# **Genome Biology in 2017**

**Mehmet Tevfik DORAK, MD PhD** 

2<sup>nd</sup> Practical Bioinformatics Course *Istanbul, 17/18 April 2017* 







### **Schedule**

### Day 1

Genome Biology in 2017

**Bioinformatics Tools in Epigenetics** 

**Pathogenicity Assessment of DNA Sequence Mutations** 

Introduction to Galaxy

**Massive Data Sources** 

**Practical** 



- Chromatin modifications
- Transcriptional regulation (TF-mediated)
- Post-transcriptional (ncRNA-mediated)
- Translational (RNA decay; ribosome occupancy)

eQTL: Expression quantitative trait loci (variants associated with expression levels)

#### Types of eQTLs:

dsQTL : DNase I sensitivity quantitative trait loci

enhSNP : enhancer SNP

**eQTN** : expression quantitative trait nucleotide (causative eQTL)

**esQTL**: expression-specific QTLs (greater correlation with mRNA than protein abundance)

hQTL : histone-modification quantitative trait loci

haQTL : histone acetylation level quantitative trait loci

meQTL : methylation level quantitative trait loci

miR-eQTL : miRNA expression level quantitative trait loci

rQTL : ribosome occupancy quantitative trait loci

rbSNP : RNA-binding protein binding site SNP
pQTL : protein abundance quantitative trait loci

psQTL : protein-specific QTLs (greater correlation with protein than mRNA abundance)

RdQTL : RNA decay quantitative trait loci sQTL : Splicing quantitative trait loci

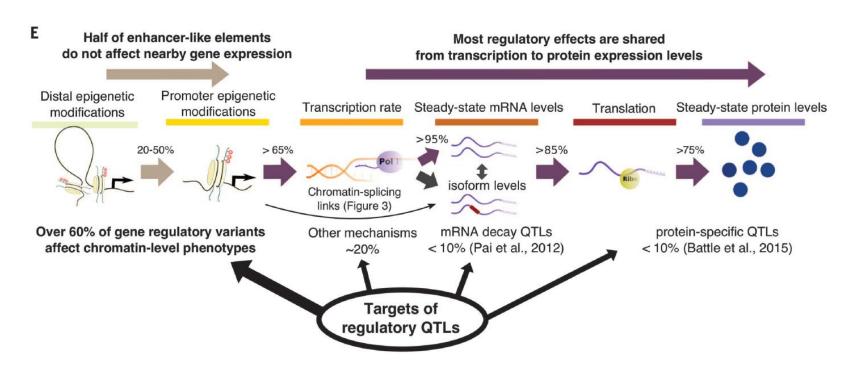
QTL<sup>epi</sup> : Epigenetic quantitative trait loci (correlations with DMR)



- Chromatin looping
- Transcription factor binding site alteration
- DNase I hypersensitivity (DHS) region modification
- Histone modifications
- DNA methylation
- ncRNA sequence or binding site alteration
- RNA splicing

Ultimately >>> eQTL effect





**Fig. 2. Percolation of genetic effects through the gene regulatory cascade.** (**A**) Correlation of effect sizes across different measurements from eQTLs identified in the GEUVADIS YRI sample (6). Txn rate, transcription rate. (**B**) QTL sharing across the regulatory cascade. Each panel shows the estimated fraction of QTLs identified at one stage that are preserved at the next stage of regulation. The four bars in each panel correspond to the *P*-value threshold for ascertaining QTLs in each assay, using the linear regression t statistics. Bars represent 80% confidence intervals on  $\pi_1$ , the fraction of true positives (16). The enhancer $\rightarrow$ TSS panel considers the effect of H3K27ac QTLs on the nearest TSS.

(**C**) The fraction of expression QTLs that also affect chromatin-level phenotypes, as estimated by two models, and for matched control SNPs. About 35% of gene eQTLs do not appear to affect chromatin traits. QTLs for H3K4me1 and H3K4me3 are from (8). (**D**) Functional context of eQTL SNPs that are not associated with chromatin changes ("unexplained") versus those eQTLs that are also chromatin QTLs. 5' untranslated regions were excluded from the "gene exons" annotation. Five annotations with bootstrap P > 0.05 are not shown. (**E**) Summary of the effects of regulatory QTLs and of their sharing through the regulatory cascade.

# RNA splicing is a primary link between genetic variation and disease



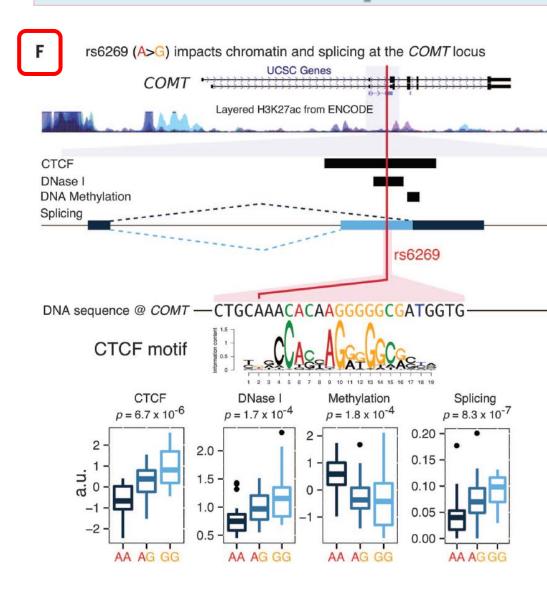


Fig. 3. Properties of sQTLs. Most sQTLs act independently from eQTLs: Positional distributions of (A) eOTLs and (B) sOTLs at 5% FDR are consistent with our mechanistic understanding of gene transcription and splicing. (C) The distance between the best eQTL and best sQTL for genes with both types of QTL is typically large, suggesting distinct causal variants. (D) A hierarchical model reveals distinct genomic features that are most relevant for eQTLs and sQTLs, respectively. (E) QTLs for CTCF binding, and H3K27ac levels are more likely to be sOTLs than matched SNPs within CTCF and H3K27ac ChIPseg peaks, respectively. (F) Example of an sOTL (rs6269) that is also a OTL for CTCF, DNasel sensitivity, and DNA methylation. The allele that is associated with increased CTCF occupancy is also associated with increased use of an alternative upstream splice site for an exon of the catechol-Omethyltransferase gene, COMT, which is consistent with the model that PollI pausing at CTCF binding sites can promote upstream exon inclusion (21). COMT, which regulates dopamine, has possible roles in neuropsychiatric conditions (25). In Europeans, the sQTL is in nearly complete linkage disequilibrium with a missense variant, rs4680, which has been the main focus of attention to date.

