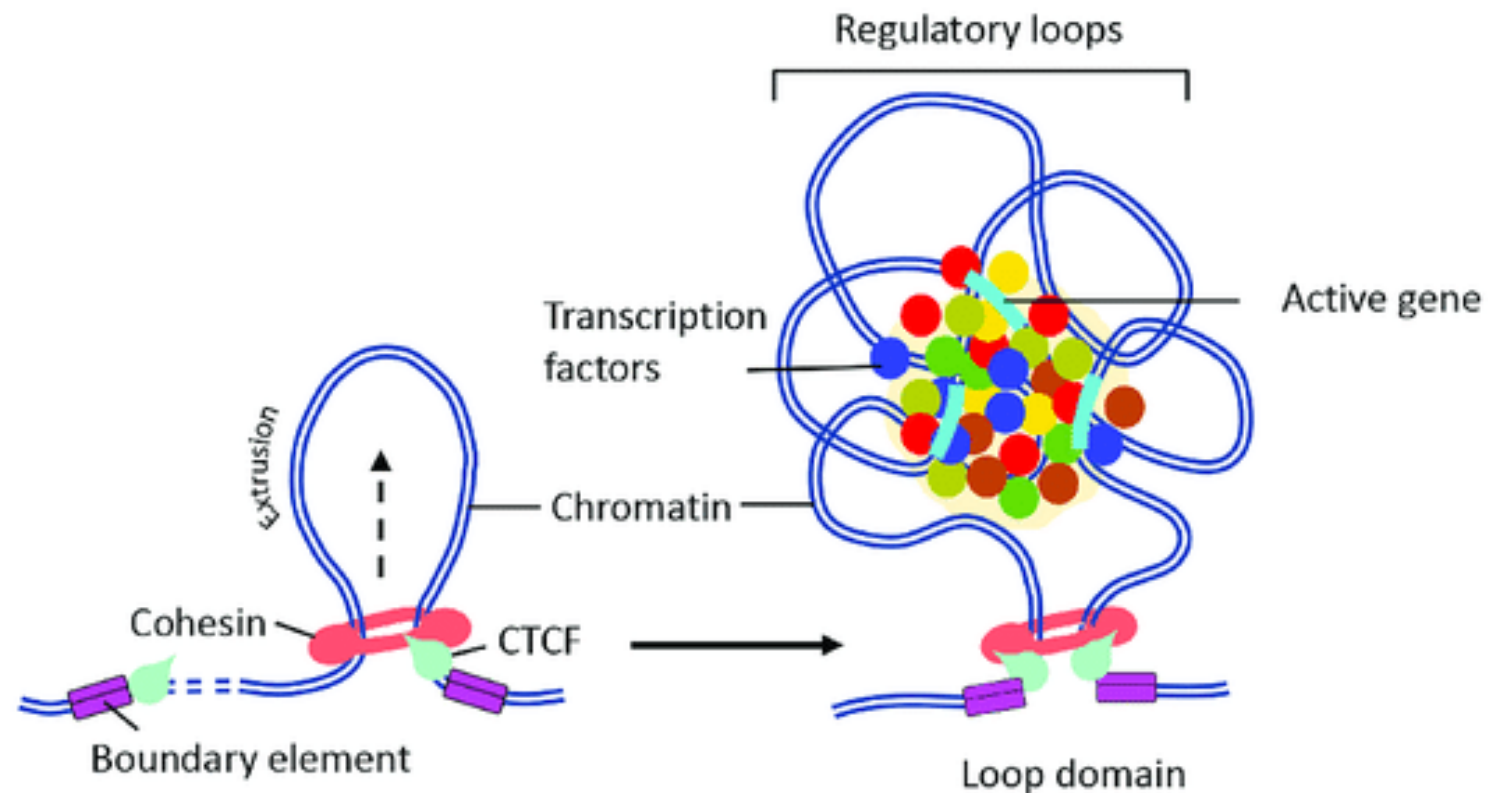
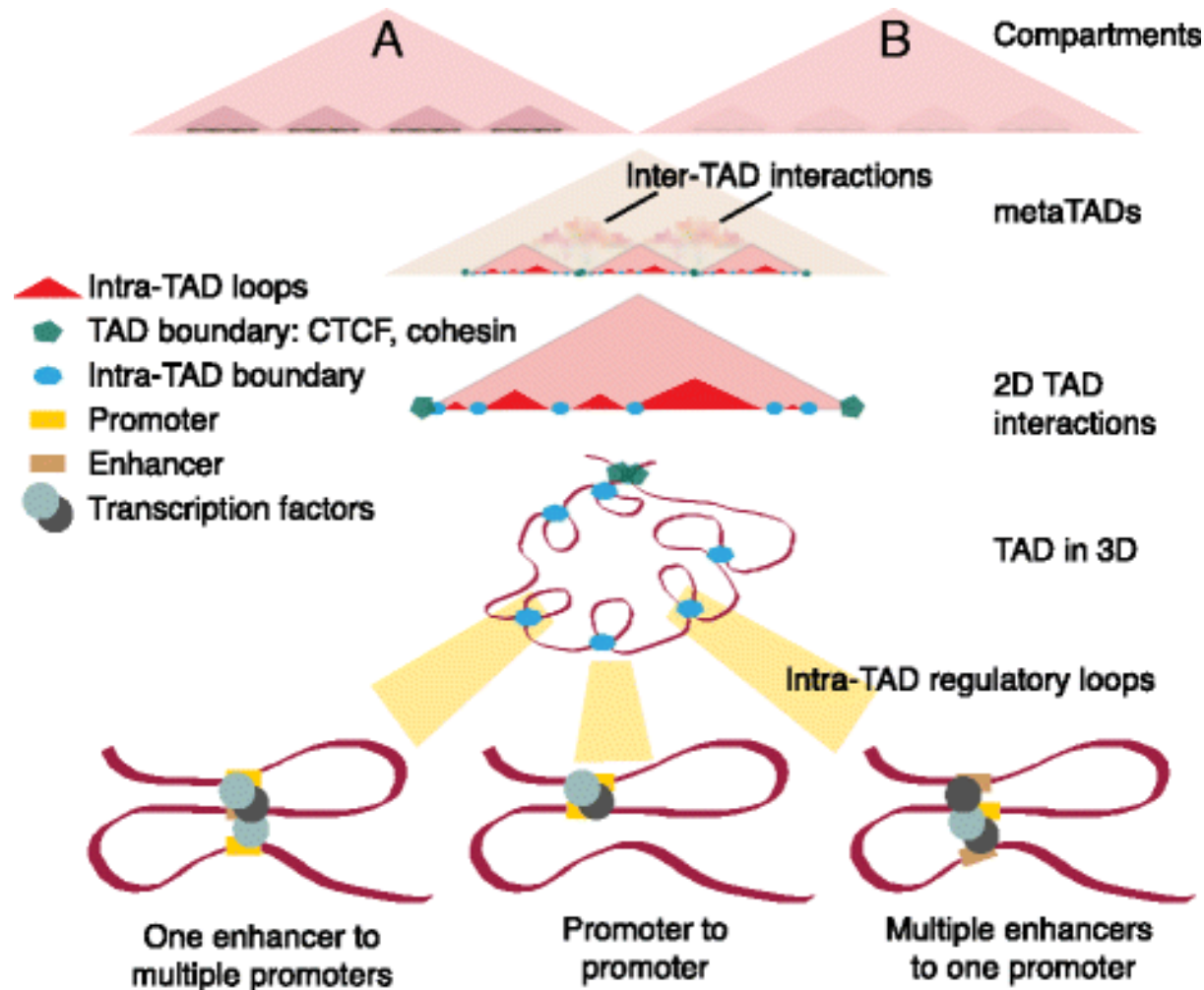


# Thesis proposal: Research on CTCF BINDING SITES and implications for Cancer genomics, Genome Deep Structure across Species, the Sound of Genome

