

# The ChIP-Seq project

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Swiss Institute of  
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High Performance  
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# Overview

- ❑ Focus on technical aspects

  - Description of applications (C programs)*

  - Where to find binaries, data files and src packages*

  - Release on SourceForge*

  - The Web Interface*

- ❑ Large data sets have become available starting from the year 2007

  - Barski et al. (2007): human CD4+ cell lines*

    - Histone modifications, POL II, CTCF (~2 millions tags per experiment)

  - Mikkelsen et al. (2007): four mouse cell lines*

    - Histone modifications (~2 millions tags per experiment)

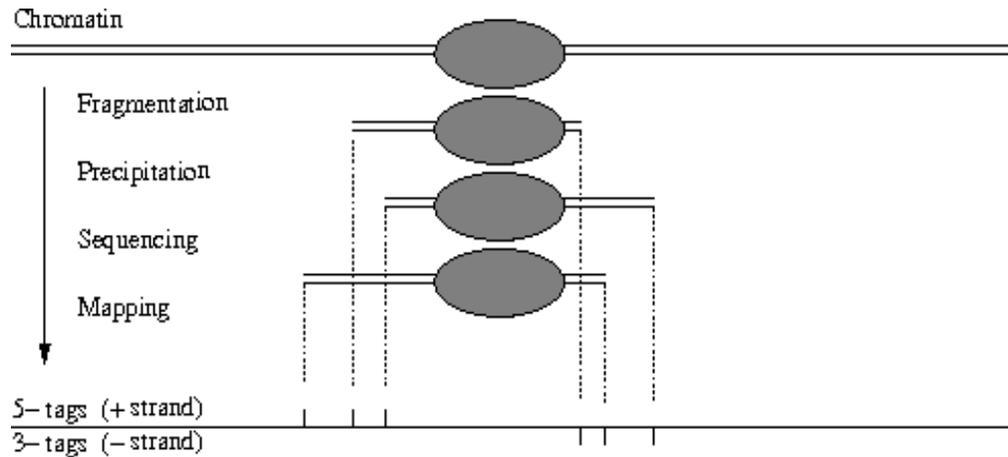
  - Robertson et al. (2007). INF-gamma stimulated HeLa cells*

    - STAT1 (>20 million tags per experiments)

- ❑ Very good data quality and reproducibility

- ❑ Choose to develop simple algorithms to achieve good results

# ChIP-Seq Technique and Data



Our representation: **SGA** (Simple Genome Annotation) format

NC_000001.9	stim	559139	-	1
NC_000001.9	stim	559333	+	1
NC_000001.9	stim	559356	-	1
NC_000001.9	stim	559765	-	1
NC_000001.9	stim	559766	+	3
NC_000001.9	stim	559767	+	1
NC_000001.9	stim	559768	+	1
NC_000001.9	stim	559777	+	3
NC_000001.9	stim	559778	+	2
...				

Fields of **SGA** format

1. Sequence ID
2. Feature
3. Position
4. Strand
5. Counts
6. Description

ChIP-Seq programs require SGA files **to be sorted** by chromosome name and position!

`setenv LANG C; sort -s -k1,1 -k3,3 -k4,4`

# ChIP-seq data analysis: Biological questions

## ❑ ChIP-seq data for specific transcription factors

- *Average length of an immuno-precipitated fragment (protected DNA regions)*
- *The location of in vivo occupied sites*
- *The strength of in vivo occupied sites*
- *The in vivo binding specificity (consensus sequence, matrix)*
- *Contextual features of in vivo occupied binding sites*

## ❑ ChIP-seq data for histone variants

- *Which regions of the genome are enriched in a particular variants*
- *Nucleosome phasing, position of individual nucleosomes*
- *Epigenetic genome organization – definition of chromatin domains*

## ❑ Combined analysis

- *Position of TF binding sites relative to nucleosomes*

# ChipSeq Tools: Design principles and available tools

## ❑ Design principles

- *Simple tools (easy to understand to non-specialists)*
- *Fast algorithms*
- *Generic methods if possible (not restricted to ChIP-seq data)*
- *C-programs for basic programming tools*
- *Auxiliary Perl tools to perform format conversion tasks and other useful tasks such as repeat masking and SGA fetching*

## ❑ Web interface (<http://ccg.vital-it.ch/chipseq>)

- *Access and analysis of selected public data*
- *Upload and analysis of private (user-owned) data*
- *Combined analysis of private and public data*
- *Interoperability with sequence analysis program (e.g. motif discovery)*
- *Link to genome browser (preparation of customized WIG and BED files)*

ccg.vital-it.ch/chipseq



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ChIP-Seq



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Computational Cancer Genomics | ExPASy | EPFL



## ChIP-Seq Analysis Server

The ChIP-Seq Server aims at providing tools for the analysis of ChIP-seq data and other types of MGA (mass genome annotation data).  
The programs offered by this web server are listed below.