# RNA splicing is a primary link between genetic variation and disease



						F				
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1	cluster	pvalue	intron_coord	snp_pos	eQTL ctcfQTL		acQTL	dsQTL	meQTL	
2	clu5430	2.21E-04	chr19:1011611:1011740	rs10405583	2.19E-03	1.00E+00	1.00E+00	2.49E-03	3.21E-03	
3	clu1743	6.99E-08	chr11:68665480:68668003	rs544370	2.98E-21	1.00E+00	2.06E-07	1.00E+00	1.36E-06	
4	clu4984	3.83E-05	chr14:24572464:24573051	rs144856253	7.36E-01	1.00E+00	1.23E-03	4.13E-03	1.00E+00	
5	clu677	4.29E-05	chr12:57867959:57868235	rs4760273	4.96E-01	1.00E+00	1.00E+00	2.13E-03	1.43E-03	
6	clu11546	3.45E-07	chr2:113955211:113955327	rs148543122	1.98E-01	1.00E+00	1.95E-03	1.00E+00	2.35E-03	
7	clu2617	5.28E-07	chr10:127473829:127483449	rs10901449	1.54E-02	1.00E+00	6.02E-04	1.00E+00	8.11E-04	
8	clu9550	2.04E-04	chr5:169188629:169191038	rs7721990	3.62E-03	1.00E+00	3.83E-04	2.16E-03	1.00E+00	
9	clu5714	2.17E-05	chr19:10675710:10676582	rs3745244	1.26E-01	1.00E+00	7.21E-04	4.20E-03	1.00E+00	
10	clu7346	4.36E-04	chr20:44424082:44429713	rs6032531	1.35E-01	2.18E-12	6.47E-04	1.00E+00	1.00E+00	
11	clu14580	4.84E-04	chr8:145065075:145065368	rs7462703	7.96E-01	1.00E+00	1.00E+00	2.71E-03	4.10E-03	
12	clu13108	4.84E-04	chr1:155238150:155238499	rs1057941	4.59E-01	1.00E+00	2.42E-06	3.02E-03	1.00E+00	
13	clu3566	3.29E-24	chr17:74553939:74557370	rs4647885	1.60E-03	1.00E+00	2.31E-03	1.00E+00	4.91E-03	
14	clu4373	8.10E-20	chr16:89165171:89167070	rs8060043	1.64E-07	1.00E+00	1.64E-04	1.00E+00	1.99E-04	
15	clu7010	4.03E-15	chr22:50316091:50316260	rs6520064	3.17E-01	1.77E-05	1.00E-03	1.00E+00	1.00E+00	
16	clu7713	2.74E-06	chr7:6049129:6057445	rs34097030	2.26E-02	1.00E+00	1.00E+00	6.80E-04	6.49E-04	
17	clu5946	9.91E-06	chr19:19743075:19744612	rs873870	8.67E-01	1.00E+00	1.00E+00	1.81E-03	3.97E-03	
18	clu6361	1.66E-16	chr19:54704756:54705028	rs3852889	5.76E-01	1.00E+00	8.71E-04	1.00E+00	2.61E-03	
19	clu5321	1.29E-16	chr14:92583986:92587540	rs2896197	8.47E-03	1.00E+00	1.26E-04	1.00E+00	4.90E-03	
20	clu7661	3.24E-05	chr7:643253:647502	rs111526379	1.75E-02	1.00E+00	1.75E-07	1.00E+00	1.58E-03	
21	clu2223	5.34E-04	chr10:51592619:51606988	rs2012677	4.39E-01	1.00E+00	3.14E-06	3.43E-03	1.00E+00	
22	clu12882	5.70E-08	chr1:111739875:111740328	rs599134	1.89E-04	4.96E-09	7.55E-10	2.18E-14	1.00E+00	
23	clu5215	1.09E-04	chr14:71064494:71067333	rs12589444	6.93E-01	1.00E+00	6.32E-04	1.66E-03	1.00E+00	
24	clu6966	3.02E-04	chr22:42995799:42998776	rs6002854	1.17E-01	1.00E+00	9.26E-05	4.23E-03	1.00E+00	

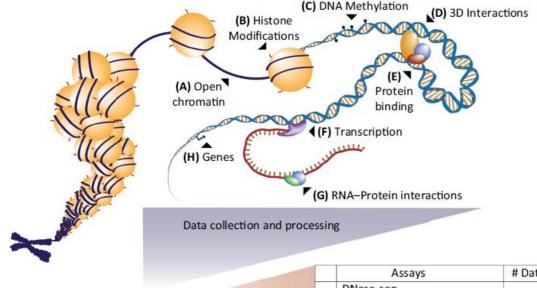


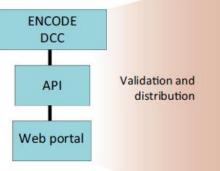
### RNA splicing is a primary link between genetic variation and disease

#### **Review**

### Deciphering ENCODE

Adam G. Diehl<sup>1</sup> and Alan P. Boyle<sup>1,2,\*</sup>



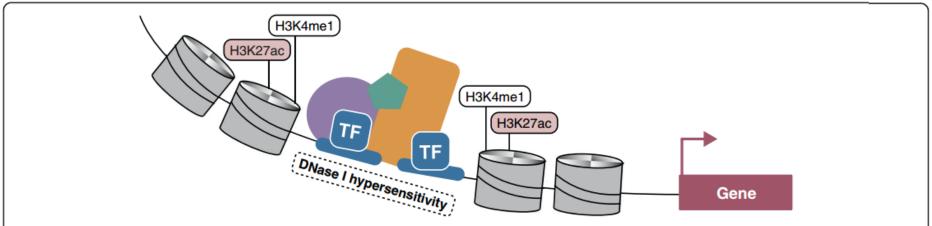


# Datasets DNase-seg 691 FAIRE-seq ChIP-seq 2641 WGBS RRBS 490 me DIP-sea 5C 28 ChIA-PET ChIP-seq 1230 RNA-sea icLIP/ecLIP 231 RIP-seg/RIP-ChIP Computational prediction RT-PCR



Figure 1. An Illustrative Example of the Data Types Available through the Encyclopedia of DNA Elements (ENCODE) Project Portals. These include measurements of (A) Open chromatin using DNase-seq and FAIRE-seq, (B) ChIP-seq for histone modifications, (C) DNA methylation, (D) 3D interactions, (E) ChIP-seq for transcription factors and other chromatin-associated proteins, (F) transcriptional output including RNA-seq, CAGE, and RNA-PET, (G) RNA-protein interactions, and (H) gene body predictions through computational and manual annotation as part of GENCODE.

<sup>\*</sup> Data in GENCODE



**Figure 1 Model of enhancer function.** Transcriptional enhancer elements are noncoding stretches of DNA that regulate gene expression levels, most often in *cis.* Active enhancer elements are located in open chromatin sensitive to DNase I digestion and flanked by histones marked with H3K4me1 and H3K27ac. Enhancers are often bound by a number of transcription factors (TF), such as p300 (blue). Mediator and cohesin are part of a complex (orange, green and purple) that mediates physical contacts between enhancers and their target promoters.

Ritchie and Flicek Genome Medicine 2014, 6:87 http://genomemedicine.com/content/6/10/87





Computational approaches to interpreting genomic sequence variation

Graham RS Ritchie<sup>1,2</sup> and Paul Flicek<sup>1,2\*</sup>



B. Hrdlickova et al. / Biochimica et Biophysica Acta 1842 (2014) 1910-1922



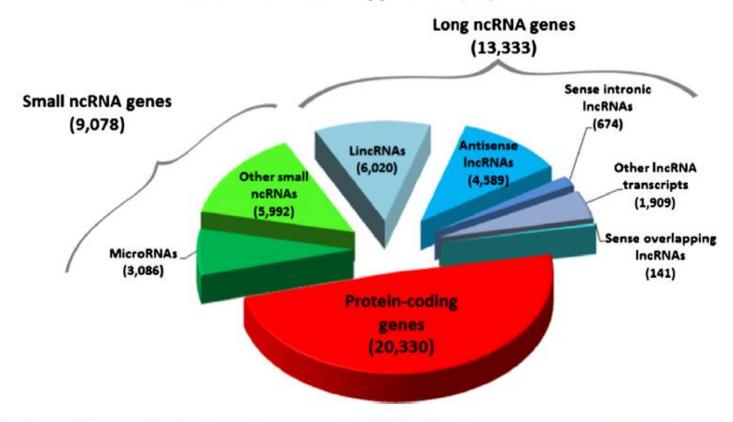


Fig. 1. Abundance of regulatory ncRNA species versus protein coding genes in the human genome. The numbers are based on Gencode V17 (http://www.gencodegenes.org/releases/17.html).



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Biochimica et Biophysica Acta

LASVILIR journal homepage: www.elsevier.com/locate/bbadis

We identified 8,902 locations at which the DNase-seq read depth correlated significantly with genotype at a nearby single nucleotide polymorphism or insertion/deletion (false discovery rate = 10%). We call such variants 'DNase I sensitivity quantitative trait loci' (dsQTLs). We found that dsQTLs are strongly enriched within inferred transcription factor binding sites and are frequently associated with allele-specific changes in transcription factor binding. A substantial fraction (16%) of dsQTLs are also associated with variation in the expression levels of nearby genes (that is, these loci are also classified as eQTLs). Conversely, we estimate that as many as 55% of eQTL single nucleotide polymorphisms are also dsQTLs. Our observations indicate that dsQTLs are highly abundant in the human genome and are likely to be important contributors to phenotypic variation.