- COHESIN-CTCF BINDINGS IN ACTION --- DNA FOLDING WITHIN 3D SPACE

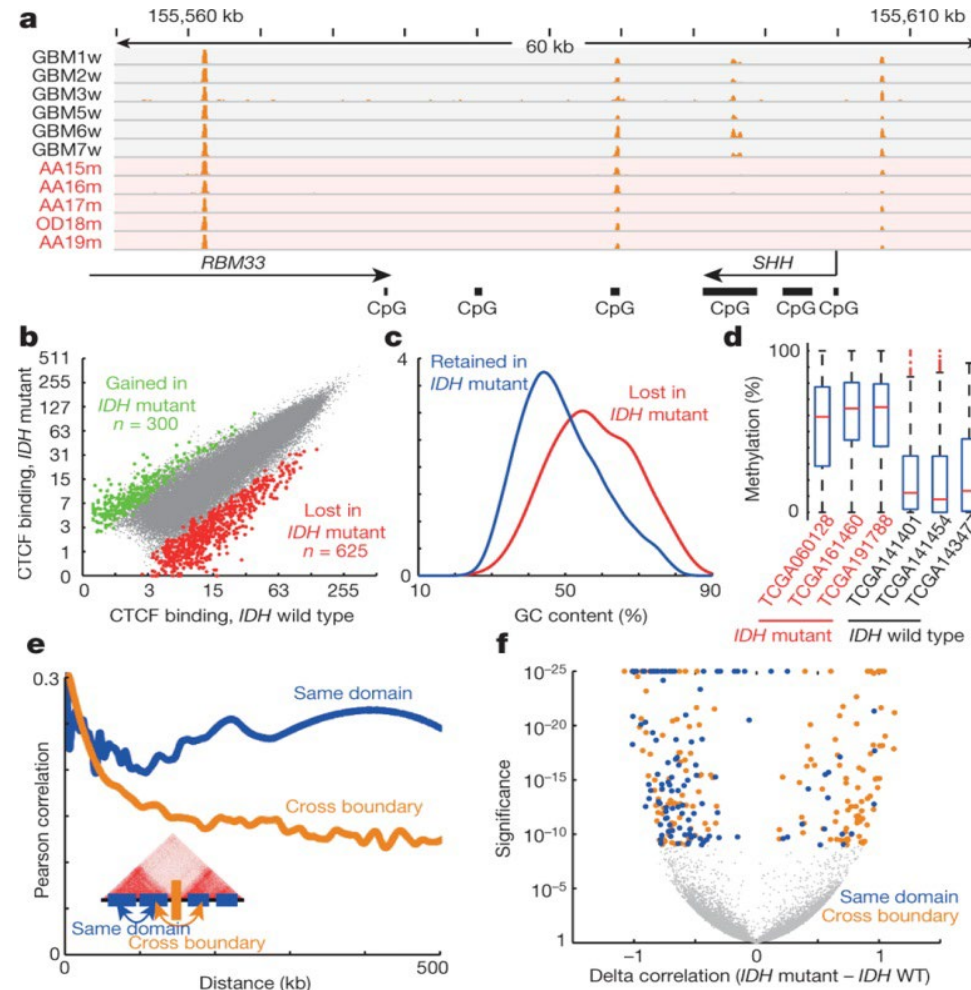


# Topological Domains (TADs) and Loops



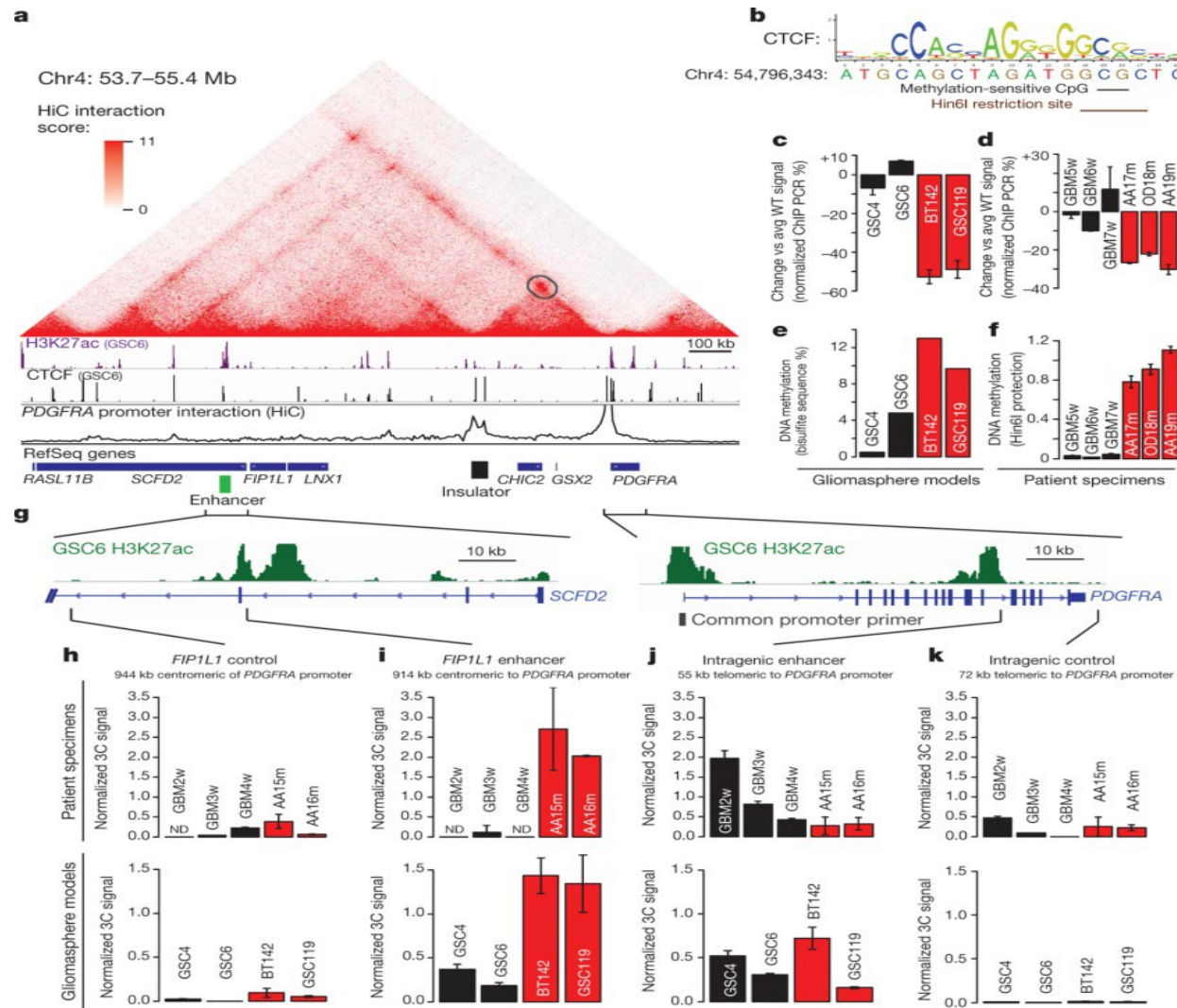
# ORIGIN: Brad Bernstein's Group, Broad Institute

CTCF binding and gene insulation compromised in *IDH* mutant gliomas.



