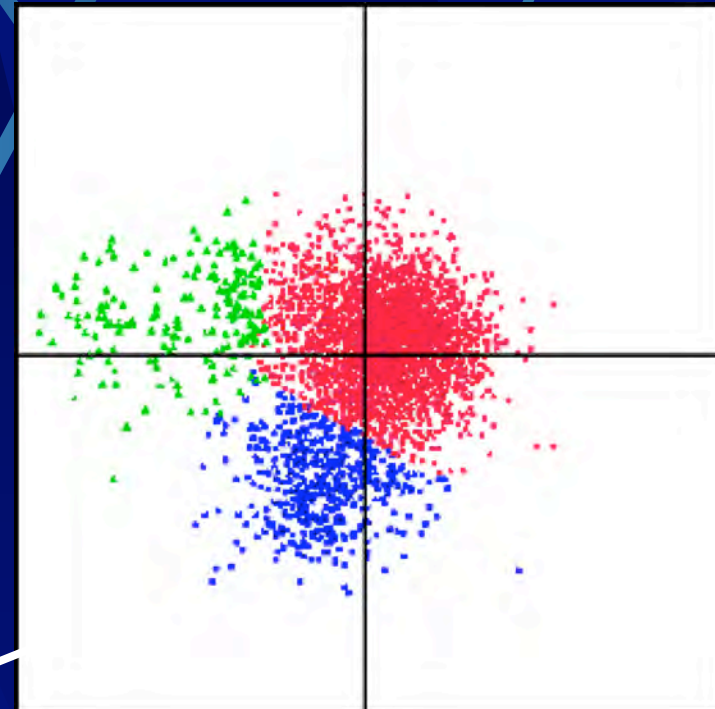


# Codon usage, organisation and evolution of the *B. subtilis* genome



	AAA	AAC	AAG	...
gene1	$n_{11}$	$n_{21}$	$n_{31}$	
gene2	$n_{12}$	$n_{22}$	$n_{32}$	
gene3	$n_{13}$	$n_{23}$	$n_{33}$	
....	....	....	....	
geneN	$n_{1n}$	$n_{2n}$	$n_{3n}$	

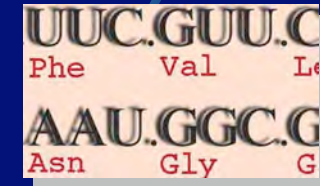
Correspondence analysis  
→  
Classification



■ Highly expressed  
■ Atypical / HGT  
■ Others



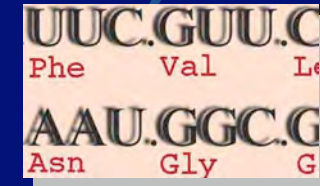
# The cell organizers



It is too early to understand the selection pressures that organize the cell architecture. However, at least in bacteria, the role of gasses and chemical highly reactive radicals play probably a major role. Most of the corresponding genes are still unknown....



# Selection pressure for organisation: Oxido-reduction

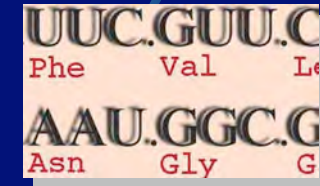


- Sulfur undergoes oxido-reduction reactions from -2 to +6
- Incorporation of sulfur into metabolism usually requires reduction to the gaseous form  $H_2S$
- $H_2S$  is highly reactive, in particular towards dioxygen
- => These two gasses, despite their diffusion properties, must be kept separate as much as possible
- Sulfur scavenging is energy-costly
- => Sulfur containing molecules have to be recycled

A. Sekowska, H-F. Kung & A. Danchin Sulfur metabolism in *Escherichia coli* and related bacteria, facts and fiction. J. Mol. Microbiol. Biotechnol. (2000) 2: 145-177