DNase I sensitivity QTLs are a major determinant of human expression variation



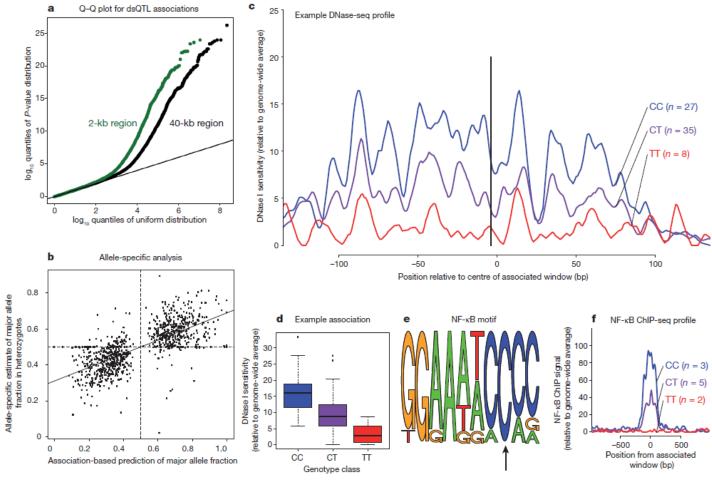


Figure 1 | Genome-wide identification of dsQTLs and a typical example. a, Q-Q plots for all tests of association between DNase I cut rates in 100-bp windows, and variants within 2-kb (green) and 40-kb (black) regions centred on the target DHS windows. b, Allele-specific analysis of dsQTLs in heterozygotes. Plotted are the predicted (x axis) and observed (y axis) fractions of reads carrying the major allele based on the genotype means. c, Example of a

dsQTL (rs4953223). The black line indicates the position of the associated SNP. d, Box plot showing that rs4953223 is strongly associated with local chromatin accessibility ( $P = 3 \times 10^{-13}$ ). e, The T allele, which is associated with low DNase I sensitivity, disrupts the binding motif of a previously identified NF-κB-binding site at this location <sup>14</sup>. f, NF-κB ChIP-seq data from ten individuals<sup>7</sup> indicates a strong effect of this SNP on NF-κB binding.

# DNase I sensitivity QTLs are a major determinant of human expression variation



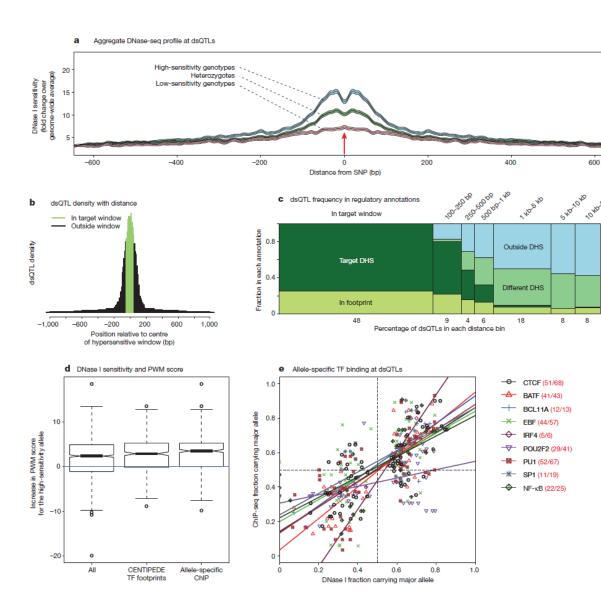


Figure 2 | Properties of dsQTLs. a, Aggregated plot of DNase I sensitivity for high-confidence dsQTLs that lie within the target DHS. Individuals were separated into the high-sensitivity (blue), heterozygote (green), and lowsensitivity (red) classes. The shading indicates the bootstrap 95% confidence intervals. b, The peak density of dsQTLs is very tightly focused around the target DHS window. c, Total fraction of cis-dsQTLs that fall into different categories of distance from the target window (x axis) and different annotations (y axis). The total area of each rectangle is proportional to the estimated number of dsQTLs in that category. d, Box plot showing distribution of position weight matrix (PWM) score differences between high-sensitivity and low-sensitivity dsQTL alleles, respectively. Notches indicate 95% confidence intervals for median. e, The x axis shows the fraction of sequence reads predicted to carry the major allele based on the DNase I genotype means; the yaxis shows the observed fraction in ChIP-seq data. The lines show the regression fits for each factor separately; the numbers in the key show the fraction of sites that are in a concordant direction for each factor. CTCF, CCCTC binding factor; BATF, basic leucine zipper transcription factor; BCL11A, B-cell CLL/lymphoma 11A zinc-finger protein; EBF, early B-cell factor 1; IRF4, interferon regulatory factor 4; POU2F2, POU class 2 homeobox 2; PU1, proviral integration oncogene spi1; SP1, Sp1 transcription factor; NF-κB, nuclear factor of κ light polypeptide gene enhancer in B-cells 1.

# DNase I sensitivity QTLs are a major determinant of human expression variation



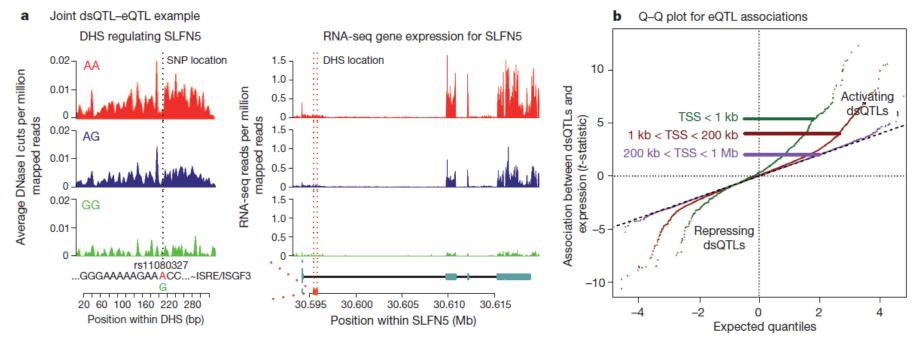
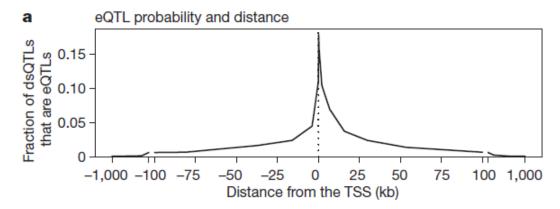


Figure 3 | Relationship between dsQTLs and eQTLs. a, Example of a dsQTL SNP that is also an eQTL for the gene SLFN5. The SNP disrupts an interferonsensitive response element, thereby changing local chromatin accessibility within the first intron of SLFN5. Expression of SLFN5 has been shown to be inducible by interferon  $\alpha$  in melanoma cell lines. DNase-seq (left) and RNA-seq

(right) measurements from DNase-seq and RNA-seq are plotted, stratified by genotype at the putative causal SNP. b, Q–Q plot of the *t*-statistic for association with gene expression changes (eQTL) of dsQTL SNPs. The sign of the eQTL *t*-statistic is with respect to the genotype that increases DNase sensitivity.

