



Using ENCODE Data To Interpret Disease-associated Genetic Variation

Mike Pazin

National Human Genome Research Institute, NIH
ENCODE Users Meeting
June 8, 2016





Welcome





- Objectives
 - We want to tell the community about the ENCODE resource
 - We want to hear community experiences and suggestions



Elise Feingold

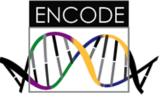


Dan Gilchrist



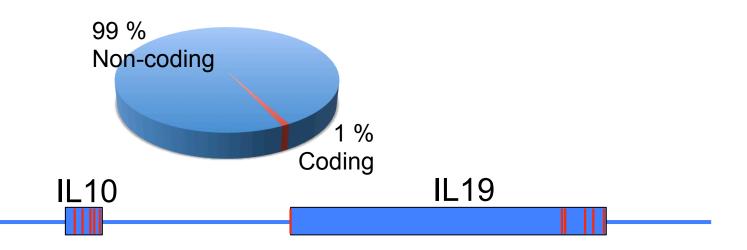
Overview

- The ENCODE Resource
- Use of ENCODE to illuminate the role of genetic variation in human disease
- Accessing ENCODE materials



Reading The Human Genome Is Difficult

- Genetic code very powerful for 1% of the human genome
- No correspondingly powerful regulatory code
- Sequence conservation can identify some candidate functional elements (but not when or where they act)
- Regulatory regions aren't always in the same order as gene targets
- Need unbiased experimental investigation





Non-coding DNA Is Important For Disease And Gene Regulation

- Vast majority of common disease associations and heritability lie outside of protein-coding regions
- Non-coding DNA variants are known to cause human diseases and alter human traits (FXS, ALS)

Functional information is needed to interpret the role of genetic variation in human disease, and to apply genomics in the clinic.

PMID: 22955828, PMID: 25439723, PMID: 23128226

PMID: 17477822, PMID: 25679767

5









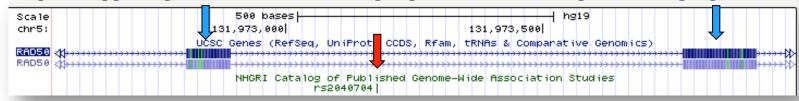
1,500 Letters Of Our 3 Billion Letter Genome

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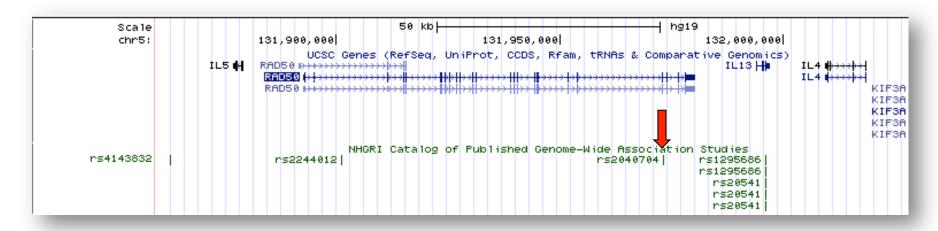
Maps And Annotation Help Us To Understand The Sequence

agccaagcagcaaagttttgctgctgtttatttttgtagctcttactatattctacttttaccattgaaaatattgaggaagttatt tatatttctatttttatatattatattttatgtattttaatattactattaccacataattatttttatatatatgaagtaccaatgacttccttttccagagcaataatgaaatttcacagtatgaaaatggaagaaatcaataaaattatacgtgacctgtggcgaa gtacctatcgtggacaaggtgagtaccatggtgtatcacaaatgctctttccaaagccctctccgcagctcttcccttatga cctctcatcatgccagcattacctccctggacccctttctaagcatgtctttgagattttctaagaattcttatcttggcaacatc ttgtagcaagaaatgtaaagttttctgttccagagcctaacaggacttacatatttgactgcagtaggcattatatttagctg atgacataataggttctgtcatagtgtagatagggataagccaaaatgcaataagaaaaaccatccagaggaaactctttt ttttttttttttttttttttttcagatggagtctcgcacttctctgtcacccgggctggagcgcagtggtgcaatcttggctca ctgcaacctccacctcctgggttcaggtgattctcccacctcagcctcccgagtagtagctggaattacaggtgcgcgctccc acacctggctaattttttgtattcttagtagagatggggtttcaccatgttggccaggctggtctcaaactcctgccctcaggtg atctgcccaccttggcctcccagtgttgggtttacaggcgtgagccaccgcgcctggcctggaggaaactcttaacagggaa actaagaaagagttgaggctgaggaactggggcatctgggttgcttctggccagaccaccaggctcttgaatcctcccagc cagagaaagagtttccacaccagccattgttttcctctggtaatgtcagcctcatctgttgttcctaggcttacttgatatgtttg ctgatgccgatgaaaatgtatcagcttctgataaaaggcggaattataactaccgagtggtgatgctgaagggagacacag ccttggatatgcgaggacgatgcagtgctggacaaaaggcaggtatctcaaaaagcctggggagccaactcacccaagtaa ctgaaagagagaaacaaacatcagtgcagtggaagcacccaaggctacacctgaatggtgggaagctctttgctgctata taaaatgaatcaggctcagctactattattacactctcctgaagctaaccaacatttcctgcaacattatgtagactt