### Access to ChIP-Seq tools

[ChIP-cor](#)

Feature Correlation Tool

[ChIP-center](#)

Tag Centering Tool

[ChIP-peak](#)

Signal Peaks Detection Tool

[ChIP-part](#)

Partitioning Tool

[WIG Files](#)

WIG Files for public chIP-seq data

# ChIP-Cor Application

## □ Input

- *Genomic tag count distributions for two features (reference, target)*
- *Features may be + and – strand tags from same experiments*
- *Applicable to other types of features, e.g. TSS positions*
- *Relative correlation distance, histogram step size and normalization*

## □ Output

- *A count correlation histogram (text file indicating the frequency of the target feature as a function of the relative distance to the reference feature)*

## □ Method

- *Consider reference positions which have at least one tag count.*
- *For each position, computes number of tag pairs that fall into a distance range.*
- *Different normalization options:*
  - *count density of target feature*
  - *global → relative target feature frequency (over-representation)*

## □ Purpose

- *Identification of average fragment size*
- *Reveals length distribution of enriched domains*
- *Provides clues for choosing parameters for peak and partitioning algorithms*
- *Positional relationship to other genomic features, e.g. transcription start sites*

## ❖ Output options on the Web

- *Histogram graph, feature extraction option*

# Correlation plot: Example

## Input data:

Ref: CTCF 5' tags

Target: CTCF 3' tags

## Analysis parameters:

Range: -400,+400

Window width: 5

Count cut-off: 3

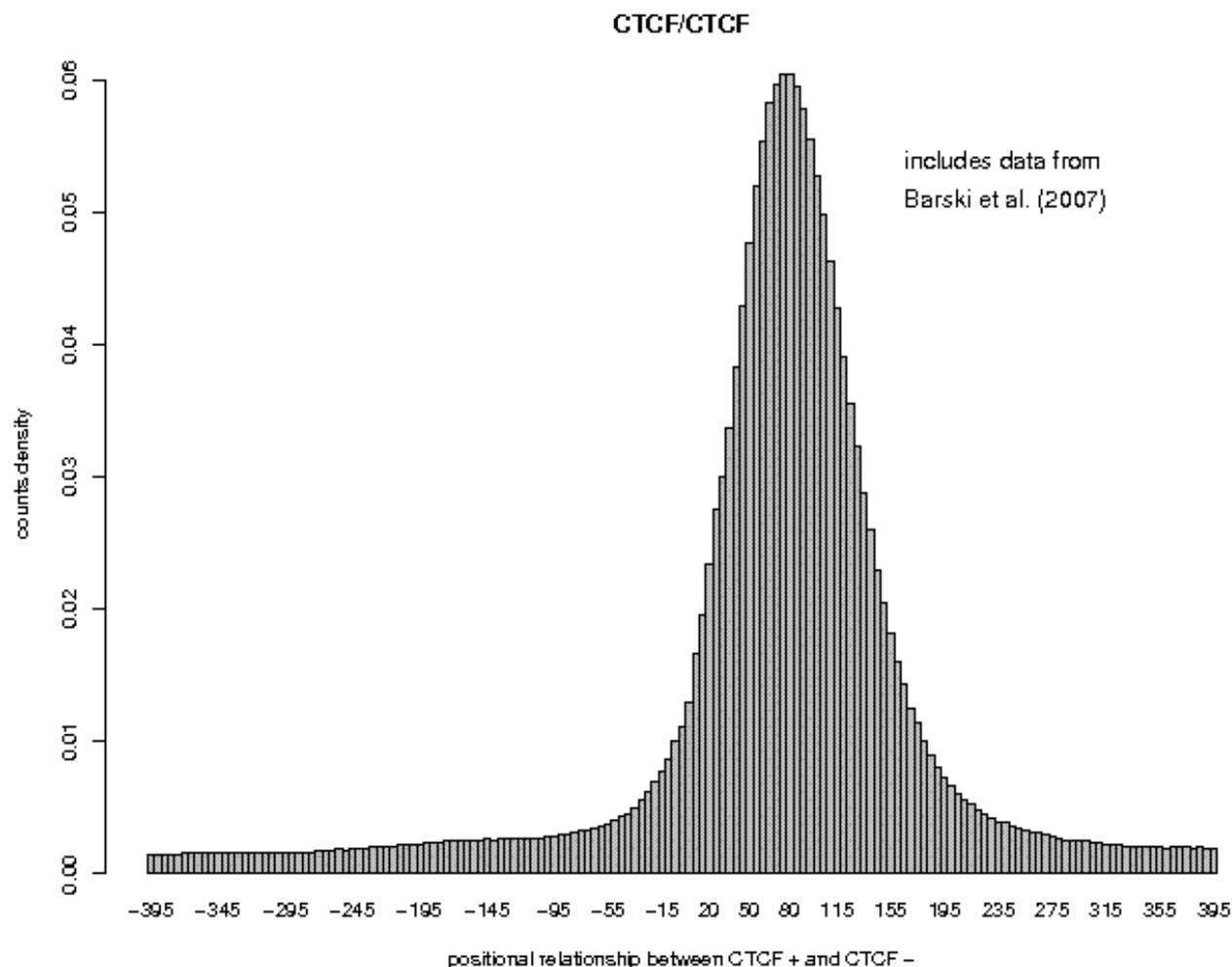
Y-axis: count-density

## ➤ Observations

➤ Peak center: ~75

➤ Peak count density: 0.06

➤ Background: < 0.002



# Correlation plot: input Data

**ChIP-Seq Input Data (Reference Feature)**

**Server-resident SGA Files**

Species :

Experiment :

Feature :

Chromosome :

**Server-resident SGA Files (By Filename)**

Experiment :

Feature

**Upload File**  SGA  GFF  FPS

Sort Input : off  on

Experiment :

Feature

**Genomes**

**Additional Input Data Options**

Strand option : +  -  any  oriented

Centering option :

**Repeat Masker**



# Auto-correlation plots for different histone modifications

## Top:

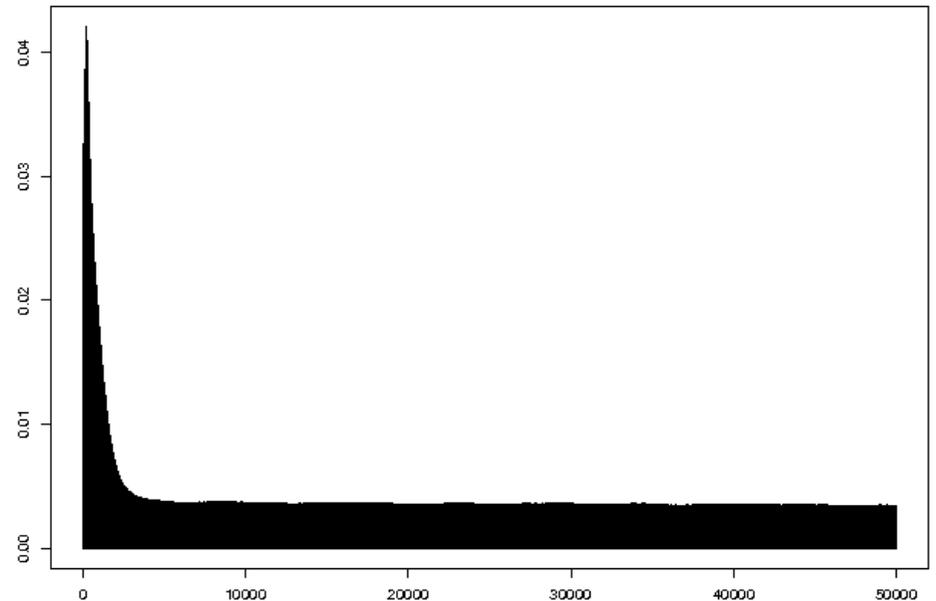
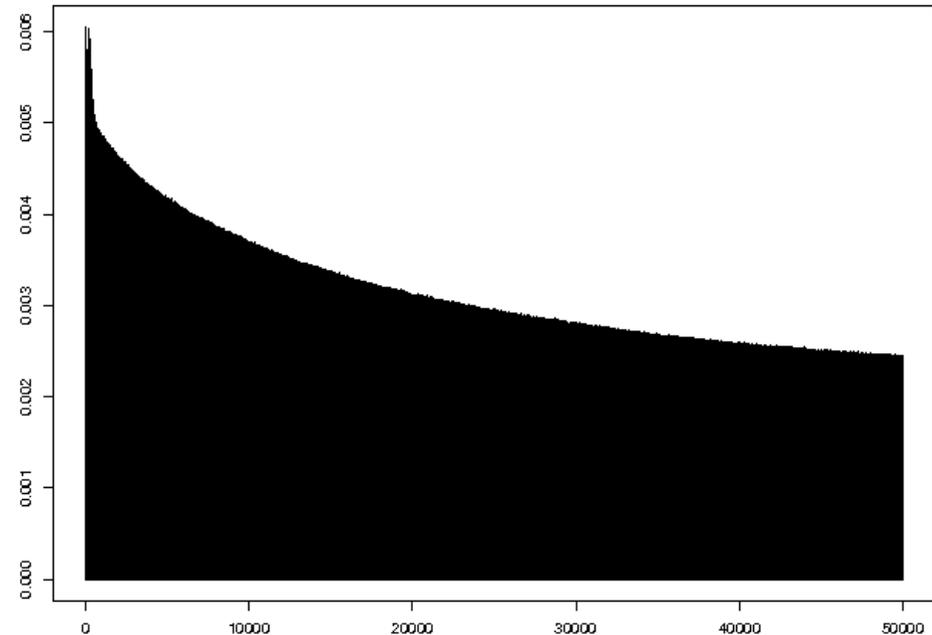
Auto-correlation plot of H3K36me3 in mouse ES cells

