### ILOTS CPG ET MÉTHYLATION

Méthylation \* IFT6299 H2014 \* UdeM \* Miklós Csűrös

CpG

dinucléotides C-G sur le même brin : CpG

la distribution de CpG varie dans le génome humaine (et mammifères en général)

juste avant le début d'un gène (ATG), les CpG sont souvent dense



dans le génome, très rares\*

\* dans le modèle iid, la fréquence de CpG ainsi que celle de GpC =  $\pi_{C}\pi_{G}$ 

	nucléotides	composition	GpC	CpG
chrX	151.10M	C = 29.81M, G = 29.87M (19.7%)	5.94M (3.9%)	1.25M (0.8%)
chr12	130.5M	C = 26.63M, G = 26.61M (20.4%)	5.54M (4.2%)	1.28M (1.0%)
chr5	177.7M	C = 35.09M, G = 35.13M (19.8%)	7.11M (4.0%)	1.51M (0.8%)
chr1	225.3M	C = 47.02M, G = 47.02M (20.9%)	9.95M (4.4%)	2.28M (1.0%)

Wikipedia

### Méthylation

Typiquement, la cytosine de CpG est méthylée, et peut se transformer en thymine facilement



Wikipedia

### Ilots CpG

enrichissement dans une région de longueur  $\ell$  : compter les occurrences n.

$$CpG(o/e) = \ell \frac{n_{CpG}}{n_{C} \cdot n_{G}}$$

ilot CpG (*CpG island*) : définitions par (G+C)% élevée, enrichissement de CpG, longueur minimale

P.e.:  $(G + C)\% \ge 50\%$ ,  $\ell \ge 200$ ,  $CpG(o/e) \ge 0.6$ 

## Ilot CpG : paramètres

 $\rightarrow$  paramètres différents . . .

→ CpG fréquent dans éléments mobiles (p.e., Alu)



Overview of CpG island prediction algorithms.

Database/prediction	Length	G + C	CpG[o/e]	RM <sup>a</sup>	Comments	Reference
ENSEMBL	≥400	≥50%	≥0.6	Ν	Stringent length constraint	[88]
NCBI relaxed	≥200	≥50%	≥0.6	Ν	Total CGIs = 307 193	
NCBI strict	≥500	≥50%	≥0.6	Ν	Total CGIs = 24 163	
USCS <sup>b</sup>	>200	≥50%	>0.6	Y	Total CGIs = 28 226	[89]
EMBOSS	UD <sup>c</sup>	UD	UD	NA	Variable parameters	[90]
CpGProD	>500	>50%	>0.6	Y	Total CGIs = 76 793	[23]
CpGcluster	NA	NA	NA	Ν	Clustering Total = 197 727	[25]

<sup>a</sup> RM, repeat masked; Y, yes; N, no; NA, non applicable.

<sup>b</sup> Parameters used for CGI identification for the ENCODE project although totals vary due to repeat masking differences between hg17 and hg18 builds [87].

<sup>c</sup> UD, user defined.

Takai & Jones PNAS 99 :3740 (2002); Illingworth & Bird FEBS Lett 583 :1713 (2009)

### Ilots CpG : distribution

 $\rightarrow$  longueur  $\sim$  1kpb

 $\rightarrow$  parfois se trouvent à l'intérieur d'un gène ou dans une région intergénique



Illingworth & Bird FEBS Lett 583 :1713 (2009)