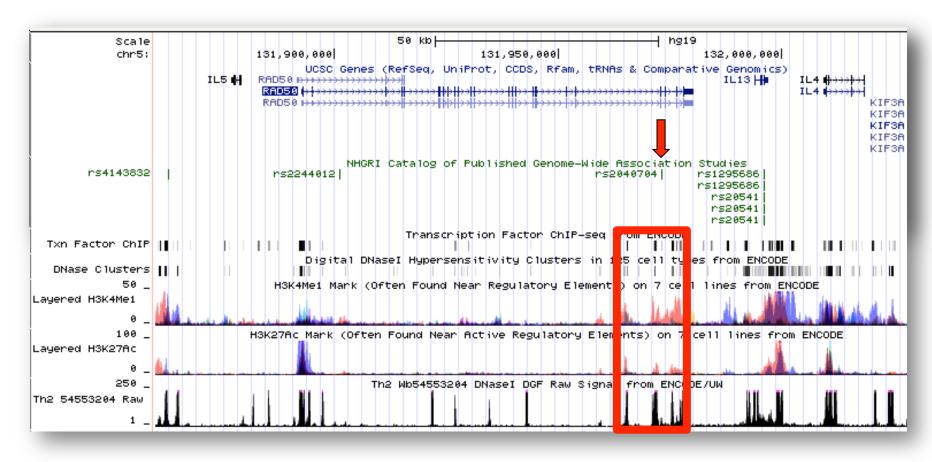




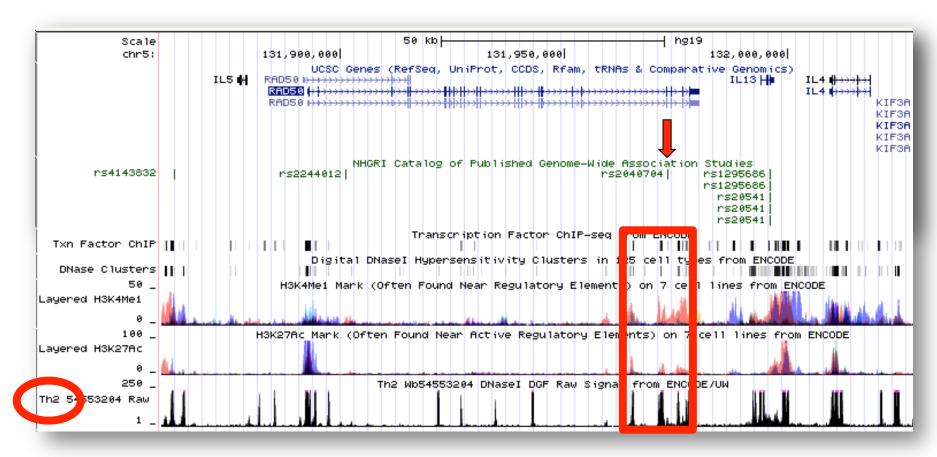
Using ENCODE



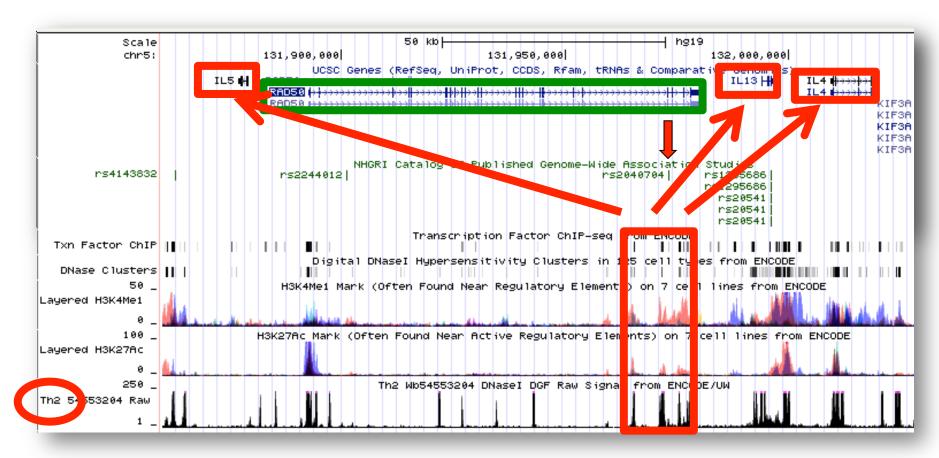


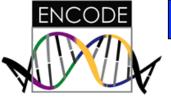












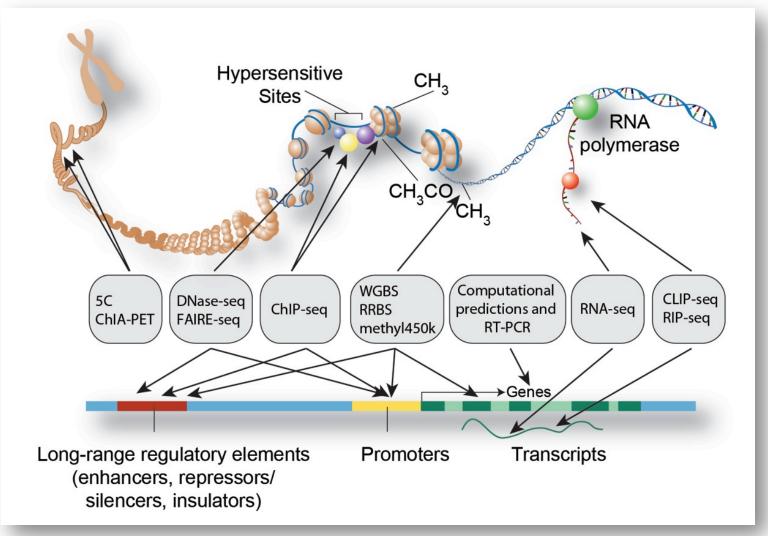
ENCODE:

Encyclopedia Of DNA Elements

- Identify all candidate functional elements in the genome
- Make resource freely available to community
 - genetic basis of disease
 - gene regulation

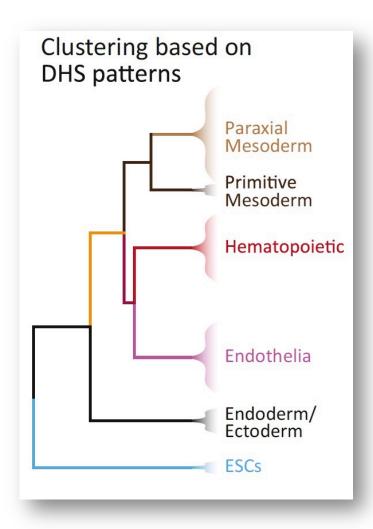


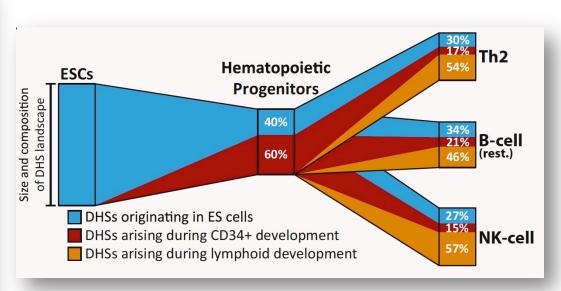
ENCODE Data Types

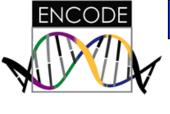




ENCODE Data Are Cell-Type Specific







ENCODE Accomplishments

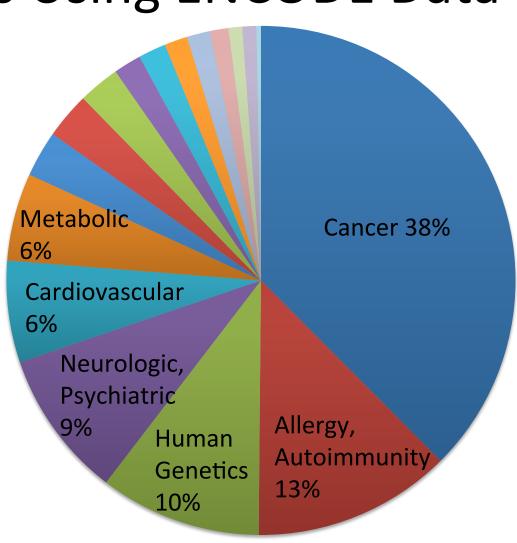
- Sharing 1000s of datasets
 - No embargo
 - Unrestricted access
 - High quality
 - Uniformly processed
- Sharing software
- Data interoperability

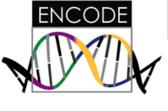
Publications Using ENCODE Data

Hundreds of Consortium publications

~1500 community publications using **ENCODE** data:

> ~675 Human Disease ~600 Basic Biology ~225 Methods/Software Development





Summary- ENCODE Resource

- Freely shared catalog of genomic data and candidate genomic functional elements
- ENCODE is built upon established techniques and interpretations developed for the study of gene regulation
- ENCODE maps can be used to make predictions about genome function



Overview

Using ENCODE

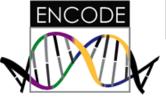
- The ENCODE Resource
- Use of ENCODE to illuminate the role of genetic variation in human disease
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Standard ENCODE Use Cases: Hypothesis Generation

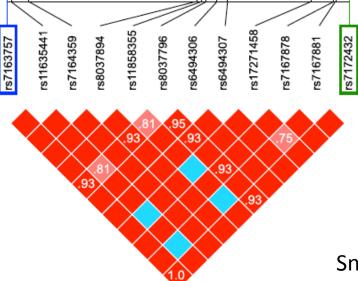
Major use: Hypothesis generation and refinement

- Prediction of causal variants/regulatory elements
- Prediction of target genes
- Prediction of target cell types
- Prediction of upstream regulators



Prediction of Causal Variants

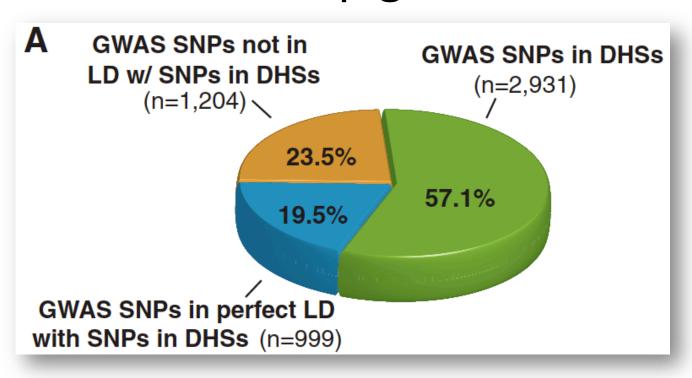
- Multiple variants may be in linkage disequilibrium
- The causal variant may not have been tested during data collection
- Multiple variants may be causal

