

# Klasyfikacja obszarów funkcjonalnych

Wykład dla biotechnologów

Bartek Wilczyński

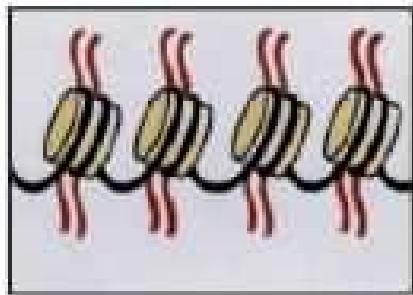
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12.12.2013

# Modyfikacje histonów a chromatyna

The Histone Code

active/open chromatin



inactive/condensed chromatin

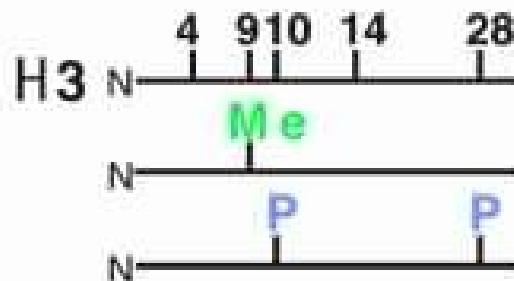
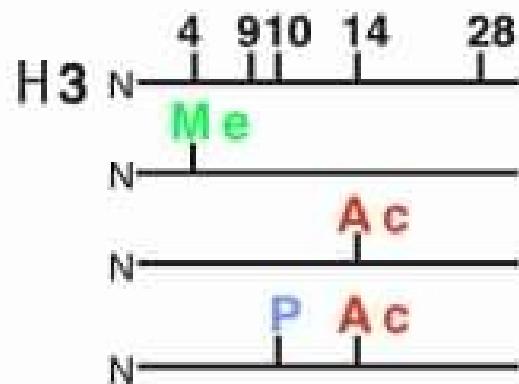
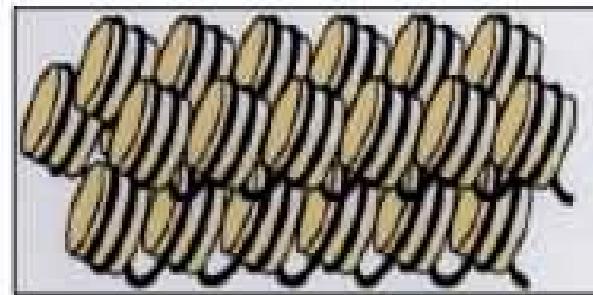
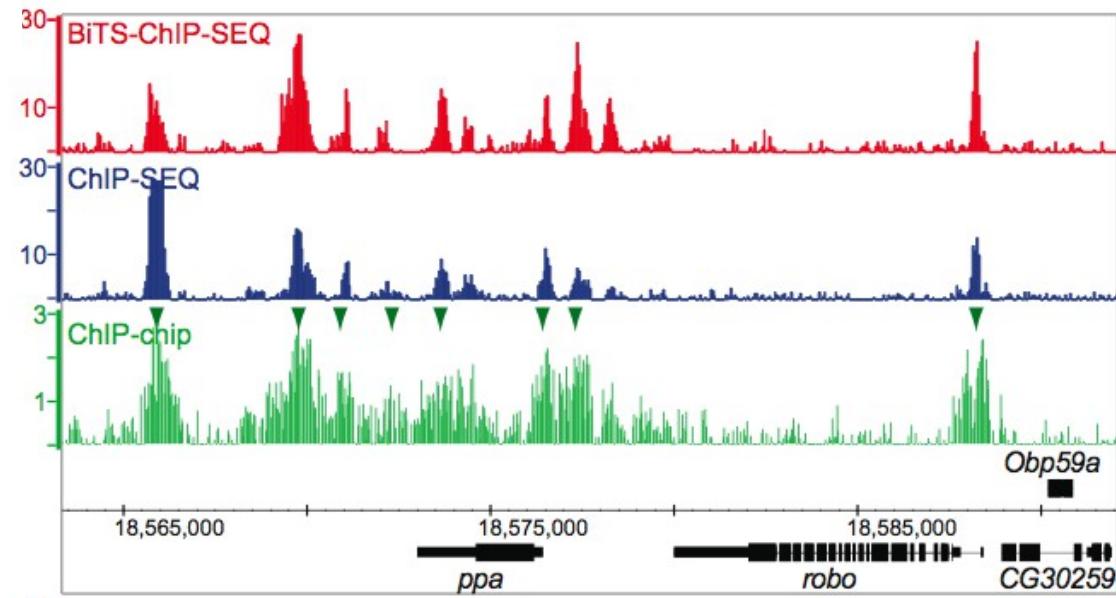
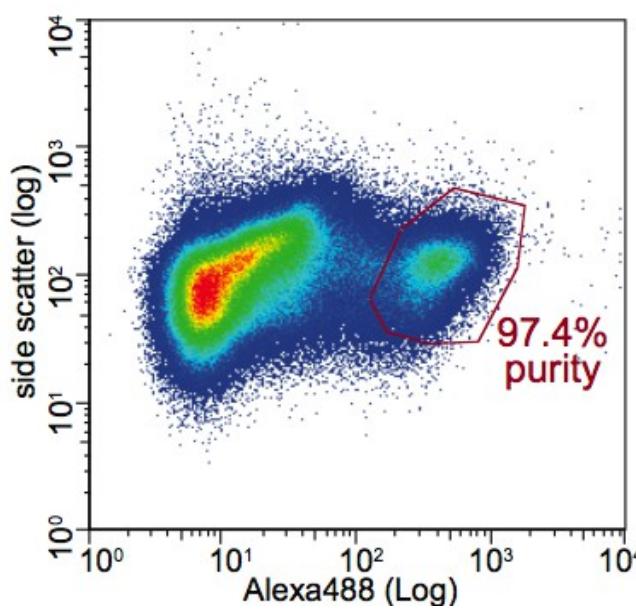
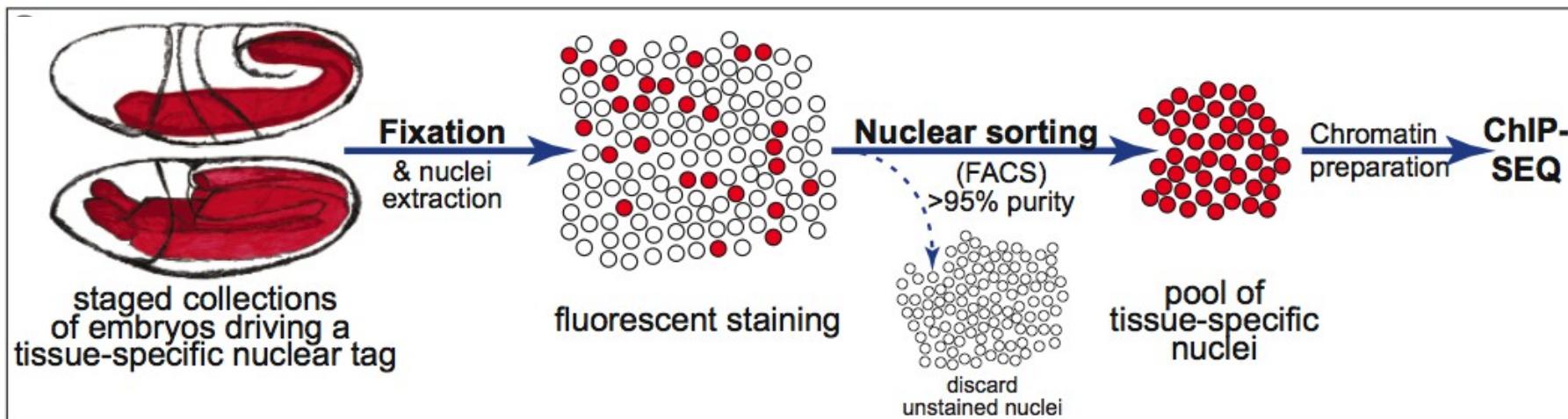


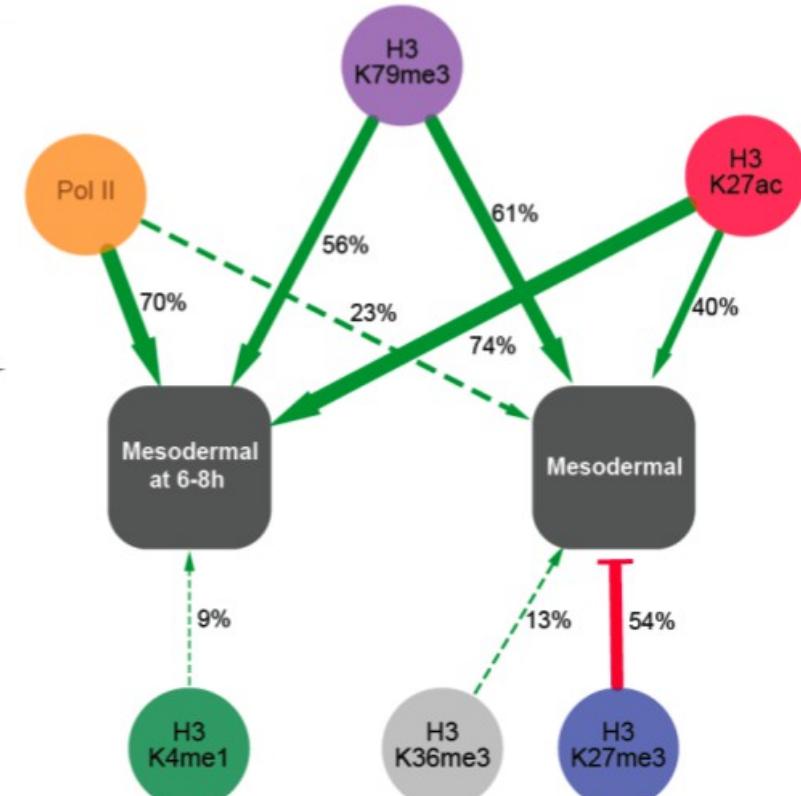
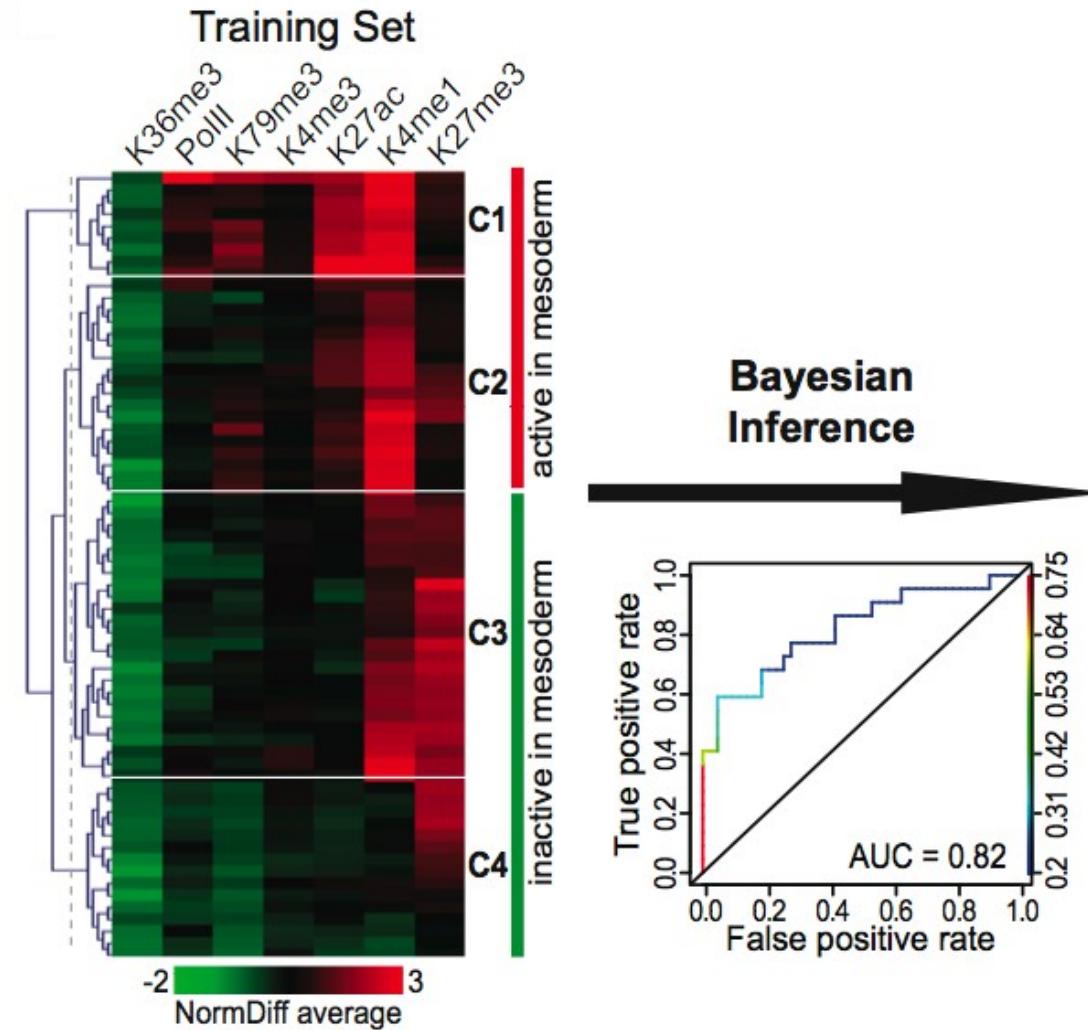
Figure 4