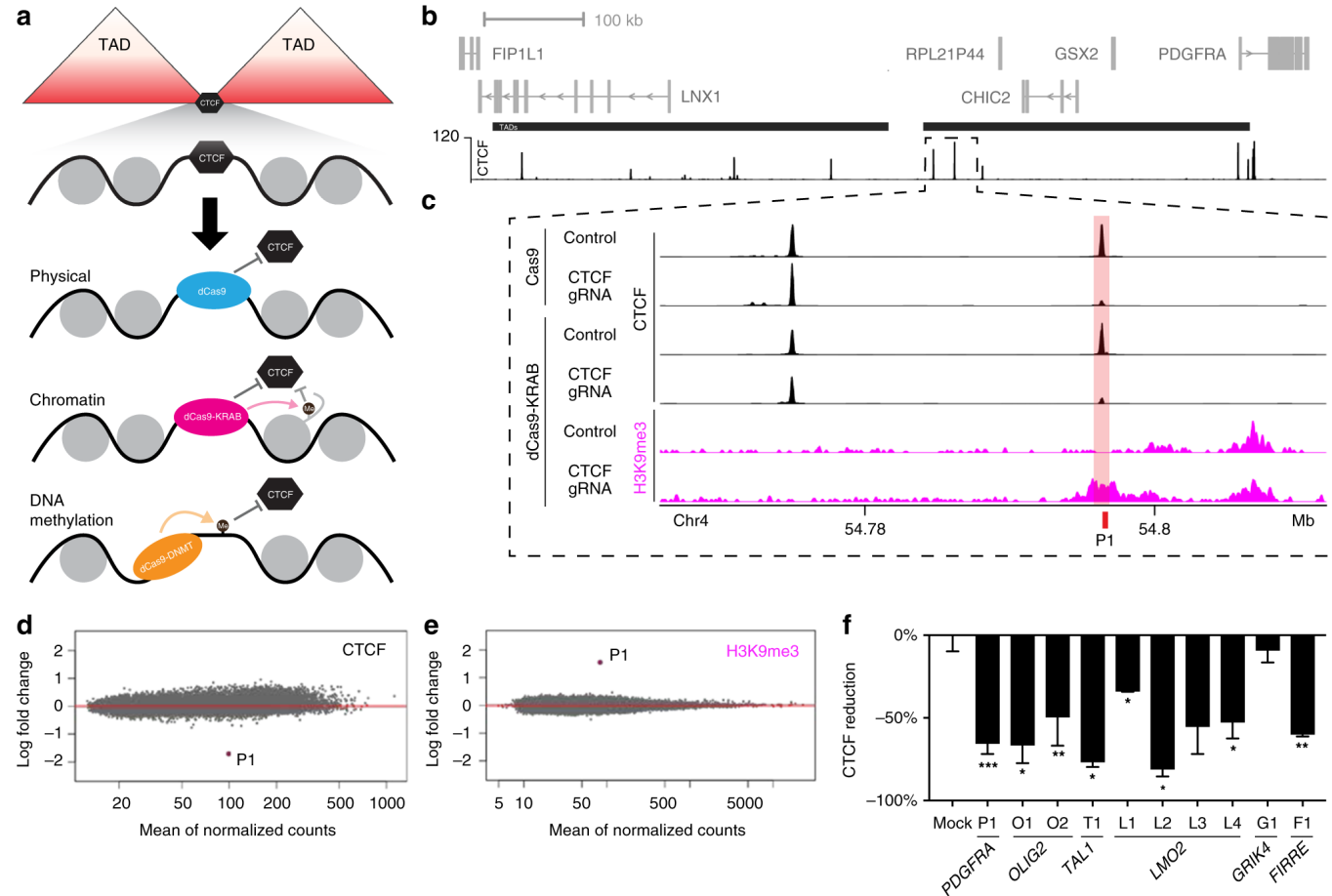
nature

# Insulator loss allows *PDGFRA* to interact with a constitutive enhancer.

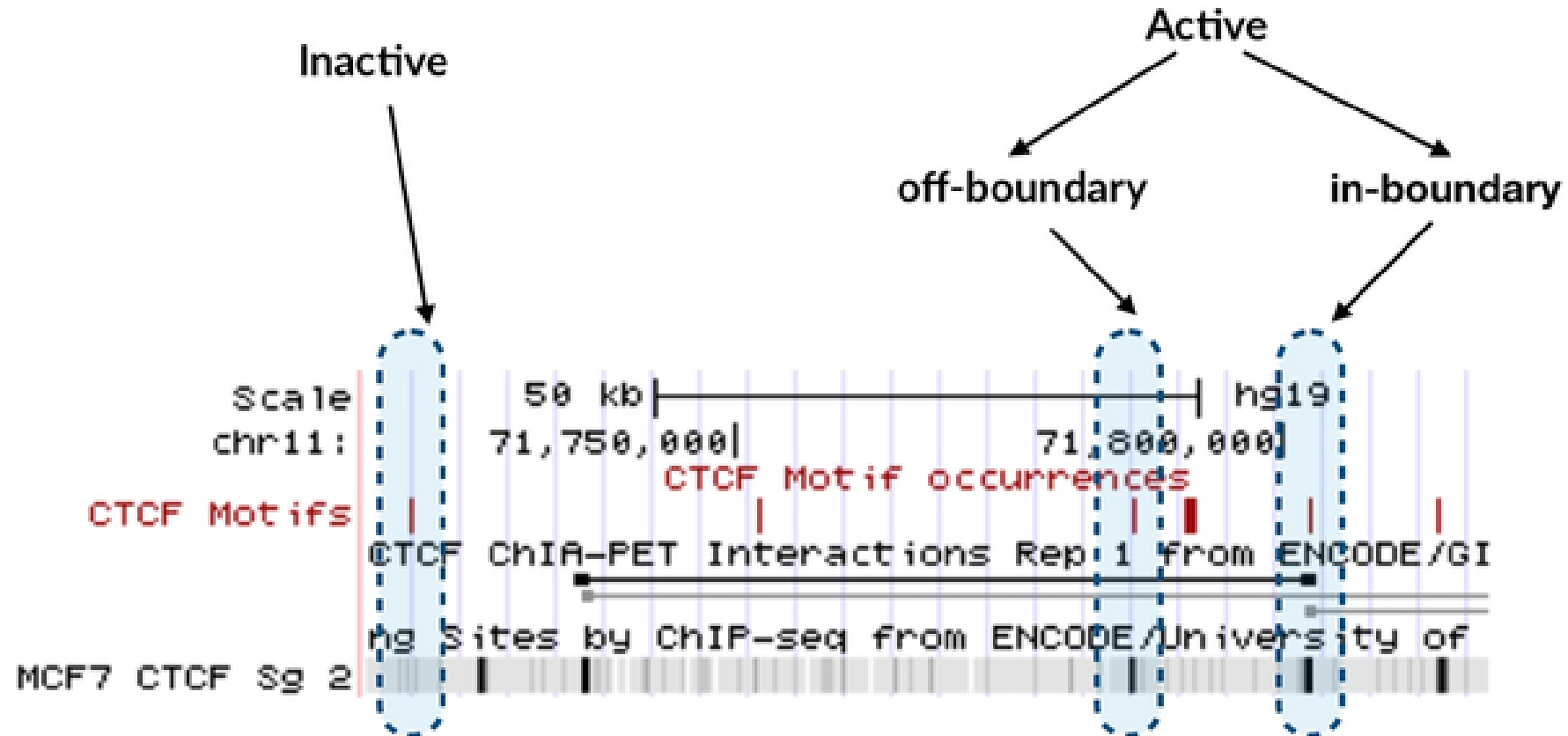


nature

# Epigenome editing strategies for the functional annotation of CTCF insulators



# First Attempt: Big Data, lots of opportunities (so far, unexploited)



## Classification of CTCF motifs, within a short portion of chromosome 11.

Motifs are classified as active (confirmed by a CTCF ChIP-seq peak) and inactive (not confirmed). Active motifs are further divided into in-boundary and off-boundary according to whether they overlap a boundary, as defined by a ChIA-PET experiment.