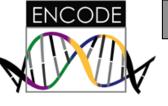




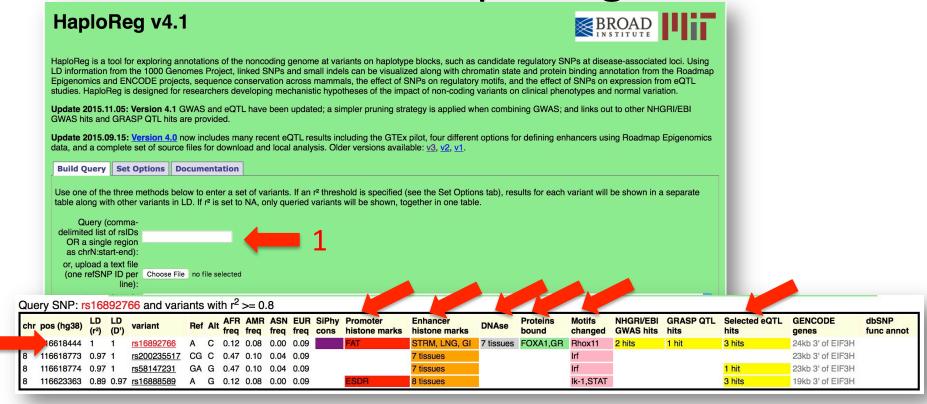
Many GWAS Associations Lie In Regions Annotated By ENCODE And CF Epigenomics Data

Using ENCODE





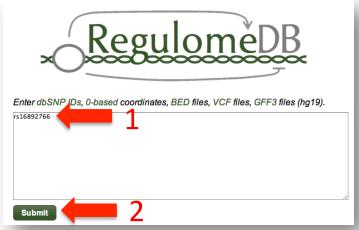
ENCODE/Epigenomics Data From HaploReg

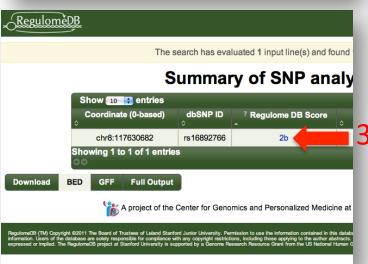


www.broadinstitute.org/mammals/haploreg/



ENCODE Data From RegulomeDB





Protein Binding Filter:							
Method	Location	Bound Protein	? Cell Type	Additional Info	Reference		
ChIP-seq	chr8:117630539117630739	FOXA1	ECC-1	DMSO_0.02pct	ENCODE		
ChIP-seq	chr8:117630626117630842	NR3C1	ECC-1	DEX_100nM	ENCODE		

	Filter:			
Method	Location	? Cell Type	Additional Info	Reference
DNase-seq	chr8:117630480117630690	Rptec		ENCODE
DNase-seq	chr8:117630480117630730	Nhlf		ENCODE
DNase-seq	chr8:117630500117630710	Nha		ENCODE
DNase-seq	chr8:117630500117630770	Hah		ENCODE
DNase-seq	chr8:117630510117630704	Aosmo	Serum	ENCODE
DNase-seq	chr8:117630520117630790	Hvmf		ENCODE
DNase-seq	chr8:117630625117631002	Htr8		ENCODE
FAIRE	chr8:117630519117630761	Medullo		ENCODE

		Filte	Filter:		
Method	Location	Histone Mark	? Cell Type	Additional Info	Reference
ChIP-seq	chr8:110578383117647033	H3k09me3	Dnd41		ENCODE
ChIP-seq	chr8:116009496120997897	H2az	Hepg2		ENCODE
ChIP-seq	chr8:117409399118413945	H4k20me1	Hmec		ENCODE
ChIP-seq	chr8:117555446118475451	H4k20me1	Nhif		ENCODE
ChIP-sea	chr8:117384499 117650386	H2az	Dnd41		ENCODE

http://regulomedb.org/



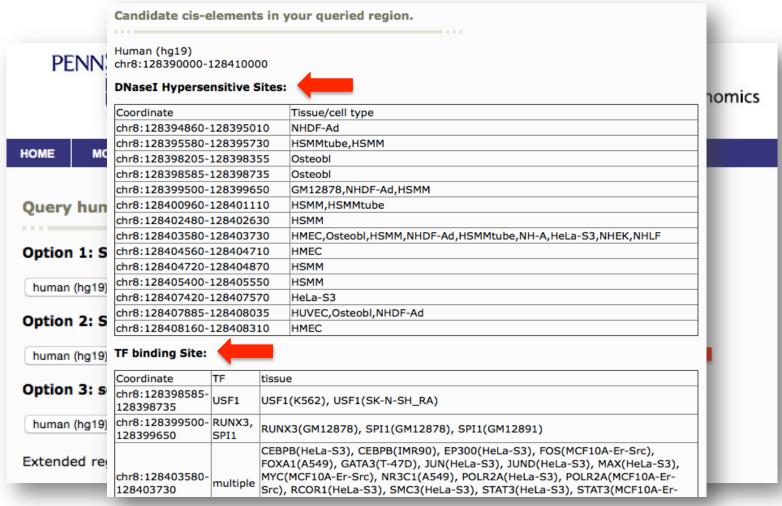
ENCODE cis-element Browser

PENNSTATE			Welcome to YUE Lab Computational and Functional Genomics/Epigenomics				
HOME	MOUSE	HUMAN	DOWNLOAD	LINKS	CONTACT		
Option	Query human ENCODE data! Option 1: Search gene expression across ~ 60 human cell types (total 108 datasets) human (hg19) Gene name(Sox2, Nanog) Submit! Option 2: Search cis-elements in a given genomic region						
humar	human (hg19) ♦ chr8 ♦ start: 128390000 end: 128410000 submit!						
Option 3: search cis-elements surrounding a gene							
humar	human (hg19) Gene name(Sox2, Nanog)						
Extended region (default +/- 100kb) kb submit!							

Workshop Session 3



ENCODE cis-element Browser

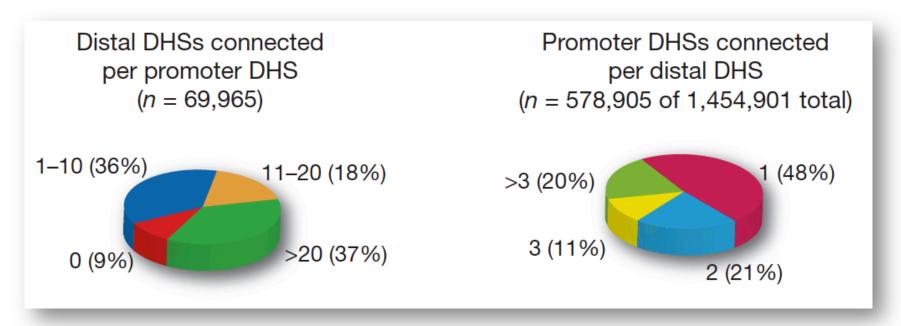


Workshop Session 3

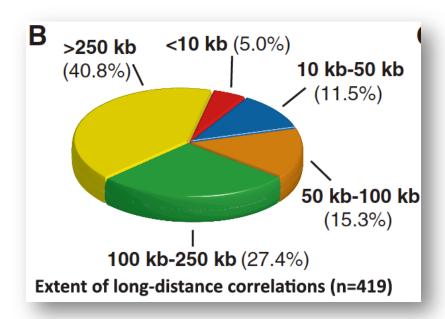


Prediction of Target Genes

- Regulatory regions can operate on multiple, distal genes
- The target gene could be a non-coding RNA

