A new pipeline SPICE identifies novel JUN-IKZF1 composite elements

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Abstract

Transcription factor partners can cooperatively bind to DNA composite elements to augment gene transcription. Here, we report a novel protein-DNA binding screening pipeline, termed Spacing Preference Identification of Composite Elements (SPICE), that can systematically predict protein binding partners and DNA motif spacing preferences. SPICE de novo predicted known composite elements, including AP1-IRF composite elements (AICE) and STAT5 tetramers, and also predicted a range of novel binding partners, including JUN-IKZF1 composite elements, including at an upstream conserved noncoding region, CNS9, in the human *IL10* gene, which contains a non-canonical IKZF1 site. We confirmed cooperative binding of JUN and IKZF1 and showed that the activity of an *IL10*-luciferase reporter construct in primary B and T cells depended on both this site and the AP1 binding site within this composite element. Overall, our findings reveal an unappreciated global association of IKZF1 and AP1 and establish SPICE as a valuable new pipeline for predicting novel transcription binding complexes.

Introduction

Genome-wide studies investigating cooperative interactions of transcription factors (TFs),
histone modifications, and higher-order chromatin conformation are critical for the systematic
evaluation of mechanisms of gene expression. Chromatin immunoprecipitation coupled with
DNA sequencing (ChIP-Seq) has been used to map genome-wide DNA binding proteins of
interest, thereby enhancing our understanding of genomics and epigenomics (1, 2), with
important discoveries related to disease-associated transcriptional regulation (3, 4), tissue-
specificity of epigenetic regulation (5, 6), and chromatin organization (7). To extract biologically
relevant information from ChIP-Seq data, many computational tools, such as Model-based
Analysis for ChIP-Seq (MACS)(8), MUltiScale enrIchment Calling for ChIP-Seq (MUSIC)(9),
and Zero-Inflated Negative Binomial Algorithm (ZINBA)(10), have been developed to
understand transcription factor cooperation and interactions. Genomic regions that are
significantly enriched represent candidates for protein/DNA-binding sites that can be used to
predict binding motifs (11), and ChIP-Seq analysis can be integrated with other types of genomic
assays, including RNA-Seq gene expression profiling and long-distance chromatin interaction
analyses to elucidate mechanisms of genomic function (12, 13) and gene ontology (14).
Moreover, given a set of identified ChIP-Seq peaks, motif enrichment analysis tools such as
MEME (11, 15) can de novo discover the motif(s) corresponding to the TF's DNA binding
domain. When binding to genomic DNA, some TFs may cooperatively bind and physically
interact with specific partner TFs, and there often is preferred spacing between their binding sites
(12, 16-19). These cooperative interactions at composite elements are critical for transcriptional
regulation of genes and are used by cells to integrate diverse signals and potently drive
transcription even at low concentrations of transcription factors. However, few computational

tools to date can predict composite elements and their optimal spacing using transcription factor

ChIP-Seq data. SpaMo (space motif analysis) in MEME suite (15) can infer interactions between

a pair of specific TFs at near sites on the DNA sequence, however, it cannot systematically

predict TF-TF composite elements genome wide. Here, we report a new computational pipeline

denoted "Spacing Preference Identification of Composite Elements" (SPICE), which can predict

in a genome-wide fashion novel composite elements for pairs of transcription factors and the

spacing between the elements. SPICE is versatile and efficient and can use any ChIP-Seq dataset

to make predictions that can be tested to confirm cooperative binding and corresponding effects

on gene expression. We found SPICE predictions to be highly accurate in predicting previously

established binding partners/compositve motifs, and in this study we demonstrate genome-wide

JUN-IKZF1 interactions. SPICE therefore has potentially broad utility and provides a powerful

method to identify a range of new transcription-factor interactions and mechanisms underlying

gene regulation.

Results and Discussion

The SPICE pipeline predicts known and novel protein complexes

The SPICE schematic pipeline is summarized in **Figure 1A** and detailed in the Methods. First,

we aligned the sequenced reads from ChIP-Seq datasets to the reference genome and identified

significant TF binding sites (peaks) using MACS. Second, we performed de novo peak analysis,

designated the top-enriched motif among the identified peaks as the primary motif, kept peaks

containing the primary motif, and eliminated sequences without primary matches. Third, we

loaded secondary motifs using motif databases (e.g., HOCOMOCO, etc.), centered the primary

motifs and scanned for secondary motifs within 500 bp of the primary motif, specifically

checking for enrichment of known TF DNA-binding motifs. Finally, we sorted the significant

secondary motifs and spacing, and grouped those that were redundant. We then visualized their

interaction matrices with the primary and secondary motifs as a heat map (see illustrative

schematic in **Figure 1B**, where each red square indicates a predicted composite element

containing the motifs at the corresponding primary and secondary motifs on the x- and y-axis,

respectively). Based on the distance from the primary to secondary motif, we displayed the

spacing distributions as bar graphs highlighting the most significant spacing preferences (**Figure

1C**). To validate the predictive accuracy of SPICE, we used our previously published IRF4

ChIP-Seq data in mouse pre-activated T cells to see if we could de novo re-discover AP-1/IRF4

composite elements (AICE, 5′-TGAnTCA/GAAA-3′)(20). Indeed, SPICE successfully

predicted these elements, including optimal spacing between AP1 and IRF4 as 0 or 4 bp (**Figure

1D; Figures S1A and S1B**), as previously reported (20), thus validating the pipeline.