# Modyfikacje specyficzne dla tkanki



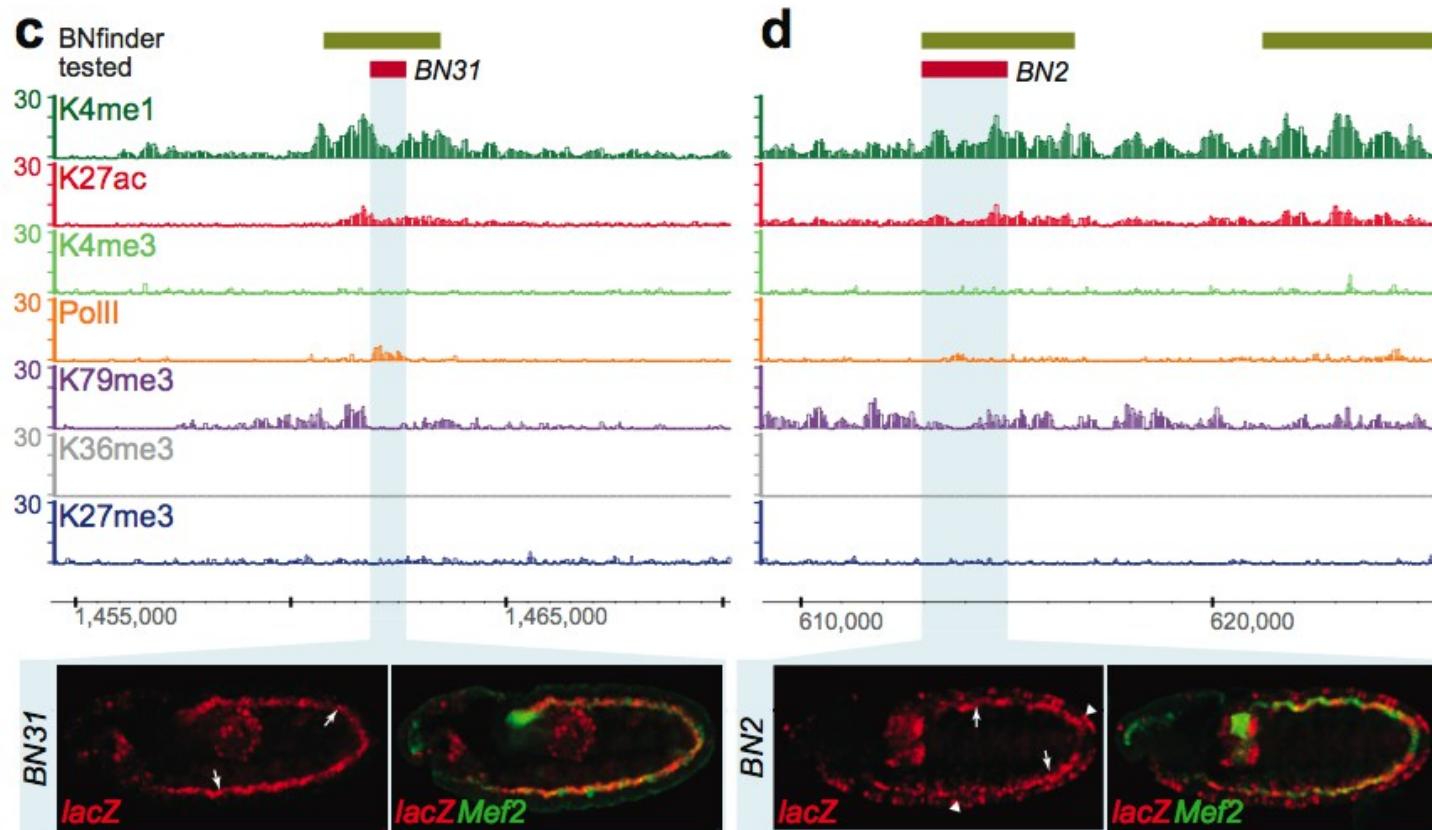
Bonn et al. Nat. Genet, 2012

# Stworzenie klasyfikatora



Bonn et al. Nat. Genet, 2012

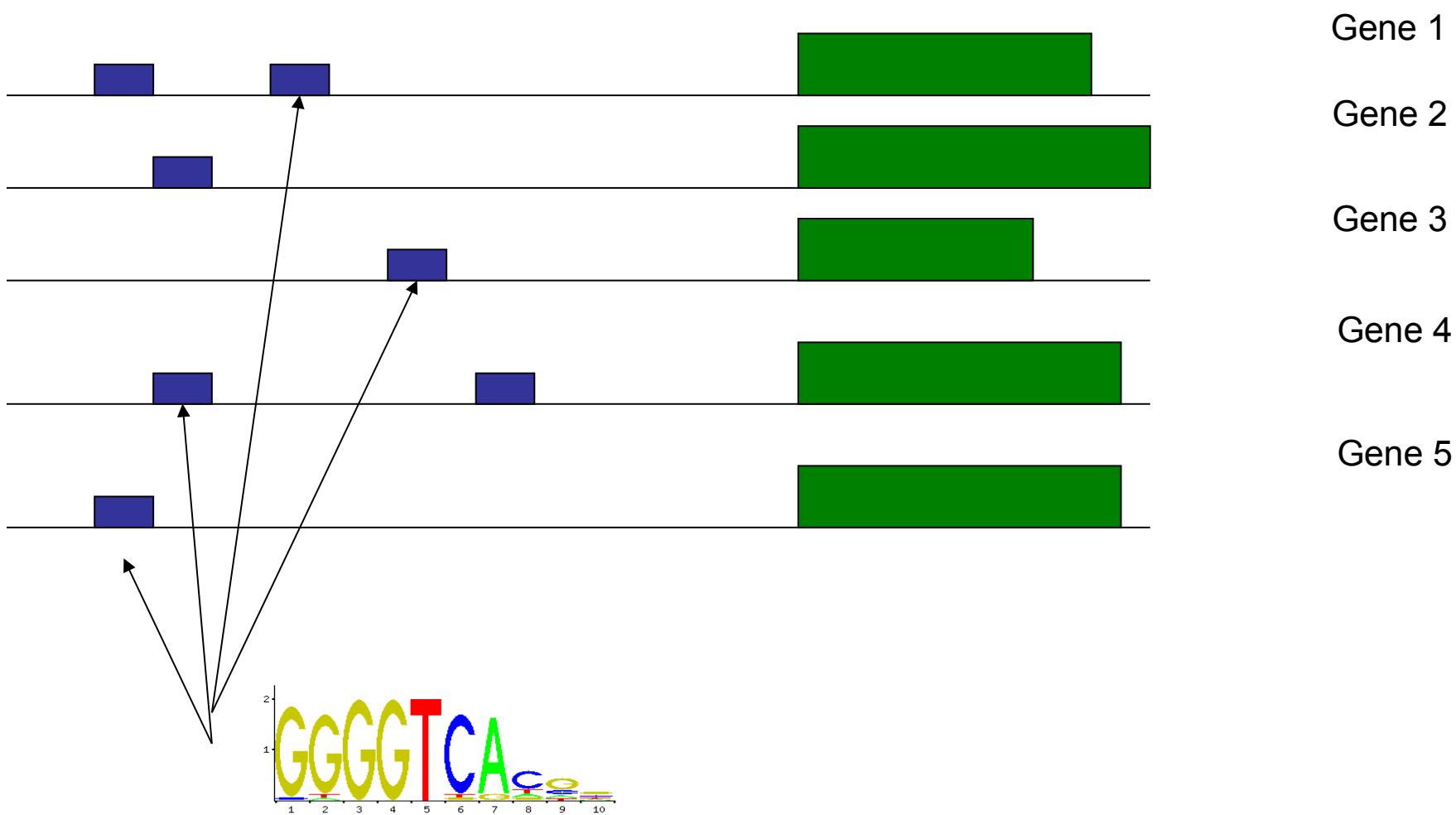
# Weryfikacja eksperymentalna



- 12 pozytywnych i 4 negatywne predykcje
- >90% prawidłowo! (1 pozytywna pomyłka)