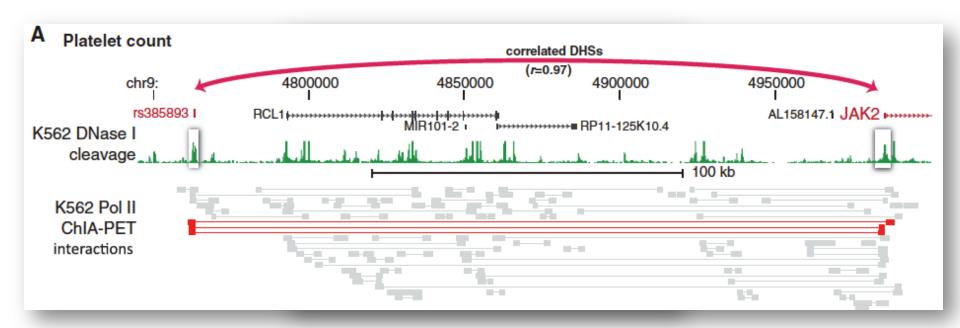


Many GWAS Associations Are Predicted To Be Linked To Distal Genes



ENCODE

Many GWAS Associations Are Predicted To Be Linked To Distal Genes



ENCODE



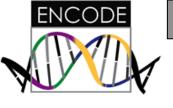
Prediction of Linkage Between Regulatory Elements and Genes

Regulatory Elements Database

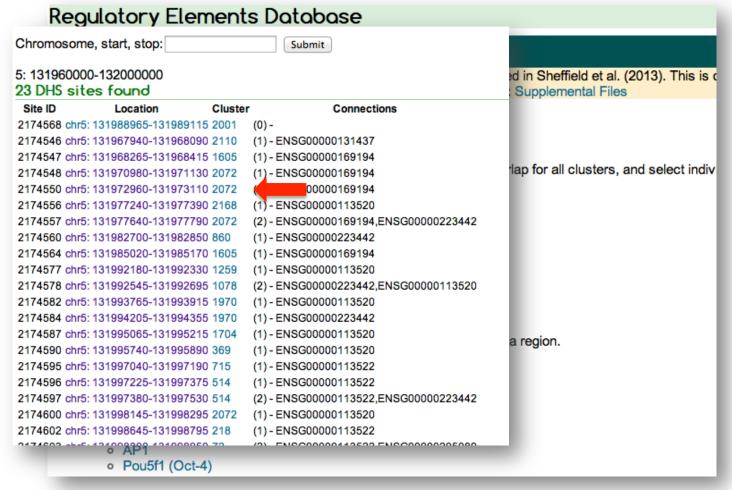
This database provides a user interface to the results of the analysis presented in Sheffield et al. (2013). This is signal in 112 human samples. Questions? contact Nathan Sheffield. See also: Supplemental Files

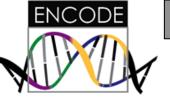
There are 5 ways to explore the data:

- By CELLTYPE Select cell-types to include or exclude.
- By CLUSTER View promoter, CpG-island, and conserved element overlap for all clusters, and select indiv
 - Muscle-specific cluster: cluster 1520
 - Prostate and hepatocyte cluster: cluster 910
 - Prostate-only cluster: cluster 2483
 - Hematopoeitic cluster: cluster 25
 - Pluripotency cluster: cluster 104
- . By GENE Search by gene of interest
 - - MyoG
 - RBFOX1
 - LIN28A
 - HBG1
- By COORDINATE: Give chr, start, stop to find all regulatory elements in a region.
 - IRF2 regulator: chr4: 185240845-185240995
 - MyoD1 regulator: chr11: 17828545-17828695
 - Blood regulator: chr3: 128166420-128166570
- By FACTOR: find a specific TF of interest
 - CTCF
 - Myf
 - AP1
 - Pou5f1 (Oct-4)

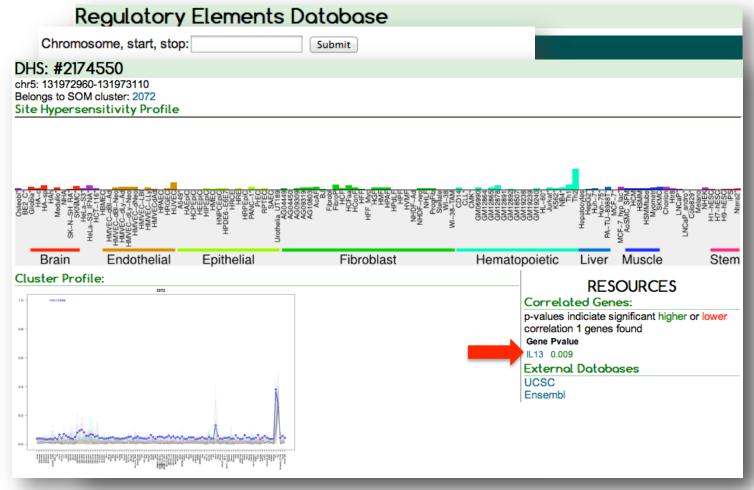


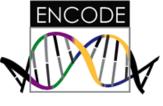
Prediction of Linkage Between Regulatory Elements and Genes





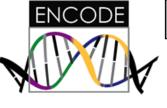
Prediction of Linkage Between Regulatory Elements and Genes



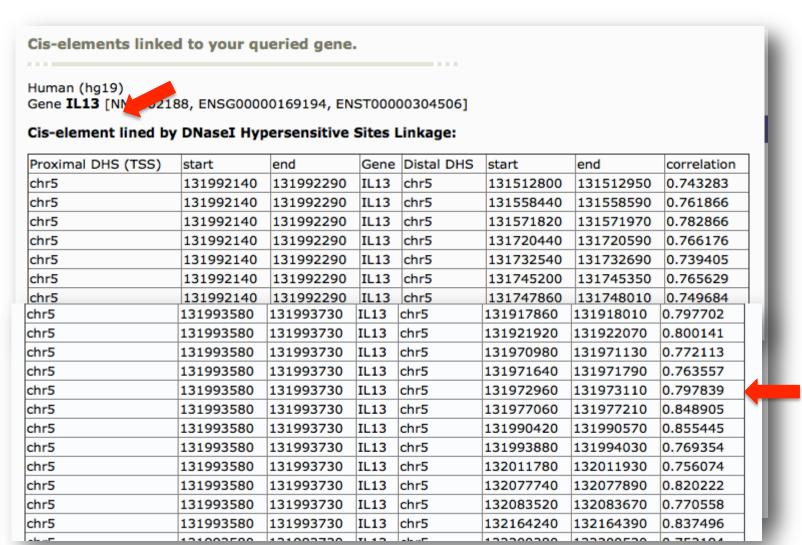


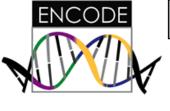
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Option 2: Search cis-elements in a given genomic region								
human	human (hg19) ♦ chr1 ♦ start: end: submit!							
Option 3: search cis-elements surrounding a gene								
human (hg19) © Gene name(Sox2, Nanog)								
Extended region (default +/- 100kb) kb submit!								
Option 4: search cis-elements LINKED to a gene based on DNaseI HSS specificity								
human (hg19) Gene name(Sox2, Nanog) IL13								



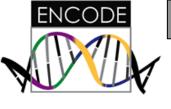
ENCODE cis-element Browser



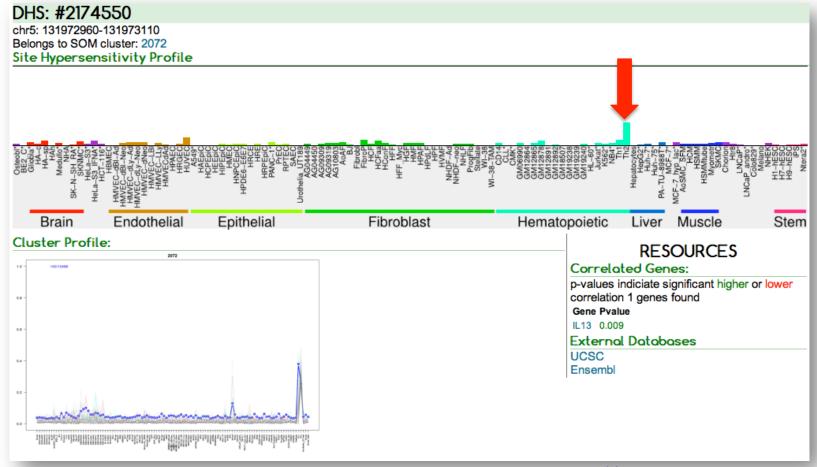


Prediction of Target Cell Types

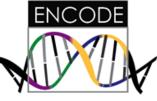
- Some diseases are known to affect multiple cell types
- The defect may not be intrinsic to the cell type with obvious pathology
- The disease etiology may not be completely known