# Sulfur metabolism: an unexpected organiser of the cell's architecture

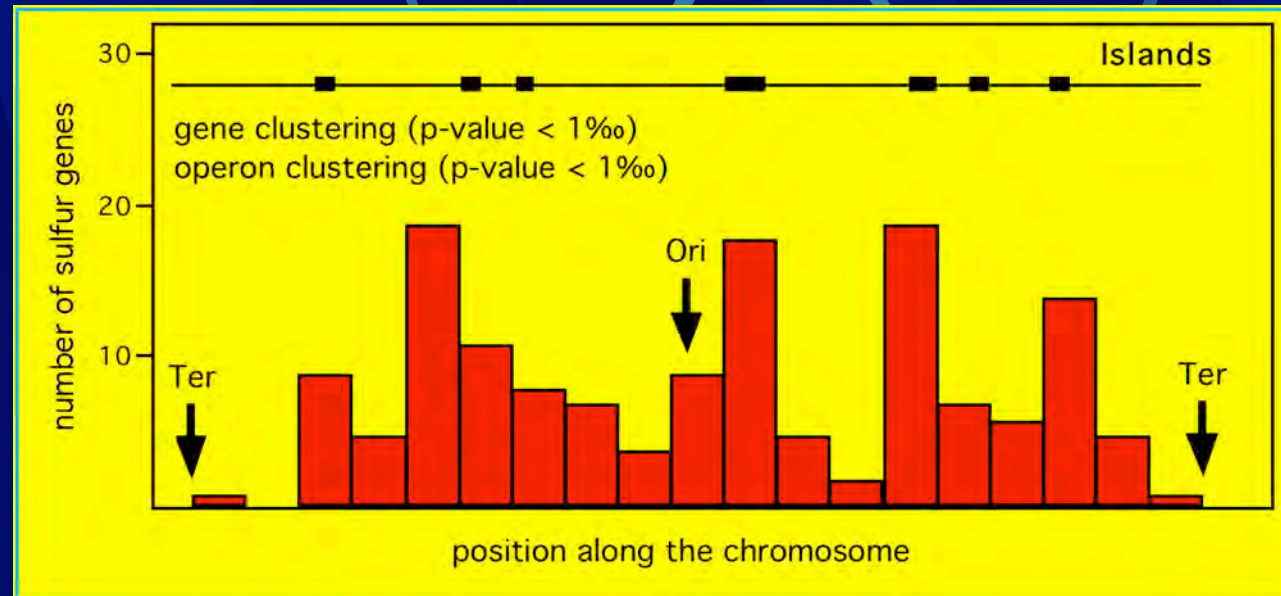


- Sulfur metabolism-related proteins are more acidic (average pI 6.5) than bulk proteins (richer in asp and glu), they are poor in serine residues
- They are significantly poor in sulfur-containing amino-acids
- Their genes are very poor in codons ATA, AGA and TCA
- There are no class III (horizontal transfer) genes in the class (only 2 in 150 genes)
- => sulfur-metabolism genes are ancestral and may form a core structure for the *E. coli* genome



# Proximity in the chromosome Sulphur islands

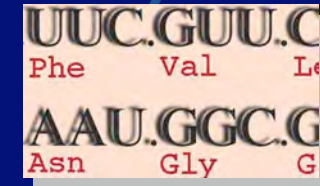
UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G



E.P.C. Rocha, A. Sekowska & A. Danchin Sulfur islands in the *Escherichia coli* genome: markers of the cell's architecture?  
FEBS Lett. (2000) 476: 8-11