Furthermore, SPICE successfully predicted STAT5 tetramerization with an optimal spacing of

11-12 bps (**Figure S1C, D**), as previously reported (17). STAT1, STAT3, and STAT4 also have

been reported to form tetramers (21-23), and indeed SPICE de novo predicted that these STATs

also can form tetramers, whereas STAT2 was not predicted to form tetramers (**Table 1**),

consistent with the lack of reports of such formation.

SPICE can predict known and novel composite elements from the human Encode database

To assess SPICE's ability to predict novel TF binding complexes, we utilized ChIP-Seq data

from the ENCODE project, as standardized by the ENCODE Analysis Working Group; this

allowed us to perform integrated analysis of all ENCODE data types based on uniform

processing. We evaluated the performance of SPICE using ENCODE ChIP-Seq libraries from

Transcription Factor Binding Sites (TFBS) generated by ENCODE/Stanford/Yale/USC/Harvard

(SYUH), which comprise a total of 343 libraries in 20 different cell lines, with K562 human

erythroleukemia, GM12878 EBV-transformed B cell, and HeLa S3 human cervical carcinoma

cell lines being heavily used to generate these libraries. For each selected TF ChIP-Seq library

that contains a primary motif (**Figure S2**, x-axis), we extracted 500 bp of DNA sequence

centered on the primary motif and searched for 401 known human transcription factor binding

motifs using the Homo sapiens Comprehensive Model Collection database (HOCOMOCO,

v11)(**Figure S2,** y-axis), and generated a 343 x 401 spatial interaction matrix, in which each cell

was assigned an E-value indicating the significance of primary-secondary motif pairs (**Table 2**).

The E-values were then log transformed (-log10(E-value)) and shown as an interaction heat map

(**Figure S2**). As is evident, most of the motif pairs were not significant, suggesting that

transcription factor composite elements are relatively rare events; in addition, some interactions

that exist in some cell types may not be observed if they are not present in the cell lines that were

used to generate the ENCODE datasets. After applying a filtering criterion that only included

motif pairs with an E-value $< 1e^{-10}$, the resulting interaction matrix had dimensions of 118 x 205

and exhibited reduced spatial complexity. Very interestingly, we could immediately identify

multiple potential TF-TF composite elements (**Figure 1E**), which include putative associations

of JUN with STAT3 and IKZF1, of CEBPβ with E2F, KLF, and BACH family members, and a

range of others including ZNF241/NF-κB, GATA1/NDF1, and CTCF/ETS. Importantly,

association of JUN with STAT3 has been known (24) and a functional CTCF-ETS1 interaction

was recently reported (25), further validating the predictive power of SPICE. Regarding the

CTCF-ETS association, SPICE successfully defined an optimal spacing of 8 bp for CTCF/ETS

complexes (**Figures S1E and S1F**), something that was not defined in the earlier study (25) and thereby further underscoring the robustness of our pipeline.

Most IKZF1 binding sites co-localize with JUN

We decided to focus on the putative JUN-IKZF1 given that both JUN and IKZF1 play critical roles in immune cells but have not been reported to physically associate or functionally cooperate. IKZF1 (Ikaros) has crucial functions in the hematopoietic system (26, 27) and is a regulator of immune cell development in early B cells and T cells (28, 29). JUN family factors are part of AP-1 complexes, forming homodimers or hetero-dimers with FOS family basic leucine zipper proteins and playing prominent roles in T cell biology (30, 31). By ChIP-Seq, IKZF1 and JUN extensively co-localized in the human cell line GM12878 (**Figure S3A)**, for example at multiple sites in the *TNFRSF8* and *IL10* loci. The *IL10* locus included a highly conserved CNS9 region (highlighted in a red box and labeled in **Figure S3B**), located approximately 9.1 kb upstream of the *IL10* promoter. Pairwise sequence alignment confirms the CNS9 region is highly conserved between human and mouse (**Figure S3C**). BATF, a FOS family member, also bound at these loci (**Figure S3B)**, consistent with BATF's ability to partner with JUN in AICEs (20). To further characterize IKZF1-JUN complexes and validate their existence in vitro and in vivo, we performed ChIP-Seq experiments with antibodies to IKZF1 and JUN in primary mouse B cells that were either untreated or treated with LPS or LPS + IL-21 for 3 hours. We used B cells given the importance of IKZF1 for B cell development (32). When cells were stimulated with LPS + IL-21, we identified a total of 9197 and 14433 binding sites for IKZF1 and JUN, respectively (**Figure 2A**). The de novo motif analysis (HOMER) on the IKZF1 peaks (**Figure 2B**) indicated the most enriched motifs include ETS-like motif (ranks 1st) and

EBF1-like motif (ranks 2nd), which are comparable to the previously identified IKZF1 motifs