**Table 1. Summary statistics of the number of boundaries and motifs.**

<b>ChIA-PET DataSet</b>	<b>ChIP-seq cellLine</b>	<b>Number of boundaries</b>	<b>Active in-bnd.</b>	<b>Active off-bnd.</b>	<b>Inactive in-bnd.</b>
<b>MCF7</b>	<b>MCF7</b>	<b>34,052</b>	<b>11,825</b>	<b>16,570</b>	<b>1,321</b>
<b>hESC</b>	<b>H1-hESC</b>	<b>47,274</b>	<b>11,907</b>	<b>6,929</b>	<b>2,113</b>
<b>Hn1sz</b>	<b>GM12878</b>	<b>16,437</b>	<b>12,815</b>	<b>15,840</b>	<b>323</b>

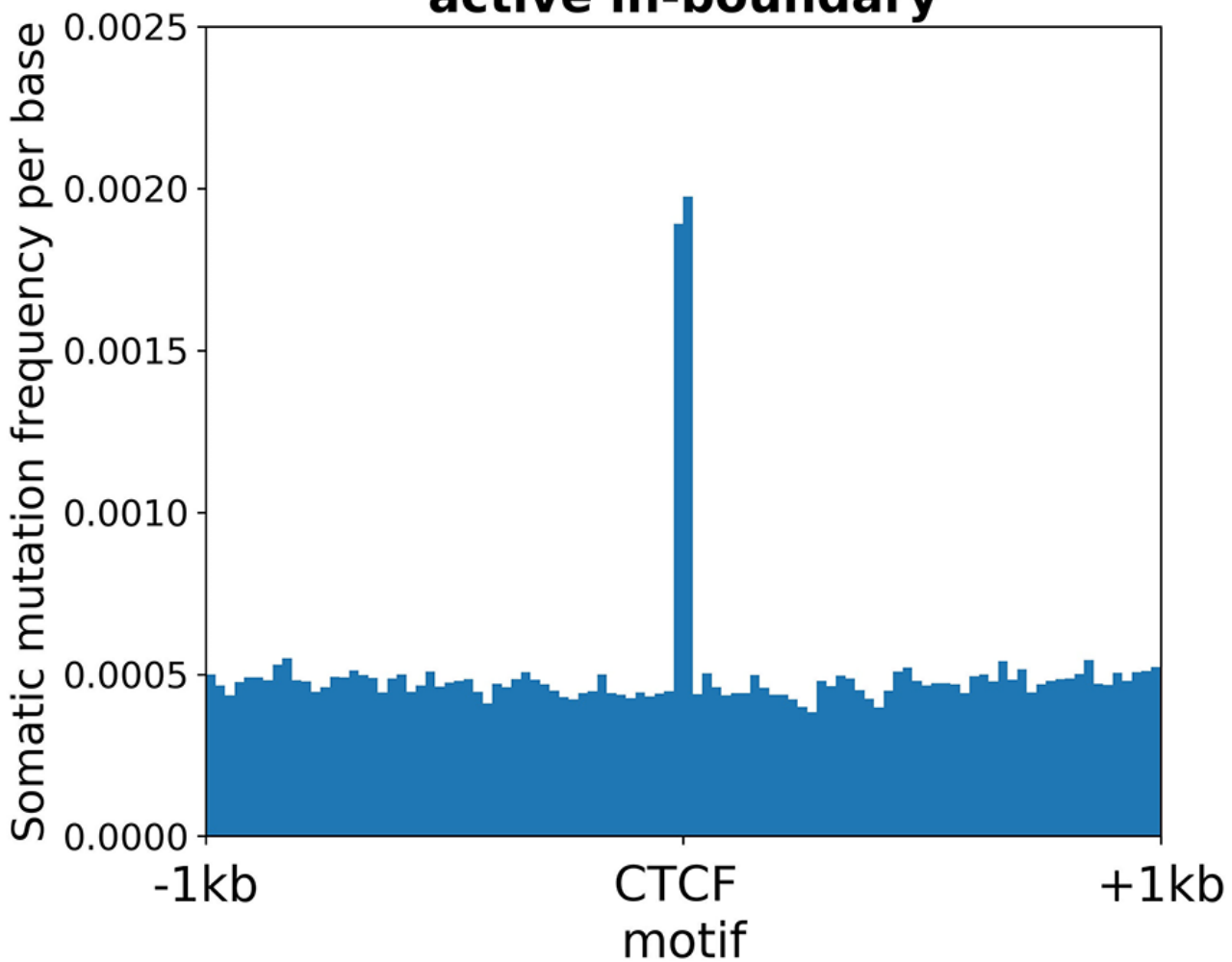
<https://doi.org/10.1371/journal.pone.0227180.t001>

Pinoli P, Stamoulakatou E, Nguyen AP, Rodríguez Martínez M, Ceri S (2020) Pan-cancer analysis of somatic mutations and epigenetic alterations in insulated neighbourhood boundaries. PLOS ONE 15(1): e0227180. <https://doi.org/10.1371/journal.pone.0227180>  
<https://journals.plos.org/plosone/article?id=10.1371/journal.pone.0227180>



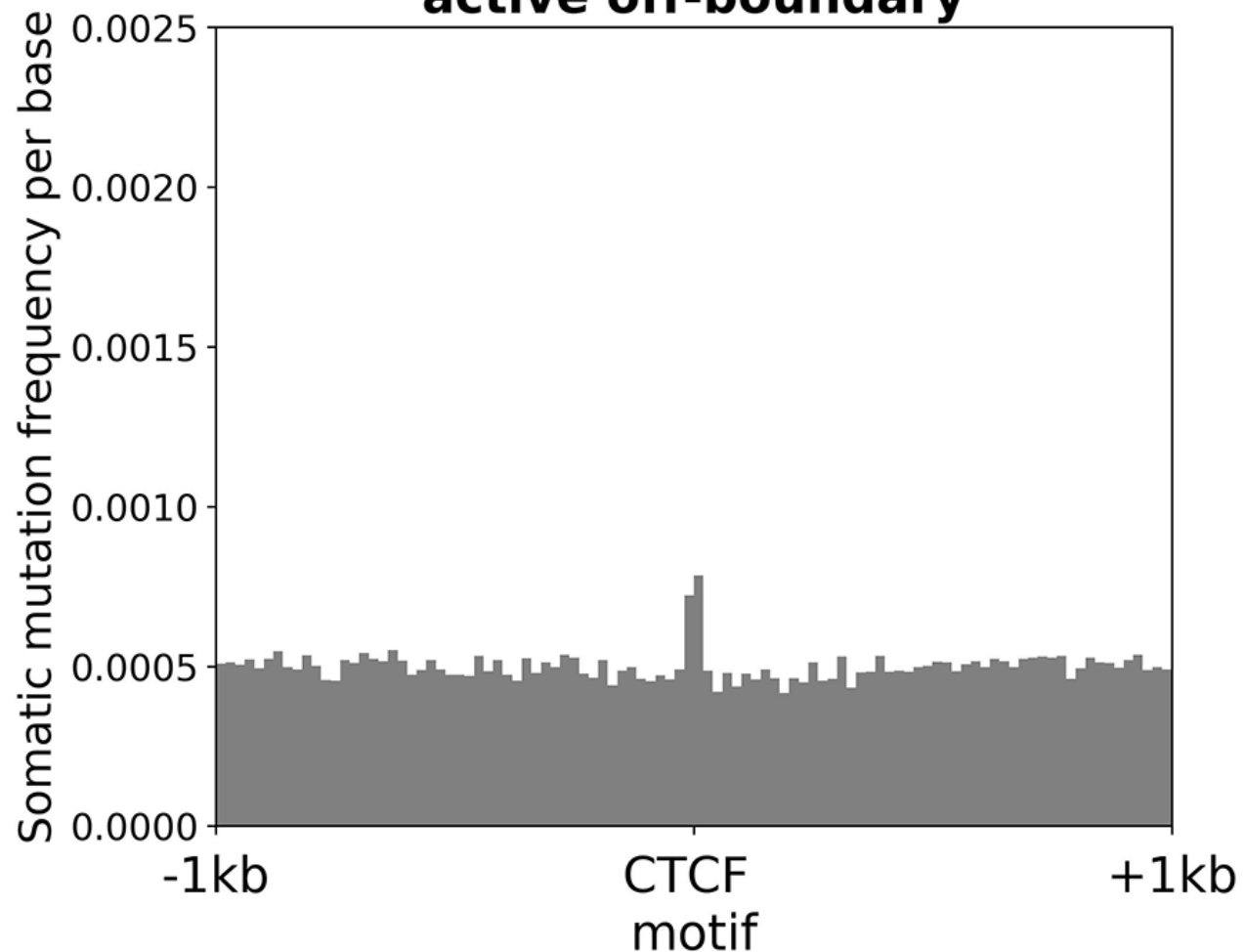
# Pan-cancer analysis of somatic mutations and epigenetic