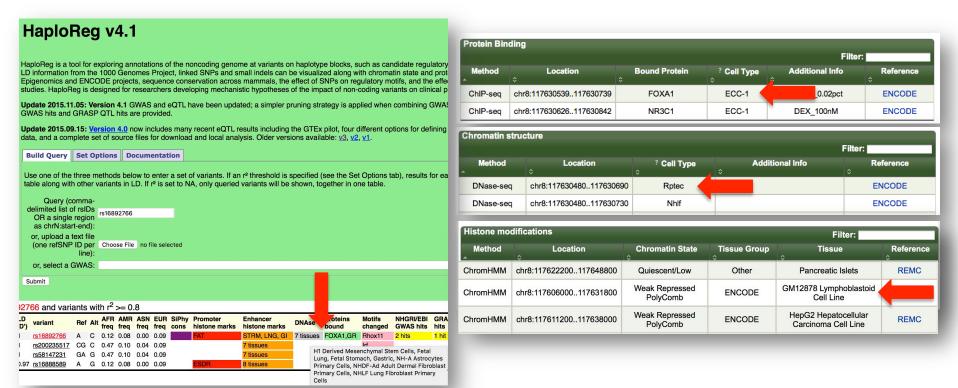
Prediction of Linkage Between Regulatory Elements and Cell Type



http://dnase.genome.duke.edu



Prediction of Linkage Between Regulatory Elements and Cell Type



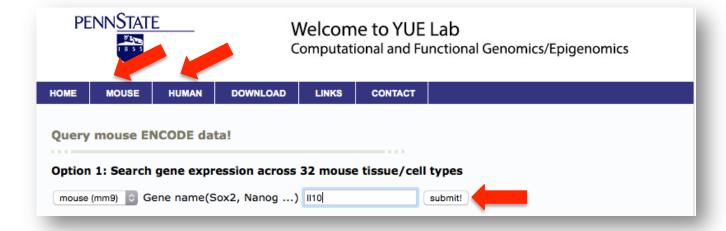
Workshop Session 3

www.broadinstitute.org/mammals/haploreg/

http://regulomedb.org/

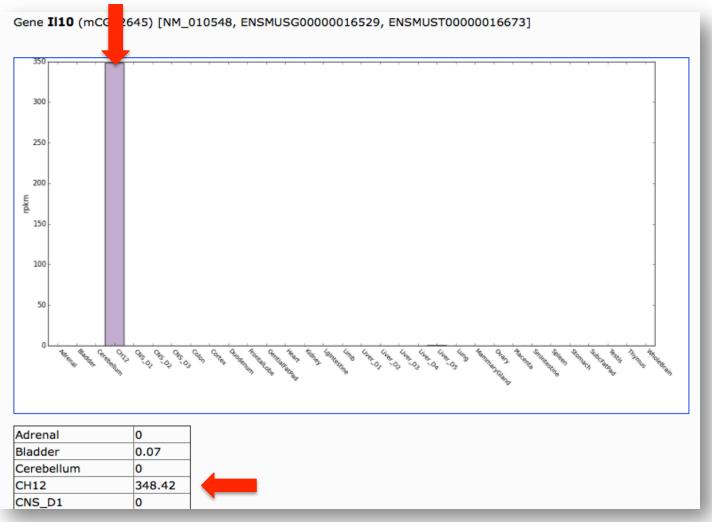


ENCODE cis-element Browser



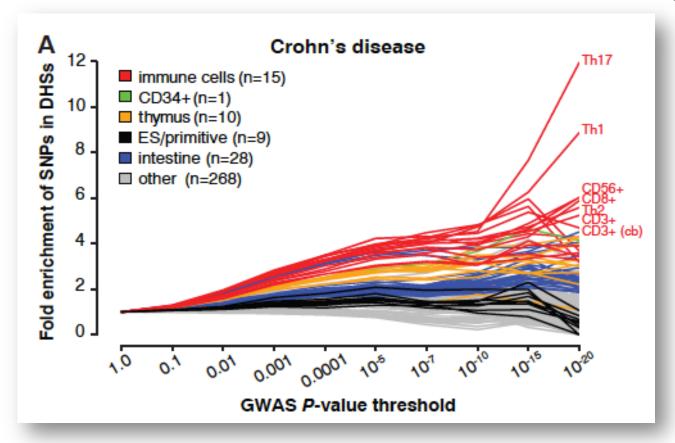


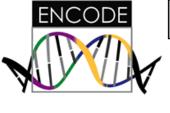
ENCODE cis-element Browser





ENCODE And Epigenomics Data Can Be Used To Predict Cell Types





Summary- ENCODE Use Cases

Major use: Hypothesis generation and refinement

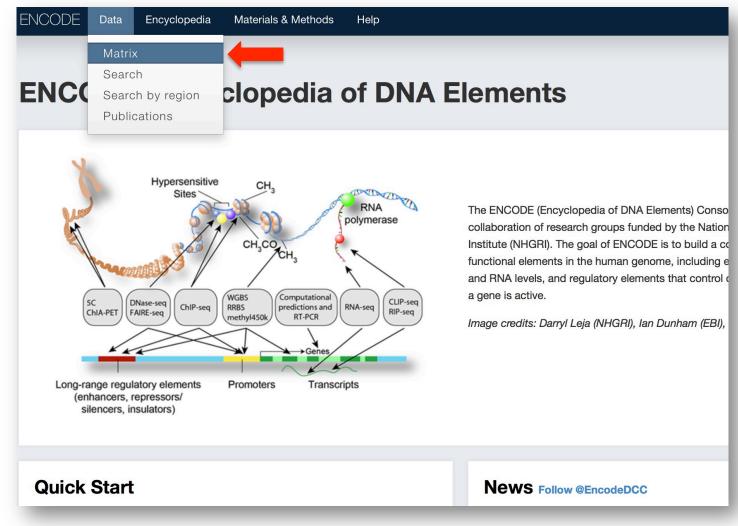
- Prediction of causal variants/regulatory elements
- Prediction of target genes
- Prediction of target cell types
- Prediction of upstream regulators
- > Genetic v. epigenetic
- ➤ Germline v. somatic



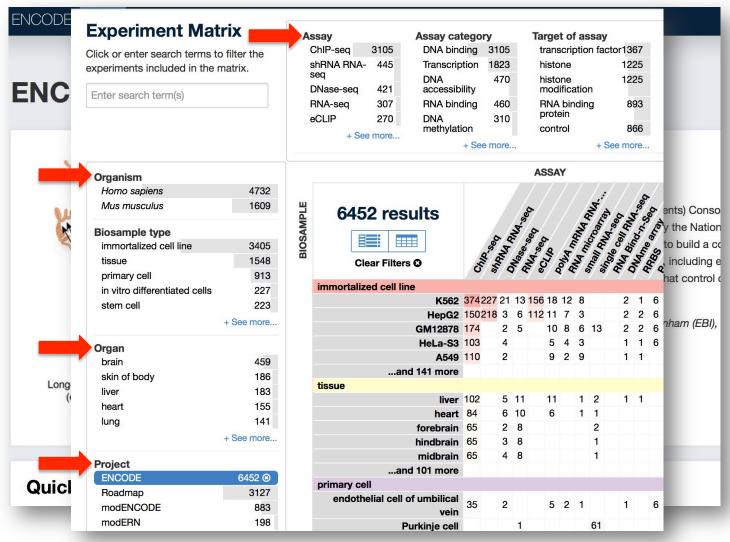
Overview

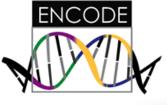
- The ENCODE Resource
- Use of ENCODE by the research community
- Accessing ENCODE materials











ENICODE

Data Use, Software, and Analysis Release Policies

The goal of the Encyclopedia of DNA Elements (ENCODE) Project is to build a comprehensive catalog of candidate functional elements in the genome. The catalog includes genes (protein-coding and non-protein coding), transcribed regions, and regulatory elements, as well as information about the tissues, cell types and conditions where they are found to be active. The current phase of ENCODE (2012-2016) greatly expands the number of cell types, data types and assays and includes the study of both the human and mouse genomes.