(33), as well as an IRF-like motif (ranks 3rd), etc., all of which ostensibly could be utilized by

IKZF1 to bind to DNA. Strikingly, 8125 out of 9197 (88.3%) of IKZF1 peaks co-localized with

JUN (**Figure 2C**), and the Reactome Pathway Analysis from the 8125 co-localized peaks

suggested that the IKZF1-JUN complex might play broad biological roles as there were multiple

enriched pathways, including "Cytokine Signaling in Immune System", "Signaling by

Interleukins", TLR4-related cascades, and more. (**Figure 2D** and **Figure S4**). IKZF1 binding

was induced when cells were treated with LPS or LPS + IL-21, while JUN binding was

prominent only with LPS + IL-21 treatment. IKZF1 sites globally co-localized with JUN (**Figure

2E**), including at known regulatory elements, for example at the *Prdm1* and *Il10* genes (**Figure

2F**)(20), which are critical for plasma cell differentiation in IL-10-producing B cells (34).

Importantly, the CNS9 region was identified not only in the human *IL10* gene (**Figure S3B**) but

also in the mouse *Il10* gene (**Figure 2F**), suggesting that this conserved region might be

biologically important and dependent on the binding of both IKZF1 and JUN.

Cooperative binding of IKZF1 and JUN at the *IL10* upstream region

To identify potential physical interactions between IKZF1 and JUN, we performed co-

immunoprecipitation experiments in the MINO cell line, a human mantle cell lymphoma B cell

line. We confirmed that both JUN and IKZF1 were expressed in these cells, as assessed by

western blotting (**Figure 3A**). Although we could not co-immunoprecipiate IKZF1 with anti-

JUN, JUN was weakly co-precipitated by anti-IKZF1, suggesting these factors might form a

complex (**Figure 3A**), consistent with their binding in proximity in a genome-wide fashion as

shown in **Figure 2C and 2E**. The gene encoding IL-10 in both humans and mice is expressed in

both T cells and B cells (35) and contains a canonical AP-1 motif and a nearby sequence

(GTTGCAGTTTC) that is an 11 bp match for the variant 3rd IKZF1 motif peak in **Figure 2B.**.

These motifs were located in the CNS9 region (~9.1 kb upstream of the *IL10* promoter) (**Figures**

2F and S3B), which is a highly conserved non-coding region in the mouse and human genes

(**Figure S3C**) and is critical for regulation of the *IL10* gene (20, 36). We wished to assess

whether this might be a variant IKZF1 motif and performed EMSAs using wild-type or mutant

probes corresponding to CNS9 (**Figure 3B**; the GTTGCAGTTTC motif 3 region and AP1 motifs

are underlined) and MINO nuclear extracts. A strong complex formed with the WT CNS9 probe

(**Figure 3C**, lane 2), but the intensity was weaker when the variant IKZF1 sequence was

mutated (lane 4) and abolished when the AP-1 motif (lane 6) or both motifs (lane 8) were

mutated (**Figures 3C and 3D**). We next evaluated the presence of IKZF1 and JUN by super-

shifting with antibodies. As expected, a strong complex was seen only in the presence of nuclear

extract (**Figure 3E**, lane 2 vs. 1). Neither mouse nor rabbit IgG affected the complex (lanes 3 and

4), but anti-IKZF1 consistently altered the appearance of the shift and anti-JUN gave a discrete

slower mobility super-shifted band, consistent with both IKZF1 and JUN being part of the

complex (lanes 5 and 6).

Both IKZF1 and JUN are critical for cooperative binding and transcriptional activation

We next performed EMSAs using the WT IR700 probe and 25, 50, 100, and 200 molar excess of

cold competitor oligonucleotides corresponding to the WT or the variant IKZF1 mutant, AP-1

mutant, or double mutant CNS9 probes. The WT competitor dramatically reduced the binding

activity and the variant IKZF1 mutant competitor moderately reduced the intensity of the shift,

whereas AP-1 mutant or IKZF1/AP-1 double mutant oligonucleotides had little if any effect

(**Figures 4A and 4B**). To determine whether IKZF1 and AP-1 proteins cooperatively bound to the CNS9 region, we used recombinant IKZF1 and cJUN/cFOS AP1 protein to perform EMSAs with wild-type and mutant IR700 probes corresponding to the *IL10* CNS9 site (data shown in **Figure 4C** and quantified in **4D**). With the wild-type probe, no binding activity was observed with IKZF1 alone (**Figures 4C and 4D, lane 2**), but binding occurred with AP-1 (**lane 3**), and stronger binding occurred when both IKZF1 and AP1 proteins were added (**lane 4**), suggesting cooperative binding of these factors. Binding was not detected to the AP-1 mutant probe (**lane 8**) and was lower with the variant IKZF1 mutant probe (**lane 6**), suggesting that the AP-1 site is absolutely required for the cooperative binding and that the putative variant IKZF1 site had low affinity in its own right but cooperated with the AP1 site to allow cooperative binding of the factors. Correspondingly, activity of the WT *IL10* luciferase reporter was potently induced by LPS in primary B cells compared to vector but not when IKZF1, AP-1, or both motifs were mutated (**Figure 4E**), suggesting both IKZF1 and AP-1 are important for transcriptional activation of this gene. Besides B cells, IKZF1 has been shown to be a regulator of *Il10* gene expression in mouse T cells, in which *Il10* expression was significantly lower compared with wild-type T cells in response to TCR stimulation or during Th2 differentiation in *Ikzf1*$^{-/-}$ cells (37). We therefore also analyzed activity in T cells. *IL10* reporter activity was potently induced, but expression was diminished when the variant IKZF1 motif, or particularly the AP1 motif or both motifs were mutated (**Figure 4F**), demonstrating cooperative binding and transcriptional activation by IKZF1 and AP1 proteins in this setting as well. These results provide mechanistic insights into the actions of IKZF1 and underscore the power of the SPICE pipeline for identifying new transcription factor cooperative effects.

