



















How to define "codon bias" and how to search for highly biased genes in an automatic manner?























### Idea of the algorithm:

- Compute the weight of the codons over the whole genome and compute afterwards SCCI values for all genes
- Select the 50% of genes with the highest SCCI value
- Repeat the iteration and select the 25% of the genes
- and so on... until we arrive to the 1% of genes in the original set.
- ... then repeat the iteration on the 1% of genes with highest SCCI until convergence is reached.



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### The set of biased genes

- is **unique** (for the organisms we checked, ~210)
- exists also for organisms that do not have an evolutionary tendency explained with translational pressure.

### For **any** bacteria we can compute:

- + dominant bias: strand bias, GC3, AT, ...
- + numerical criteria to determine the strength of translational bias

## Random version of the algorithm

- Choose randomly the 1% of genes in G
- Compute weights and CAI values
- Select the 1% of genes with the highest CAI
- Repeat the iteration until convergence























### Metabolic pathways essential to *Mycobacterium tuberculosis*

Essential to M.tuberculosis but not to other bacteria

### **Biotin synthesis**

Chorismate biosynthesis Aspargine degradation Pyridoxal 5'phosphate biosynthesis Valine degradation Leucine biosynthesis ppGpp (Norman et al. 1994) (Parish and Stoker 2002) (Sassetti et al. 2003) (Sassetti et al. 2003) (Sassetti et al. 2003) (Sassetti et al. 2003) (Primm et al. 2000)

## Coherence in the organisms space based on SCCI

## Can we use this signal to deduce some more biological information ?

We determined the <u>most important</u> **metabolic networks** in a (translationally biased) organism

### Can we determine genes belonging to minimal gene sets ?







### Craig Venter, November 2002

### Synthesis of a bacterial genome

the chromosome will be inserted in a living cell (whose genetic material has been removed) to verify if it can direct normal functional activities of the organism.

**Clyde Hutchison, 1999** (*Science* 286, 2165-2169): Gene knock out (517) of *Mycoplasma genitalium* (580kb), and estimation of how many genes are necessary to life over 517: about 300 to survive.

**Eckard Wimmer, 2002** (*Science* 297, 1016-1018): Synthesis of a poliovirus that infects cells! (~7500b)

**Venter, Hutchison, Smith, 2008** (*Science* 319, 1215-1220) Synthesis of *Mycoplasma genitalium* 

### Search for a minimal genome

### Why to do this :

Add genes to transform *Mycoplasma* in a "useful" bacteria

Remedy against environmental pollution, new industrial chemical substances production, insuline production...

### To search for a minimal set is not easy...

### Experiments : transposomal mutagenesis & RNA silencing

<i>B.subtilis</i> 300 genes/~4000 (Itaya, 1995) 248 genes/~4100	<i>M.genitalium</i> 265 genes / 482 (Hutchison et al., 1999) 382 genes / 482	<i>H.influenzae</i> <b>670</b> genes/ ~1272 (Akerley et al. 2002)	<i>E.coli</i> 620 genes / 3746 (Gerdes et al. 2003) 234 genes / 2994
(Kobavashi, 2003)	(Hutchison et al., 2006)		(Hashimoto et al. 2005)
S.cerevisiae 1105 genes/ 5916 (Giaever et al. 2002)	C.elegans 1722 genes/ 19427 (Kamath et al. 2003)	<i>S.aureus</i> <b>150</b> genes (Yi et al. 2001)	S.pneumoniae 110 genes (Thanassi et al. 2002)
Comparativo	aonomice		
Comparative	genomics		
2 genomes 256 genes	34 genomes 80 genes	100 genomes 60 genes	147 genomes 35 genes
(Mushegian & Koonin 1996)	(Harris et al 2003)	(Koonin et al. 2003)	(Charlebois & Doolittle 2004)

Number of genes in the minimal set depends on

### Experiments:

Iife/environmental conditions of the organism during the experiment
 → bacteria live in very good lab conditions

### Computational detection of sequence homology:

- parameters and tools to detect homologies
- $\rightarrow$  there are genomes with more than 60% of genes with unknown function

Genes relevant to **environmental conditions** are missing **Stress response genes** are missing