Like the Human Genome Project, the ENCODE Project seeks rapid data dissemination and use by the entire scientific community. Accordingly, to encourage the widest possible use of the datasets, all data produced will be available for unrestricted use immediately upon release to public databases, eliminating the nine-month moratorium previously used by ENCODE.

Data Use Policy for External Users



External data users may freely download, analyze and publish results based on any ENCODE data without restrictions as soon as they are released. This applies to all datasets, regardless of type or size, and includes no grace period for ENCODE data producers, either as individual members or as part of the Consortium. Researchers using unpublished ENCODE data are encouraged to contact the data producers to discuss possible coordinated publications; however, this is optional. The Consortium will continue to publish the results of its own analysis efforts in independent publications.

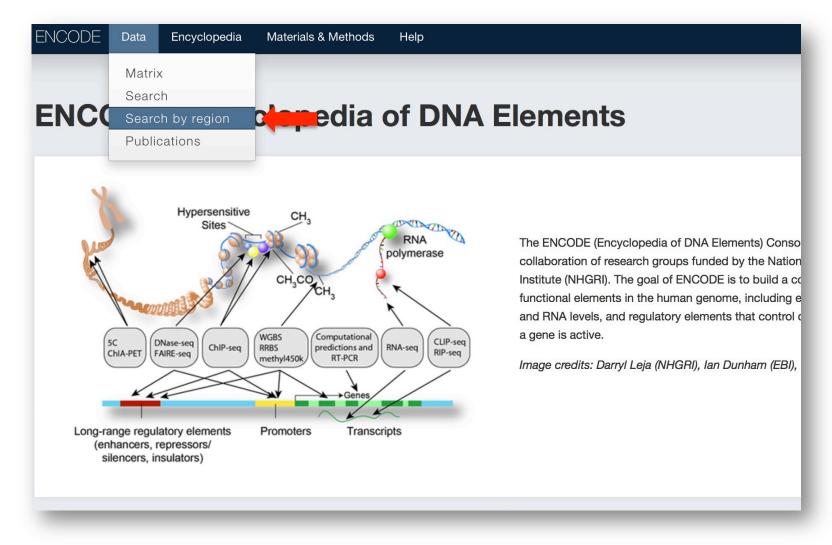
We request that researchers who use ENCODE datasets (published or unpublished) in publications and talks cite the ENCODE Consortium in all of the following ways:

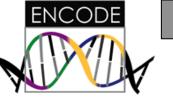


- Cite the Consortium's most recent integrative publication (PMID: 22955616; PMC: PMC3439153);
- Reference the ENCODE Data Coordination Center (DCC) or GEO accession numbers of the datasets (DCC accession: ENCSR037HRJ; GEO accession: GSE30567);
- 3. And acknowledge the ENCODE Consortium and the ENCODE production laboratory(s) generating the particular dataset(s)

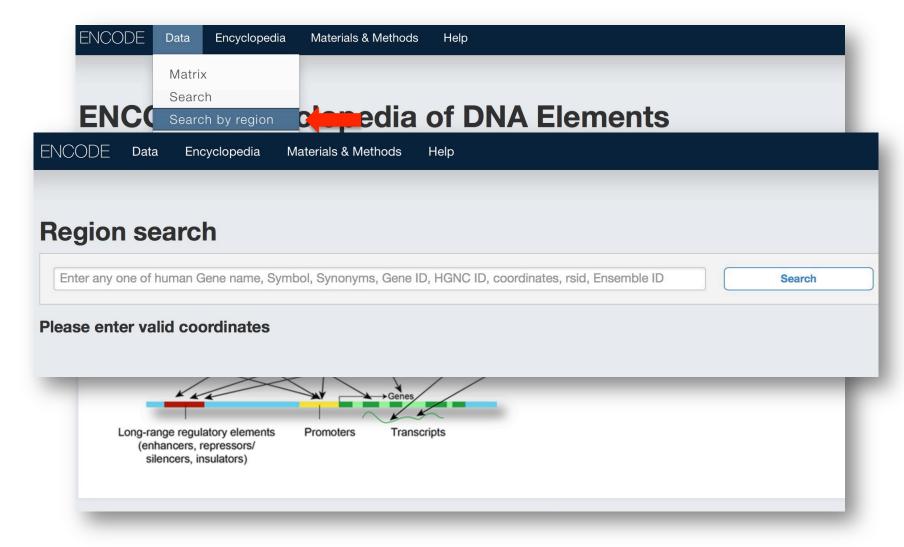
modERN 198 Purkinje cell 1 6

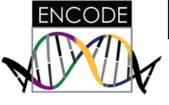


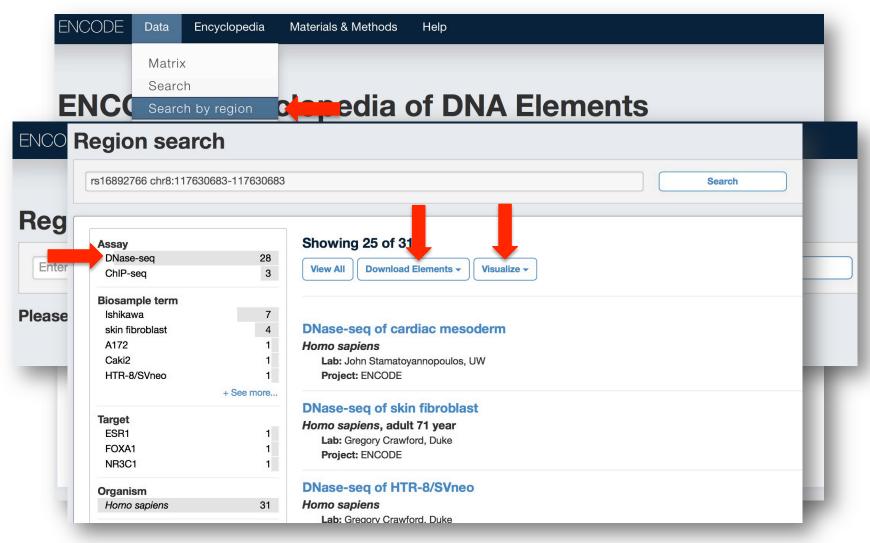




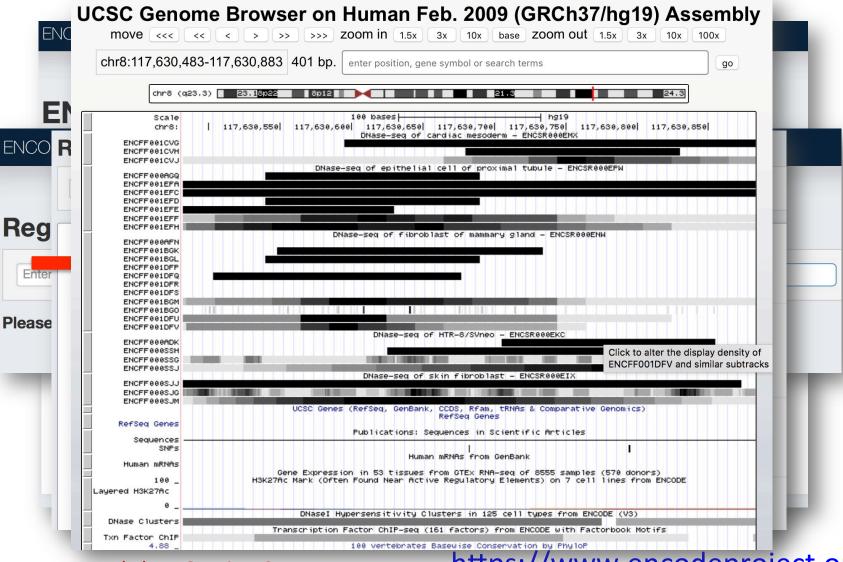
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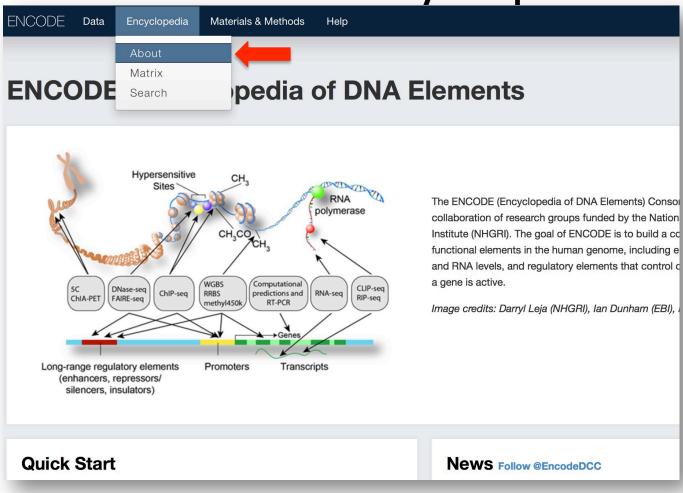