**active in-boundary**



(a) hESC in-boundary, ESAD mutations

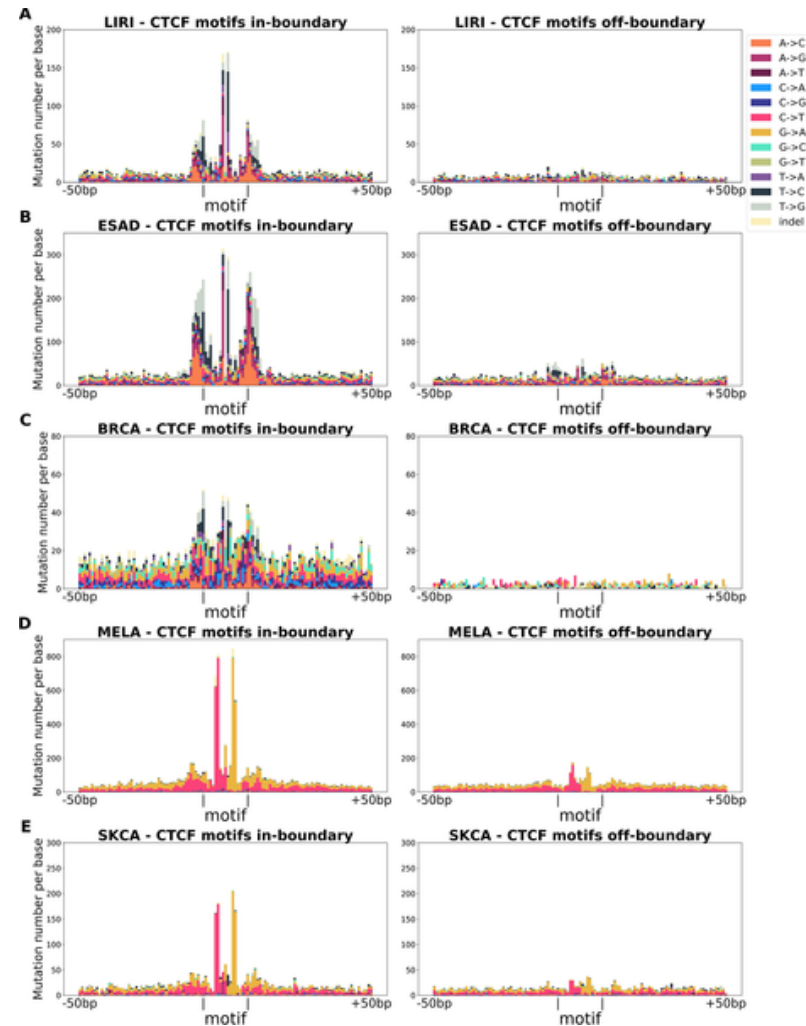
**active off-boundary**



(b) hESC off-boundary, ESAD mutations

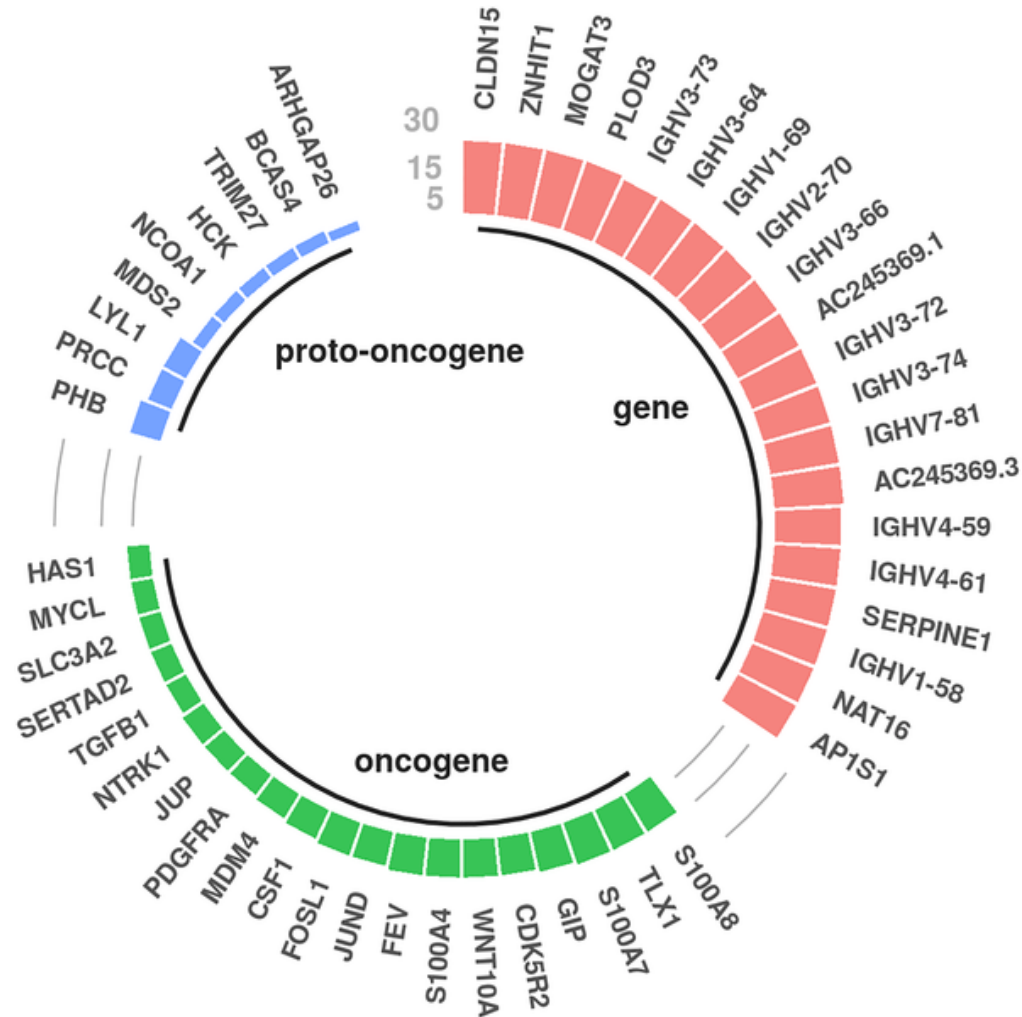


Fig 5. Mutations in active in-boundary CTCF motifs and flanking regions (19 bp  $\pm$ 50 bp).



Pinoli P, Stamoulakatou E, Nguyen AP, Rodríguez Martínez M, Ceri S (2020) Pan-cancer analysis of somatic mutations and epigenetic alterations in insulated neighbourhood boundaries. PLOS ONE 15(1): e0227180. <https://doi.org/10.1371/journal.pone.0227180>  
<https://journals.plos.org/plosone/article?id=10.1371/journal.pone.0227180>

Fig 4. Genes close to mutated CTCF in-boundary motifs in melanoma.



Pinoli P, Stamoulakatou E, Nguyen AP, Rodríguez Martínez M, Ceri S (2020) Pan-cancer analysis of somatic mutations and epigenetic alterations in insulated neighbourhood boundaries. PLOS ONE 15(1): e0227180. <https://doi.org/10.1371/journal.pone.0227180>  
<https://journals.plos.org/plosone/article?id=10.1371/journal.pone.0227180>