## Bottom:

Auto-correlation plot of H3K4me3 in mouse ES cells

## ➤ Observations

- H3K36me3 → long range correlation
- H3K4me3 → short range correlation



# ChIP-Score Application

## ❑ Input

- *Genomic tag count distributions for two features (reference, target)*
- *Count output threshold, distance range*

## ❑ Output

- *All reference sites that are enriched or depleted in target feature sites.*

## ❑ Method

- *Consider reference positions which have at least one tag count.*
- *For each position, computes cumulative target tag counts that fall into a distance range.*
- *Select those reference positions, which:*
  - *Have cumulative target tag count  $\geq$  threshold (enriched feature)*
  - *Or have cumulative target tag count  $<$  threshold (depleted feature)*

## ❑ Purpose

- *Identification of enriched/depleted domains*
- *Further correlation to other genomic features, e.g. transcription start sites*

❖ **Special ChIP-Cor Web server option**

# ChIP-Center Application

## ❑ Input

- *Oriented tag counts for a Chip-Seq feature*
- *Shift amount for centering tag positions*

## ❑ Output

- *Centered, un-oriented tag counts*

## ❑ Method

- *Moves by a given shift value tag positions to estimated center positions of DNA fragments*

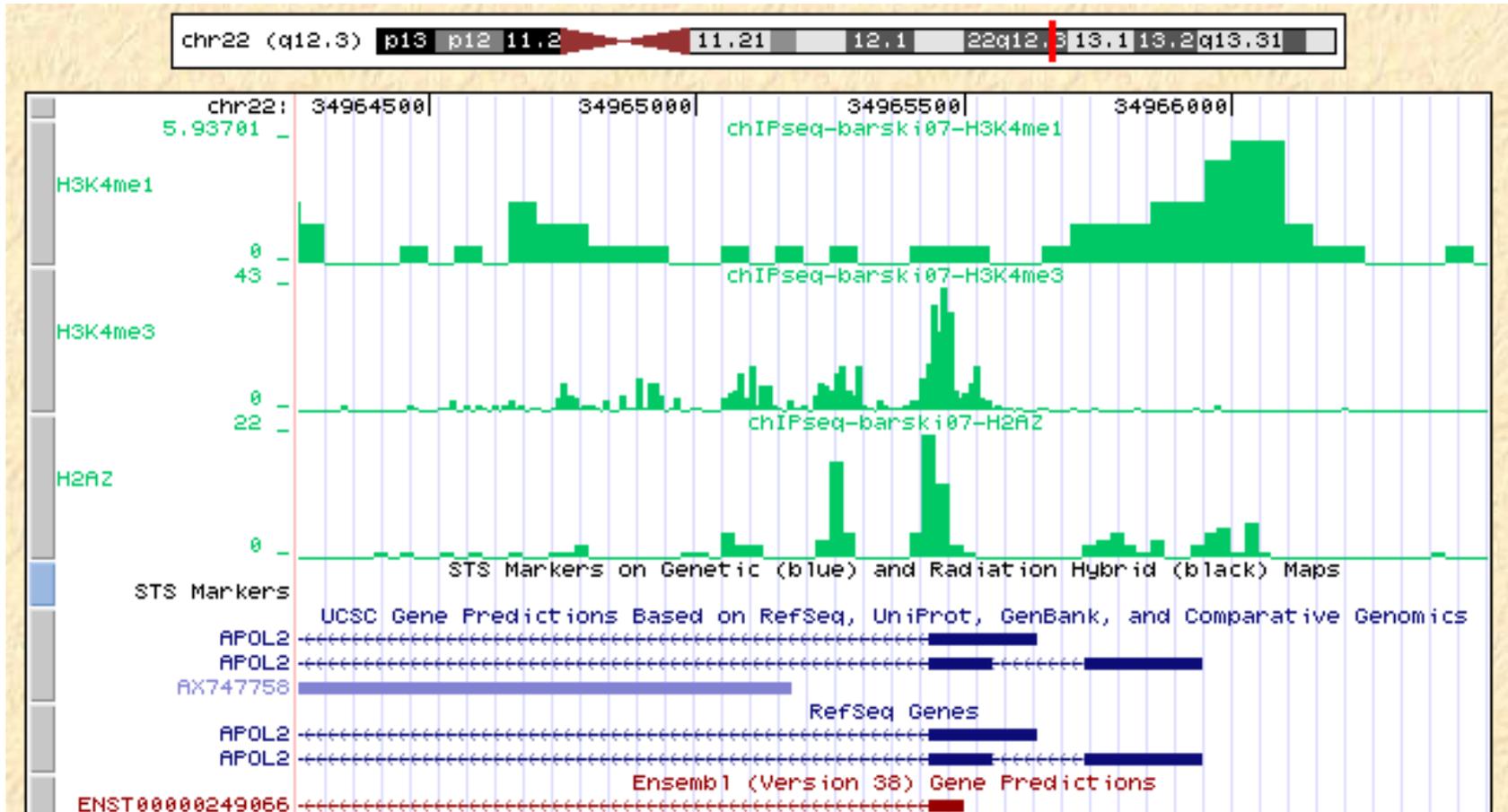
## ❑ Motivation

- *5' and 3' tag positions show relative displacement to each other*
- *best estimates for protein-binding site position:*