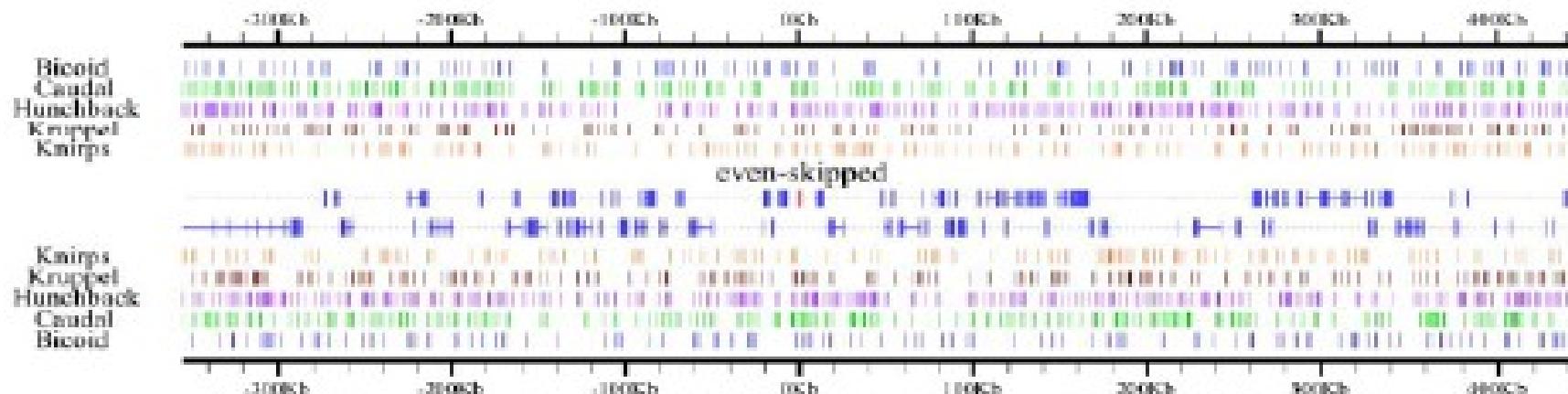
Bonn et al. Nat. Genet, 2012

# Znajdowanie nowych motywów

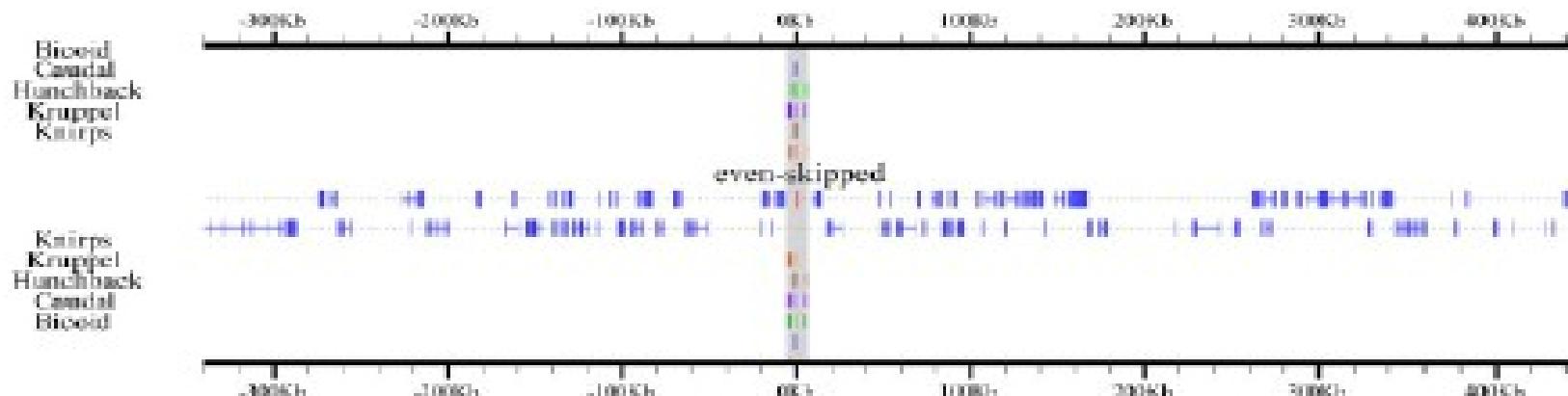


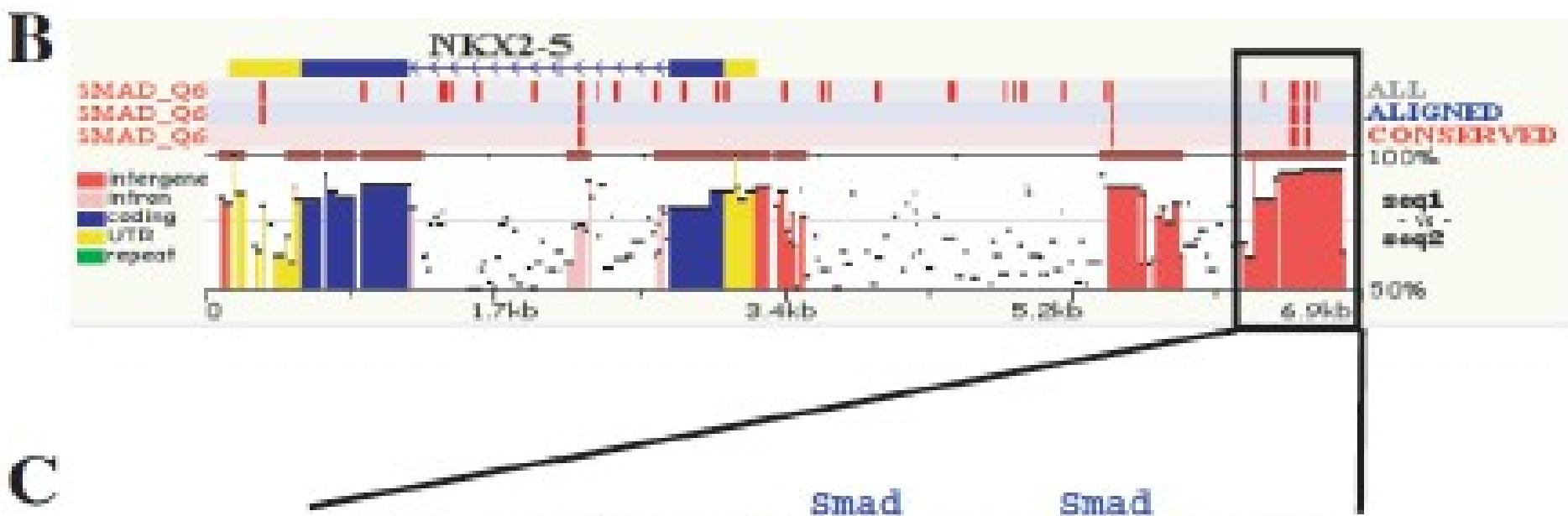
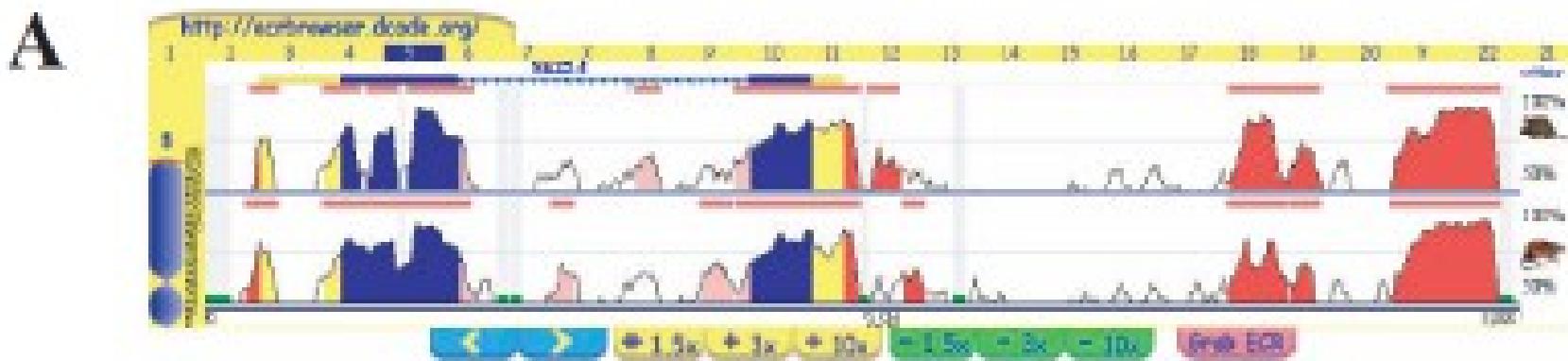
## Szukanie Enhancerów przy pomocy motywów