# The error catastrophe

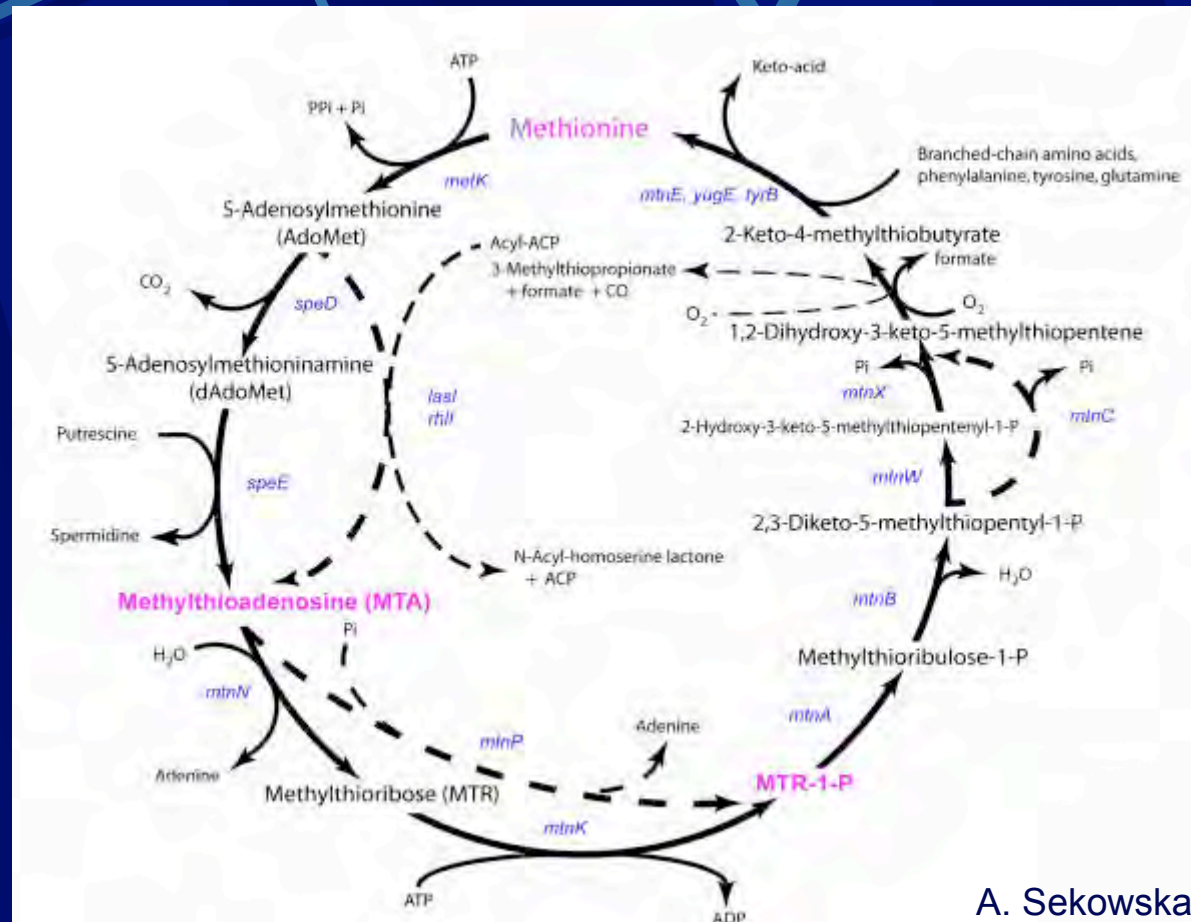


- Similarity in sequence leads to functional inference
- Because of recruitment of pre-existing structures, there is often no obvious link between a structure and a function (the book-paperweight
- Hence a propagation of annotation errors
- *ykrS* annotated as « translation factor » is a component of sulfur metabolism!