### Méthylation et transcription



Figure 1 | Molecular anatomy of CpG sites in chromatin and their roles in gene expression. About 60% of human genes have CpG islands (CGIs) at their promoters and frequently have nucleosome-depleted regions (NDRs) at the transcriptional start site (TSS). The nucleosomes flanking the TSS are marked by trimethylation of histone H3 at lysine 4 (H3K4me3), which is associated with active transcription, and the histone variant H2A.Z, which is antagonistic to DNA methyltransferases (DNMTs). Downstream of the TSS, the DNA is mostly CpG-depleted and is predominantly methylated in repetitive elements and in gene bodies. CGIs, which are sometimes located in gene bodies, mostly remain unmethylated but occasionally acquire 5-methylcytosine (5mC) in a tissue-specific manner (not shown). Transcription elongation, unlike initiation, is not blocked by gene body methylation, and variable methylation may be involved in controlling splicing. Gene bodies are preferential sites of methylation in the context CHG (where H is A, C or T) in embryonic stem cells<sup>5</sup>, but the function is not understood (not shown). DNA methylation is maintained by DNMT1 and also by DNMT3A and/or DNMT3B, which are bound to nucleosomes containing methylated DNA<sup>99</sup>. Enhancers tend to be CpG-poor and show incomplete methylation, suggesting a dynamic process of methylation or demethylation occurs, perhaps owing to the presence of ten-eleven translocation (TET) proteins in these regions, although this remains to be shown. They also have NDRs, and the flanking nucleosomes have the signature H3K4me1 mark and also the histone variant H2A.Z<sup>32,100</sup>. The binding of proteins such as CTCF to

Jones Nat Rev Genet 13 :484 (2012)

### Méthylation et cellules souches

 $\rightarrow$  méthylation de cytosine aussi à de sites CH (H = {A, C, T})

 $\rightarrow$  change lors de la différentiation de cellule



(H1 = cellules souches; IMR90=lung fibroblast)

Lister, Pelizzola & al Nature 462 :315 (2009)

### Détection de méthylation

### Table 1 | Main principles of DNA methylation analysis

Pretreatment	Analytical step										
	Locus-specific analysis	Gel-based analysis	Array-based analysis	NGS-based analysis							
Enzyme digestion	• Hpall-PCR	<ul> <li>Southern blot</li> <li>RLGS</li> <li>MS-AP-PCR</li> <li>AIMS</li> </ul>	<ul> <li>DMH</li> <li>MCAM</li> <li>HELP</li> <li>MethylScope</li> <li>CHARM</li> <li>MMASS</li> </ul>	<ul> <li>Methyl–seq</li> <li>MCA–seq</li> <li>HELP–seq</li> <li>MSCC</li> </ul>							
Affinity enrichment	• MeDIP-PCR		• MeDIP • mDIP • mCIP • MIRA	• MeDIP–seq • MIRA–seq							
Sodium bisulphite	<ul> <li>MethyLight</li> <li>EpiTYPER</li> <li>Pyrosequencing</li> </ul>	<ul> <li>Sanger BS</li> <li>MSP</li> <li>MS-SNuPE</li> <li>COBRA</li> </ul>	• BiMP • GoldenGate • Infinium	• RRBS • BC-seq • BSPP • WGSBS							

AIMS, amplification of inter-methylated sites; BC–seq, bisulphite conversion followed by capture and sequencing; BiMP, bisulphite methylation profiling; BS, bisulphite sequencing; BSPP, bisulphite padlock probes; CHARM, comprehensive high-throughput arrays for relative methylation; COBRA, combined bisulphite restriction analysis; DMH, differential methylation hybridization; HELP, *Hpall* tiny fragment enrichment by ligation-mediated PCR; MCA, methylated CpG island amplification; MCAM, MCA with microarray hybridization; MeDIP, mDIP and mCIP, methylated DNA immunoprecipitation; MIRA, methylated CpG island recovery assay; MMASS, microarray-based methylation assessment of single samples; MS-AP-PCR, methylation-sensitive arbitrarily primed PCR; MSCC, methylation-sensitive cut counting; MSP, methylation-specific PCR; MS-SNuPE, methylation-sensitive single nucleotide primer extension; NGS, next-generation sequencing; RLGS, restriction landmark genome scanning; RRBS, reduced representation bisulphite sequencing; WGSBS, whole-genome shotgun bisulphite sequencing.

Laird Nat Rev Genet 11 :191 (2010)



Xi & Li BMC Bioinformatics 10:232 (2009)

# Séquençage bisulphite 2

Alignement asymétrique . . .

