

Supplementary Information 9 – Overview of DNA attributes used for prediction and statistical analysis

General remarks

In order to make the attributes comparable between multiple sites of different sizes, most attributes are aggregated over the site (mean, standard deviations, etc.) and standardized to a 1000 basepair window.

Because many attributes share similar calculation patterns, we give an overview of typical calculations here, to which we will refer many times below.

Distributions:

`_avg` = mean
`_std` = standard deviation
`_skew` = skewness
`_kurt` = kurtosis

Patches:

Only feature patches are counted where the feature overlaps the window by at least 25% of the feature or 10% of the window. From the set of valid patches, the following attributes are calculated:

`_len` = total length of overlap with window, standardized to 1000 basepairs
`_no` = total number of patches, standardized to 1000 basepairs
`_avg` = average of full lengths, not only the overlap
`_std` = standard deviation of full lengths, not only the overlap
`_sco` = [only for *scored patches*] mean score (no weighting by length)

Genes:

Only genes are taken into account that overlap by at least one basepair with the window. Attributes are then calculated at exon level for each exon that fulfills the patch overlap definition (overlap >25% of exon length or >10% of window size):

`_elen` = total length of exonic DNA with window, standardized to 1000 basepairs
`_eno` = total number of exons within window, standardized to 1000 basepairs
`_eavg` = average full length of the exons in the window
`_estd` = standard deviation of full lengths of the exons in the window
(no weighting by genes)

All genes that contain at least one exon fulfilling the above condition are taken into account for the gene statistics.

`_glen` = total length of exonic+intronic DNA with window, standardized to 1000 basepairs
`_gno` = total number of genes within window, standardized to 1000 basepairs
`_gavg` = average full length of the genes in the window
`_gstd` = standard deviation of full lengths of the genes in the window
`_gcav` = average number of exons per gene
`_gcsd` = standard deviation of exons per gene

(i) DNA sequence patterns and properties

Attribute Name(s)	Description	Implementation / Reference
Pat_AAAA to Pat_TTTT	Pattern frequency (strand-specific, +-strand only) of all 4-mers	By simple counting on the +-strand of the genomic sequence (NCBI35)
Uni_AAAA To Uni_CTTT	Pattern frequency (not strand-specific, both strands) of all 4-mers	By simple counting on the +-strand and saving to either the pattern or the reverse complement, whichever comes earlier in the alphabet
P_TATATA etc.	Pattern frequency (strand-specific, +-strand only) of a few arbitrarily picked special purpose patterns	By simple counting on the +-strand of the genomic sequence (NCBI35)
fG_avg fG_std fG_skew fG_kurt fC_avg fC_std fC_skew fC_kurt fCG_avg fCG_std fCG_skew fCG_kurt fOE_avg fOE_std fOE_skew fOE_kurt	Frequency distribution of Cs, Gs, CpGs, and of the Observed / Expected ratio	Calculated directly from sequence (NCBI35), over non-overlapping 50bp windows. Average, std-dev, skewness, and kurtosis are then calculated for the resulting distribution

(ii) Repeat attributes, frequency and distribution

Attribute Name(s)	Description	Implementation / Reference
WDu_len WDu_no WDu_avg WDu_std	Confirmed segmental duplications, defined as having similarity to sequences in the Segmental Duplication Database (SDD)	From UCSC Genome Browser “WSSD Duplication Track”: <code>celeraDupPositive.ChromStart</code> and <code>ChromEnd</code> in the usual way for patches
SDu_len SDu_no SDu_avg SDu_std SDu_sco	Duplications of at least 1000 basepairs of the total sequence (containing at least 500 bp of non-RepeatMasked sequence) with a sequence identity of at least 90%	From UCSC Genome Browser “Segmental Duplications”: <code>genomicSuperDups.ChromStart</code> and <code>ChromEnd</code> in the usual way for scored patches
SAI_len SAI_no SAI_avg SAI_std	Alignments of the human genome with itself, using a gap scoring system that allows longer gaps than tradi-	From UCSC Genome Browser “Self Chain”: <code>chr<No>_chainSelf.ChromStart</code> and <code>ChromEnd</code> in the usual way for scored patches