A Sekowska, V Dénervaud, H Ashida, K Michoud, D Haas, A Yokota, A Danchin Bacterial variations on the methionine salvage pathway *BMC Microbiol* (2004) 4: 9

# A new metabolic pathway

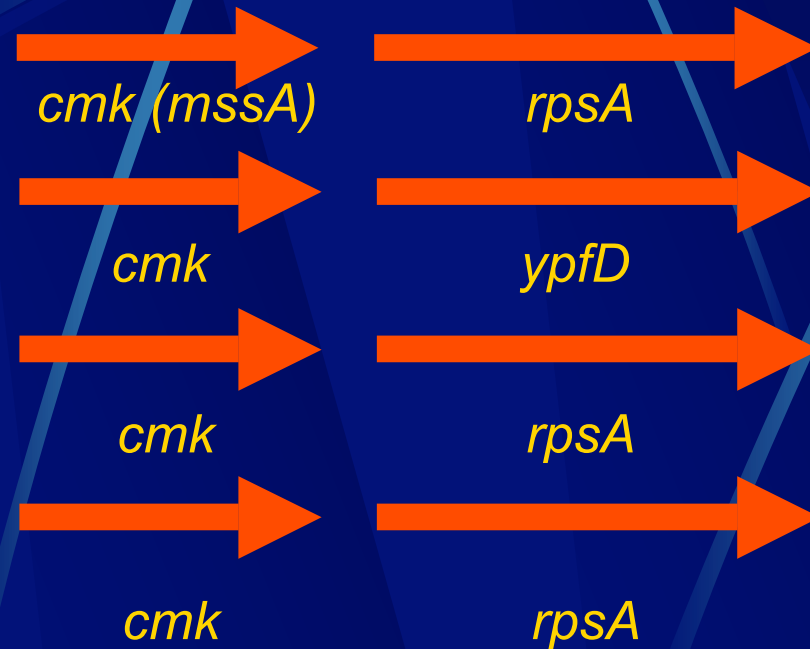
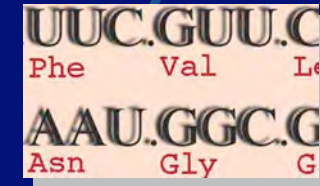
UUC.GUU.C  
Phe Val Le  
AAU.GGC.G  
Asn Gly G







# Just so story: proximity in the genome



*Escherichia coli*

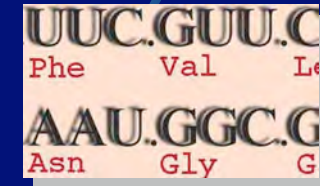
*Bacillus subtilis no rpsA !!!*

*Haemophilus influenzae*

*Sinorhizobium meliloti*



# The pyrimidine diphosphate paradox



In order to make deoxyribonucleotides the cell uses ribonucleosides **d**iphosphates, not **tr**iphosphates