  - 5' end position + 1/2 fragment length*
  - or 3' end position - 1/2 fragment length*
- *centered tag count distribution more useful as input for peak recognition and partitioning algorithm*

## ❖ Output options on the Web

- *WIG files for viewing data in a genome browser environment*

# Example ChIP-center: Viewing customized WIG files in a UCSC browser environment



Based on data: from Barski et al. 2007, Cell 129, 823-837).  
ChIP-Seq tags from both strands centered by 70 bp .  
WIG file resolution: H3K4me1 50bp, H3K4me3 10 bp, H2A.Z 25 bp.

# ChIP-peak Application

## ❑ Input

- *Centered tag counts*
- *Peak threshold ( $t$ ), integration range of tag counts ( $w$ ), Vicinity range ( $r$ )*

## ❑ Output

- *List of peak center positions (SGA or FPS format)*

## ❑ Method

- *Consider only positions which have at least one tag count.*
- *For each position, determines cumulative tag counts in windows of width  $w$ .*
- *select as peaks those positions, which*
  - *have cumulative tag count  $\geq$  threshold  $t$ .*
  - *are local maximum with range  $\pm r$ .*

## ❖ Special server options

- *Download of sequences around peak center positions*
- *Provide several output formats: WIG, GFF, FPS*

# Example ChIP-Peak: Locating *in vivo* STAT1-binding sites

## Input data

Robertson et al. (2007) Nature Methods 4, 651-657.  
Cell material: Interferon  $\gamma$ -stimulated HeLa S3 cells.  
About 15 million tags in total