### 1) Multiple Mapping



2) Mapping Asymmetry



Xi & Li BMC Bioinformatics 10:232 (2009)

### **BSMAP**

hachage + manipulation de bits pour détecter match/mismatch (stocker un masque pour la référence)



Xi & Li BMC Bioinformatics 10:232 (2009)

### Pénalisation modifiée

On peut aussi trouver une pénalisation propre (LODS) à la conversion bisulfite :

		a	С	g	t	
	a	6	-18	-18	-18	
c'aren e	C	-18 -18	6 	-18	3 −18	••• match
No.	9 t	-18	-18	-18	3	C:T ou T:T

**Table 1.** Score matrix for aligning bisulfite-converted DNA reads to

 a reference genome sequence

Columns refer to bases in the read, and rows refer to bases in the genome.

Frith, Mori & Asai Nucleic Acids Res 40 :e100 (2012)

# Ambiguïté

Placement est difficile : plus de matches C :T et T :T, régions de compléxité réduite (CpG)



Bock Nat Rev Genet 13 :705 (2012)

### Inférence

On veut surtout détecter régions de méthylation différente (*differentially methyla-ted region*, DMR) entre échantillons (100s de génomes)



q-value : estimation de taux de faux positives (False Discovery Rate, FDR)

Bock Nat Rev Genet 13 :705 (2012)

### Inférence 2

### (signal plus fort dans fenêtres ou selon annotation)

<b>a</b> Gei	nomic DNA sequence	CG		CG	••• •	•• •••	CG		CG	•••	••• •	••	CG		CG		CG	•••	CG	•••	CG	•••		CG
S	Sample 1	3%		6%			80%		57%				1%		0%		1%		1%		42%			78%
Case	Sample 2	2%		0%			50%		74%				0%		1%		0%		0%		38%			85%
0	Sample 3	0%		1%			95%		86%				2%		0%		0%		0%		41%			67%
					1									ſ		I								
ols	Sample 4	0%		2%			8%		1%				12%		3%		15%		8%		36%			72%
ontr	Sample 5	1%		4%			5%		2%				15%		5%		33%		11%		39%			94%
ŭ	Sample 6	0%		2%			13%		1%				19%		2%		24%		22%		33%			92%
с Ger	nome-wide tiling analysis	Tiling	g reg	ion 1			Tiling	g regi	ion 3				Tiling	g regi	ion 5				Tilin	g reg	gion 7			
					Tiling r	egion 2				Tiling	g regior	4				Tilin	g regi	on 6				Tilin	g reg	ion 8
Higher in cases (q value)		(	).549	)			0.048*		*				0.988			0.988			0.549		9	0.988		5
Higher in controls (q value)		(	).768	3			0.993						0.067			0.067		0.299		0.299				

d Annotated genome analysis	Enhancer	Promoter region			
				First exon	
Higher in cases (q value)	0.024*	0.986		0.353	
Higher in controls (q value)	0.993	0.045*		0.299	

Bock Nat Rev Genet 13 :705 (2012)

### Inférence avec HMM?

#### (a) mC calling



- 1. Align reads allowing C-C matches and C-T mismatches
- 2. Evaluate alignment probability based on read quality and multi-locus mapping
- 3. Discard small-probability alignments
- 4. Estimate the mC level for each C position

#### (b) DMR detection



 $\rightarrow$  2 échantillons

 $\rightarrow$  émissions : restreintes à CpG seulement distribution binomiale (*m reads* avec méthylation sur *n*, niveau  $\theta$  spécifique à l'état)

$${m \choose n} heta^m (1- heta)^{n-m}$$

 $\rightarrow$  duration géométrique de rester dans un état  $\rightarrow$  LODS score d'une région :

$$\log \frac{\mathbb{P}\left\{ \text{région} \mid \mathsf{UP} \right\}}{\mathbb{P}\left\{ \text{région} \mid \mathsf{NoCH} \right\}}$$

Saito, Tsuji & Mituyama Nucleic Acids Res (2014)