# DNase I sensitivity QTLs are a major determinant of human expression variation





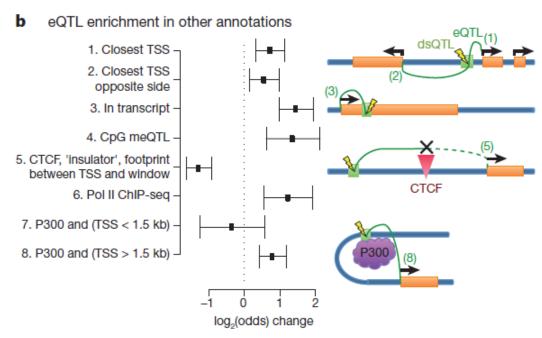
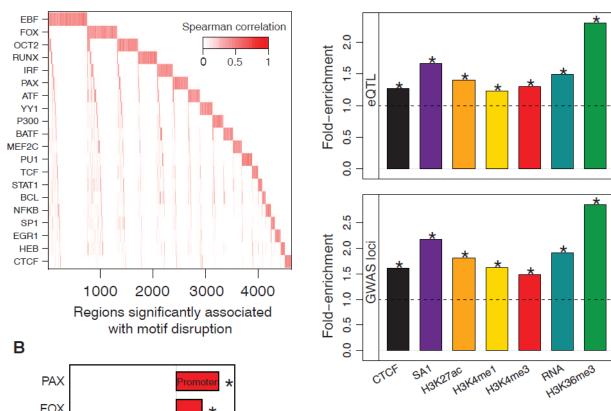


Figure 4 | Relationship between dsQTLs and eQTLs. a, Most joint dsQTL-eQTLs lie close to the gene TSS. b, Effect of various factors on the log odds that a given dsQTL is also an eQTL, while controlling for the strong distance relationship observed in a. In annotations (1) and (2) we do not consider the direction of transcription. In annotations (6–8) ChIP-seq is measured on the dsQTL window. In annotations (4) and (6), 'meQTL' refers to a dsQTL that is also associated with methylation levels of a nearby CpG site<sup>27</sup> and 'Pol II' refers to the presence of an RNA polymerase II ChIP-seq peak overlapping the DHS associated with the dsQTL<sup>23</sup>. One of the most significant annotations in delineating the regulatory regions is defined by the presence of the CTCF insulator element, which decreases 2.4-fold the probability that a dsQTL is an eQTL. Error bars represent 95% confidence intervals.

# DNase I sensitivity QTLs are a major determinant of human expression variation





PAX
FOX
NFKB

MEF2C

PU1

Enhancer

-1.0 -0.5 0.0 0.5

Log2-fold change
Promoter vs. Enhancer states

**Fig. 4. Mechanism and functional consequences of chromatin variation.** (**A**) Correlation coefficients of TF motif disruption scores and H3K27ac signal across individuals. Motifs are sorted based on the number of associated peaks; peaks are sorted based on their associated motifs. (**B**) Log2 fold-enrichment of motifs in promoter (red) versus enhancer (orange) states. Only significant enrichments (Fisher's exact test P < 0.05) are shown. (**C**) eQTLs and GWAS hits in variable regions. Stars indicate P < 0.05.

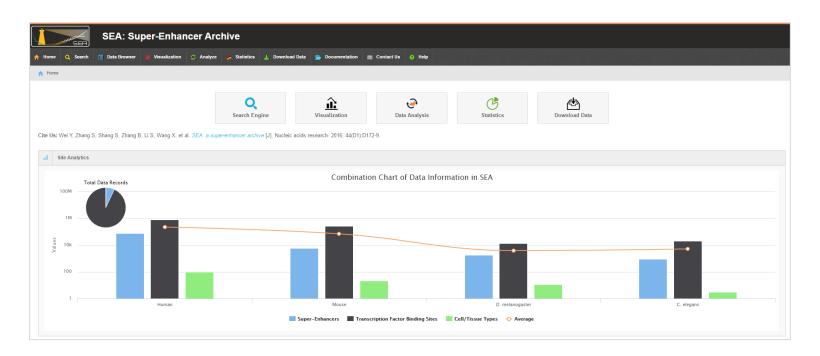
## Extensive Variation in Chromatin States Across Humans

Maya Kasowski, <sup>1,2</sup>\* Sofia Kyriazopoulou-Panagiotopoulou, <sup>3</sup>\* Fabian Grubert, <sup>1</sup>\* Judith B. Zaugg, <sup>1</sup>\* Anshul Kundaje, <sup>1,3,6</sup>\*\* Yuling Liu, <sup>8</sup> Alan P. Boyle, <sup>1</sup> Qiangfeng Cliff Zhang, <sup>1</sup> Fouad Zakharia, <sup>1</sup> Damek V. Spacek, <sup>1</sup> Jingjing Li, <sup>1</sup> Dan Xie, <sup>1</sup> Anthony Olarerin-George, <sup>6</sup> Lars M. Steinmetz, <sup>1,7</sup> John B. Hogenesch, <sup>6</sup> Manolis Kellis, <sup>4,5</sup> Serafim Batzoglou, <sup>3</sup> Michael Snyder <sup>1</sup>†

## **Gene Expression Regulation: Super Enhancers**

# Super-Enhancers in the Control of Cell Identity and Disease

Denes Hnisz, <sup>1,3</sup> Brian J. Abraham, <sup>1,3</sup> Tong Ihn Lee, <sup>1,3</sup> Ashley Lau, <sup>1,2</sup> Violaine Saint-André, <sup>1</sup> Alla A. Sigova, <sup>1</sup> Heather A. Hoke, <sup>1,2</sup> and Richard A. Young <sup>1,2,\*</sup>



#### SEA: a super-enhancer archive

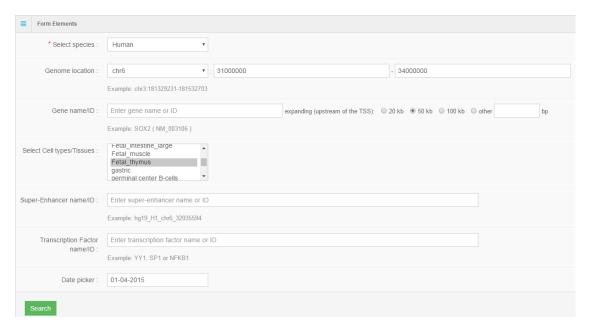
Yanjun Wei<sup>1,†</sup>, Shumei Zhang<sup>1,†</sup>, Shipeng Shang<sup>1,†</sup>, Bin Zhang<sup>1</sup>, Song Li<sup>1</sup>, Xinyu Wang<sup>1</sup>, Fang Wang<sup>1</sup>, Jianzhong Su<sup>1</sup>, Qiong Wu<sup>2</sup>, Hongbo Liu<sup>1,†</sup> and Yan Zhang<sup>1,†</sup>



## **Gene Expression Regulation: Super Enhancers**



#### Advanced Search



#### Search Results



#### SEA: a super-enhancer archive

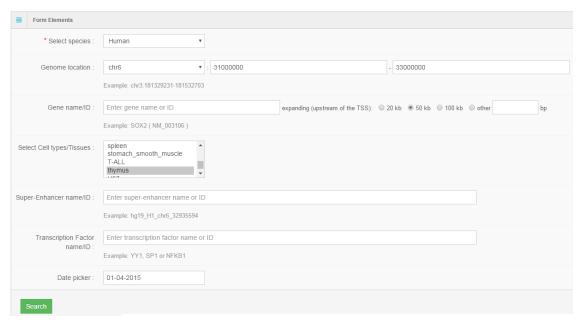
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# **Gene Expression Regulation: Super Enhancers**



#### Advanced Search



#### Search Results

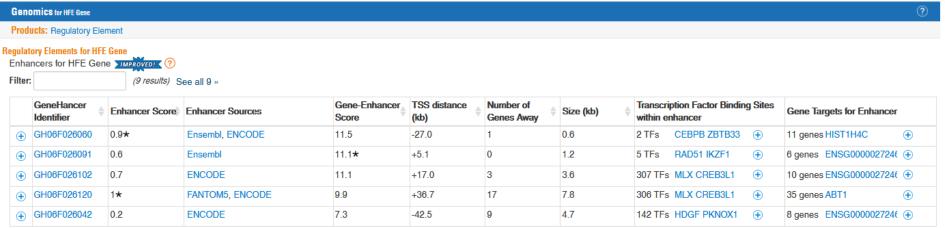


#### SEA: a super-enhancer archive

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### **GeneHancer in GeneCards**



\* - Elite enhancer/Elite enhancer-gene association

Download Table
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Enhancers around HFE on UCSC Golden Path with GeneCards custom track