## Analysis parameters

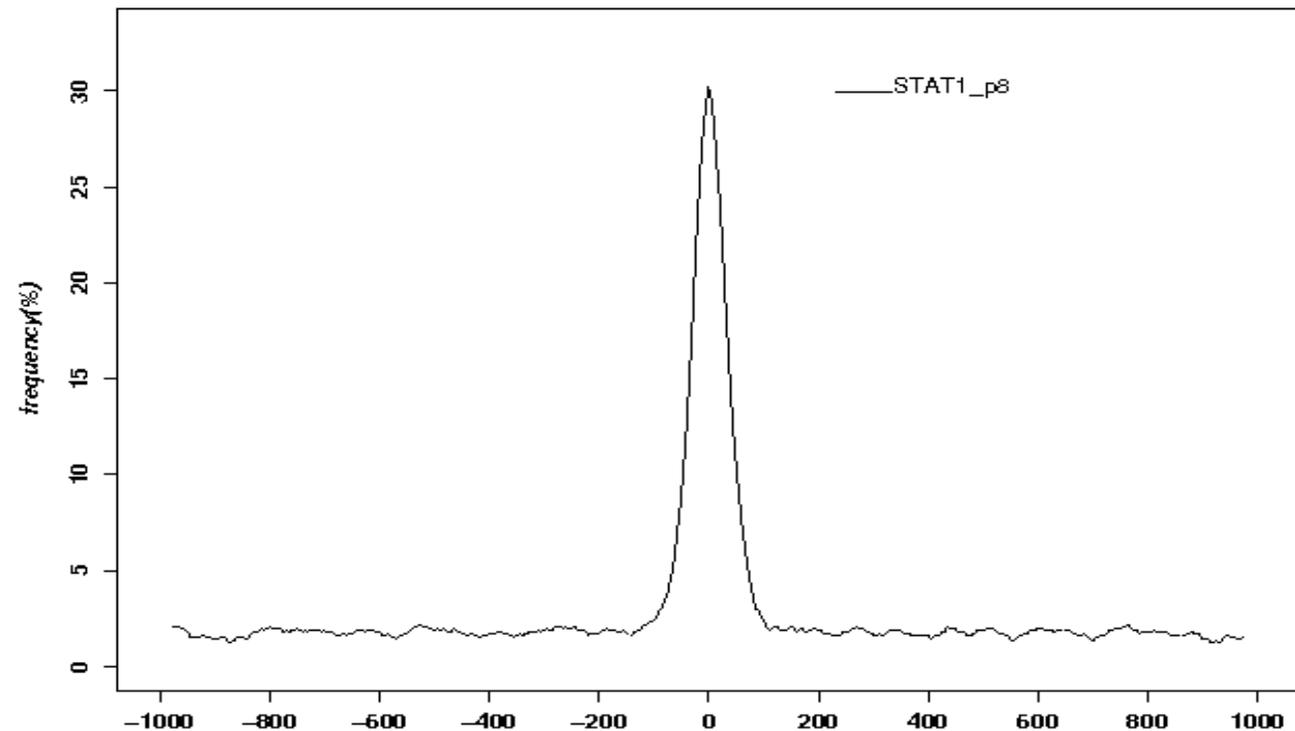
Centering: 70bp, window 200bp, exclusion range 200 bp, threshold 100 counts

## ➤ Result: 4446 peaks

Sequence extraction range for downstream analysis: -1000, 1000

### Downstream sequence analysis

- ◇ Distribution of TTCNNGAA around STAT1 peak
- ◇ Sliding window size 50
- ◇ Figure produced with OPROF (SSA server)



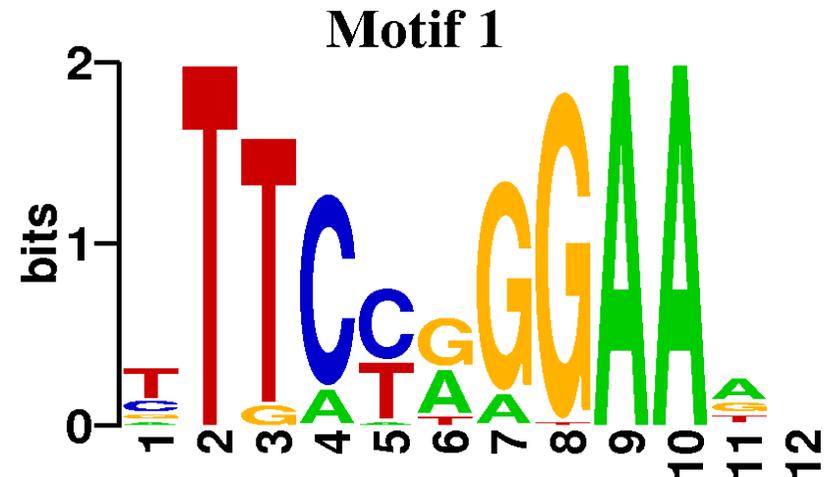
# STAT1 Sequence Motif Defined by ChIP-Seq data