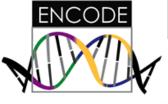


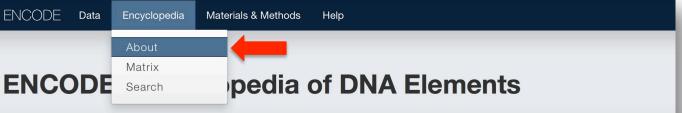










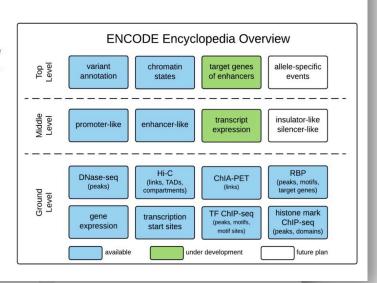


ENCODE Encyclopedia: Genomic annotations

Introduction

The ENCODE Consortium not only produces data, but also analyzes the data in an integrative fashion. The ENCODE Encyclopedia organizes the most salient analysis products into annotations, and provides tools to search and visualize them. The Encyclopedia has three levels of annotations:

- Ground level annotations are typically derived directly from the experimental data.
- Middle level annotations integrate multiple types of experimental data and multiple ground level annotations.
- Top level annotations integrate a broad range of experimental data and ground and middle level annotations.







Ground Level Annotations

EN

Gene expression (RNA-seq)

The expression levels of genes annotated by GENCODE 19 in over 100 human cell types and 70 mouse cell types.

[Long RNA-seq Data | Query C | Download C | Method]

Transcription factor binding (TF ChIP-seq)

Peaks (enriched genomic regions) of TFs computed from ~900 human and mouse ChIP-seq experiments. [Raw Data | Peaks]

Visualize sequence motifs and other information [Factorbook 7]

Histone mark enrichment (ChIP-seq)

Peaks of a variety of histone marks computed from ~600 ChIP-seq experiments.

[Raw Data | Peaks]

Open chromatin (DNase-seq)

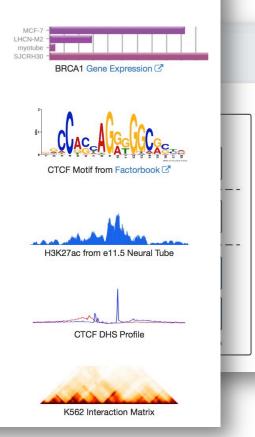
DNase I hypersensitive sites (also known as DNase-seq peaks) computed from ~300 human and mouse experiments.

[Raw Data | Peaks]

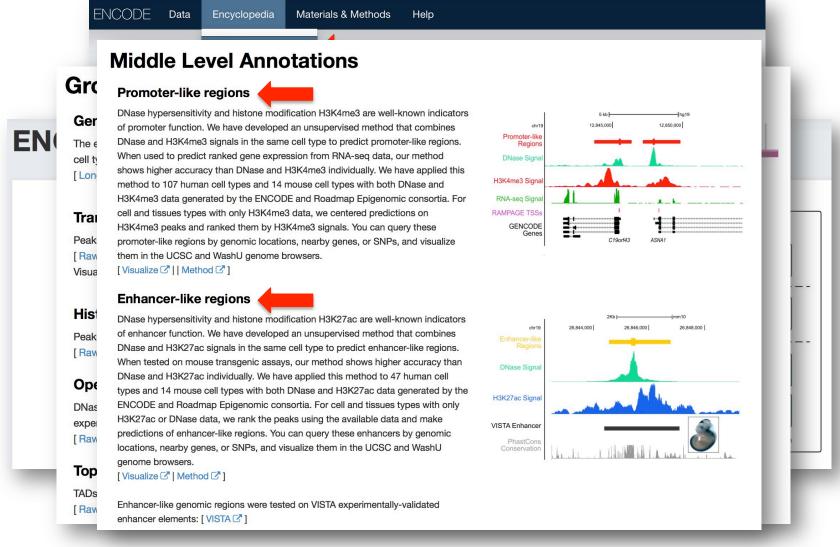
Topologically associating domains (TADs) and compartments (Hi-C)

TADs and A and B compartments computed from 12 human cell lines.

[Raw Data | Visualize 7]









ENCODE

Data Encyclopedia

Materials & Methods

Help

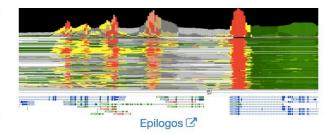
Top Level Annotations

Chromatin states



Semi-automated genomic annotation methods such as ChromHMM and Segway take as input a panel of epigenomic data (including histone mark ChIP-seq and DNase-seq) in a particular cell type and use machine learning methods to simultaneously partition the genome into segments and assign chromatin states to these segments; the states are assigned such that two segments with the same state exhibit similar epigenomic patterns. The procedure is "semi-automated" because states are then manually compared with known biological information in order to designate each state as an enhancer-like, promoter-like, gene body, etc.

[Search]

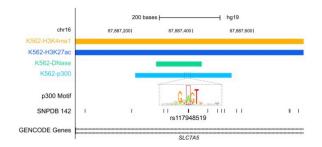


Variant Annotation

Over the past decade, Genome Wide Association Studies (GWAS) have provided insights into how genetic variations contribute to human diseases. However, over 80% of the variants reported by GWAS are in noncoding regions of the genome and the mechanism of how they contribute to disease onset is unknown. By integrating data from the ENCODE project and other public sources, RegulomeDB and HaploReg are two resources developed by ENCODE labs to aid the research community in annotating GWAS variants. FunSeq2 is another ENCODE resource for annotating both germline and somatic variants, particularly in the noncoding regions of cancer genomes.

[RegulomeDB 7 | HaploReg 7 | FunSeq2 7]





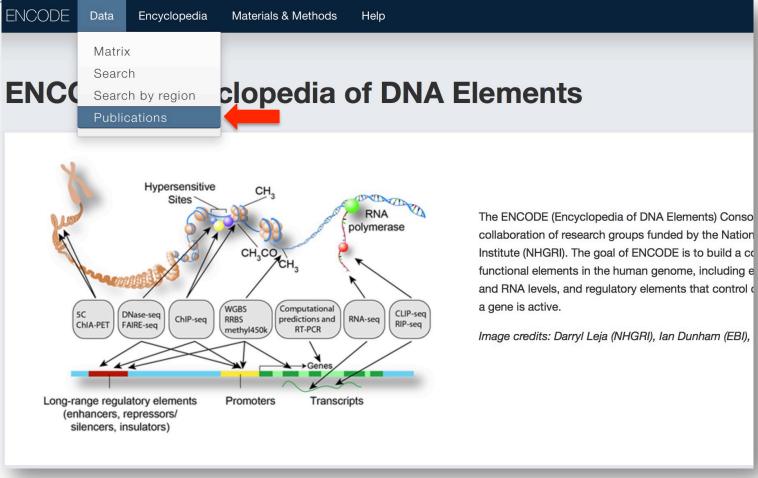
TADs [Raw

Enhancer-like genomic regions were tested on VISTA experimentally-validated enhancer elements: [VISTA 🗗]

https://www.encodeproject.org



Publications





Publications



Publications using ENCODE data

ENCODE-funded publications



These are publications by members of the ENCODE, mouse ENCODE, and modENCODE consortia.