GeneHancer: genome-wide integration of enhancers and target genes in GeneCards

Simon Fishilevich<sup>1,†</sup>, Ron Nudel<sup>1,†</sup>, Noa Rappaport<sup>1</sup>, Rotem Hadar<sup>1</sup>, Inbar Plaschkes<sup>1</sup>, Tsippi Iny Stein<sup>1</sup>, Naomi Rosen<sup>1</sup>, Asher Kohn<sup>2</sup>, Michal Twik<sup>1</sup>, Marilyn Safran<sup>1</sup>, Doron Lancet<sup>1,\*</sup> and Dana Cohen<sup>1,\*</sup>



## **Gene Expression Regulation: GARLIC**





GARLIC: a bioinformatic toolkit for aetiologically connecting diseases and cell type-specific regulatory maps ∂

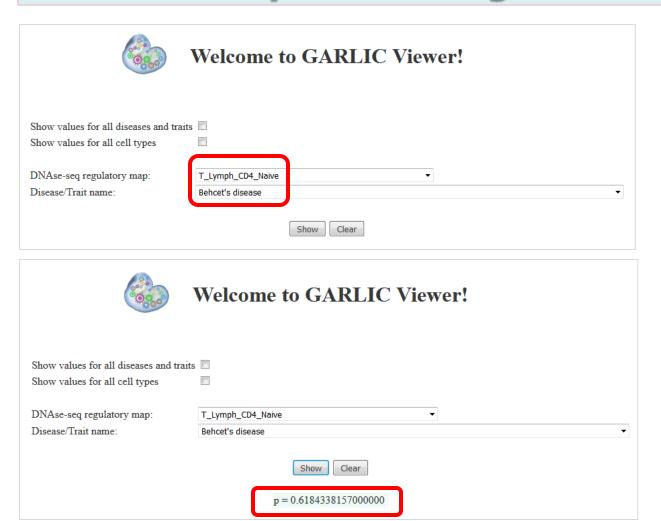
Miloš Nikolić; Argyris Papantonis; Alvaro Rada-Iglesias 

Miloš Nikolić; Argyris Papantonis; Alvaro Rada-Iglesias 

Miloš Nikolić; Argyris Papantonis; Alvaro Rada-Iglesias

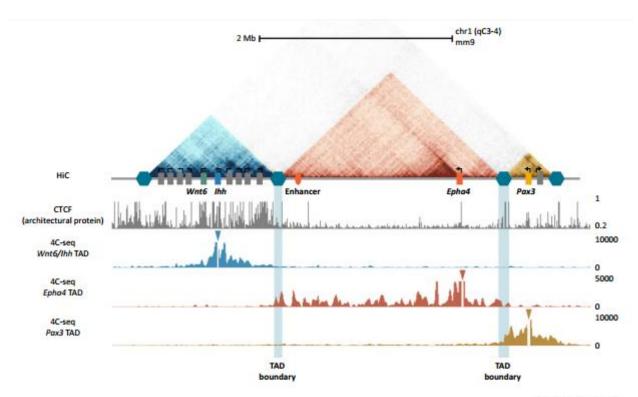


## **Gene Expression Regulation: GARLIC**



GARLIC: a bioinformatic toolkit for aetiologically connecting diseases and cell type-specific regulatory maps 3





Trends in Genetics

Figure 1. Higher-Order Chromatin Folding and Topologically Associating Domain (TAD) Structure at the Eph receptor A4 (Epha4) Locus. Hi-C interactions are shown in a heat map in which each dot reflects two interaction pairs. The resulting interaction profile shows the formation of triangles (schematically enhanced in color) that represent individual TADs. There is a high degree of interaction within each TAD but little contact between TADs. Abrupt changes in the directionality of contacts demarcate boundary regions (blue hexagon). Of note is the very large TAD containing one (Epha4) gene, whereas the flanking TADs are much smaller (right) or contain many genes (left). Below, the binding profile of the CCCTC-binding factor (CTCF) transcription factor is shown. Note the scarcity of binding sites in the Epha4 TAD and the enrichment at the boundaries. CTCF is also associated with gene promoters. The 4C-seq profiles of the viewpoints Indian hedgehog (Ihh), Epha4, and Paired box3 (Pax3) are depicted below. Note that the interaction profiles are restricted to the respective TADs. Data from [23,30].

Breaking TADs: How Alterations of Chromatin Domains Result in Disease

Darío G. Lupiáñez, 1,2,3,@ Malte Spielmann, 1,2,3 and Stefan Mundlos 1,2,3,\*



The eukaryotic nucleus is a complex 3D environment in which genome function depends not only on the linear arrangement of regulatory sequence elements, but also on their spatial organization for effective control of gene expression.

Analysis of the role of chromatin 3D organization in gene expression is progressing rapidly, largely due to the development of chromosome conformation capture methods such as Hi-C.

Sequences within these <u>Topologically Associated Domains</u> (TADs) interact more frequently with sites inside than outside the domain. TADs with a median size of 880 kb have been found in mammals.

Breaking TADs: How Alterations of Chromatin Domains Result in Disease



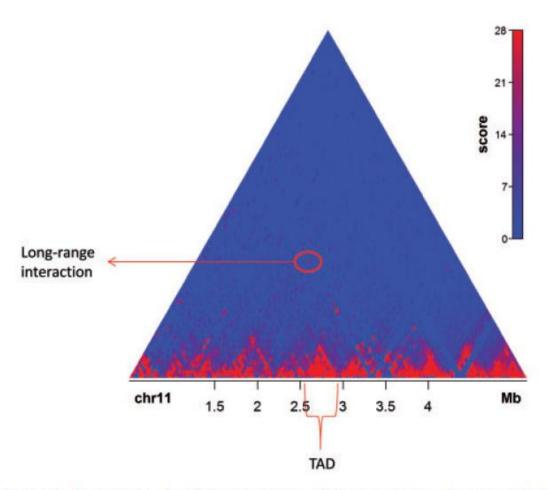


Figure 2. An example of a Hi-C contact map. Hi-C contact map of a segment of mouse chromosome 11, generated using Sushi [90] from Dixon et al. [85] data. A TAD and a long-range interaction between two loci are annotated. A colour version of this figure is available online at BIB online: https://academic.oup.com/bib.



Briefings in Bioinformatics, 17(6), 2016, 980-999 doi: 10.1093/bb/bbv097 Advance Access Publication Date: 19 November 2015

In the loop: promoter–enhancer interactions and bioinformatics

Antonio Mora, Geir Kjetil Sandve, Odd Stokke Gabrielsen and Ragnhild Eskeland



### **3D Genome: CCSI**

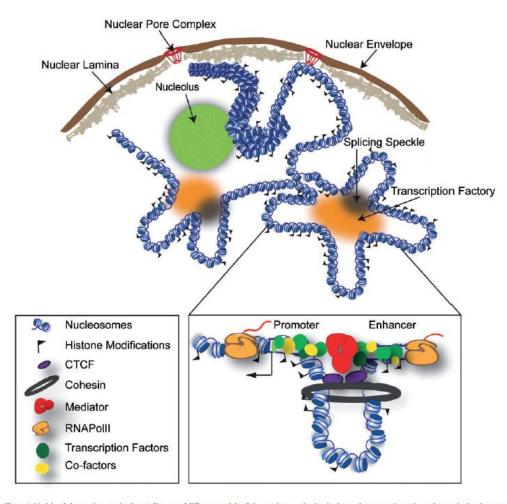


Figure 1. Models of chromatin organization. A diagram of different models of chromatin organization in the nuclear space. Interphase chromatin that interacts with the nuclear lamina (grey), nucleolus (green), hudear pores (red), transcription factories (orange) and splicing speckles (black) are depicted here. Generally, lamin- and nucleolar-associated domains are transcriptionally repressed and have a more condensed chromatin, whereas chromatin that loops to the nuclear pore, transcription factories and splicing speckles are transcriptionally active and therefore have a more open chromatin structure (here, depicted as 10 nm chromatin fibre). Enhancers can activate gene expression over a distance and contain binding sites for TFs that recruit co-factors (activators or repressors). A promoter-enhancer looping mechanism mediated by cohesin (brown), CTCF (purple) and the mediator complex (red) that brings the enhancer into close proximity to its target promoter are presented in the enlarged box. The enhancer and promoter are marked with white boxes, and the transcription start site of the transcribed target gene is annotated with an arrow. TFs (green) and co-factors (yellow) bind the enhancer and are brought close to the basal transcription machinery at the promoter. RNAPollI (orange) transcribes premRNA from the target gene and eRNA from the enhancer. Some of these models may co-exist for different PEIs, however, there are also other models that we could not show. A colour version of this figure is available online at BIB on line: https://academic.oup.com/bib.