SAI_sco	tional affine gap scoring systems	
Rep_len Rep_no Rep_avg Rep_std Rep_sco Rep_ssco Rep_sta Rep_ssta Rep_end Rep_send Rep_lef Rep_slef	Repeats found by RepeatMasker. XXXX stands for repeat classes (SINE, LINE, etc.), and YYYY for repeat families (L1, L2, Alu, etc.) Rep_sco = mean of Smith-Waterman alignment score (1) Rep_ssco = std. dev. (2)	From UCSC Genome Browser “RepeatMasker”: chr<No>_rmsk in the usual way for scored patches
RC1_XXXX RCn_XXXX RCa_XXXX RCs_XXXX RC1_XXXX RC2_XXXX RC3_XXXX RC4_XXXX RC5_XXXX RC6_XXXX RC7_XXXX RC8_XXXX	Rep_sta = alignment start relative to full repeat (3) Rep_ssta = std. dev. (4) Rep_end = alignment end relative to full repeat (5) Rep_send = std. dev. (6) Rep_lef = no. of bases of full repeat that are unaligned (7) Rep_slef = std. dev. (8)	
RF1_YYYY RFn_YYYY RFa_YYYY RFs_YYYY RF1_YYYY RF3_YYYY RF5_YYYY RF7_YYYY	(for classes: mean and stddev; for families: only mean)	
Tan_len Tan_no Tan_avg Tan_std Tan_per Tan_sper Tan_cop Tan_scop Tan_sco Tan_ssco Tan_ent Tan_sent	Simple tandem repeats (possibly imperfect) located by Tandem Repeats Finder Period, mean + std. dev Copy number, mean + std. dev Score, mean + std. dev Entropy, mean + std. dev	From UCSC Genome Browser “Simple Repeats”: simpleRepeat in the usual way for scored patches

(iii) CpG island association and properties

Attribute Name(s)	Description	Implementation / Reference
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mCG_len mCG_no mCG_avg mCG_std mCG_gc mCG_sgc mCG_rat mCG_srat mCG_dist	CpG islands according to the following definition: GC > 55%, length > 200 bp, Obs/Exp > 0.6, no repeat masking Explanation: CpG_gc = avg. CpG percentage CpG_rat = avg. CpG observed / expected ratio CpG_dist = distance to closest CpG island or 0 if overlap	Calculated with the help of a locally modified version of "CpG_searcher.pl" by Daiya Takai and Peter A. Jones
CpG_len CpG_no CpG_avg CpG_gc CpG_rat CpG_dist	CpG islands according to the UCSC Genome Browser annotation	From UCSC Genome Browser "CpG Islands": CpGIslandExt in the usual way for scored patches

(iv) Predicted DNA structure properties

Attribute Name(s)	Description	Implementation / Reference
SASA_avg SASA_std SASA_skew SASA_kurt	Solvent accessible surface area of the DNA, predicted from sequence using oligomers with known structure	Prediction for each base from the DNA sequence according to J. Greenbaum's solvent accessibility prediction, based on "22_Solvent_Accessibility_Trimers.txt" (J. Greenbaum).
twis_avg twis_std twis_skew twis_kurt roll_avg roll_std roll_skew roll_kurt tilt_avg tilt_std tilt_skew tilt_kurt rise_avg rise_std rise_skew rise_kurt slid_avg slid_std slid_skew slid_kurt shif_avg	Basic structural properties of the DNA, predicted from sequence using oligomers with known structure	Prediction for each base from the DNA sequence based on "23_Octamer_Structure_Attributes.txt", averaging over all eight overlapping octamers

shif_std shif_skew shif_kurt		
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(v) *Gene association and properties*

Attribute Name(s)	Description	Implementation / Reference
TSS_over TSS_EnPD TSS_EnMD TSS_RePD TSS_ReMD	Location relative to nearest Ensembl TSS and Refseq TSS. PD: distance to +-strand TSS MD: distance to --strand TSS over: true if any one is zero	From UCSC Genome Browser “RefSeq Genes”: refFlat and “Ensembl Genes”: ensGene
Gen_over Gen_EnPD Gen_EnMD Gen_RePD Gen_ReMD	Location relative to nearest Ensembl gene and Refseq gene. PD: distance to +-strand gene MD: distance to --strand gene over: true if any one is zero	From UCSC Genome Browser “RefSeq Genes”: refFlat and “Ensembl Genes”: ensGene
Reco_avg Reco_std	Average recombination rate over a 1,000,000 basepair window	From UCSC Genome Browser “Recombination Rate Track” (deCODE genetic map): recom-bRate.decodeAvg, taking the unweighed average and stddev of overlapping areas
CCD_elen CCD_eno CCD_eavg CCD_estd CCD_glen CCD_gno CCD_gavg CCD_gcav	Human genome high-confidence gene annotations from the Consensus CDS (CCDS) project	From UCSC Genome Browser “CCDS”: ccdsGene in the usual way for genes
Ref_elen Ref_eno Ref_eavg Ref_estd Ref_glen Ref_gno Ref_gavg Ref_gstd Ref_gcav	Known protein-coding genes taken from the NCBI mRNA reference sequences collection (RefSeq)	From UCSC Genome Browser “RefSeq Genes”: refFlat in the usual way for genes
Ens_elen Ens_eno Ens_eavg Ens_estd Ens_glen Ens_gno Ens_gavg	Ensembl gene annotations	From UCSC Genome Browser “Ensembl Genes”: ensGene in the usual way for genes