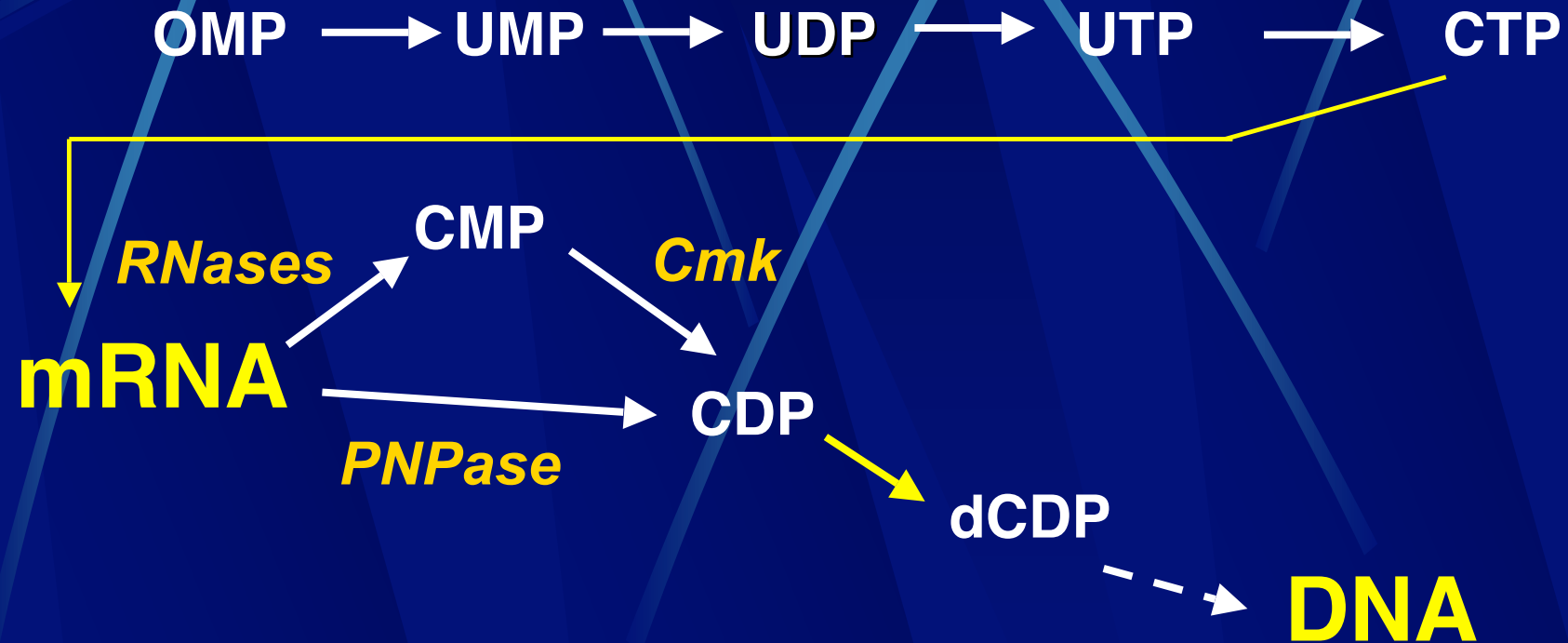
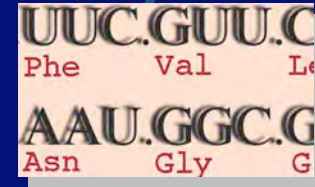


And here is the paradox:



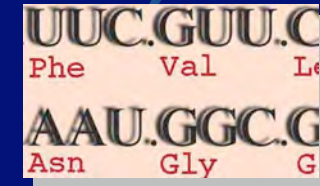


# How is the paradox resolved?





## Phylogenetic neighbors: the S1 box



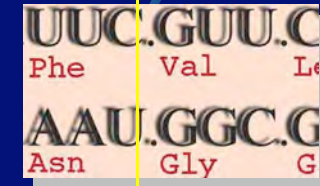
- *rpsA* codes for ribosomal protein S1. It contains the S1 box (PROSITE PS50126). Many other proteins contain a similar box: polynucleotide phosphorylase, RNases E, G and R, RNA helicases etc.
- protein RegB of bacteriophage T4, associated to S1, cuts mRNA at GAGG motifs.
- S1 is a subunit of bacteriophage Q $\beta$  replicase...

**=> All this points to a function for S1 in RNA metabolism**



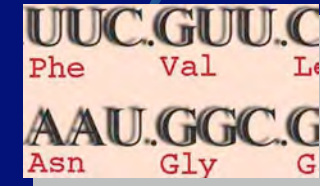
# Codon usage bias neighbors

Gene	Comment
<i>bla</i> <i>cat</i> <i>dicB</i> <i>lpp</i> <i>ompA</i>	long mRNA turnover
<i>pyrF</i>	pyrimidine metabolism
<i>hflB</i> <i>ftsH</i> <i>mrsACF</i> <i>lpp</i>	cell architecture
<i>nusA</i> <i>pcnB</i> <i>metY</i> <i>pnp</i> <i>rna</i> <i>rnB</i> <i>rnc</i> <i>rne/ams</i> <i>rng</i> <i>rph</i>	RNA maturation and turnover
<i>trxA</i>	oxido-reduction, subunit of T7 replicase, needed for synthesis of deoxyribonucleotides