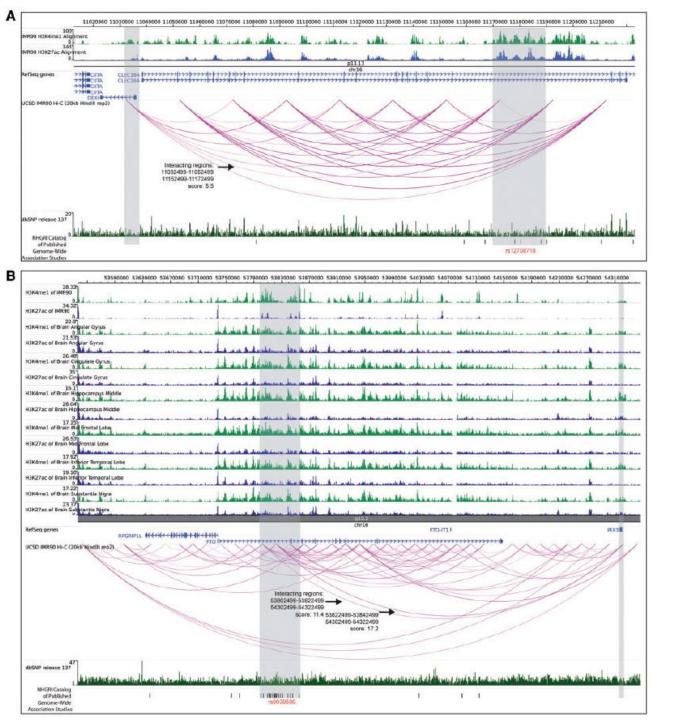
Briefings in Bioinformatics, 17(6), 2016, 980-995

doi: 10.1093/bib/bbv097 Advance Access Publication Date: 19 Nove

In the loop: promoter–enhancer interactions and bioinformatics

Antonio Mora, Geir Kjetil Sandve, Odd Stokke Gabrielsen and Ragnhild Eskeland





...., joyj show interactions between the, respectively, and the filter thresh-(pink) for interaction ingraptice with an arrow. (B) Long-range interactions links obesity-associated variants in FTO with the RX3 locus. Hi-c data in human focial lung (LMK-90) cells show interactions between the first intron of FTO with IRX3. The tracks for H3K4me1 and H3K2Ta care shown in gene and blue from LMR-90 cells and different human brain associated SNP rs9930506 is marked in red. Arcs (pink) for interacting regions (gey) are highlighted with arrows. These public data sets are available and visualized with the WashU EpiGenome Browser (http://epigenomegateway.wustl.edu/browser), dsSNP release 137 is shown in dark green, and the The National Human Genome Riseasch-Institute (NHGR) Catalogues of GWAS are visualized in UCSC browser (http://genome-euro.ucsc.edu) [166] A Andrew warmen of All and Care and the Company of the Research and the Research of the Research and the Research of t between DEXI and the DEXI locus. The intron of CLECIGA. H-C data from human foetal lung (IAR-90) cells (from the Ren lab, [85]) show in the the DEXI locus. The enhancer marks in IMR-90 cells for H3K4me1 and H3K27ac are shown in green and blue, respectively, is was set to 5. SNPs in the region are in black, and the eQTL SNP rs12708716 is marked in red. The arc (pink) for innermance in the first inton of FTO with IRR3 locus in the region are in black, and the eQTL SNP rs12708716 is marked in red. The arc (pink) for innermance in the first inton of FTO with IRR3 locus in the tracks for H3K4me1 and red. CLEC16A intron 19 and the DEXI locus. old for the Hi-C data was set to 5. SN Figure 3. I



Briefungs in Bioinformatics, 17(6), 2016, 980-999 dai: 10.1093/bib/bb/097 Advance Access Publication Date: 19 November 2015 Software Beview

#### In the loop: promoter–enhancer interactions and bioinformatics

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### **3D Genome: CCSI**

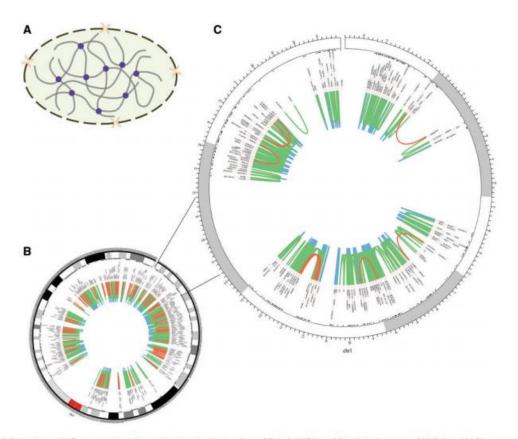


Figure 2. Chromosomal 3D structure and promoter–promoter interactions of Chr1 in IMR90 cell line based on a set of Hi-C data. (A) Chromosomal 3D structure. The dashed circle with two orange crescents that stand for nuclear pore complex is the nucleus membrane. The thick grey lines are chromatin and the purple circles stand for proteins that link chromatin together. (B) Promoter–promoter interactions of Chr1. (C) Promoter–promoter interactions of Chr1:1-20000000, zooming into the interactions. The red lines stand for long-range interactions (distance between interaction pair > 500 kb), while the blue lines for short-range (distance < 50 kb) and the green lines for middle-range (distance spanning 50–500 kb). The black texts are the gene names of corresponding loci.







Original article

CCSI: a database providing chromatinchromatin spatial interaction information

Xiaowei Xie<sup>1</sup>, Wenbin Ma<sup>1</sup>, Zhou Songyang<sup>1</sup>, Zhenhua Luo<sup>1,2</sup>, Junfeng Huang<sup>1</sup>, Zhiming Dai<sup>3,\*</sup> and Yuanyan Xiong<sup>1,4,\*</sup>



### **3D Genome: CCSI**



### **Chromatin Chromatin Space Interaction**

Home Method Search Download Help Update

#### Welcome to CCSI database

Here, **CCSI** (**Chromatin Chromatin Space Interaction**) database presents 3,017,962 chromatin interaction pairs with annotation of genes, enhancers and SNPs in many cell lines of human, mouse and yeast. These data were obtained by means of **3C**, **4C**, **5C**, **ChIA-PET and Hi-C** technology in a cell's natural state, nearly all of which detected the three-dimensional architecture of chromosome by coupling ligation in close spatial proximity followed by high-throughput sequencing. So transcriptional regulatory mechanism in disease pathogenesis associated with spatial interactions among genes, enhancers and SNPs could be explored on the base of it.



### 3D Genome: 3CDB



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Genome Browser

Search

3C Technology

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#### Welcome to Chromosome Conformation Capture Database(3CDB)

Chromosome conformation capture (3C) is a biochemical technology to analyze contact frequencies between selected genomic sites in a cell population. We have developed a database of manually curated 3C data (3CDB). By searching Pubmed with carefully designed keyword combinations, we have retrieved about 5000 papers, and from which 3319 interactions in 17 species were manually extracted. Moreover, we developed a systematic evaluation scheme for data reliability and classified the interactions into four categories. Our evaluation scheme provides a solution to a long-standing problem about the incomparability of 3C data between laboratories. We believe that 3CDB will provide fundamental information for experimental design and bridges the gap between molecular and systems biologists who must now contend with noisy high-throughput data.