We have developed a computational pipeline, SPICE, that can predict novel transcription factor binding partners and optimal DNA spacing of motifs. In this report, we analyzed the ENCODE database using the SPICE pipeline, successfully predicting a range of known interactions as well as a multitude of novel interactions. Here, we focused on JUN-IKZF composite elements, an association not previously demonstrated. ChIP-Seq analysis demonstrated that IKZF1 co-localizes with JUN in a genome-wide manner, and that the major two motifs identified were canonical IKZF1 motifs, but that non-canonical variant motifs were also identified, including at the *IL10* gene locus. We could coprecipitate JUN with anti-IKZF1, and moreover, we found functional cooperation between IKZF1 and AP1 motifs. Specifically, we found that IKZF1 and JUN not only cooperatively bound to the CNS9 region in the *IL10* locus but that both IKZF1 and AP1 motifs were critical for transcriptional activity of a reporter construct in both B and T cells. Although we focused on the *IL10* locus, we demonstrated genome-wide co-localization of these factors, and reactome pathway analysis linked the genes in which they were found to a range of pathways including but not limited to cytokine signaling pathways (**Figure 2**); thus, the physiological relevance of cooperation of these transcription factors may be broad, potentially including in the context of cellular function and diseases. The identification of JUN-IKZF1complexes demonstrates that our computational approach and novel pipeline, SPICE, can predict novel transcription factors binding complexes and their optimal spacing, providing a valuable new way to discover composite elements that contribute to a highly specific pattern of gene transcriptional regulation and to better understand gene regulatory networks in the immune response.

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Figure Legends

Figure 1. Spacing Preference Identification of Composite Elements (SPICE) predicts known and novel composite elements and spacing preferences. (**A**) Schematic step-by-step flowchart of the SPICE pipeline to predict transcription factor composite elements and their spacing preferences (see Methods for details). (**B**) Schematic of a heat map depicting hypothetically enriched significant motif pairs (shown as solid red boxes). This interaction matrix of primary-secondary motifs depicts the types of data that would be generated as potential composite elements after a ChIP-Seq derived primary motif region is compared with the motif database for secondary motifs based on distribution of spacing between primary and secondary motifs. The red boxes indicate composite elements based on the the primary and secondary motifs on the x- and y-axis, respectively. (**C**) Schematic bar graphs showing spacing distribution of secondary motifs centered on a given primary motif, with bars highlighted in red indicating the most preferred spacing. (**D**) SPICE successfully predicts and validates known composite elements. Shown is validation of SPICE's ability to rediscover the known AP-1/IRF4 composite element (AICE). (**E**) Potential transcription factor composite elements identified from SPICE. Heat map of the significant motif pairs, with at least one pair of motifs exhibiting an E-value $< 1e^{-10}$. This 118 x 205 spatial interaction matrix using Transcription Factor Binding Sites (TFBS) from the ENCODE project represents a subset of the primary and secondary motifs shown in the interaction matrix shown in **Figure S2**. The x-axis represents the primary motifs derived from ChIP-Seq libraries, and the y-axis indicates the motifs from HOCOMOCO database. Potential

novel combinatory complexes are highlighted in black boxes and yellow font (e.g., CTCF/ETS composite elements and JUN/IKZF composite elements).

Figure 2. JUN co-localizes with IKZF1. (**A**) Number of ChIP-Seq peaks identified for IKZF1 and JUN in experiments from primary mouse B cells that were treated with LPS + IL-21. (**B**) De novo motif discovery (HOMER) from IKZF1 peaks in primary mouse B cells treated with LPS + IL-21. The most significantly enriched motifs and their corresponding p-values are shown. (**C**) Venn diagram showing that most (88.3%) IKZF1 peaks co-localize with JUN. (**D**) Reactome pathways analysis from the IKZF1-JUN co-localized peaks reveal that cytokine related pathways were most enriched, including "Cytokine Signaling in Immune System", "Signaling by Interleukins", and several TLR4-related pathways/cascades. (**D**) Heat map showing that IKZF1 binding was potently activated by LPS or LPS + IL-21 treatment and that IKZF1 binds in proximity to JUN. Shown are normalized ChIP-Seq signals ± 3 kb, centered on IKZF1 peak summits. (**E**) IGV browser file shows IKZF1 and JUN bound to the *Prdm1* and *Il10* genes. The red boxes indicate known regulatory elements. The position of a known upstream cis-regulatory element (CNS9) that controls *Il10* expression is indicated.