## Input

4446 ChIP peak regions  
200 bp

*ab initio* motif discovery

MEME (zoops)



weblogo.berkeley.edu

## Matrix from experimental *in vivo* sites

	-7	-6	-5	-4	-3	-2	-1	0
<b>A</b>	23	38	15	0	2	29	8	19
<b>C</b>	33	17	13	0	0	67	56	31
<b>G</b>	35	17	12	4	2	4	15	31
<b>T</b>	10	27	60	96	96	0	21	19

## Matrix from SELEX

	-7	-6	-5	-4	-3	-2	-1	0
<b>A</b>	6	62	26	2	2	5	2	2
<b>C</b>	57	13	27	2	3	89	95	48
<b>G</b>	23	14	10	2	2	2	2	49
<b>T</b>	14	11	36	95	93	4	2	2

# ChIP-partition Application

## ❑ Input

- Centered tag counts
- Count density threshold, transition penalty

## ❑ Output

- List of signal-enriched regions (beginning, end)

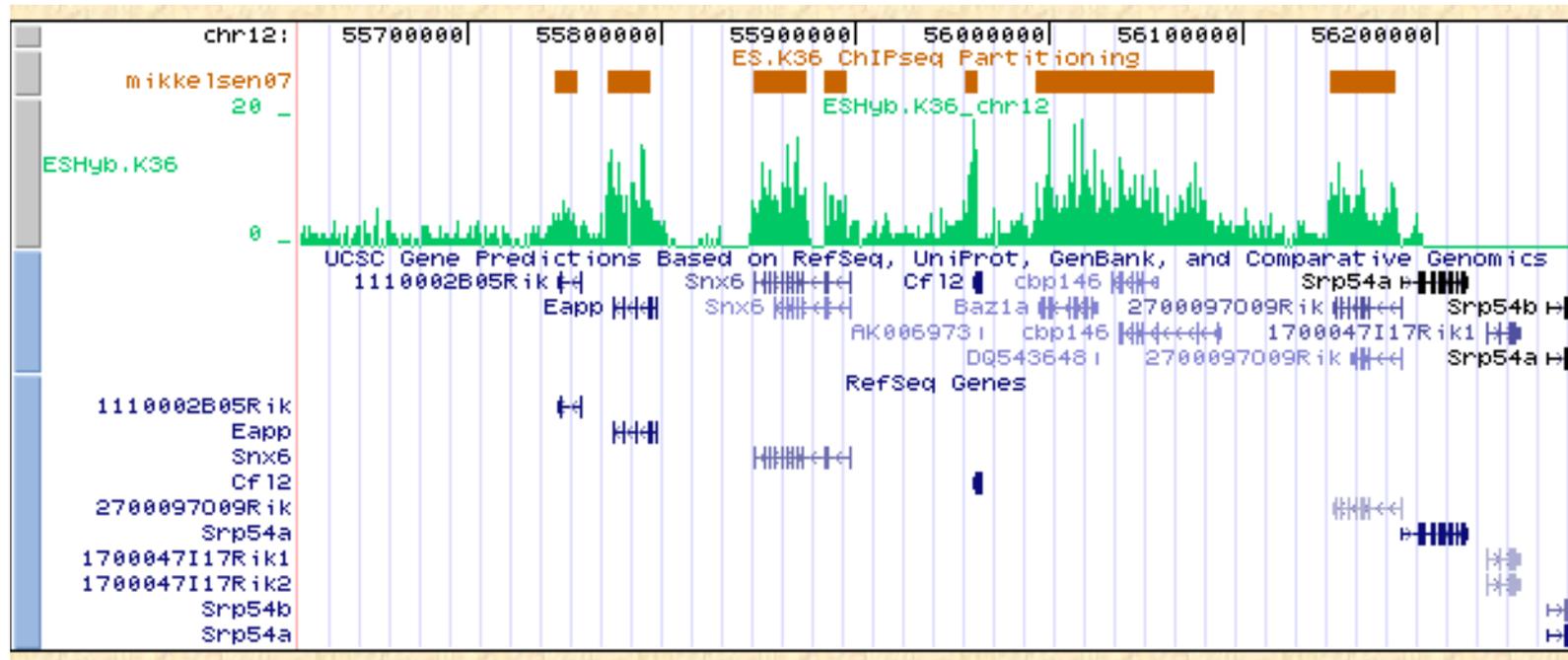
## ❑ Method

- *Optimization of a partition scoring function by a fast dynamic programming algorithm*
- *Two parameters: count density **threshold**, transition **penalty***
- *Scoring functions for global results: sum of scores of*
  - *Transitions (**penalty**)*
  - *Signal-rich region:  $\text{length} \times (\text{local count-density} - \text{threshold})$*
  - *Score for signal-poor region:  $\text{length} \times (\text{threshold} - \text{local count-density})$*