### Chromosome Conformation Capture Database

Search General Search, e.g. CD34 or CD34 ci0000001

Data Browser

Genome Browser

3C Technology

#### Search Result

	Name							
		Locus1	Fragment location	Primer sequence	Strand	Locus2	Fragment location	
1	hs0000001	MYC,colon cancer risk locus	NA	NA	NA	<b>Ø</b> MYC	NA	
2	hs0000002	MYC,breast cancer risk locus	NA	NA	NA	<b>Ø</b> MYC	NA	
3	hs0000006	MYC,breast cancer risk locus	NA	NA	NA	<b>Ø</b> MYC	NA	
4	hs0000651	MYC,enhancer,segment E	chr8:128406277- 128416808	AATTTCCCATCCACATTCCACAAGCAACTGT	+		chr8:128745463- 128751378	
5	hs0000530		chr8:128745990- 128756984	AGCAGCAGATACCGCCCCTCCT	-	MYC,enhancer,segment A	chr8:128226105- 128226859	
6	hs0000531		chr8:128745990- 128756984	AGCAGCAGATACCGCCCCTCCT	-	MYC,enhancer,segment C	chr8:128235179- 128236036	



doi: 10.1093/database/baw04

Original article

#### 3CDB: a manually curated database of chromosome conformation capture data

Xiaoxiao Yun<sup>1,2,†</sup>, Lili Xia<sup>1,2,†</sup>, Bixia Tang<sup>1,2</sup>, Hui Zhang<sup>1,2</sup>, Feifei Li<sup>1</sup> and Zhihua Zhang<sup>1,\*</sup>

<sup>1</sup>CAS Key Laboratory of Genome Sciences and Information, Beijing Institute of Genomics, Chinese Academy of Sciences, Beijing, 100101, China and <sup>2</sup>University of Chinese Academy of Sciences, Beijing, 100049, China

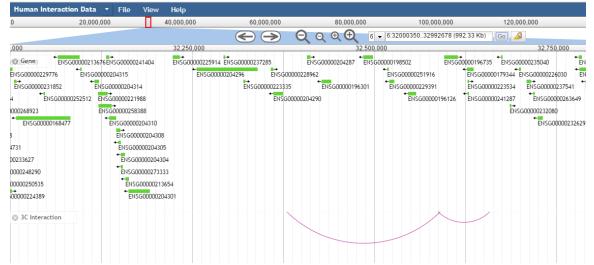
### 3D Genome: 3CDB



Home Data Browser Genome Browser Search 3C Technology Help Contact

#### Welcome to Chromosome Conformation Capture Database(3CDB)

Chromosome conformation capture (3C) is a biochemical technology to analyze contact frequencies between selected genomic sites in a cell population. We have developed a database of manually curated 3C data (3CDB). By searching Pubmed with carefully designed keyword combinations, we have retrieved about 5000 papers, and from which 3319 interactions in 17 species were manually extracted. Moreover, we developed a systematic evaluation scheme for data reliability and classified the interactions into four categories. Our evaluation scheme provides a solution to a long-standing problem about the incomparability of 3C data between laboratories. We believe that 3CDB will provide fundamental information for experimental design and bridges the gap between molecular and systems biologists who must now contend with noisy high-throughput data.







Original article

### 3CDB: a manually curated database of chromosome conformation capture data

Xiaoxiao Yun<sup>1,2,†</sup>, Lili Xia<sup>1,2,†</sup>, Bixia Tang<sup>1,2</sup>, Hui Zhang<sup>1,2</sup>, Feifei Li<sup>1</sup> and Zhihua Zhang<sup>1,\*</sup>

<sup>1</sup>CAS Key Laboratory of Genome Sciences and Information, Beijing Institute of Genomics, Chinese Academy of Sciences, Beijing, 100101, China and <sup>2</sup>University of Chinese Academy of Sciences, Beijing, 100049, China

### 3D Genome: rVarBase



#### rVarBase: an updated database for regulatory features of human variants

Chromatin states, regulatory elements and target genes

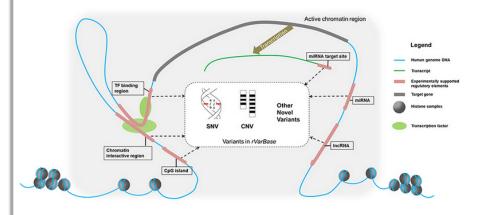
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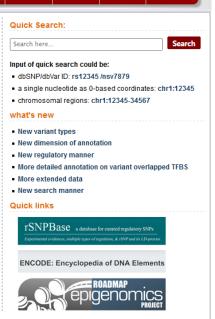
#### About rVarbase

rVarBase annotates variant's regulatory feature in three fields: chromatin state of the region surrounding variant, regulatory elements overlapped with variant, and variant's potential target genes. It also provides optioned extended annotation for variants, including: LD-proxies of known SNP, SNP/CNV that is overlapped with or located in queried variant, traits (disease and expression quantitative trait) associated with variant. N'arBase is an updated version of the database rSNPBase, it is consistent with the old version in utilizing experimentally supported regulatory elements from ENCODE and other data resources to make relevant annotation (such as involved regulatory manner and potential target gene).rVarBase is different from the old version in several new features:

- New variant types
- New dimension of annotation
- New regulatory manner
- More detailed annotation on variant overlapped TFBS
- More extended data
- New search manner



Citation: Guo, L., Du, Y., Qu, S., & Wang, J. (2015). rVarBase: an updated database for regulatory features of human variants. Nucleic acids research, gkv1107 pubmed



The 2.0 version of rSNPBase

**About Us** 

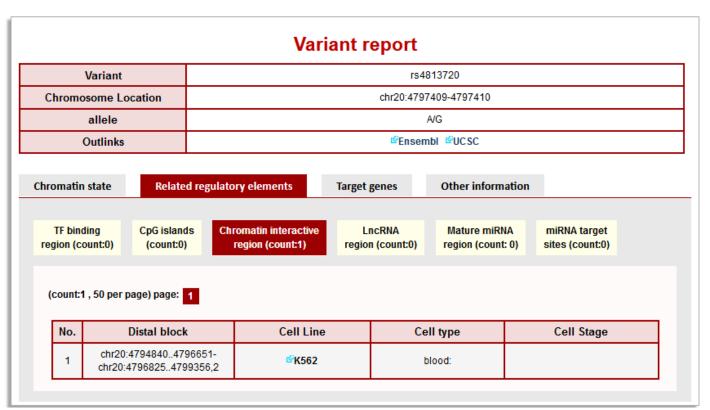
Feedback

rVarBase: an updated database for regulatory features of human variants 3



### 3D Genome: rVarBase





rVarBase: an updated database for regulatory features of human variants 3

Liyuan Guo; Yang Du; Susu Qu; Jing Wang



### 3D Genome: CTCFBSDB

#### CTCFBSDB 2.0: A database for CTCF binding sites and genome organization

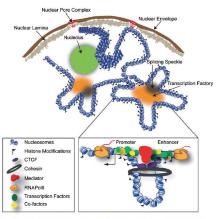
Home Search Experimentally Identified CTCFBS Browse Topological Domain Predicted CTCFBS CTCFBS Prediction To

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- 2. Sources of binding sites
- 3. Database access and content
- 4. In silico CTCFBS prediction tool
- 5. Recent updates
- 6. Download
- 7. References
- Contact us

#### 1. Background

CCCTC-binding factor (CTCF) is a versatile transcription regulator that is evolutionarily conserved from fruit fly to human. CTCF binds to different DNA sequences through combinatorial use of 11-zinc fingers, and shows distinct functions (transcription activation/repression and chromatin insulation) depending on the biological context <sup>1,2</sup>. Insulators, with the functions of enhancer-blocking and domain-bordering, are critical regulatory elements for gene expression control <sup>3,4</sup>. They represent a class of diverged DNA sequences capable of shielding genes against inappropriate cis-regulatory signals from their genomic neighborhood. Recent studies also linked insulators to epigenetics, such as imprinting <sup>5,6</sup> and X-chromosome inactivation <sup>7</sup>. In eukaryotic genomes, maintenance of distinct chromatin domains is critical for transcription control, and CTCF has been identified as playing a crucial role in the global organization of chromatic architecture <sup>2</sup>. Evidence for this CTCF function has been strengthened by Hi-C experiments that have shown that interacting genomic regions commonly contain CTCF binding sites and that the boundaries of genomic topological domains are enriched for CTCF binding sites <sup>8,9,10</sup>. To analyze this important type of DNA regulatory element, we created a CTCF binding site database (CTCFBSDB), a comprehensive collection of experimentally determined and computationally predicted CTCF binding sites (CTCFBS) from the literature. The database is designed to facilitate the studies on insulators and their roles in demarcating functional genomic domains.