### (A) High stringency matches



### (B) High stringency matches and clustering filter

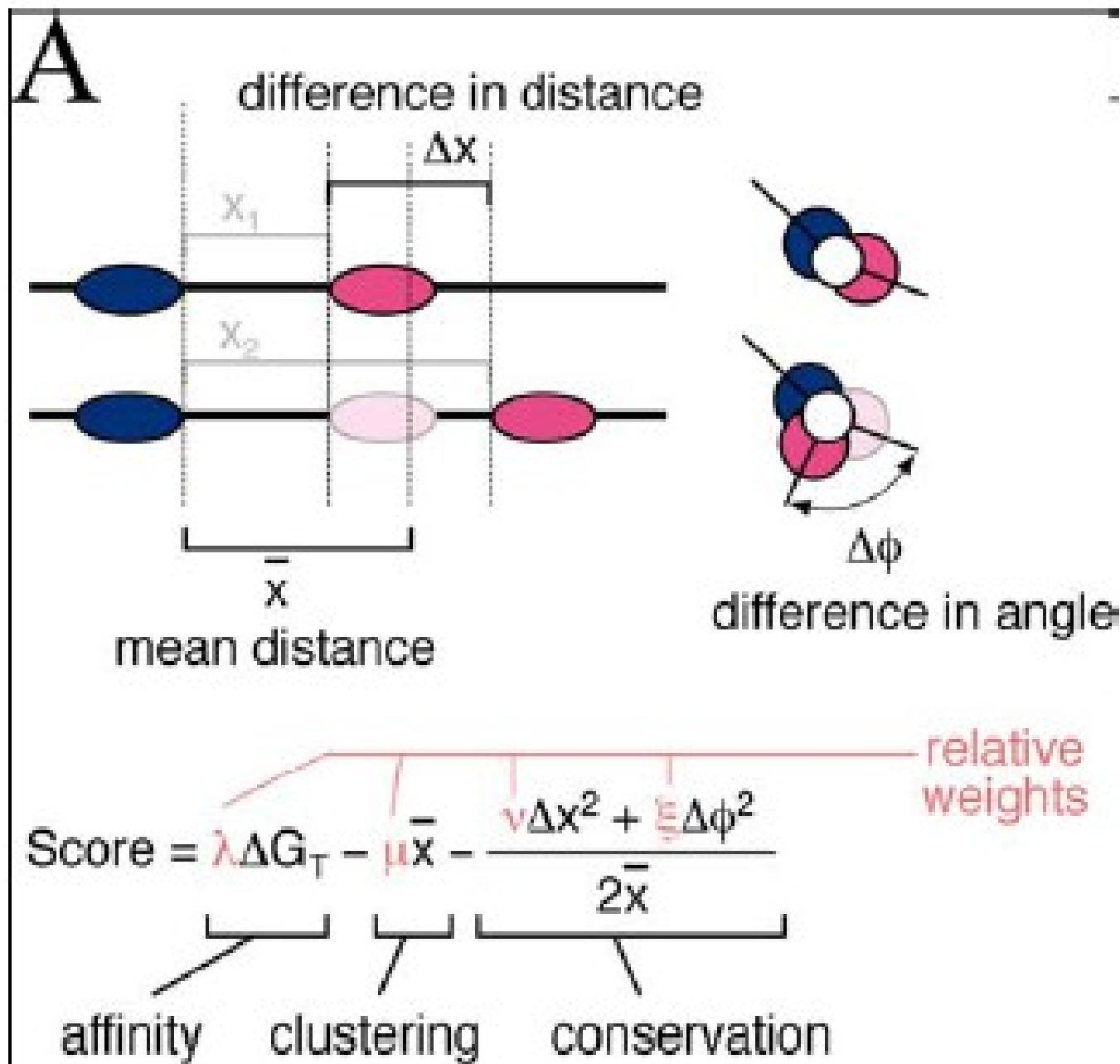




**Smad**                   **Smad**

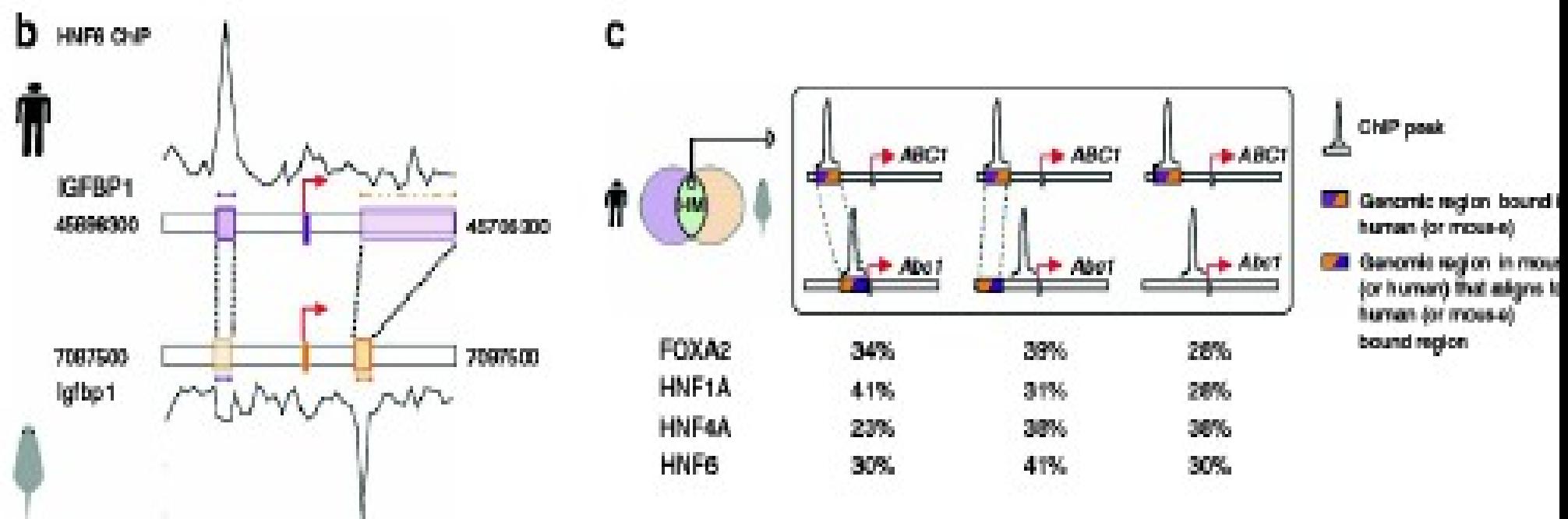
Human	GGAAATGTCATTAATGGCTTGCGCAAGCGCATTCGCAACACCGCGTTATCG 	*****
Mouse	GGAAATGTCATTAATGGCTTGCGCAAGCGCATTCGCAACACCGCGTTATCG 	*****

The EEL method (Halikas et al. Cell, 2006) aligns binding sites from promoter regions of homologous genes using a special function:



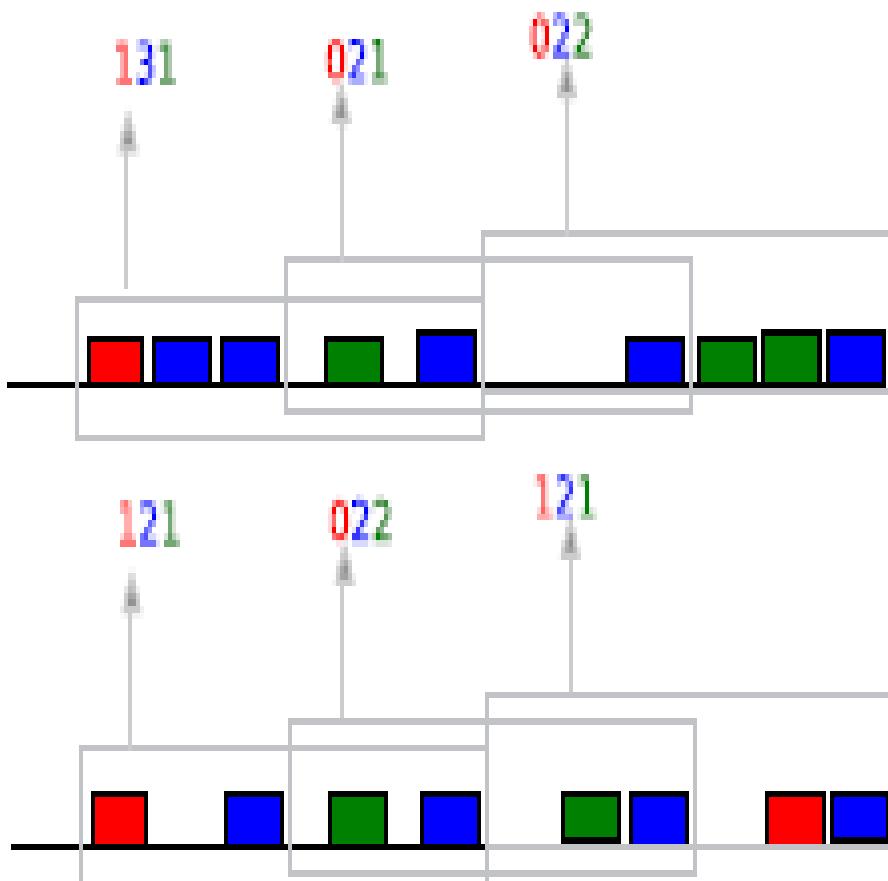
**a**

Regulator	PFAM category	HS bound	MM bound	Intersection	Pvalue	HS binding sequence	MM binding sequence
FOXA2	Forkhead	151	574	68	1.0E-45		
HNF1A	POU-homeodomain	251	224	45	1.0E-29		
HNF4A	Nuclear receptor	1,251	654	367	1.0E-136		
HNF6	CUT-homeodomain	157	324	41	1.0E-27		



Odom et al. Nature Genetics, 2007, Similar results for Drosophila, Li et al, Genome Biol. 2007

$$S(P, P') = |P \cap P'| - \alpha \cdot |P \otimes P'| - \beta$$



$$P = p_1, p_2, p_3 = 131, 021, 022$$

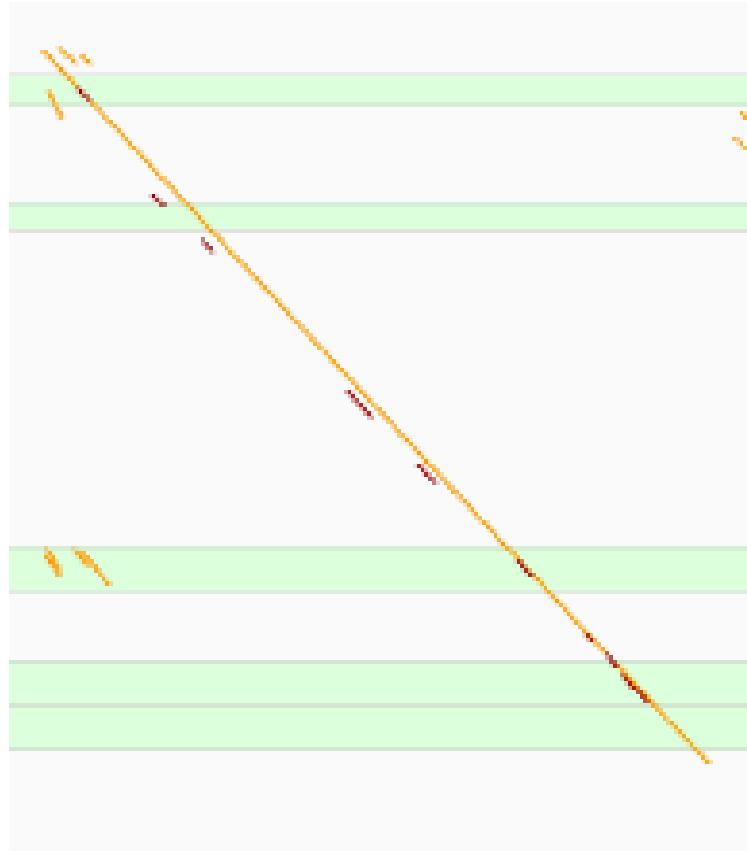
$$P' = p'_1, p'_2, p'_3 = 121, 022, 121$$

$$S(P, P') =$$

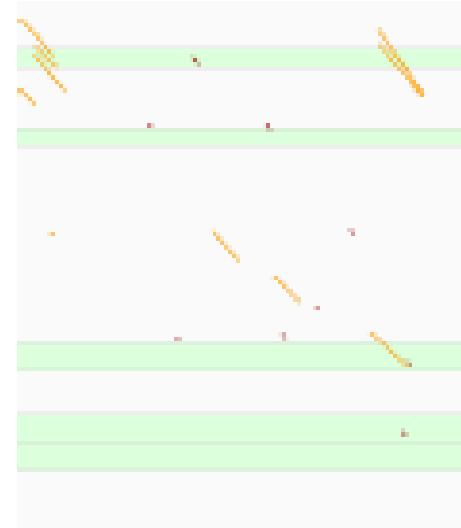
$$S(p_1, p'_1) + S(p_2, p'_2) + S(p_3, p'_3)$$