## ❖ Output options on the Web

- *GFF, BED file for genome browser*

# Viewing the results of the partitioning program in the genome browser



Custom tracks:

Mikkelsen07: results of ChIP-partition program (BED file)

ESHyb.K36: from: [http://www.isrec.isb-sib.ch/WIG/HSM07\\_ESHyb.K36\\_m\\_chr12.wig](http://www.isrec.isb-sib.ch/WIG/HSM07_ESHyb.K36_m_chr12.wig)

# Where to find source and binary files

## ❑ On Vital-IT (at [SIB](http://www.isb-sib.ch) – <http://www.isb-sib.ch>)

*/mnt/common/share/chip-seq-1.1.0*

*/bin.em64t -> /mnt/local/bin*

*chipcor chipscore chipcenter chippeak chippart*

*/src*

*chipcor.c chipscore.c chipcenter.c chippeak.c chippart.c*

*/perl*

*eland2sga.pl bed2sga.pl gff2sga.pl sga2.bed.pl sga2fps.pl [counts\\_filters.pl](#) [fetch\\_sga.pl](#)*

## ❑ On SourceForge

<http://sourceforge.net/projects/chip-seq>

*tarball file: chip-seq.1.1-0.tar.gz*

*www : <http://chip-seq.sourceforge.net>*

## ❑ Documentation

*Man pages, README files, C programs*

*On going projects: [ChIP-seq Web Tutorial](#), [PDF User Manual](#), [Reference Technical Manual](#)*

# Where to find data files

## □ On all platforms (within the Vital-IT environment)

*/db/chipseq*

*Experiments*

*Barski et al. (2007):* human CD4+ cell lines

Histone modifications, POL II, CTCF (~2 millions tags per experiment).

*Mikkelsen et al. (2007):* four mouse cell lines

Histone modifications (~2 millions tags per experiment).

*Robertson et al. (2007):* INF-gamma stimulated HeLa cells

STAT1 (>20 million tags per experiments).

*Boyle et al. (2008):* CD4+ cell lines

Open chromatin studies (~10 millions tags per experiment).

*Wang et al. (2008):* human CD4+ cells lines

Histone acetylations and methylations (3,4 millions tags per experiments).

*Schones et al. (2008):* human CD4+ cells lines

Regulation of nucleosome positioning (100 millions tags per experiments).

....

*Genome Annotations*

*CAGE, ENSEMBL, DBTSS7 and EPD TSS*

*Repeat masks*

*Phastcons tracks from UCSC*

*ENSEMBL POLYA*

# Where to find data files (cont.)

## ❑ On the Web Server

CHIP-Seq Input Data (Reference Feature)	CHIP-Seq Input Data (Target Feature)
<input checked="" type="radio"/> <b>Server-resident SGA</b> Species : Experiment : Feature : Chromosome :	<input checked="" type="radio"/> <b>Server-resident SGA Files</b> Species : Experiment : Feature : Chromosome :
<input type="radio"/> <b>Server-resident SGA Files (By Filename)</b> Experiment : Feature :	<input type="radio"/> <b>Server-resident SGA Files (By Filename)</b> Experiment : Feature :
<input type="radio"/> <b>Upload File</b> Sort Input : off on Experiment : Feature : Genomes :	<input type="radio"/> <b>Upload File</b> Sort Input : off on Experiment : Feature : Genomes :

# Web Access Statistics

## ❑ Chip-Seq Web Server on [ccg.vital-it.ch](http://ccg.vital-it.ch) *Week: Jan 10 2010 - Jan 17 2010*

- ✓ *Tot Number of Accesses : 828*
- ✓ *Tot Number of IPs : 95*
  
- ✓ *Number of Accesses from Switzerland: 316*
- ✓ *Number of IPs from Switzerland: 10*
  
- ✓ *Number of Accesses from Abroad: 512*
- ✓ *Number of IPs from Abroad: 85*
  
- ✓ *Number of Accesses from inside the UNIL: 4*
- ✓ *Number of IPs from the UNIL: 3*
- ✓ *Number of Accesses from the EPFL: 293*
- ✓ *Number of IPs from the EPFL: 4*