**Table 5. Significant alterations in cancer types.**

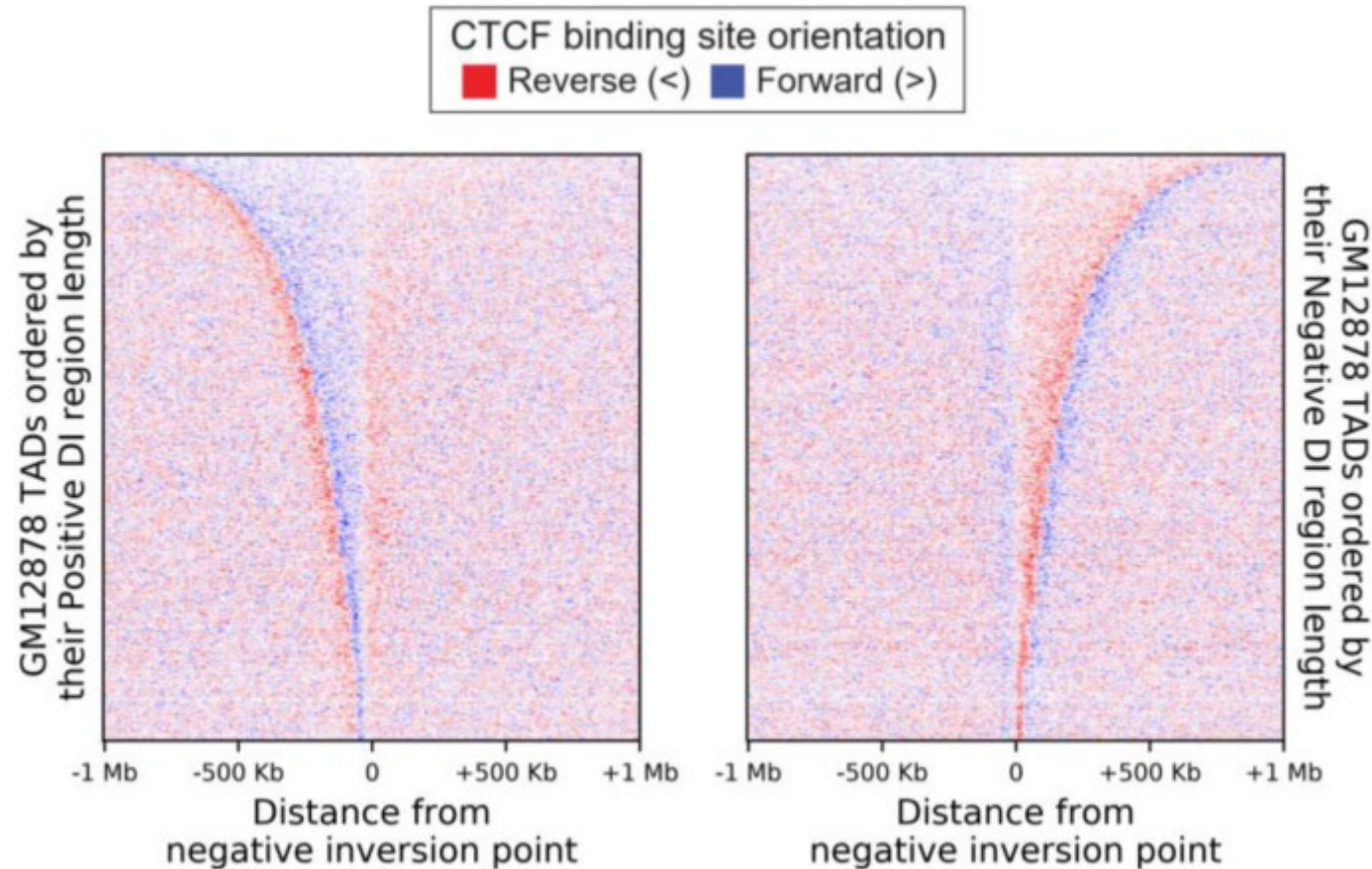
Tumour	Somatic mut.			DNA meth.			CNA		
	h	M	H	h	M	H	h	M	H
BLCA	-	-	-	Y(+)	Y(+)	Y(+)	N	Y	Y
BOCA	-	-	-	-	-	-	-	-	-
BRCA	N	Y	Y	Y(+)	Y(+)	Y(+)	Y	Y	Y
BTCA	-	-	-	-	-	-	-	-	-
COCA	N	Y	Y	-	-	-	-	-	-
EOPC	-	-	-	-	-	-	-	-	-
ESAD	Y	Y	Y	-	-	-	-	-	-
GACA	N	Y	Y	-	-	-	-	-	-
GBM	-	-	-	-	-	-	N	Y	N
HNSC	-	-	-	Y(+)	Y(+)	Y(+)	N	Y	N
KIRC	-	-	-	N	Y(-)	Y(-)	-	-	-
KIRP	-	-	-	Y(-)	Y(-)	Y(-)	N	N	N
LIHC	-	-	-	Y(+)	Y(+)	Y(+)	N	Y	N
LIRI	Y	Y	Y	-	-	-	-	-	-
LUAD	-	-	-	N	Y(-)	Y(-)	Y	Y	Y
LUSC	-	-	-	Y(+)	Y(+)	Y(+)	N	Y	N
MALY	Y	Y	Y	-	-	-	-	-	-
MELA	Y	Y	Y	-	-	-	-	-	-
OV	-	-	-	-	-	-	Y	Y	Y
PACA	-	-	-	-	-	-	-	-	-
PRAD	-	-	-	Y(-)	Y(-)	Y(-)	N	Y	N
RECA	-	-	-	-	-	-	-	-	-
SKCA	Y	Y	Y	-	-	-	-	-	-
SKCM	-	-	-	Y(+)	Y(+)	Y(+)	-	-	-
THCA	-	-	-	Y(+)	N	N	-	-	-
UCEC	-	-	-	Y(+)	Y(+)	Y(+)	N	Y	Y

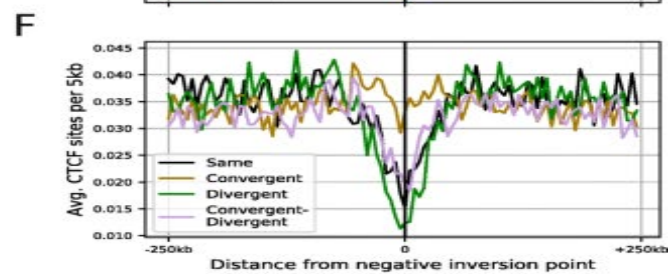
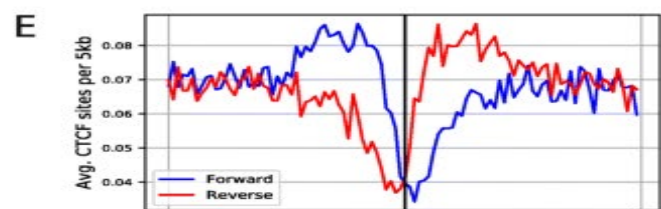
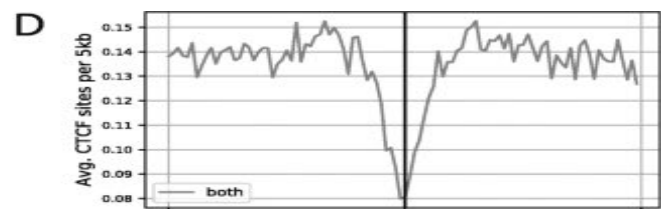
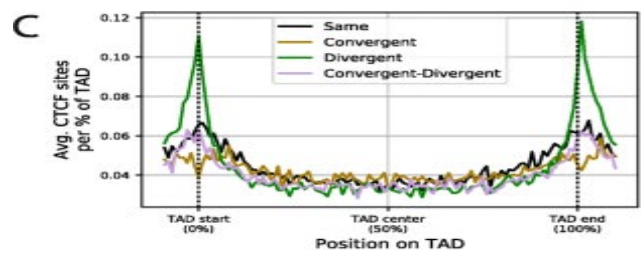
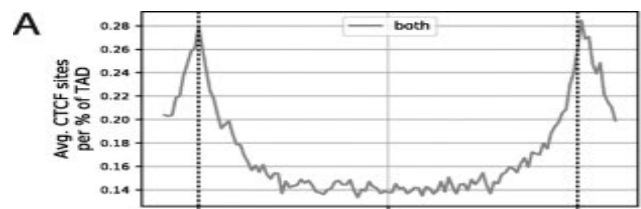
<https://doi.org/10.1371/journal.pone.0227180.t005>

Pinoli P, Stamoulakatou E, Nguyen AP, Rodríguez Martínez M, Ceri S (2020) Pan-cancer analysis of somatic mutations and epigenetic alterations in insulated neighbourhood boundaries. *PLOS ONE* 15(1): e0227180. <https://doi.org/10.1371/journal.pone.0227180>  
<https://journals.plos.org/plosone/article?id=10.1371/journal.pone.0227180>