$$= (4 - \alpha - \beta) + (3 - \alpha - \beta) + (3 - 2\alpha - \beta)$$

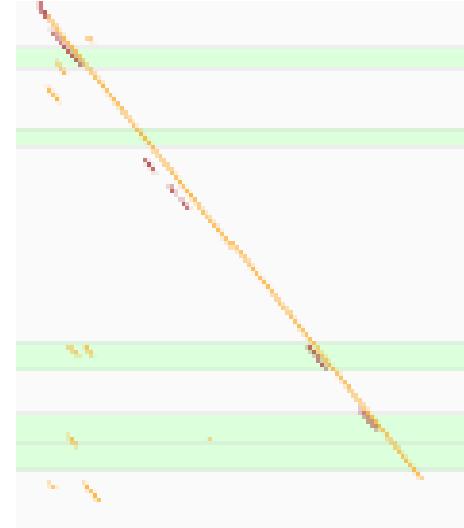
$$= 9 - 4\alpha - 3\beta$$



a) *D. pseudoobscura*



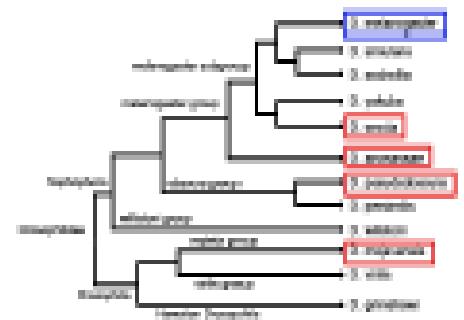
b) *D. erecta*



c) *D. ananassae*

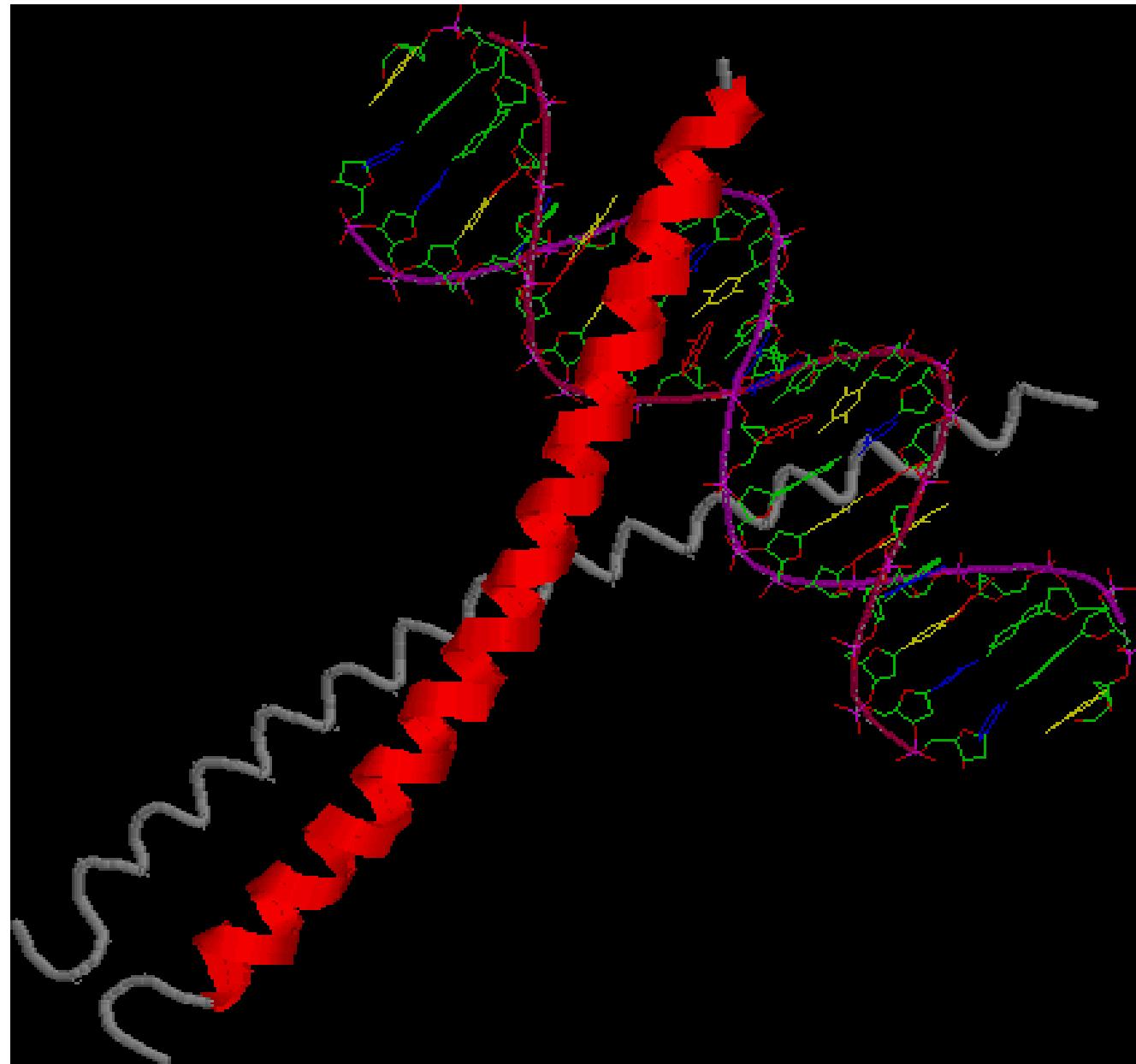


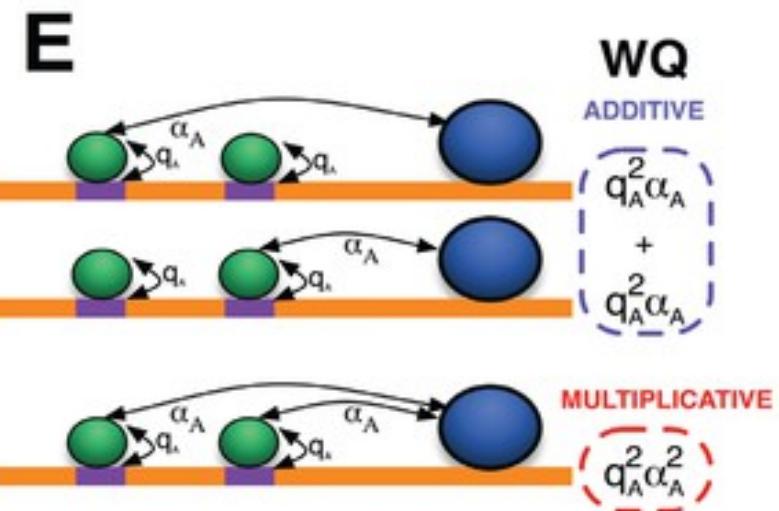
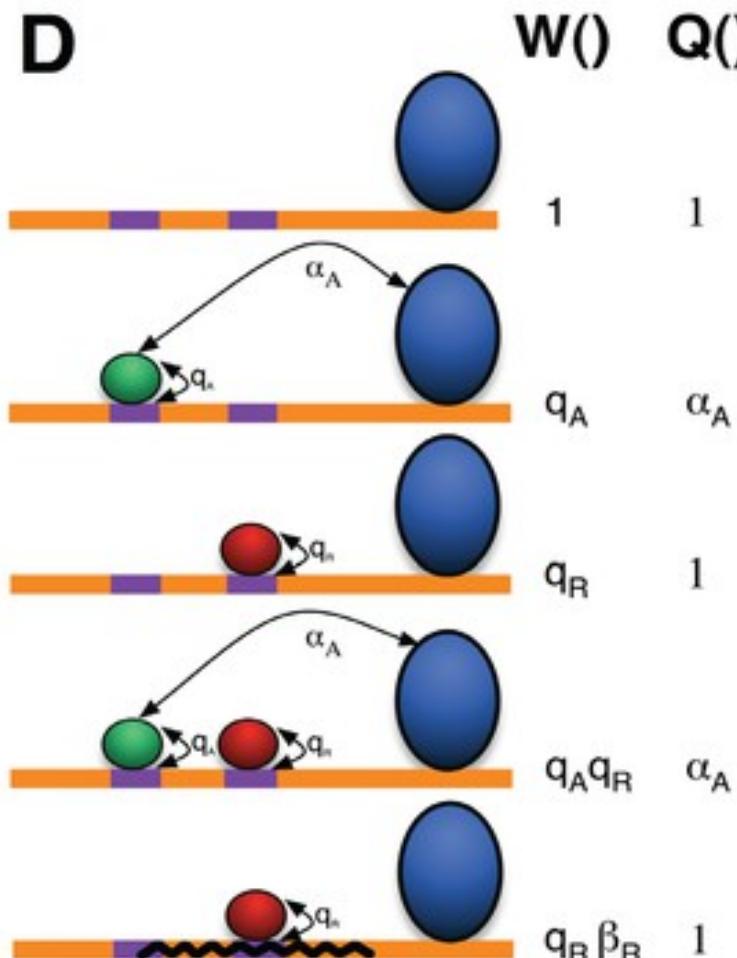
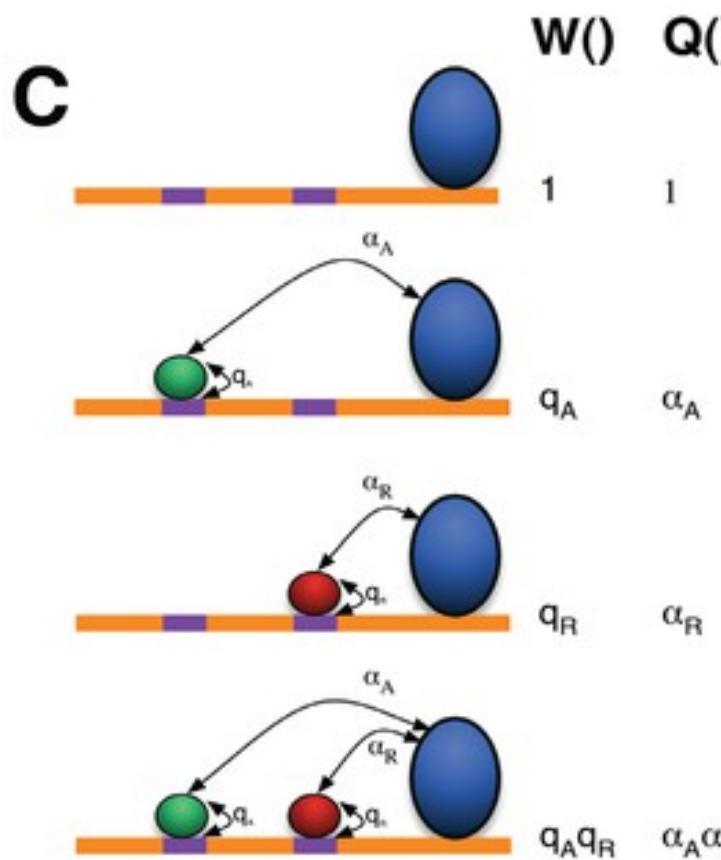
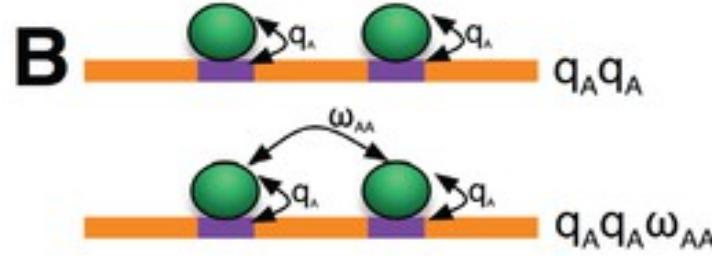
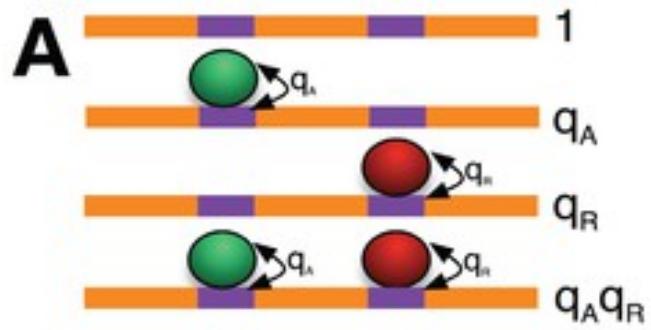
d) *D. mojavensis*



e) phylogenetic tree

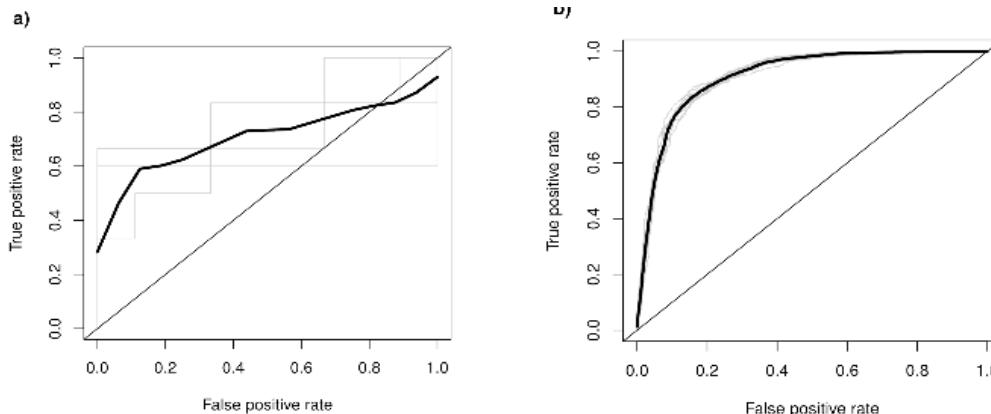
# Wiązanie czynników transkrypcyjnych





# We can add the sequence information

- First, we increase the size of the training dataset to use non-curated CRM predictions