Figs. 1 Models of Chimatelli regulations. A Signate of different models of chimatelli regulations in the model regulation grant and the second regulation of the models are second regulations. A Signate of different models in the models are second regulations and the control of the second regulation of the models are second regulations. A second regulation of the second

D188-D194 Nucleic Acids Research, 2013, Vol. 41, Database issue doi:10.1093/nar/gks1165

Published online 27 November 2012

CTCFBSDB 2.0: a database for CTCF-binding sites and genome organization

Jesse D. Ziebarth<sup>1,2</sup>, Anindya Bhattacharya<sup>1,2</sup> and Yan Cui<sup>1,2,\*</sup>

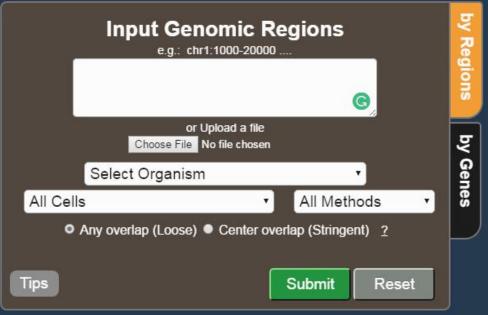




### repository for chromatin interaction data.

Records in 4DGenome are compiled through comprehensive literature curation of experimentallyderived and computationally-predicted interactions. The current release contains 4,433,071 experimentally-derived and 3,605,176 computationally-predicted interactions in 5 organisms. Experimental data cover both high throughput datasets and individual focused studies.

All interaction data are freely available in a standardized file format. Records can be queried by genomic regions, gene names, organism, and detection technology.





00	ownload Tables
F	ull Dataset [884M]
Зу	Organism
D	rosophila melanogaster (dm3) [5.4M]
Н	omo sapiens (hg19) [375M]
M	lus musculus (mm9) [505M]
Р	lasmodium falciparum (3D7) [37M]
S	accharomyces cerevisiae (sacCer3) [26M]

	InteractorA	Start_hg19	End_hg19	InteractorB	Start_hg19	End_hg19	Agene	Bgene	Cell/Tissue	Detection	Confidence	Confidence	Contact	PMID
1	Chr 🏋	-	-	Chr 🏋	~	~	▼	▼	~	Method ▼	Score 1 →	Score 2 🔻	Frequen 🕶	-
422	chr6	10315975	10329941	chr20	38750056	38752056	NA	MAFB,ENSG00000204103	Islet	4C	1.00E-10	1.00E-10	NA	24413736
423	chr6	157503620	157517838	chr15	60243703	60245703	NA	CDC24A	Islet	4C	1.00E-10	1.00E-10	NA	24413736
424	chr6	161565011	161582986	chr15	60243703	60245703	AGPAT4,ENSG00000026652	CDC24A	Islet	4C	1.00E-10	1.00E-10	NA	24413736
425	chr6	72459549	72460254	chr15	60243703	60245703	NA	CDC24A	Islet	4C	1.00E-10	1.00E-10	NA	24413736
426	chr6	86476726	86488417	chr15	60243703	60245703	NA	CDC24A	Islet	4C	1.00E-10	1.00E-10	NA	24413736
427	chr6	87749120	87765233	chr15	60243703	60245703	NA	CDC24A	Islet	4C	1.00E-10	1.00E-10	NA	24413736
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110072	chr6	140366524	140369650	chr8	87119559	87124371	NA	NA	MCF7	ChIA-PET	7.97E-03	7.97E-03	2	19890323
110217	chr6	144461139	144464271	chr7	25996058	25997037	NA	NA	MCF7	ChIA-PET	9.84E-03	9.84E-03	2	19890323
110218	chr6	144461139	144464271	chr7	71651988	71653553	NA	NA	MCF7	ChIA-PET	1.69E-03	1.69E-03	2	19890323
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111610	chr6	170636828	170642065	chr9	116356261	116362118	NA	RGS3,ENSG00000138835	MCF7	ChIA-PET	1.48E-02	1.48E-02	2	19890323
113870	chr6	33971691	33975907	chrX	81952949	81955903	NA	NA	MCF7	ChIA-PET	2.85E-01	2.85E-01	2	19890323
114100	chr6	35281954	35285440	chrX	125368031	125372077	DEF6,ENSG00000023892	NA	MCF7	ChIA-PET	5.20E-03	5.20E-03	2	19890323
114653	chr6	40571645	40576759	chr8	110919605	110924033	NA	NA	MCF7	ChIA-PET	1.42E-02	1.42E-02	2	19890323
115297	chr6	44075370	44079223	chr8	113967345	113970934	NA	NA	MCF7	ChIA-PET	9.94E-03	9.94E-03	2	19890323
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115931	chr6	67912721	67914213	chr7	2577564	2579485	NA	NA	MCF7	ChIA-PET	5.75E-03	5.75E-03	2	19890323
115999	chr6	69744408	69747906	chr8	93602364	93609113	NA	NA	MCF7	ChIA-PET	9.94E-03	9.94E-03	2	19890323
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116652	chr6	92449274	92451582	chr8	143446104	143450546	NA	NA	MCF7	ChIA-PET	9.94E-03	9.94E-03	2	19890323

Nature. 2009 Nov 5;462(7269):58-64. doi: 10.1038/nature08497.

#### An oestrogen-receptor-alpha-bound human chromatin interactome.

Fullwood M.J., Liu M.H., Pan Y.F., Liu J. Xu, H., Mohamed Y.B., Orlov Y.L., Velkov S., Ho, A., Mei P.H., Chew, E.G., Huang P.Y., Welboren W.J., Han Y., Ooi H.S., Ariyaratne P.N., Vega V.B., Luo Y., Tan P.Y., Chov, P.Y., Wansa K.D., Zhao B., Lim K.S., Leow, S.C., Yow, J.S., Joseph R., Li, H., Desai K.Y., Thomsen J.S., Lee Y.K., Karuturi R.K., Herve T., Bourque G., Stunnenberg H.G., Ruan X., Cacheux-Rataboul V.S., Sung W.K., Liu E.T., Wei C.L., Cheung E., Ruan Y.

#### Author information

#### Abstract

Genomes are organized into high-level three-dimensional structures, and DNA elements separated by long genomic distances can in principle interact functionally. Many transcription factors bind to regulatory DNA elements distant from gene promoters. Although distal binding sites have been shown to regulate transcription by long-range chromatin interactions at a few loci, chromatin interactions and their impact on transcription regulation have not been investigated in a genome-wide manner. Here we describe the development of a new strategy, chromatin interaction analysis by paired-end tag sequencing (ChIA-PET) for the de novo detection of global chromatin interactions, with which we have comprehensively mapped the chromatin interaction network bound by oestrogen receptor alpha (ER-alpha) in the human genome. We found that most high-confidence remote ER-alpha-binding sites are anchored at gene promoters through long-range chromatin interactions, suggesting that ER-alpha functions by extensive chromatin looping to bring genes together for coordinated transcriptional regulation. We propose that chromatin interactions constitute a primary mechanism for regulating transcription in mammalian genomes.



## **Key Points**

- Genetic variation affects chromatin states and gene expression regulation much more than protein structure and function
- DNAse I hypersensitivity regions are enriched for GWAS hits
- There are many ways an eQTL correlates with gene expression levels, including effects on chromatin states, transcription factor / miRNA binding site alteration, RNA splicing and DNA methylation.
- The effects are generally cell type-specific
- Most of these correlations are already catalogued in open access databases.



# ... Looking forward

### Day 1

Genome Biology in 2017

**Bioinformatics Tools in Epigenetics** 

**Pathogenicity Assessment of DNA Sequence Mutations** 

Introduction to Galaxy

**Massive Data Sources** 

**Practical** 