Figure 3. Cooperative binding of IKZF1 and JUN at an *IL10* upstream site, CNS9. (**A**) Co-immunoprecipitation reveals IKZF1 physically associates with JUN. Nuclear protein lysates from 25 x 10^6 cells were used for each IP reaction. Protein extracts (input) were immunoprecipitated with antibodies to IKZF1, JUN, or normal IgG (mouse and rabbit) and resolved by SDS-PAGE. Western blotting was then performed with antibodies to IKZF1 or JUN. (**B**) Wild-type and mutant probes at the *IL10* CNS9 upstream site; variant IKZF1 and AP-1

motifs are underlined, with mutant nucleotides colored in red. (**C**) Representive EMSA with

IL10 upstream probes (wild-type, or IKZF1, AP-1, or IKZF1/AP-1 mutants; see panel B) and

nuclear extracts from MINO cells. 100 nM of IR700-labeled probes was used per EMSA

reaction. 5 μg of MINO nuclear extract was used in lanes 2, 4, 6, an 8; no nuclear extract was

added in control lanes 1, 3, 5, and 7. (**D**) Average intensities from three independent EMSA

experiments (one of which is shown in panel C). Band intensities were calculated using Image

Studio software (LI-COR). (**E**) EMSA super-shifting was performed with 5 μg of nuclear

extracts from MINO cells and mouse IgG, rabbit IgG, anti-IKZF1, and anti-JUN. Nuclear lysates

were pre-incubated for 20 minutes on ice with 1 μg of the indicated antibodies prior to addition

of probe. EMSAs were performed at least 3 times.

Figure 4. Both IKZF1 and JUN are critical for cooperative binding and transcriptional

activation. (A, B) Cooperative binding of IKZF1 and AP1. EMSA were performed with a WT

IL10 probe corresponding to CNS9 and nuclear extracts from MINO cells stimulated with LPS +

IL-21. Un-labeled "cold" wild-type or mutant double-stranded oligonucleotides (25, 50, 100, or

200-fold molar excess relative to the IR700-labeled probes; see Fig. 4B) were added to 5 μg

nuclear extracts (prepared from MINO cells treated with LPS + IL-21) prior to the addition of

100nM of WT IR700-labeled probe. Shown are a representative EMSA (A) and summary of

relative band intensities from three independent experiments (B). Relative intensities were

calculated using Image Studio software (LI-COR). (**C, D**) EMSA using human recombinant AP-

1 or IKZF1 with *IL10* CNS9 upstream probes (wild-type, or IKZF1/AP-1 mutants). 300 ng of

recombinant AP1 protein (150 ng of each cJUN and cFOS) and 1 μg of recombinant IKZF1 were

used as indicated. Band intensities from three independent experiments are shown in panel D. (**E**)

WT or mutant reporter constructs were transfected via electroporation into mouse primary B

cells pre-stimulated with LPS for 24 hours. After electroporation, cells were treated with LPS for

24 hours before dual luciferase activity was measured (n=3; mean ± S.D.). (**F**) WT or mutant

reporter constructs were transfected into mouse primary pre-activated CD8[+] T cells and the cells

were then treated as indicated for 24 h (n = 3; mean □±□S.D.). RLU, relative light units.

Figure S1. SPICE successfully predicts AICE, STAT5 tetramers, and CTCF/ETS

complexes. SPICE successfully predicted previously identified composite elements, including

AICE (AP-1/IRF4 composite elements), based on BATF, JUN and IRF4 ChIP-Seq data in TCR

pre-activated mouse T cells (**A, B**), STAT5 tetramer complex formation based on STAT5 ChIP-

Seq in TCR pre-activated and IL-2-treated T cells (**C, D**), and CTCF/ETS composite elements

based on available ETS2 ChIP-Seq data (**E, F**).

Figure S2. SPICE predicts transcription factor composite elements using the Encode ChIP-

Seq data. Heat map of the motif interaction matrix of ChIP-Seq libraries from Transcription

Factor Binding Sites (TFBSs) from the ENCODE project. The x-axis represents the primary

motifs derived from 343 Encode ChIP-Seq libraries, and the y-axis indicates the 401 motifs from

HOCOMOCO database. The color scale represents the -log10 transformed E-value, which is the

lowest p-value of any spacing of the secondary motif times the number of secondary motifs.

Figure S3. JUN-IKZF composite elements in GM12878 cells. (A) Heat map of genome-wide

ChIP-Seq binding intensities in a ± 3 kb genomic region centered on summits of combined

IKZF1 and JUN peaks in GM12878 cells from the ENCODE project; two biological replicate

experiments are shown in the heat map. (**B**) Co-localization of IKZF1, JUN, and BATF peaks at the *IL10* and *TNFRSF8* genomic loci. A conserved cis-regulatory element in the human *IL10* and mouse *Il10* loci, CNS9, is highlighted in the red box. (**C**) Sequence alignment reveals CNS9 region is highly conserved in human and mouse.