Genes with uncharacterized functions are missing





Map of core genes of 27	' c	org	a	nis	sm	IS	(b	as	seo	d (	on	2	00	) n	10	st	b	ias	se	d	ge	en	es	;)			
	Aci	Bha	Bsu	Bth	Bba	Cdi	Efa	Eca	Eco	Hin	Lpl	Lla	Mac	Pmu	Plu	Pab	Sty	Sat	Son	Sfl	Sag	Smu	Spn	Spy	Syn	Vch	Ype
INFORMATION STORAGE AND PROCESSING J Translation and associated functions ribosomal proteins (including subunits) elongation. factors initiation factors aminoacyl-transfer-RNA-synthetases polyribonucleotide nucleotidyltransferase ribosome recycling/releasing/binding factors	49 5 2 1 1 1	65 4 2 1	48 4 1 2 1	34 4 1 13 1	$     \begin{array}{c}       11 \\       1 \\       3 \\       5 \\       1     \end{array} $	49 4 1 5	49 4 5 1	41 5 1 7 1	45 5 1 9 1 2		50 4 1 6 1	$53 \\ 4 \\ 1 \\ 8 \\ 1$	39 2 6 2	$51 \\ 52 \\ 6 \\ 1 \\ 1$	47 5 2 9 1 2	49 3 3 5	47 5 1 7 1	46 5 1 7 1 1		44 5 1 11 1 1	52 5 2 6 2	46 4 2 7 1	51 6 11 1	52 5 2 9	22 3	53 7 2 10 1 1	51 3 2 2 1 1
K Transcription cold shock proteins RNA polymerase transcription antiterminator trascription terminator	2 3	$\frac{1}{1}$	$^{3}_{4}$	$\frac{5}{1}$	$1 \\ 1 \\ 1$	1 3 1	1 3 1 1	2 4	3 5 1	3 1	3 5 1	$     \begin{array}{c}       2 \\       5 \\       1 \\       1     \end{array} $	2	2 3 1 1	$^{3}_{4}_{1}$	4	$3 \\ 1 \\ 2$	3 3 1 2	2 3 1	3 5 1	$ \begin{array}{c} 1\\ 6 \end{array} $	$^{4}_{1}$	4	$1 \\ 5 \\ 1$	5	3 4 2	7 4 1
L DNA replication, recombination and repair Bacterial nucleoid DNA-binding protein RNA holicase single-strand binding protein Recombination protein CPLLII A DROCESSES AND SIGNALING	1	1	1		$1 \\ 1 \\ 1$	1	1	$1 \\ 1$	2 1 1 1	1	1	1 1 1	1	1	1 1 1		1 1 1	1 1 1		2 1 1 1	1	1	1	1 1 1 1	1	2 1	2 1 1 1
D Cell division and chromosome partitioning cell division proteins							1	1				1	1		1	1	1	1			2	2	1				1
O Posttranslational modification, protein turnover, chaperons chaperone proteins photographic cis-trans isomerase photographic cis-trans isomerase alkyl hydroperoxids reductase protein trigger factor Clip protease ribose-phosphate pyrophosphokinase cell division	3 2 1 1	3 1 3 1 1	3 1 1 1 1 1	2 1 2 1 1 1	3 2	4 1 2 1	3 1 1 1 1	3 3 1 1	2 3 1 1 1 1	3 3 1 1	3 2 1 1	3 1 2 1 1	22	3 2 1 1	5 3 1 1 1		3 3 1 1 1	3 3 1 1	3 3 1 1 1 1	3 3 1 1	1 1 1	2 1 1 2 1	3 2 1 1	2 1 1 1 1	4 1 2 1 2	5 2 1 1 1	3 3 1 1
M Cell envelop biogenesis, outer membrane channel forming, conductance lipoproteins outer membrane proteins	1			1	1	1		2 4	1 1 5	$^{1}_{4}$				1 1 3	2 3		1 3 8	$\frac{1}{2}$	2 9	1 2 5	1	1		1		2 6	2 7
N Cell mobility and secretion secretory proteins flagellin proteins membrane GTP-binding proteins	1	1	2	1	2 1 1	1	1	2 1 1	3	2	1	1		3	3 1 1	3	3	4	3 1	4	2				1	1	23
P Inorganic ion transport and metabolism superoxide dismutase phosphate binding proteins metal-ion binding proteins	1	$\frac{1}{2}$	1	1	1	1	1	$\frac{1}{3}$	2 2	1	1	$1 \\ 1$	1	1	1		$\frac{1}{3}$	$\frac{1}{3}$	1	2 2	1	$1 \\ 1$	1	1 1 1	$\frac{1}{2}$	$1 \\ 1$	1

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H Coenzyme metabolism																											
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I Lipid metabolism																											
I Lipid metabolism acyl carrier protein acetylCoA carboxylase	1	1	1			1	1	2	1	1		1		1	1		1	1	2	1	1		1	1	1	1	1









# Collaborations and references Algorithm and microbial SCCI codon space : F.Képés, CNRS & génopole Evry A.Zinovyev, IHES & Institut Curie (Paris) A.Carbone, A.Zinovyev, F. Képés, Codon adaptation index as a measure of dominating codon bias, *Bioinformatics*, 19, 2005–2015, 2003. A.Carbone, F. Képés, A. Zinovyev, Codon Bias Signatures, Organization of Microorganisms in Codon Space, and Lifestyle, *Molecular Biology and Evolution*, 22, 547–561, 2004. Metabolic networks comparison: D.Madden, IHÉS & IGI (USA) A. Carbone, R. Madden, Insights on the Evolution of Metabolic Networks of Unicellular Translationally Biased Organisms from Transcriptomic Data and Sequence Analysis, *Journal of Molecular Evolution*, 59, 1–25, 2005. Minimal gene sets : A.Carbone, Computational prediction of genomic functional cores specific to different microbes, *Journal of Molecular Evolution*, 2006, in press.