Ens_gstd Ens_gcav		
Yale_len Yale_avg	Yale Pseudogene annotation	From UCSC Genome Browser “Yale Pseudo”: pseudoYale in the usual way for patches
Retr_len Retr_avg Retr_sco	UCSC retrotransposed gene annotation	From UCSC Genome Browser “Retrotransposed Genes”: pseudoGeneLink in the usual way for scored patches
ExA_len ExA_no ExA_avg ExA_std ExA_sco ExA_ssco ExA_var ExX_sco ExX_ssco	Degree of expression (the ratio over the median of several replicates) according to the GNF Atlas 2, averaged over all tissues (A) resp. for interesting groups of cells (X according to “categ” column in “12_GNF_Atlas_2_tissue_manual”) <i>brain o</i> <i>nerve o</i> <i>blood b</i> <i>immunei</i> <i>cancer o</i> <i>gland o</i> <i>muscle o</i> <i>other o</i> <i>placenta p</i> <i>germ m</i> <i>germ f</i>	From UCSC Genome Browser “GNF Atlas 2 Track”: gnfAtlas2 gives the values (column expScores) and hgFixed.gnfHumanAtlas2MedianExps gives the tissue information necessary for aggregation, in the way that the first value in expScore corresponds to tissue id 0, second to tissue id 1, ... until 79) The attributes are calculated in an adapted way for scored patches: Explanation: ExA_sco = avg. of expression of probed sequences in window ExA_std = stddev of ExA_sco over probed sequences in window (no weighting) ExA_var = avg. of (std. dev. over tissues) over genes in window

(vi) Predicted transcription factor binding sites:

Attribute Name(s)	Description	Implementation / Reference
TF_Total TF_XXX	Number of human/mouse/rat conserved, computationally identified, transcription factor binding sites in window (XXX stands for any transcription factor with a known binding matrix – all TFs starting with the same three letters are assumed to form a group and are counted together)	From UCSC Genome Browser “TFBS Conserved”: tfbsConsSites by simple counting (after manual removal of TFBS that have a frequency of less than 5 on chrom21q). To get some aggregation, TF where the first three letters are identical are put into the same category

(vii) Evolutionary conservation and single nucleotide polymorphisms

Attribute Name(s)	Description	Implementation / Reference
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Mos_len Mos_no Mos_avg Mos_std Mos_sco Mos_ssco	Elements of high conservation as calculated by PhastCons over pairwise Human/Chimp/Mouse/Rat/Dog/Chick/Fugu/Zfish whole genome alignments	From UCSC Genome Browser “Most Conserved”: phastConsElements in the usual way for scored patches
Con_avg Con_std Con_skew Con_kurt	Conservation score distribution	From UCSC Genome Browser “Conservation Track”: Calculate average, std-dev, skewness, and kurtosis of the 1 bp resolution distribution in window
S_count SC_XXXXX SF_YYYYY	Total number of SNPs in window, number of SNP by class (snp, in-del, ...), and by function (manually simplified)	From UCSC Genome Browser “SNPs”: snp by simple counting and use of the first 5 characters of ‘class’ as XXXXX and of ‘func’ as YYYYY

(viii) CpG island attributes

Attribute Name(s)	Description	Implementation / Reference
fG_avg fC_avg fOE_avg Length	Window characteristics: G content, C content, CpG observed vs. expected ratio, and window length	Calculated directly from the genome sequence. G and C content are measured separately in order to enable the detection of “mathematical CpG islands” (Takai / Jones 2002).