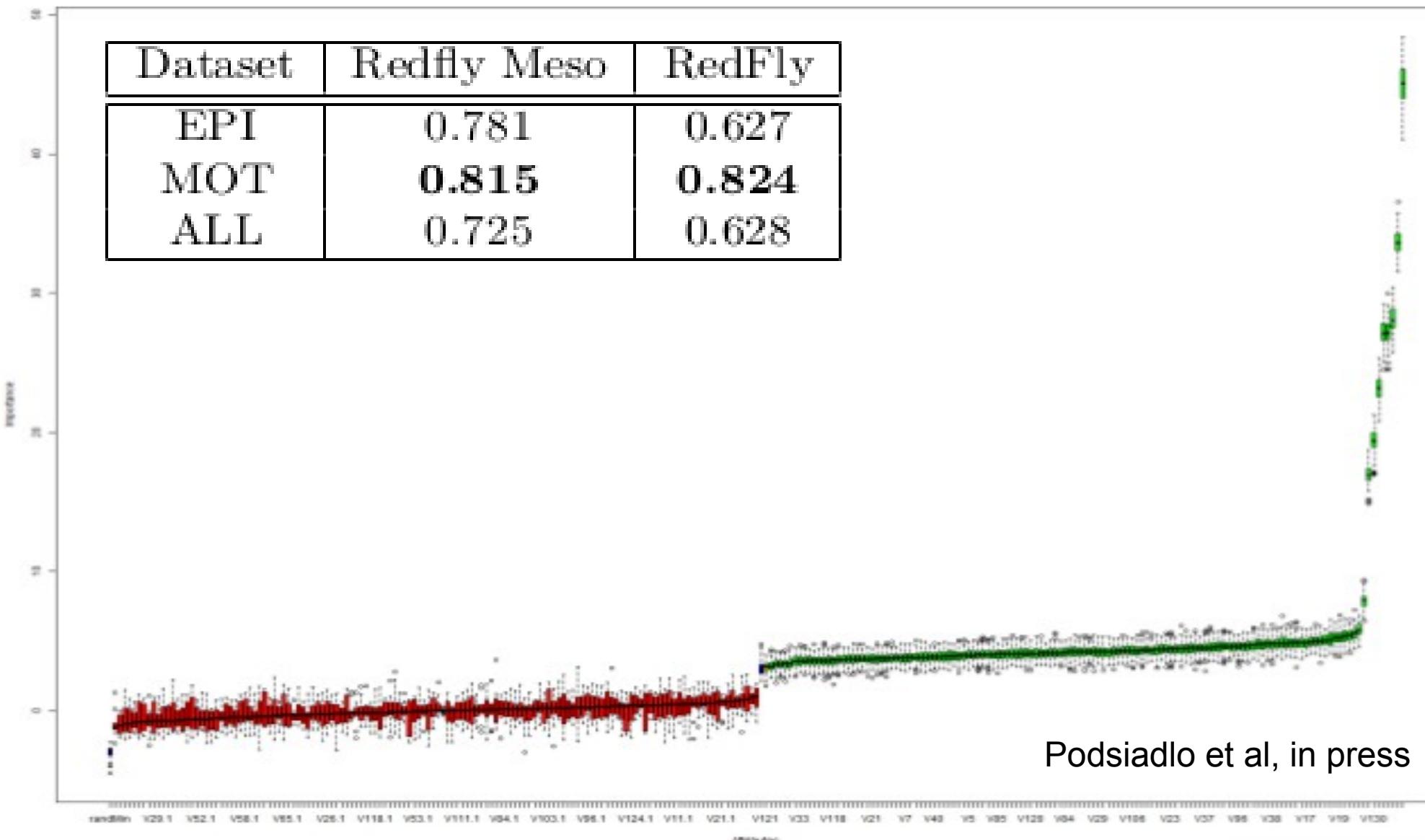


- Then, we add in data on motif affinity for JASPAR motifs

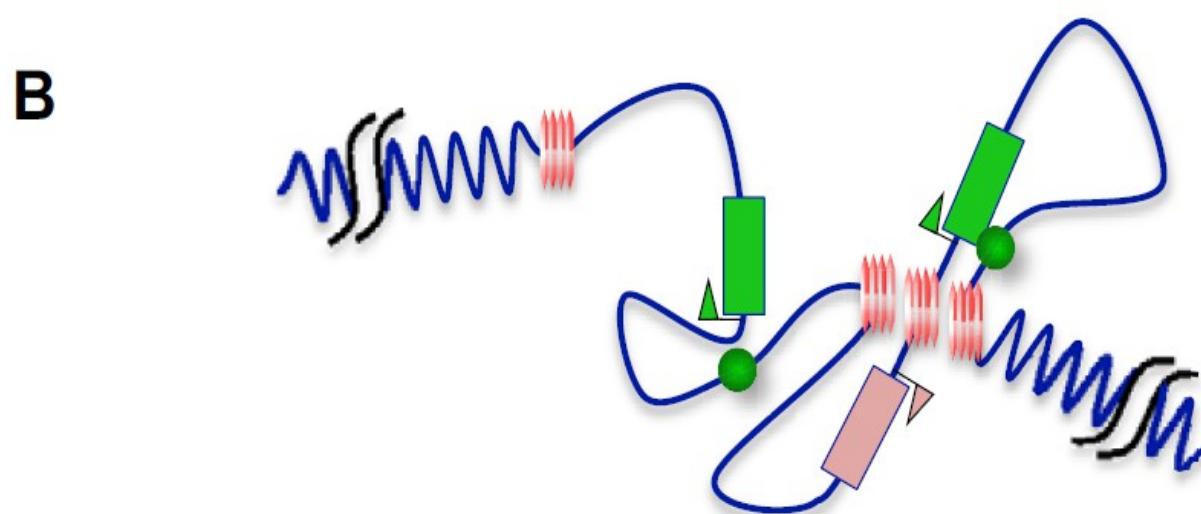
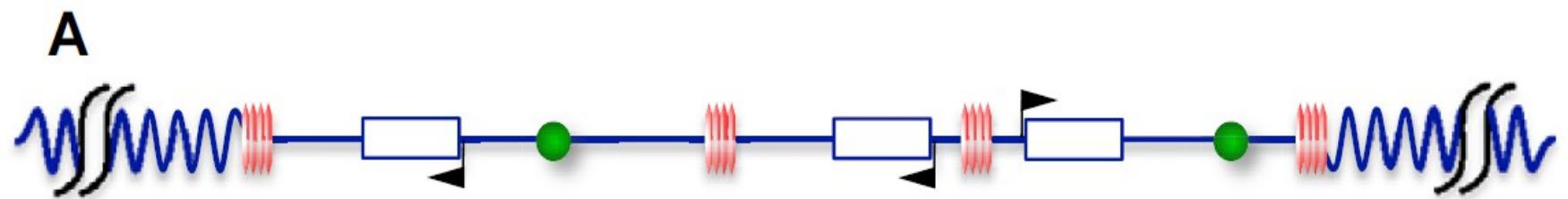
Dataset	BNFinder	SVM	RF
EPI	<b>0.9</b>	0.88	0.86
MOT	0.5	<b>0.89</b>	0.87
ALL	0.93	0.97	<b>0.98</b>

# Importance of features is not consistent with generality

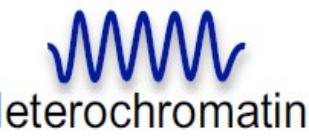
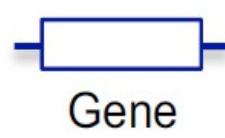
Dataset	Redfly Meso	RedFly
EPI	0.781	0.627
MOT	<b>0.815</b>	<b>0.824</b>
ALL	0.725	0.628



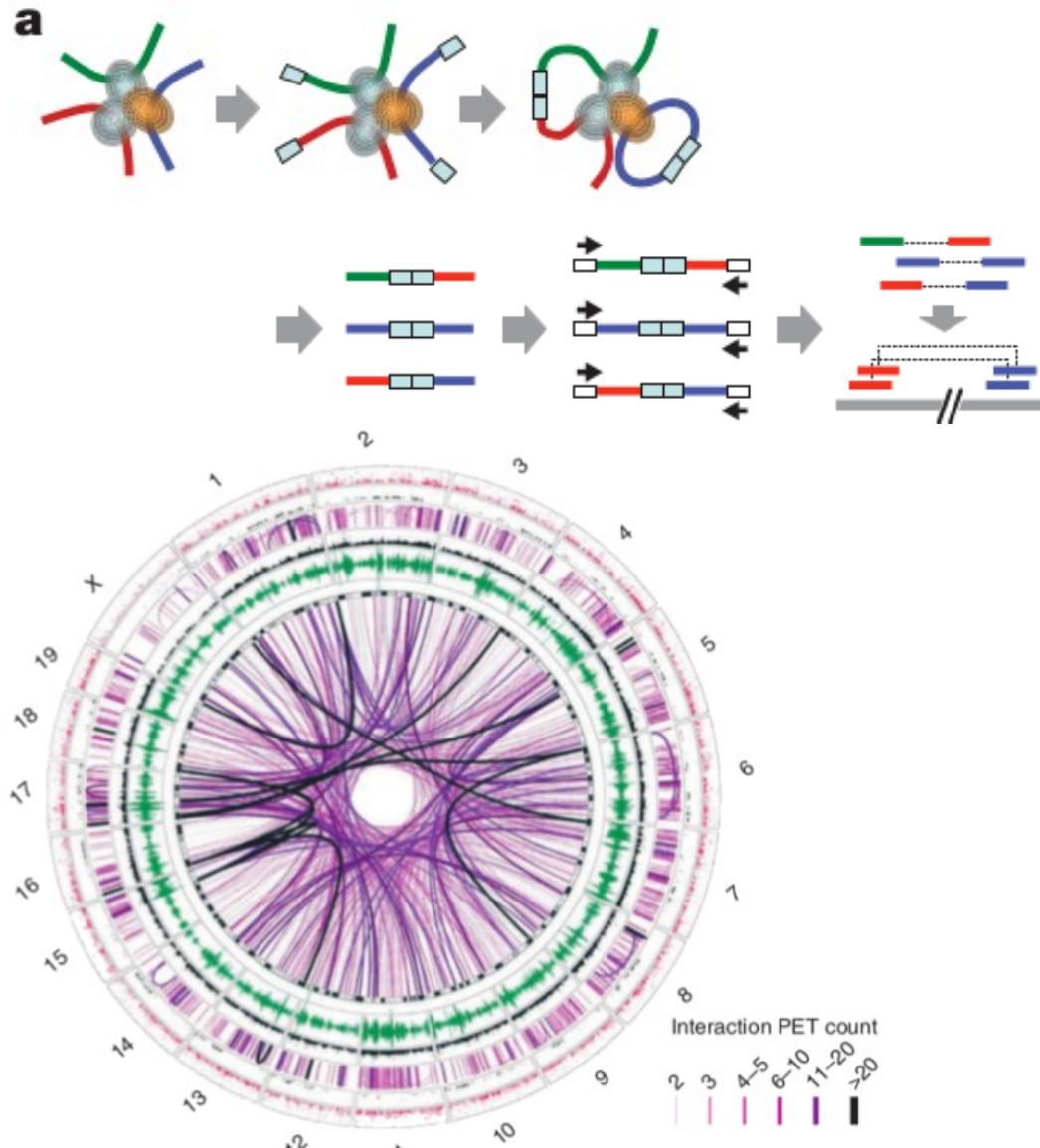
# Insulator looping creates regulatory domains



