

CEAS: *cis*-regulatory element annotation system

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ABSTRACT

The recent availability of high-density human genome tiling arrays enables biologists to conduct ChIP–chip experiments to locate the *in vivo*-binding sites of transcription factors in the human genome and explore the regulatory mechanisms. Once genomic regions enriched by transcription factor ChIP–chip are located, genome-scale downstream analyses are crucial but difficult for biologists without strong bioinformatics support. We designed and implemented the first web server to streamline the ChIP–chip downstream analyses. Given genome-scale ChIP regions, the *cis*-regulatory element annotation system (CEAS) retrieves repeat-masked genomic sequences, calculates GC content, plots evolutionary conservation, maps nearby genes and identifies enriched transcription factor-binding motifs. Biologists can utilize CEAS to retrieve useful information for ChIP–chip validation, assemble important knowledge to include in their publication and generate novel hypotheses (e.g. transcription factor cooperative partner) for further study. CEAS helps the adoption of ChIP–chip in mammalian systems and provides insights towards a more comprehensive understanding of transcriptional regulatory mechanisms. The URL of the server is <http://ceas.cbi.pku.edu.cn>.

INTRODUCTION

Chromatin immunoprecipitation coupled with DNA microarrays (ChIP–chip) has become a popular technique to identify genome-wide *in vivo* protein–DNA interactions. With the recent availability of commercial human genome tiling microarrays, many laboratories are starting to combine these

two technologies to detect *cis*-regulatory elements in the human genome.

Despite the importance of ChIP–chip, there is still a shortage of convenient tools developed to streamline the downstream analyses with the capability of processing genome-scale ChIP regions. So far all the ChIP–chip papers in mammalian systems are published as a direct result of powerful bioinformatics support (1–6), which may not be available for smaller labs. Therefore, web servers that can perform comprehensive analyses of hundreds or thousands of ChIP regions are not only valuable to biologists, but also useful for promoting the adoption of this powerful technology.

We present a comprehensive *cis*-regulatory element annotation system (CEAS) web server that integrates useful tools for sequence analysis and annotation of ChIP regions in the human genome. CEAS results not only help biologists analyze and validate their ChIP regions, but also can be directly included in their manuscript or Supplementary Data.

WEB APPLICATION

CEAS is composed of three parts: (i) a front-end web-based user interface for input data submission, input data validation and job scheduling; (ii) an annotation engine for sequence analysis and annotations; and (iii) a reporting system for output generation and Email notification to the user.

User input

CEAS accepts an input file with ChIP regions in either UCSC BEDformat (<http://genome.ucsc.edu/goldenPath/help/customTrack.html#BED>) or Sanger GFF format (<http://www.sanger.ac.uk/Software/formats/GFF/>). The standard BED files have three required fields: *chrom* for the chromosome name, *chromStart* for the starting position of a ChIP region on the chromosome and *chromEnd* for the ending position of the ChIP region on the chromosome. The chromosome coordinates of the ChIP regions should follow the human genome assembly version Build 35 (Hg17). Coordinates

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The authors wish it to be known that, in their opinion, the first two authors should be regarded as joint First Authors

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based on earlier genome assembly can be converted to Hg17 using the Batch Coordinate Conversion at UCSC genome browser (7). A unique identifier for every ChIP region, ordinarily an optional fourth field in BED files, is also required by CEAS.

Because sequence analysis and annotation for genome-scale ChIP regions are time consuming, CEAS requires the user to supply an Email address. After submission, the server will put each job submission on queue and Email the user once the computation is finished. Alternatively, if the user inputs 'guest' instead of an Email address, the server will return a confirmation page which will be redirected to a result page when the annotation is finished. The output files will be stored on the server for 3 days to ensure that the user has enough time to browse and download the results.

Sequence retrieval

Although several websites can retrieve repeat-masked sequence for a particular genomic region, none can handle hundreds to thousands of ChIP regions simultaneously. Furthermore, current retrieval websites mask only RepeatMasker repeats (<http://repeatmasker.org>) and tandem repeats with period of 12 or less (8). Tandem repeats with period of >12 could greatly affect the qPCR primer design for ChIP region validation and sequence motif finding within the ChIP regions. CEAS automatically retrieves the genomic sequences of all the ChIP regions with all RepeatMasker repeats and all tandem repeats masked, and presents them in FASTA format for user download.