# Protein complexes: the Degradosome



**PNPase**  
**PolyA polymerase**  
**RNAse E**  
**S1**

**Polyphosphate kinase**

**Enolase**

mRNA degradation



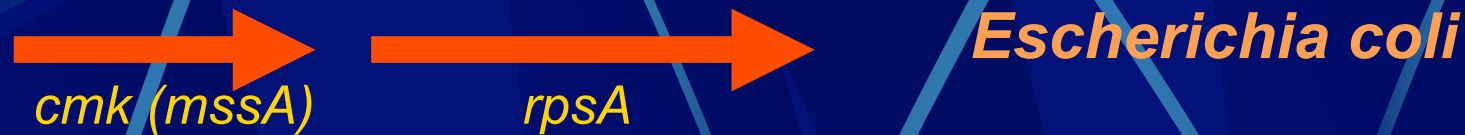
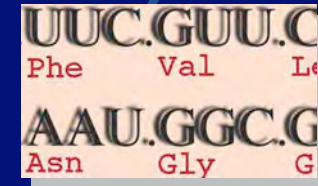
CDP for de novo DNA synthesis

GDP recycling of GTP for  
carbohydrate secretion





## Just so story: the *cmk rpsA* operon



*mssA* was discovered as a suppressor of *smbA (pyrH)*, itself a suppressor of MukB, a myosin-like protein involved in chromosome segregation

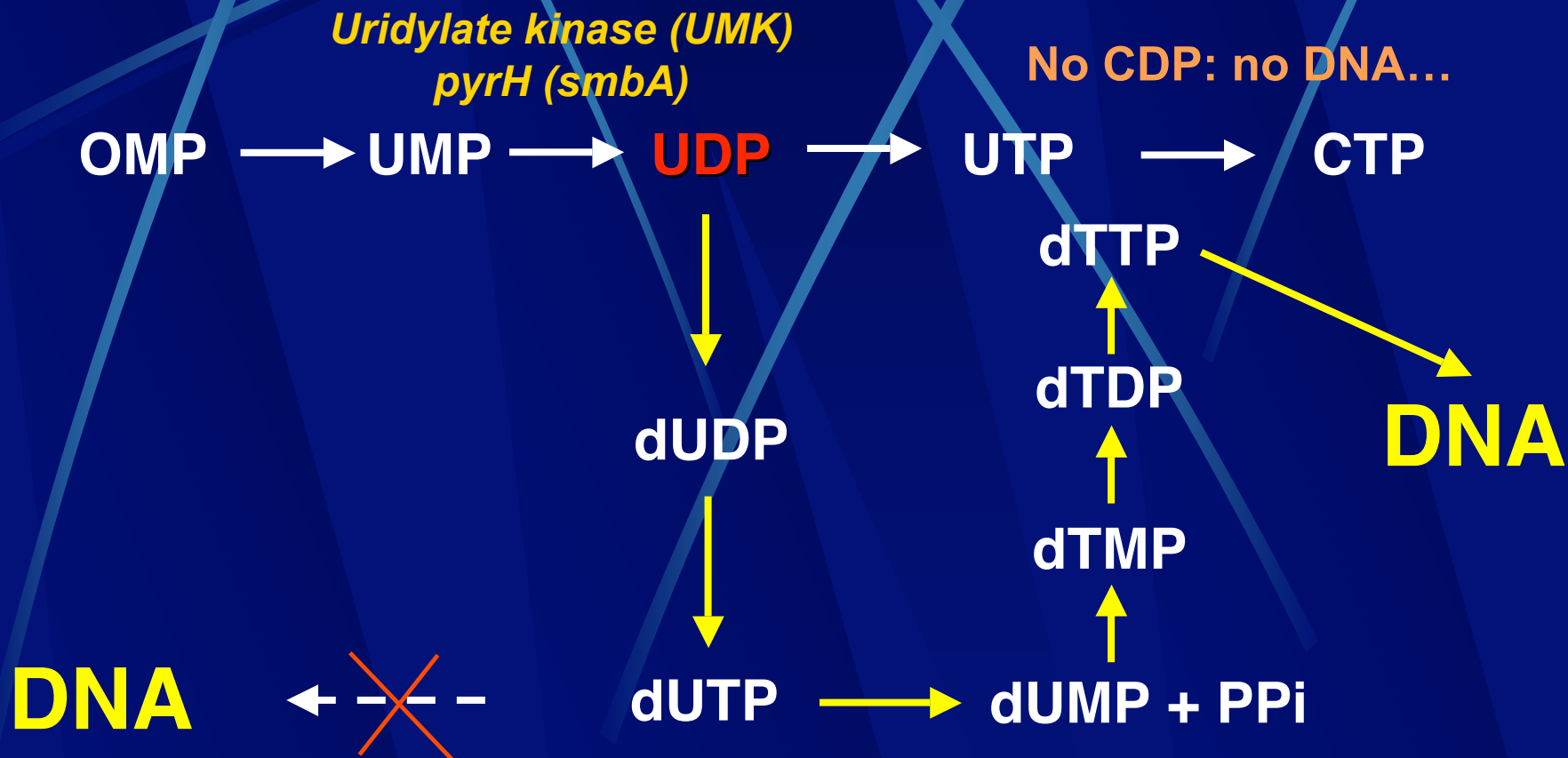
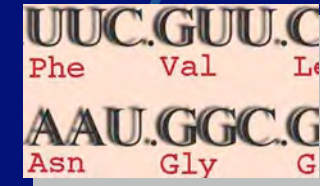
=> **DNA synthesis is involved in the function.**