Figure S4. Gene-concept network depicts the linkages of genes and biological concepts of the top 5 Reactome Pathways that were enriched in IKZF1-JUN shared peaks. The highlighted red dots represent the top 5 enriched pathways and the dot size indicates the number of genes involved in each pathway.

Table 1. SPICE can predict possible tetramers for STAT family member proteins. SPICE is capable of identifying canonial STAT binding motifs, also known as interferon gamma-activated sequence (GAS) motifs, and then predicts STAT tetramer formation and the optimal spacing for tetramer formation for STAT1, STAT3, STAT4, STAT5A, and STAT5B, whereas STAT2 was predicted to not form tetramers. The various STAT family members were activated in the indicated cell types by the indicated cytokine, ChIP-Seq derived canonical GAS motifs, percentage of GAS motifs, likelihood of tetramer formation, and predicted optimal spacing were determined.

Table 2. The spatial interaction matrix of primary motifs from ChIP-Seq libraries and secondary motifs from HOCOMOCO database. Each row represents one of the 401 motifs from HOCOMOCO database, and each column is derived motifs from 343 TFBS ChIP-Seq libraries. Each cell has an E-value indicating the significance of motif pairs, which is the lowest

p-value of any spacing of the secondary motif times the number of secondary motifs. The value of 1 indicates there is no interaction between motif pairs.

Materials and Methods:

SPICE pipeline

All mapped files of Transcription Factor Binding Sites (TFBS) were downloaded from ENCODE project (http://hgdownload.soe.ucsc.edu/goldenPath/hg19/encodeDCC/wgEncodeSydhTfbs/), from a collection of libraries generated by Stanford/Yale/USC/Harvard (SYUH). The following are the step-by-step analysis corresponding to the flowcart in Figure 1A.

"Idenfity TF peaks": MACS 1.4.2(8) was used to identifiy significant peaks for each transcription factor using input IgG as control, *p-value* threshold was set as $1e^{-10}$. Alternatively, one can directly download SYUH pre-defined peaks-- i.e., SydhTfbsGm12878JundIggrabPk.narrowPeak. *"De novo motif analysis"*: MEME (multiple EM for motif elicitation) was used to to "de novo" discover consensus primary motifs from the 1000 most significant TF binding sites (sorted by *-log10(p-value)* in peak file). *"Using top-enriched motif as primary motif"*: The top-enriched motif (sorted by *e-value*, which is based on its log likelihood ratio, width, sites, the background letter frequencies) was selected as the primary motif . *"Loading all sequences", "Determining best primary motif matches", and "Eliminating sequences without primary matches"*: If there was indeed a primary motif from a particular TF ChIP-Seq, we extracted 500 bp DNA sequences centered on TF peak summits and only kept sequences containing primary motif matches and eliminated sequences without primary matches. *"Loading secondary motifs from database" and "Scanning for secondary motifs"*: We performed a spacing distribution analysis using SpaMo from MEME suite(15) from DNA sequences containing primary motif to search for the strongest secondary motif from a motif

database (HOCOMOCO, v11) to identify significantly enriched spacings. The relative spacings

of the primary and secondary motifs in all identified ChIP-Seq peaks were counted and the

probability of each spacing was calculated. A *p-value* was assigned based on the Binomial Test,

using the number of observed secondary spacings falling into the given 1-bp bin, adjusted for the

number of bins tested. *"Sorting significant secondary motifs and spacing" and "Grouping*

redundant secondary motifs": After all the calculations were done, SPICE ranked the non-

redundant secondary motifs with the best spacing, or gap (e.g., 4 bp) that passed the significance

threshold (*p-value* < 0.01) in order of significance. Similar secondary motifs belonging to the

same cluster (e.g., ETS1 and ELF1 belong to the same ETS cluster) were grouped together and

ranked in order of *p-value*. We performed the above step-by-step analysis iteratively for each

individual TF ChIP-Seq and generated the final result of interaction sparse matrix to plot in heat

map.

Cell culture and reagents

MINO cells were cultured in RPMI-1640 medium (Gibco, 11875-003) containing 10% fetal

bovine serum (FBS, Gemini Bio-Products, 100-106) and 1% penicillin-streptomycin (Gemini

Bio-Products, 400-109). Mouse splenic B cells were isolated using the EasySep[TM] Mouse B cell

isolation Kit (STEMCELL technologies, 19854) according to the manufacturer's protocol.

Primary mouse B cells were cultured in RPMI-1640 medium containing 10% FBS, 1%

penicillin-streptomycin and 50 μM 2-mercaptoethanol (Gibco, 21985023). LPS (Escherichia coli

O111:B4) was purchased from Sigma-Aldrich (L3012). Recombinant human and mouse IL-21

protein was purchased from R & D systems.

Mice

Wild-type 6 -10 weeks old female C57BL/6 background mice were purchased from Charles River Laboratories (strain #556). All experiments with mice were conducted under protocols approved by the NHLBI Animal Care and Use committee. NIH guidelines for use of animals in intramural research were followed.