**Key**

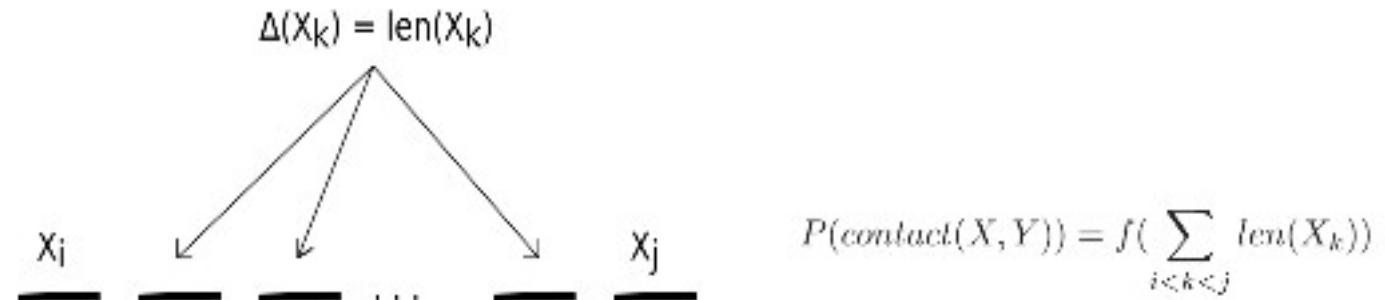


# Enter chromosome interaction data



- Hi-C and ChIA-Pet protocols allow for measurement of chromatin interactions
- Getting this type of data is still difficult
- We can use computational methods to predict domains and interactions

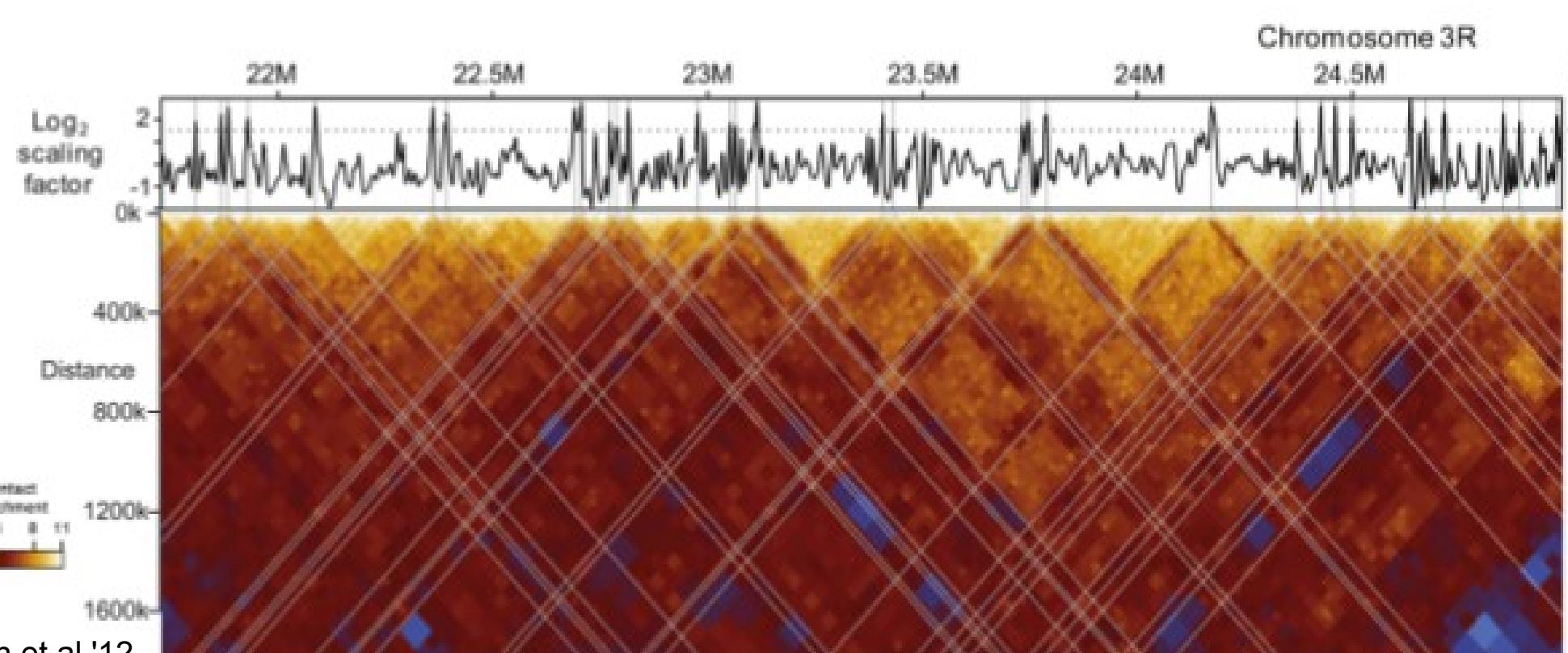
Basic Model



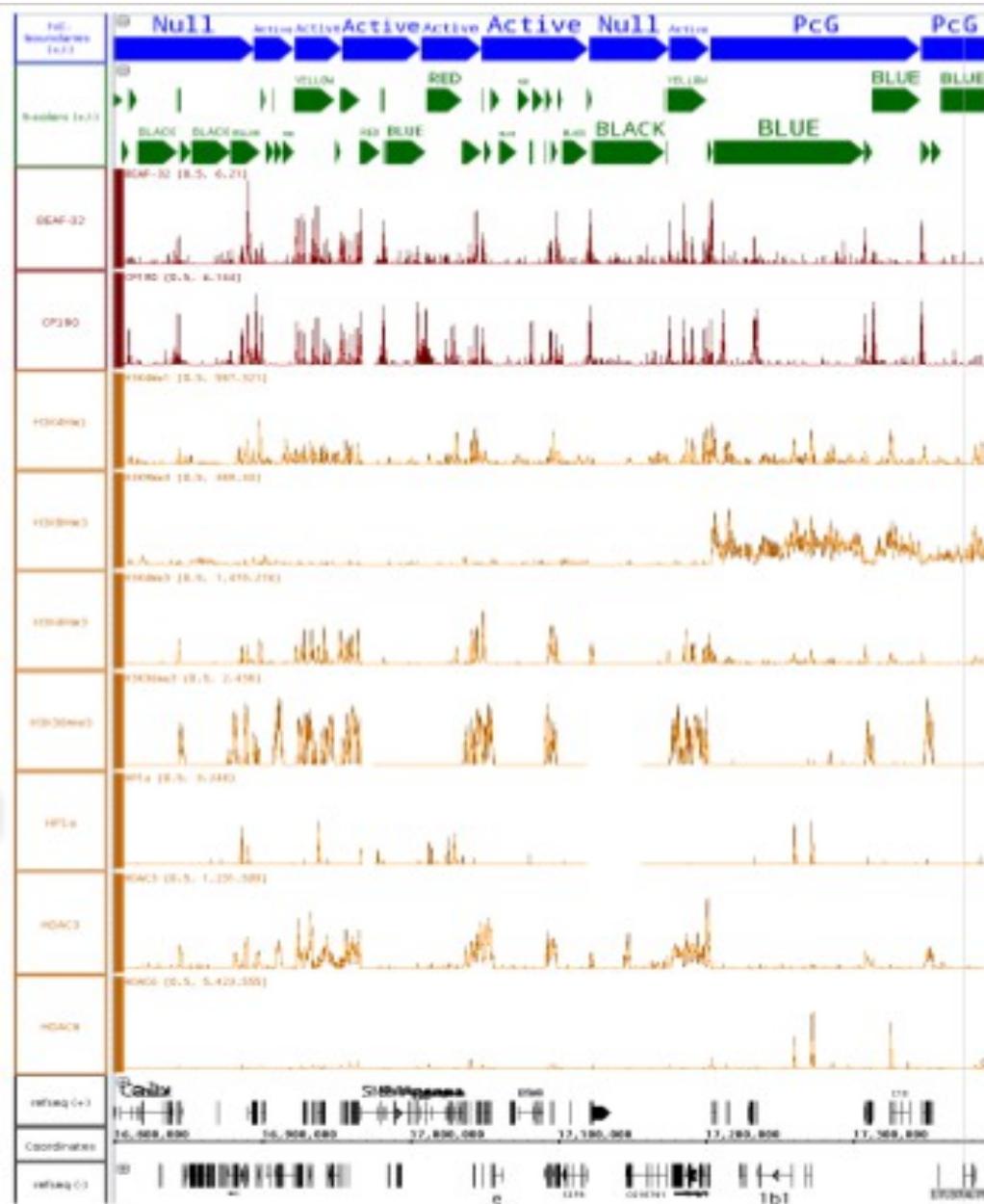
Distance scaling model

$$\Delta(X_k) = \text{len}(X_k) \cdot \gamma(X_k)$$

$$P(\text{contact}(X, Y)) = f\left(\sum_{i < k < j} \text{len}(X_k) \cdot \gamma_k\right)$$



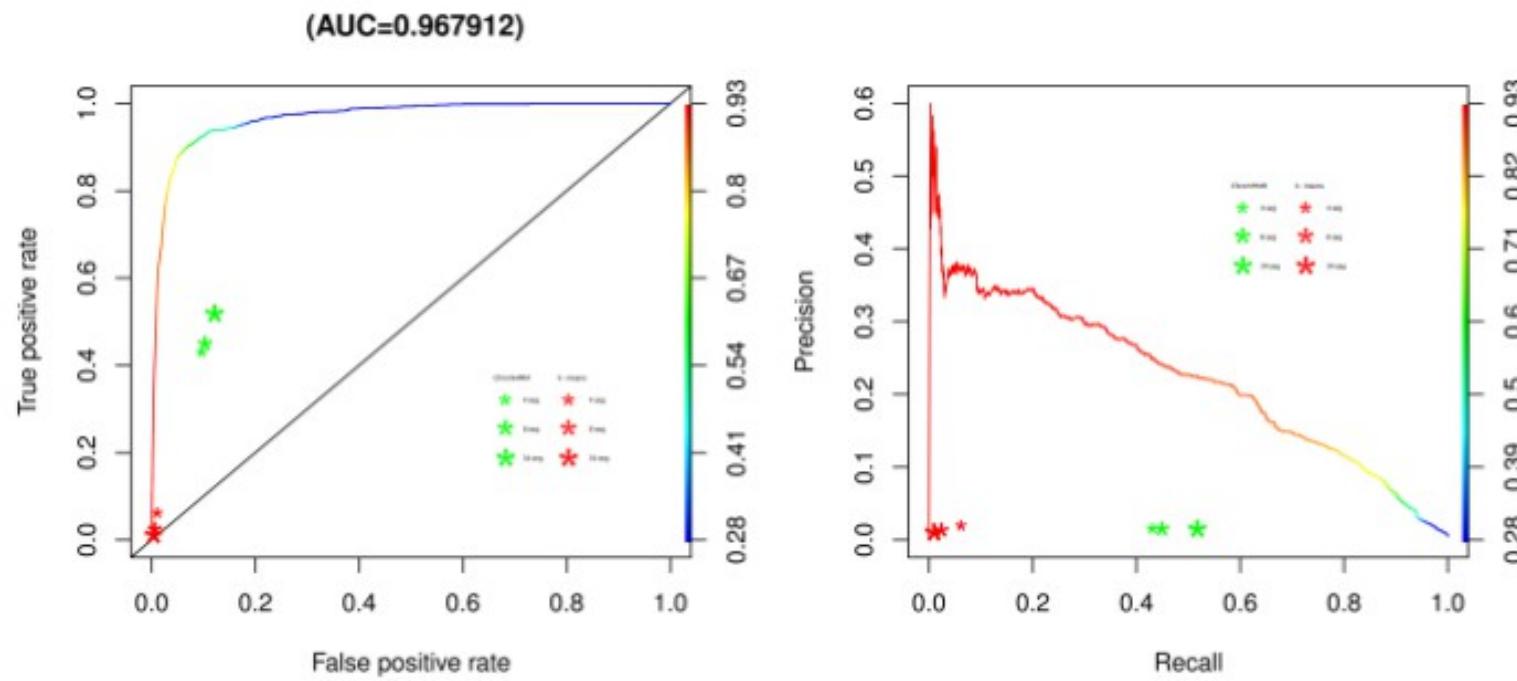
# Predicting boundary elements from modEncode data