**Conclusion:**

The function of the *cmk rpsA* operon is to make CDP for DNA synthesis

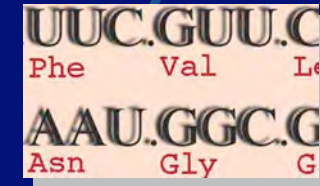
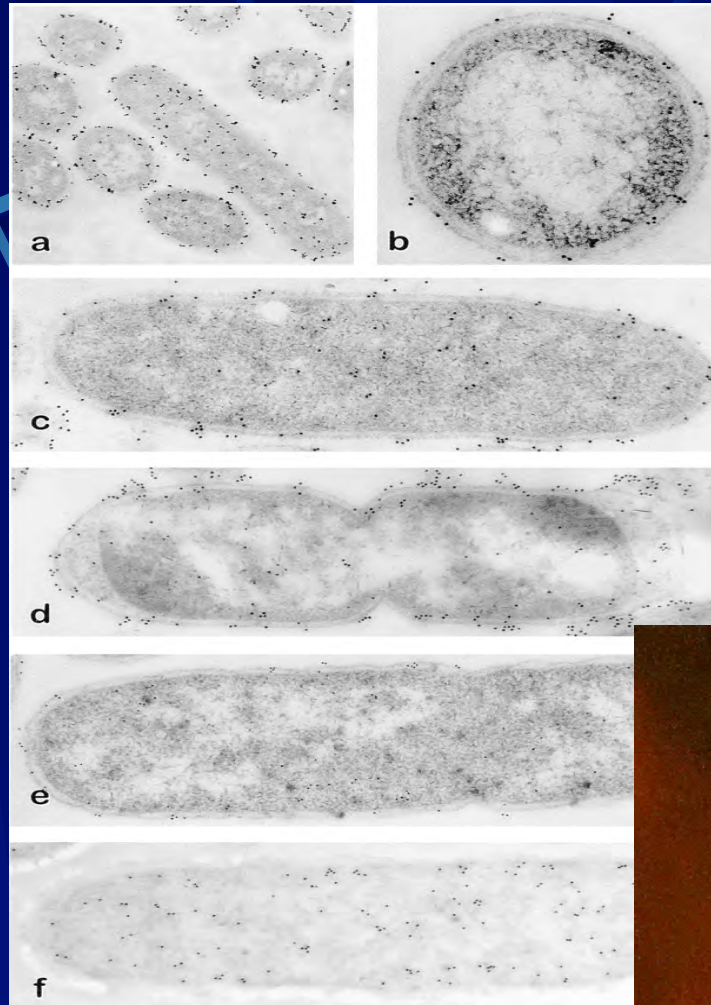