# Spatial patterns of CTCF sites define the anatomy of TADs and their boundaries

Nanni, Ceri, Logie – Genome Biology 2020

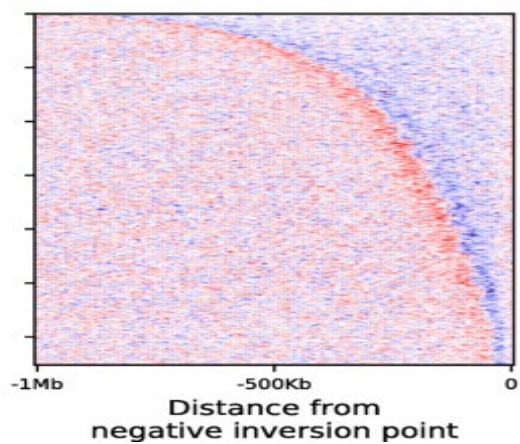




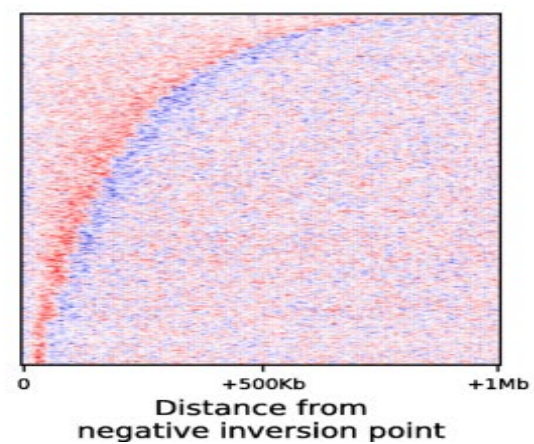
**G**

CTCF binding sites orientation  
■ Reverse ■ Forward

Positive DI regions



Negative DI regions





# CTCF site clusters

Patterns	4-plets	3-plets	2-plets	1-plets
Same	>>>>, <<<< 8,117	>>>, <<< 16,017	>>, << 31,343	> , < 30,560 30,519
Convergent	>><<, >>><, ><<< 11,904	>><, ><< 15,305	>< 14,846	
Divergent	<<>>, <<<>, <>>> 11,984	<>>, <<> 15,304	<> 14,848	
Convergent-Divergent	>><>, ><>>, <><<, <<><, ><><, ><<>, <>><, <><> 28,948	><>, <>< 14,369		
Total	60,953	60,995	61,037	61,079
Pearson $\chi^2$ test p-value	$1.37 \times 10^{-33}$	$2.34 \times 10^{-19}$	$1.95 \times 10^{-10}$	

Classification of CTCF site clusters by relative orientation. CTCF mono-plet, di-plet, tri-plet and tetra-plet adjacent binding sites in all possible patterns of relative orientation. Patterns are divided into four classes: *Same* (all sites oriented in the same direction), *Convergent* (sites pointing towards each other), *Divergent* (sites pointing away from each other) and, for tri-plets and tetra-plets, the class *Convergent + Divergent*.

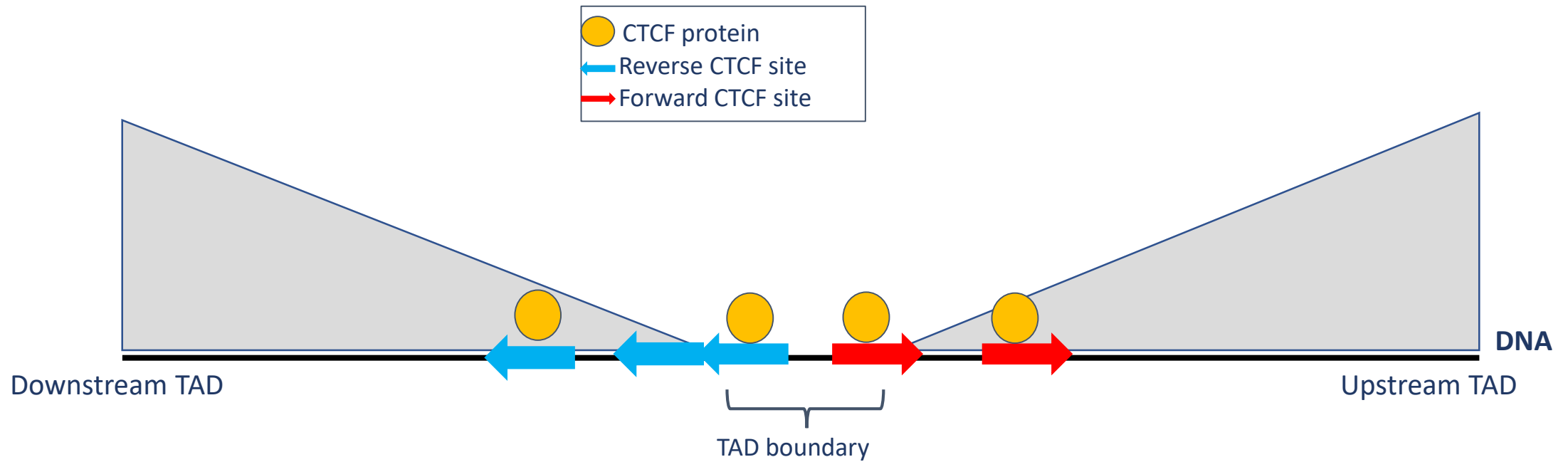
Confirming work on mouse tissues  
 txs to: Lucia Morato Gomez  
 Work with L. Nanni, C. Logie, P. Pinoli

Patterns	4-plets	3-plets	2-plets	1-plets
Same	>>>> , <<<< 48,646 48,112 <b>96,758</b>	>>> , <<< 95,187 94,589 <b>189,776</b>	>> , << 188,788 188,265 <b>377,053</b>	> , < <b>381,740 381,221</b>
Convergent	>><<, >>><, ><<< 45,512 46,538 46,474 <b>138,524</b>	>>< , ><< 93,596 93,670 <b>187,266</b>	>< <b>192,944</b>	
Divergent	<<>>, <<<>, <>>> 45,573 46,475 46,537 <b>138,585</b>	<>> , <<> 93,596 93,671 <b>187,267</b>	<> <b>192,944</b>	
Convergent-Divergent	>><>, ><>>, <><<, <<><, ><><, ><<>, <>><, <><> 48,080 48,020 48,158 48,096 51,246 47,193 47,057 51,184 <b>389,034</b>	><> , <>< 99,267 99,345 <b>198,612</b>		
<b>Total</b>	<b>762,901</b>	<b>762,921</b>	<b>762,941</b>	<b>762,961</b>
<b>p-value</b>	<b>3.68x10<sup>-90</sup></b>	<b>1.39x10<sup>-98</sup></b>	<b>6x10<sup>-23</sup></b>	

*Figure 14: Classification of CTCF site clusters by relative orientation for motifs not found under chIP seq peaks. p values calculated using the Pearson chi-square test.*