Electrophoretic mobility shift assays

MINO cells were treated with LPS (1 μg ml^{-1}) and IL-21 (100 ng ml^{-1}) for 3 hours. 10^7 cells were washed with 1 ml of ice-cold PBS and resuspended in 1 ml of ice-cold lysis buffer (10 mM HEPES pH 7.9, 10 mM KCL, 0.1 mM EDTA, 0.1 mM EGTA, 1 mM DTT and protease inhibitors). After 10 minutes of incubation on ice, 32 μl of 10% NP-40 was added and vortexed for 10 seconds. The samples were centrifuged at 13,000 rpm for 30 seconds, and the supernatants was discarded. Pellets were washed with 1 ml of ice-cold lysis buffer and centrifuged at 13000 rpm for 30 seconds, supernatants were discarded, and 100 μl of nuclear extraction buffer (20 mM HEPES pH 7.9, 0.4 M NaCl, 1 mM EDTA, 1 mM EGTA, 1mM DTT and protease inhibitors) was added to each tube and vortexed. The samples were incubated on ice for 30 minutes and spun out at 13,000 rpm for 10 minutes. The supernatant (nuclear extract) was transferred to a fresh tube and the pellet was discarded. The protein concentration was measured using the Pierce^{TM} BCA protein assay kit – reducing agent compatible (Cat. No. 23250). IRDye 700-labeled and non-labeled probes were purchased from IDT DNA technologies. The EMSA reactions were set up according to the manufacturer's protocol (LI-COR, P/N: 829-07910). 5 μg of MINO nuclear extract was used per reaction. For super-shift assays, the nuclear extract was pre-incubated for 20 minutes on ice with anti-cJUN rabbit mAb (clone 60A8) from Cell

Signaling technologies (#9165S) or with anti-IKZF1 (clone IK14), provided by Dr. Katia

Georgopoulos, Massachusetts General Hospital, Boston, MA. Recombinant human cJUN

(ab84134), cFOS (ab56280) and IKZF1 (ab169877) proteins were purchased from Abcam.

Equimolar concentrations of recombinant cJUN and cFOS proteins were mixed together and

incubated on ice for 20 minutes to generate recombinant AP1 protein for EMSA. 300 ng of

recombinant AP1 and 1 µg of recombinant IKZF1 was used per EMSA reaction. 10X orange

loading dye was purchased from LI-COR (P/N 927-10100). The samples were run on a 4 - 12%

TBE gel (Invitrogen, EC62352BOX) in 0.5 X TBE buffer (KD medical, RGE-3330).

Co-immunoprecipitation assays

MINO cells were stimulated for 3 hours with LPS (1 µg ml^{-1}) and IL-21 (100 ng ml^{-1}), and

nuclear co-IP was performed according to the manufacturer's protocol (Active Motif, 54001).

25 x 10^6 cells were used per IP reaction. Protein lysates were immunoprecipitated with

antibodies to cJUN (Cell Signaling Technologies, 9165S), IKZF1 (Sigma-Aldrich, MABE913),

normal mouse IgG (Santa Cruz, sc-2025) and normal rabbit IgG (Cell Signaling Technologies,

2729S). 5 µg of antibody was used per reaction. The protein-antibody complex was captured

using Pierce^{TM} protein A/G magnetic beads (88802). NuPage^{TM} LDS sample buffer (4X)

(Invitrogen, NP0007) and NuPage^{TM} sample reducing agent (10X) (Invitrogen, NP0004) was

used to prepare the IP samples for denaturing western blot. The samples were loaded onto

NuPage^{TM} 4 - 12% bis-tris gels (Invitrogen, NP0335BOX). After gel electrophoresis, the

proteins were transferred onto a PVDF Low fluorescence membrane (Bio-Rad, 1620261). The

membranes were blocked for 1 hour at room temperature with 5% skim milk in Tris-buffered

Saline (TBS). After washing three times with TBS, the membrane was incubated overnight at

4^oC with primary antibodies to cJUN (Cell Signaling Technologies, 9165S), or IKZF1 (Sigma-Aldrich, MABE913). Blots were then washed and probed with secondary antibodies: IRDye 680RD Goat anti-rabbit IgG (LI-COR, P/N 926-68071) or IRDye 800CW Goat anti-mouse IgG (LI-COR, P/N 926-32210) at 1:10000 dilution. The membranes were imaged using ODYSSEY CLx (LI-COR).

Luciferase reporter assays

Mouse splenic B cells were pre-stimulated with LPS (1 µg ml^{-1}) for 24 hours. 5 x 10^6 cells were electroporated with 1 µg of NanoLuc pNL3.1 (Promega, N1031) vector and 0.2 µg of control vector, pGL4.S4 luc TK (Promega) using the P3 Primary cell 4D-nucleofector X kit S from Lonza (V4XP-3032) according to the manufacturer's protocol. The wild-type and mutant oligos were cloned into pNL3.1 vector using XhoI and HindIII restriction sites. After electroporation, the cells were stimulated with 1 µg ml^{-1} LPS for 24 hours. Dual luciferase reporter activity was measured using the Nano-Glo Dual-Luciferase Reporter assay (Promega, N1630). The luciferase activity data shown is relative to the control pGL4.S4 luc TK activity. Primary mouse CD8$^+$ T cells were purified from spleens from WT C57BL/6 mice. Cells were activated for 24 hours with anti-CD3 (2 µg ml^{-1}) and anti-CD28 (1 µg ml^{-1}). Cells (0.5 x 10^6) were then transfected with 1 µg nanoluciferase reporter constructs by nucleofection and stimulated immediately for 24 hours with IL-21 or anti-CD3 + anti-CD28 or the combination of IL-21 with anti-CD3 + anti-CD28. Luciferase activity was measured 24 hours later and expressed as RLU relative to the control plasmid.