# Selection pressure for compartmentalization: a dangerous intermediate



S. Noria & A. Danchin Just so genome stories : what does my neighbor tell me? International Congress Series 1246 Elsevier Science (2002) 3-13

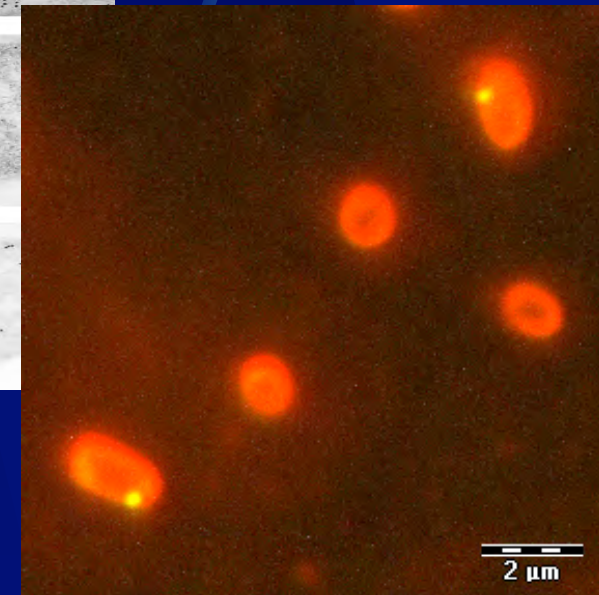




**In conclusion:**

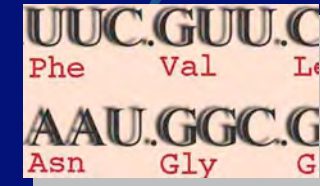
**UMK** must be compartmentalized

S. Landais, P. Gounon, C. Laurent-Winter, J.C. Mazié, A. Danchin, O. Barzu & H. Sakamoto Immunochemical analysis of UMP kinase from *Escherichia coli*. J. Bacteriol. (1999) **181**: 833-840





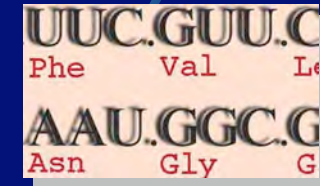
## A prediction: ribosome recycling and UTP



This organisation is conserved in most Gram+ and Gram- bacteria. **Why ?**



# Ribosome recycling and UTP

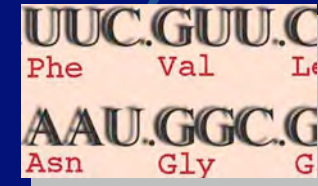


*frr* codes for the ribosome recycling factor, that allows 70S ribosomes to split into 30S and 50S subunits. In polycistronic operons, the 70S ribosome can go on from one gene to the next one without recycling (**this requires formylation of the first methionine**). At the end of the message, the ribosomes must recycle. This happens in a context where transcripts make stem and loops, ending with a polyU sequence.

**Conjecture:** is UTP controlling the activity of Frr? Remember that one cannot speak of « concentrations » of molecules in a cell. 1 micromolar would mean 600 molecules. There are 20,000 ribosomes, therefore 1 mM means only **30 individual molecules** in the immediate vicinity of each ribosome...



# Transcription termination



At Rho-independent sites for termination of transcription the messenger RNA ends with rows of U. This must lower the local availability of UTP....



This suggests Frr as a drug target, with analogs of UTP as leads...