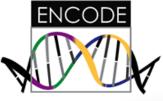
- · Key integrative publications by consortia members
- . Human ENCODE publications
- Mouse ENCODE publications
- · modENCODE publications
- Technology development publications
- · ENCODE pilot project publications

Community publications

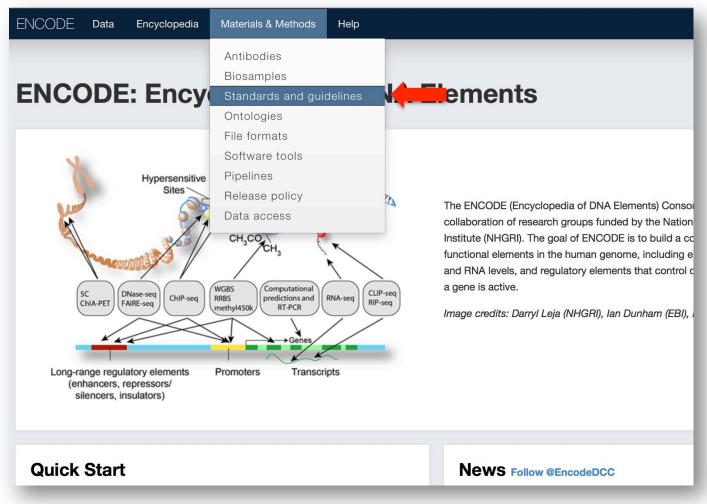


These are publications that use ENCODE, published by authors not funded by ENCODE, as well as papers that use modENCODE data, published by authors not funded by modENCODE. The ENCODE project tracks these papers to assess impact of the resource and to provide examples of how the resource can be used. Please contact Mike Pazin at NHGRI to suggest publications to add to these lists.

- · Human disease publications
- · Basic biology publications
- · Software tools
- modENCODE community publications

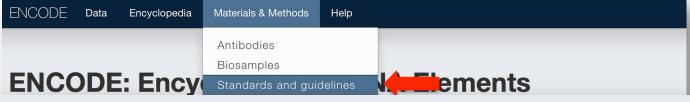


ENCODE Data Standards





ENCODE Data Standards



Data standards

Overview

The ENCODE consortium analyzes the quality of the data produced using a variety of metrics. This page describes the data standards and metrics that are used to evaluate the data and what they appear to measure. These quality metrics will be updated on occasion to include analysis of more recent data.

It is important to note that quality metrics for evaluating epigenomic assays is an area of research, so standards are emerging as more metrics are used with more datasets and types of experiments. The typical values for a quality metric can be quite different with different assays, or even comparing different features in the same assays, such as different antibodies used in ChIP-seq experiments. Currently there is no single measurement that identifies all high-quality or low-quality samples. As with quality control for other types of experiments, multiple assessments (including manual inspection of tracks) are useful because they may capture different concerns. Comparisons within an experimental method (e.g., comparing replicates to each other, or comparing values for one antibody in several cell types, or the same antibody and cell type in different labs) can help identify possible stochastic error.

Experimental guidelines

The ENCODE Consortium has adopted uniform guidelines for the most common ENCODE experiments. The guidelines have evolved over time as technologies have changed. The current guidelines are informed by results gathered during the project. Previous versions of the standards are also available for reference.

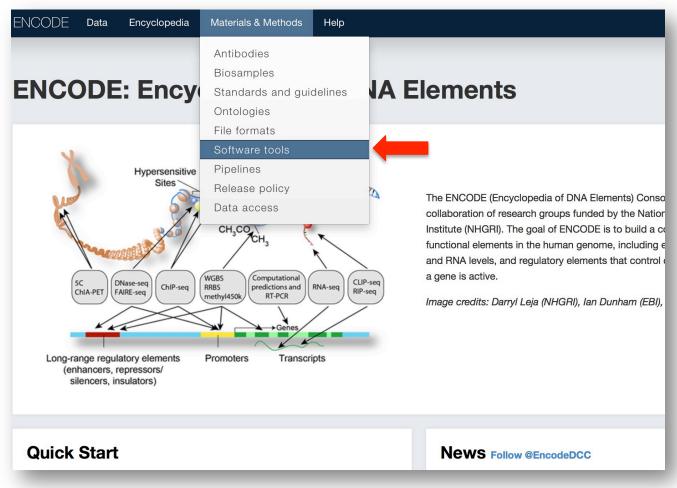
- · Current experiment guidelines
- Antibody characterizations guidelines
- · Terms and definitions

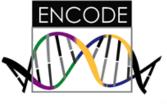
Quality metrics



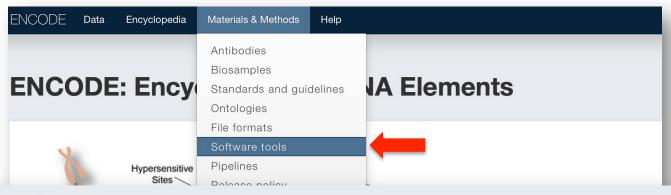
ENCODE Software Tools

Using ENCODE





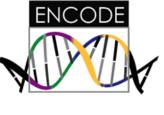
ENCODE Software Tools



Software Tools

The goal of the ENCODE project is to generate a comprehensive catalog of all functional elements. To facilitate this task, members of the consortium have developed and refined software tools. View all software used or developed by the ENCODE Consortium or select one of the following:

- Software tools used to identify ENCODE elements: On this page are brief descriptions of some of the software used to identify ENCODE
 elements. Software for identification of functional elements, for integrated analysis of multiple data types, and for quality measurement of
 the data are described.
- Software tools used to generate ENCODE quality metrics: On this page are brief descriptions of some of the software used to generate quality metrics for ENCODE datasets.
- External software tools used to create the ENCODE resource: On this page are brief descriptions of some of the software used to create the ENCODE resource. This software was not funded by ENCODE, or developed by the consortium.
- Software tools and resources for applying and analyzing ENCODE data: On this page are brief descriptions of software and resources that others might find useful for analyzing and using ENCODE data in their own research.



International Human Epigenome Consortium (IHEC)

- Data Portal: http://epigenomesportal.ca/ihec/
- Goal: Coordinate production of 1000 human epigenome maps for cellular states relevant to health and disease http://ihec-epigenomes.org
- Can view by consortium, by assay, by cell type
- Data from 8 consortia











ENCODE



Summary- Accessing ENCODE Resources

Using ENCODE

- ENCODE portal https://www.encodeproject.org
 - Display/download ENCODE and Roadmap Epigenomics data
 - Data Standards
 - Software tools
 - Publications
 - Encyclopedia prototype
- ENCODE Analysis Tools
 - RegulomeDB http://regulomedb.org/
 - HaploReg http://www.broadinstitute.org/mammals/haploreg/
 - Regulatory Elements Database http://dnase.genome.duke.edu
 - RegulomeDB GWAS Database http://www.regulomedb.org/GWAS/
- ENCODE Tutorials
 - http://www.genome.gov/27553900
 - https://www.encodeproject.org/tutorials/ http://www.ncbi.nlm.nih.gov/pubmed/25762420
- ENCODE mailing list :
 - https://mailman.stanford.edu/mailman/listinfo/encode-announce
- IHEC resources
 - IHEC Home Page http://ihec-epigenomes.org
 - IHEC Data Portal http://epigenomesportal.ca/ihec/



Goals Of ENCODE

- Catalog all functional elements in the genome
- Develop freely available resource for research community

ENCODE data are being used in the study of human disease and basic biology