Conservation plot

Comparative genomics has been widely used to identify *cis*-regulatory elements in higher eukaryotes (9), and thus biologists are often interested in knowing the level of conservation of the ChIP regions. CEAS uses the high-quality phastCons (10) information from the UCSC GoldenPath genome resource, which assigns a conservation score based on a phylogenetic hidden Markov model to virtually every nucleotide in the human genome. CEAS generates a thumbnail phastCons conservation plot for each ChIP region, allowing biologists to skim through hundreds of ChIP regions in a single pdf file. In addition, the server extends both ends of each ChIP region to 3 kb, calculates an average phastCons score for each position and generates an average conservation plot. This final conservation plot can give biologists an idea of how conserved their ChIP regions are (in the middle of the plot) compared to the genomic background (at both ends of the plot).

Nearby gene mapping

For each ChIP region, CEAS reports the nearest RefSeq genes in both upstream and downstream directions on both strands unless no gene is found within 300 kb. When a ChIP region lies within a gene, CEAS reports whether it is in the 5'-untranslated region (5'-UTR), 3'-UTR, a coding exon or an intron. For each ChIP region, CEAS provides its length, GC content and a link to UCSC genome browser. The server also gives a summary statistic for GC content and gene mapping of all the ChIP regions, including the percentages of

ChIP regions that reside in proximal promoters (1 kb upstream from RefSeq 5' start), immediate downstream (1 kb from RefSeq 3' end), 5'-UTRs, 3'-UTRs, coding exons, introns and enhancers (>1 kb from RefSeq). This rough estimate of the ChIP region distribution helps biologists understand the specific binding behavior of their transcription factor.

Motif finding and enrichment analysis

CEAS finds enriched sequence motifs in the ChIP regions that are putatively bound by the ChIP-chip transcription factor and its cooperative-binding partners. The current best *de novo* motif finding methods for ChIP-chip includes MEME (11), AlignACE (12), Mascan (13) and their combinations (14). For known motif-scanning methods, the best is TRANSFAC (15) or JASPAR (16) motif scan. Since the latter is less time consuming and can be pre-computed, we decided to use it. CEAS pre-collected all the motif matrices in the TRANSFAC (15) and JASPAR (16) databases, and filtered out motifs from microbial genomes or constructed with <10 sites to get ~800 well-characterized eukaryotic motifs. For each motif, CEAS pre-computed and stored all its hits (with information on chromosome, position, strand and score) in the fully repeat-masked human genomic sequence. The score of a particular *w*-mer hit to a motif of width *w* is calculated as follows:

$$\text{score}(w - \text{mer}) = \log \left[\frac{pb(w - \text{mer from motif})}{pb(w - \text{mer from Markov background})} \right],$$

where the background is the 9th order nucleotide Markov dependency estimated from the human genomic sequence. A score cutoff of *Max* ($5.0.9 \times \text{Motif Relative Entropy}$) is used to call a motif a hit. The relative entropy of a motif of width *w* is calculated as $\sum_{i=A,C,G,T} \sum_{j=1}^w m_{ij} \log(m_{ij}/p_i)$, where m_{ij} is the probability of seeing nucleotide *i* at position *j*, and p_i is the probability of *i* in the human genome. Given user's ChIP regions, CEAS counts the number of hits for every motif both within the ChIP region and in the whole genome. To be comprehensive, CEAS chooses a relative less stringent criteria of >1.5-fold change and binomial test *P*-value <1E-5 to report motifs enriched in the ChIP regions. Reported motifs are ranked by their *P*-values so biologists could refine the motif list with a more stringent cutoff. With each reported motif, CEAS provides its fold change, *P*-value, hit sequence in the ChIP regions and sequence logo (17).

Example output

Without other jobs pending on the queue, it takes CEAS ~20 min to process an input with 1000 ChIP regions each of length ~600 bp. Once the computation is finished, CEAS notifies the user by Email with a link to the result page. The result Html page reports each of the CEAS analysis results in different sections for user to view and download (Figure 1).

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