ChIP-Seq library preparation

For ChIP-Seq experiments, 8-10 million B cells were treated with either LPS (1 µg ml^{-1}) or LPS + mouse IL-21 (100 ng ml^{-1}) for 3 hours. Immunoprecipitation was performed overnight at 4°C using antibodies to cJUN (Cell Signaling Technologies, 9165S), IKZF1 (Active Motif, 39291), normal mouse IgG (Santa Cruz, sc-2025), or normal rabbit IgG (Cell Signaling Technologies, 2729S). ChIP-Seq DNA libraries were prepared with the KAPA LTP Library Preparation Kit and barcoded with NEXTflex DNA barcodes, quantified, and sequenced on an Illumina HiSeq 3000 system.

Bioinformatics analyses

Sequenced reads (50 bp, single end) were obtained with the Illumina CASAVA pipeline and mapped to the mouse genome mm10 (GRCm38, December 2011) using Bowtie 2.2.6. Only uniquely mapped reads were retained. The mapped outputs were converted to browser-extensible data files, which were then converted to binary tiled data files (TDFs) using IGVTools 2.4.13 for viewing on the IGV browser (https://software.broadinstitute.org/software/igv/). TDFs represent the average alignment or feature density for a specified 20 bps window size across the genome. Peak calling was performed by MACS 1.4.2(8) relative to an IgG library as input control and the p-value threshold was set as 1e^{-10}. Only non-redundant reads were analyzed for peak calling. ChIP-Seq binding intensity heat maps were analyzed and visualized using deepTools. ChIP-Seq co-localization analysis was performed using R package "ChIPseeker", and Reactome pathway analysis was performed using R package "ClusterProfiler".

Data availability

All data generated or analyzed during this study are included in the manuscript and supporting file. The raw and processed datasets of ChIP-Seq are available in Gene Expression Omnibus

with accession GSE230035 (https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE230035,

temporary reviewer's token: uvkzskimxzsjhup)

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Figure 1

Figure 2

A

IP Ab

IB Ab

mIgG | anti-IKZF1 | rIgG | anti-cJun | Input | kDa

anti-cJun — 50

anti-IKZF1 — 70

B

IL10 upstream probes

WT   GAGGTTGCAGTTTCGTTGTGAGTCAGGCCTGCTGA
IKZF1 Mutant   GAGGTTACAATTTCGTTGTGAGTCAGGCCTGCTGA
AP1 Mutant   GAGGTTGCAGTTTCGTTGAGAGTCTGGCCTGCTGA
Double Mutant GAGGTTACAATTTCGTTGAGAGTCTGGCCTGCTGA

Variant IKZF1   AP1

C

Extract – + – + – + – +

1 2 3 4 5 6 7 8

Probe   WT | IKZF1 mut | AP1 mut | Dbl mut

D

Extract – + – + – + – +

Probe   WT | IKZF1 mut | AP1 mut | Dbl mut

E

mIgG | rIgG | Anti-IKZF1 | Anti-cJun

Extract – + + + + +

Super-shift
Shift

1 2 3 4 5 6

Figure 4

A

B
AICE complex
Optimal spacing: 0/4 bps

D
STAT5 tetramer complex
Optimal spacing: 11-12 bps

E

F
CTCF/ETS2 complex
Optimal spacing: 8 bps

Figure S2

All secondary motif from HOCOMOCO database (401)

All primary motifs derived from Encode ChIP-Seq (343)

A

IgG	IKZF1	IKZF1	JUN	JUN

2481

10457

-3k   0   3k

B

anti-IKZF1
anti-JUN
anti-BATF

IL10   CNS9

anti-IKZF1
anti-JUN
anti-BATF

TNFRSF8

C

Human_CNS9:   CACTTTGAGGTTGCAGTTTCGTTGTGAGTCAGGCCTGCTGAGAGCAGT-
              · · |||||||||||||||||||||||||||||||||||||||||||||||| |
Mouse_CNS9:   TGCTTTGAGGTTGCAGTTTCGTTGTGAGTCAGGCCTGCTGAGAGCA-TC

STATs (Conditions)	Identified canonical GAS motif	GAS%	Tetramer likelihood	Optimal Spacing (bp)
STAT1 (MΦ, +IFN-γ)		87.4%	****	10
STAT2 (Th1, +IFN-γ)		38.2%	NA	NA
STAT3 (CD8T, +IL-21)		87.0%	***	11?
STAT4 (Th1)		95.4%	****	11-12
STAT5A (Total T, +IL-2)		99.8%	****	6-7, 11-12
STAT5B (Total T, +IL-2)		100%	****	6-7,11-12