# TAD boundaries

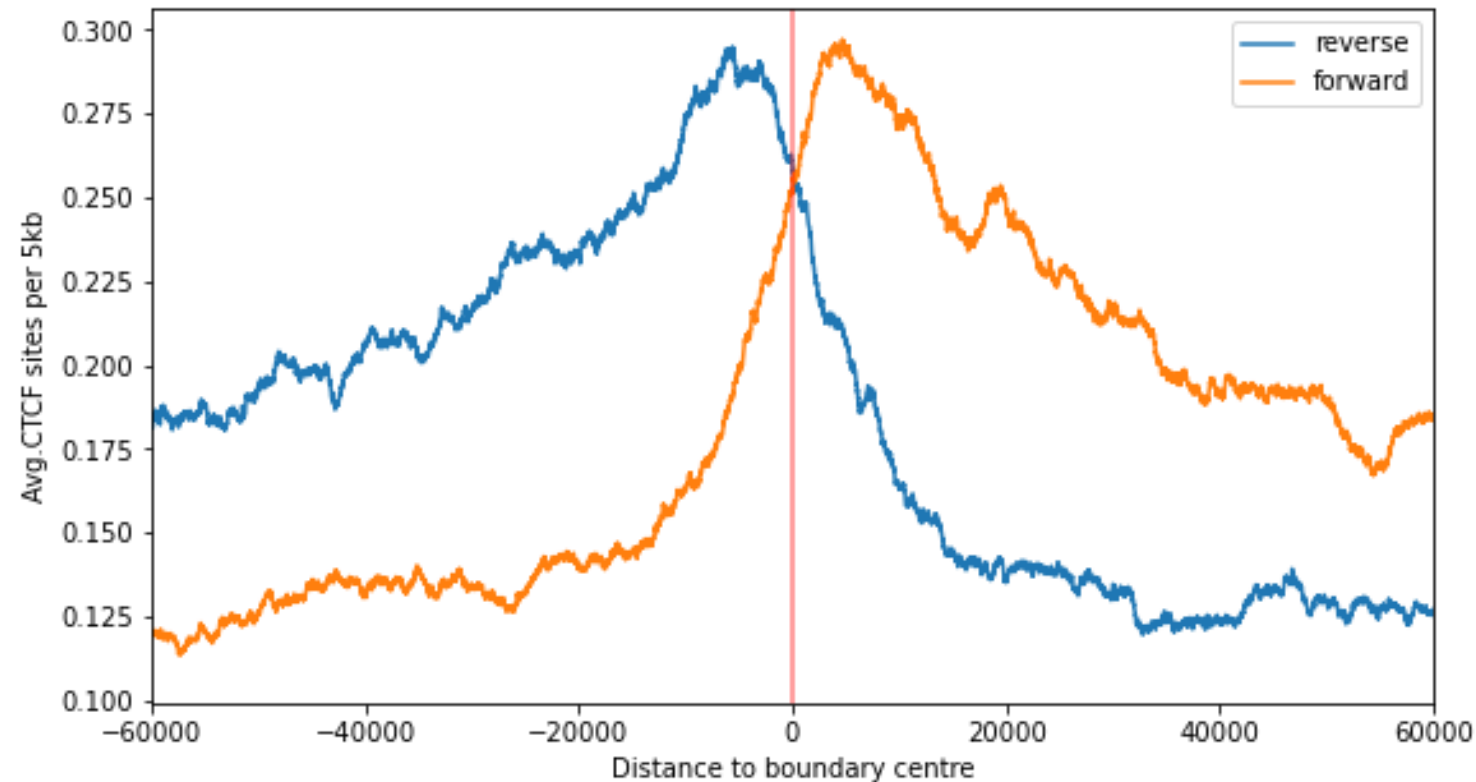


*Figure 15: Current proposed model for CTCF relative orientation pattern at TAD boundaries*

# CTCF motifs under boundaries (1)

Orientation analysis for non-intersecting CTCF motifs found under a peak with a single motif occurrence under boundaries – 100 percentile

*Figure 19: Distribution of reverse (blue) and forward (orange) oriented CTCF motifs in 5kb bins across Louvain boundaries respecting their boundary centre*



37,640 motifs  
16,138 boundaries

# Research Questions – some will be answered by Lucia's work, some by future MS students

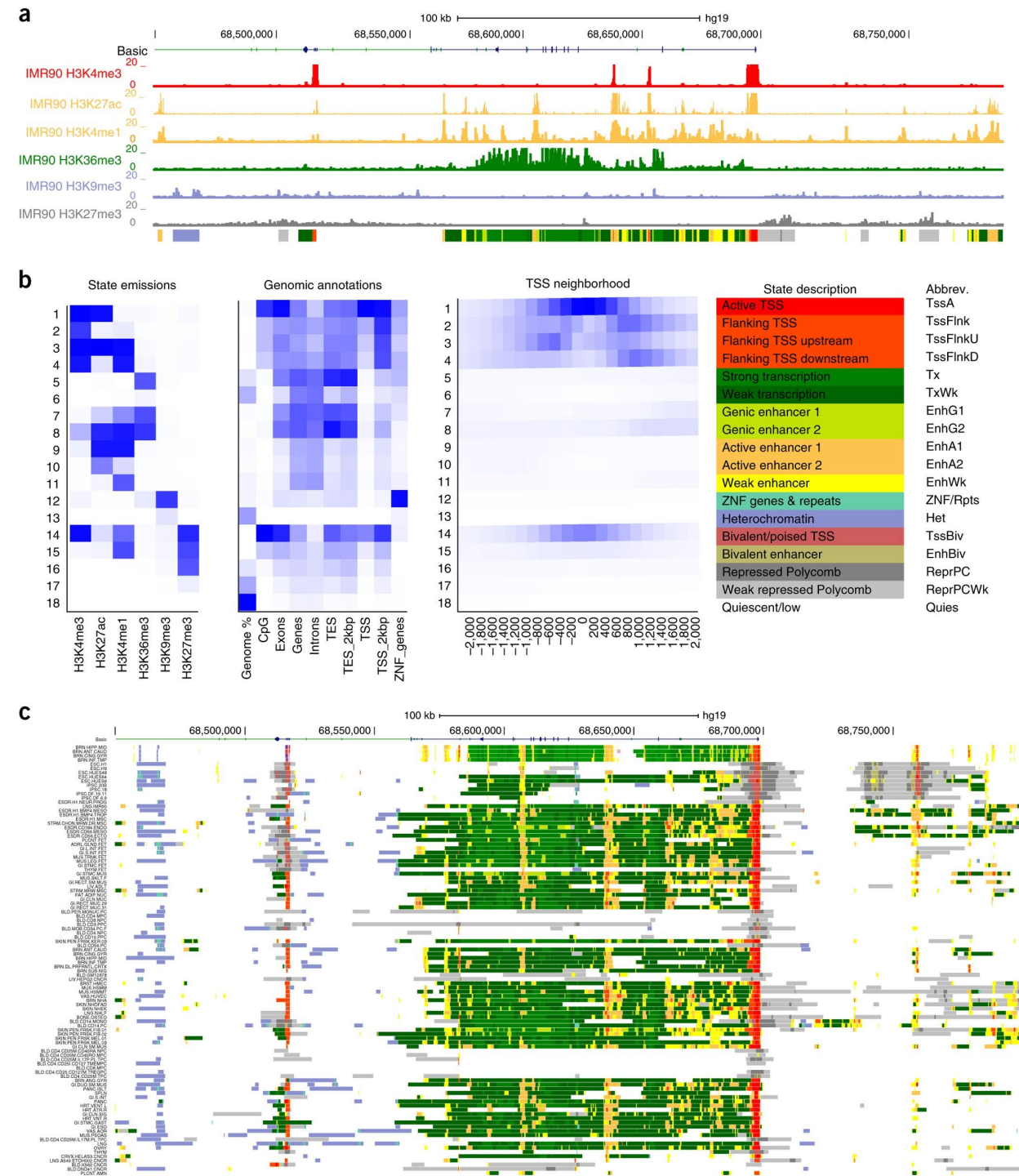
- Conservation of CTCF «strong boundaries» across species (humans and mice)
  - Possibly: separation between «constituents» TADS vs more «transient» loops (tissue-specific, possibly causing cancer)
- Integration with epigenetic data – gene promoters and enhancers (along the direction of work at Bernstein lab, to be studied, and taking advantage of the PLOS partial results).
- Cancer-specific studies, with possible indication for DNA-lab experiments (e.g. use CRISPR technology to artificially remove bindings and measure gene expression for connected pairs enhancer-promoter)

# The sound of genome

- Going beyond humans and mice: is there an «higher level organization»?
- Can we predict missing properties (using ML)?
- CTCF binding directions respond to a sort of «grammar»; is this grammar also responsible of the other epigenetic signals?
- Can we discover the «sound of genome»? The figure looks like a music score, can we create a sound from genomic tracks?

## Figure 1: Overview of ChromHMM.

From: [Chromatin-state discovery and genome annotation with ChromHMM](#) (Nature Methods)



# On the sound of genome... call for MS theses

- If you want to know more, send mail to [Stefano.Ceri@Polimi.it](mailto:Stefano.Ceri@Polimi.it)
- Project will start in September 2023. Theses will be created based upon active collaborations at the time of first contact.
- Potential players:
  - Colin Logie (nejmegen)
  - Luca Nanni (human technopole)
  - Augusto Sarti (Sound Engineering Master Director, POLIMI)
    - + some students from sound engineering
  - Luca Francesconi (composer)
  - Several PhDs