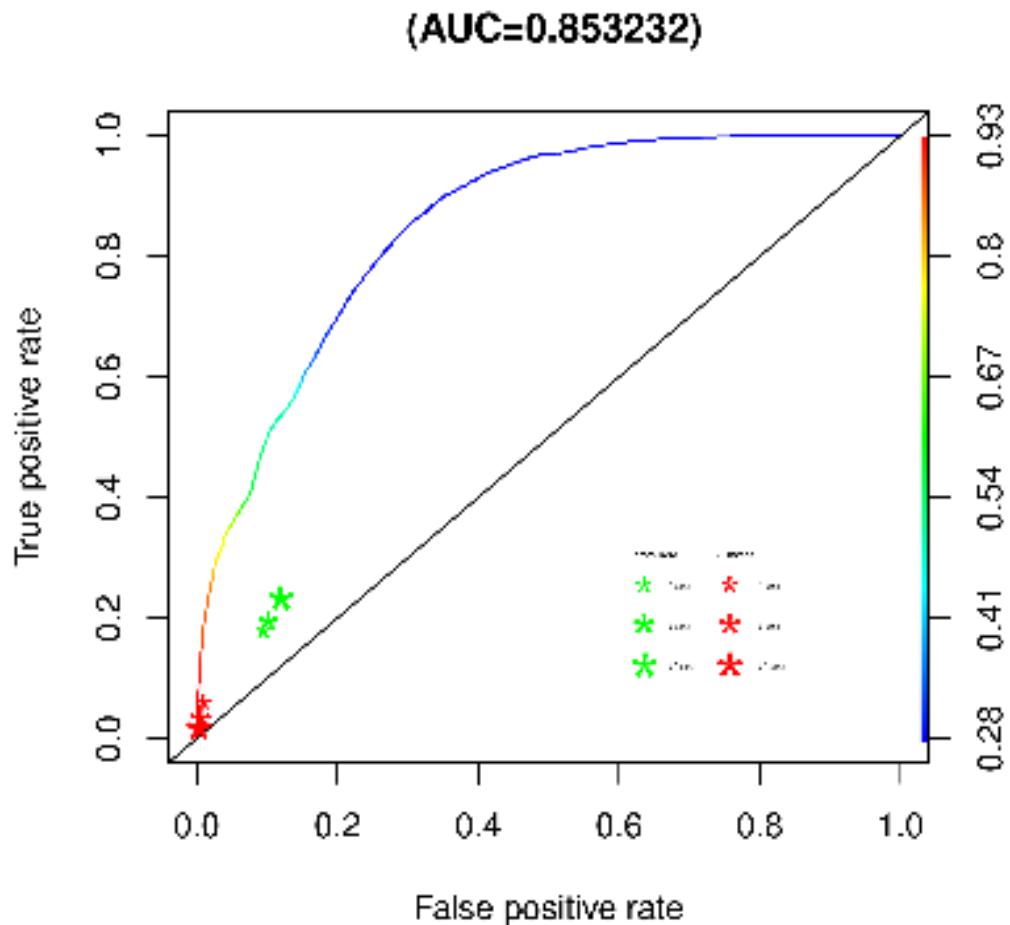
- We can use all chromatin IP data available in modENCODE for late embryos and try to predict domain boundaries
- We will use the Hi-C derived data as our main interaction set and Dam-ID derived data as additional validation

# BN classifier can predict boundaries

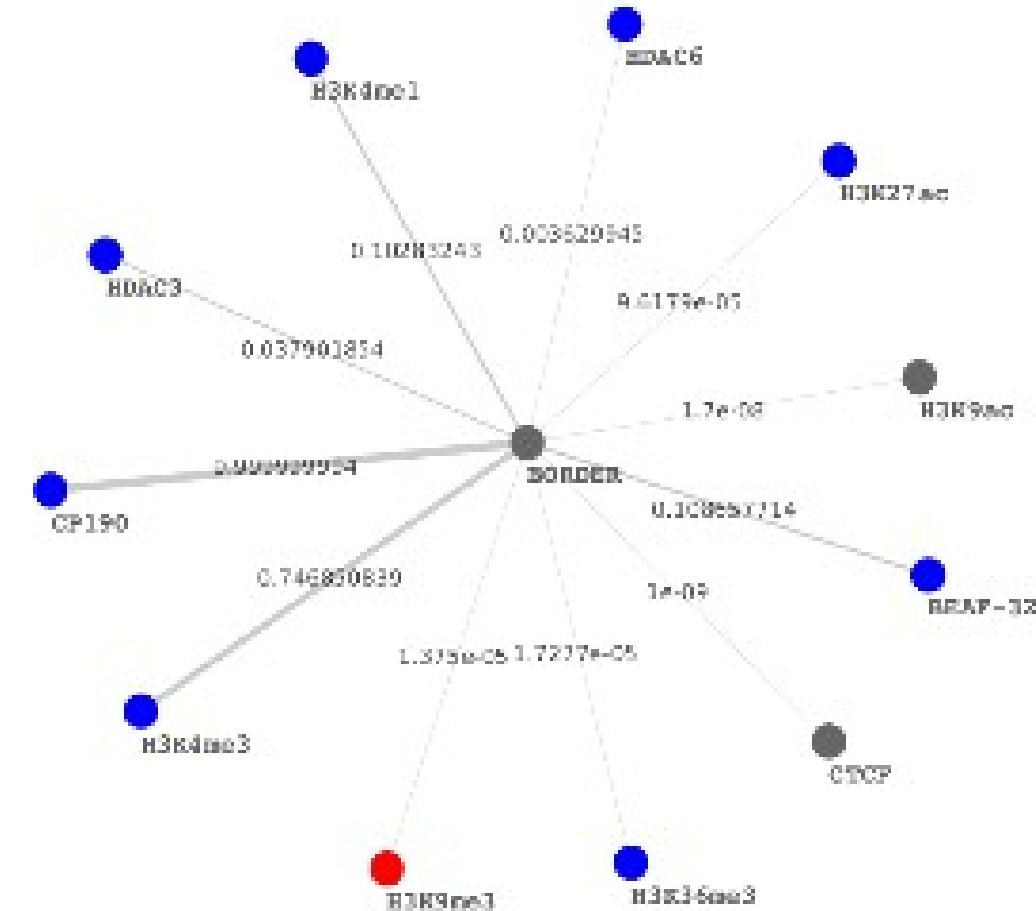
- Using BN classifiers trained on modENCODE data, we can predict position of boundary elements
- This method outperforms HMMs and clustering of histone modification data



# Predictions make sense, and the model brings new information

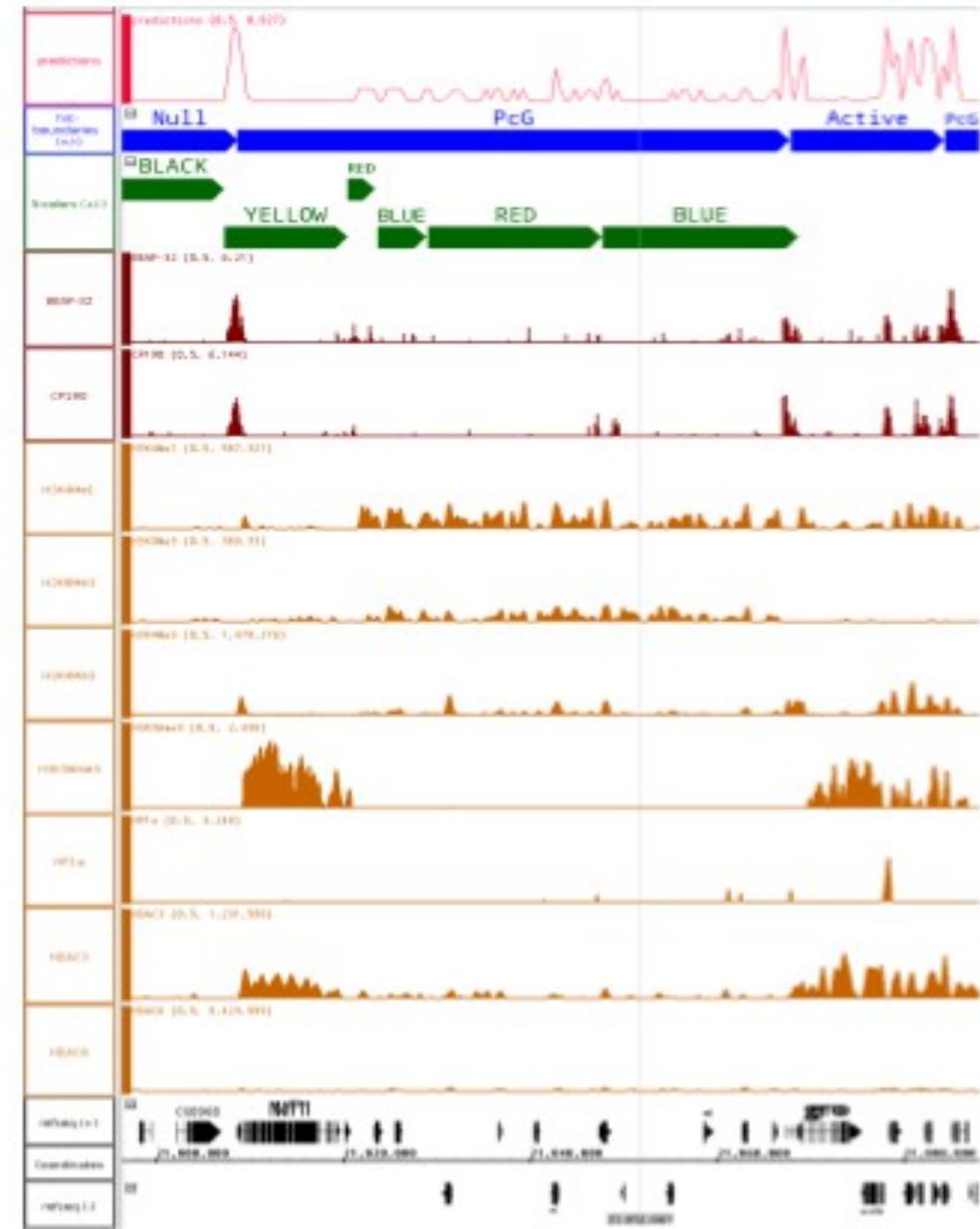
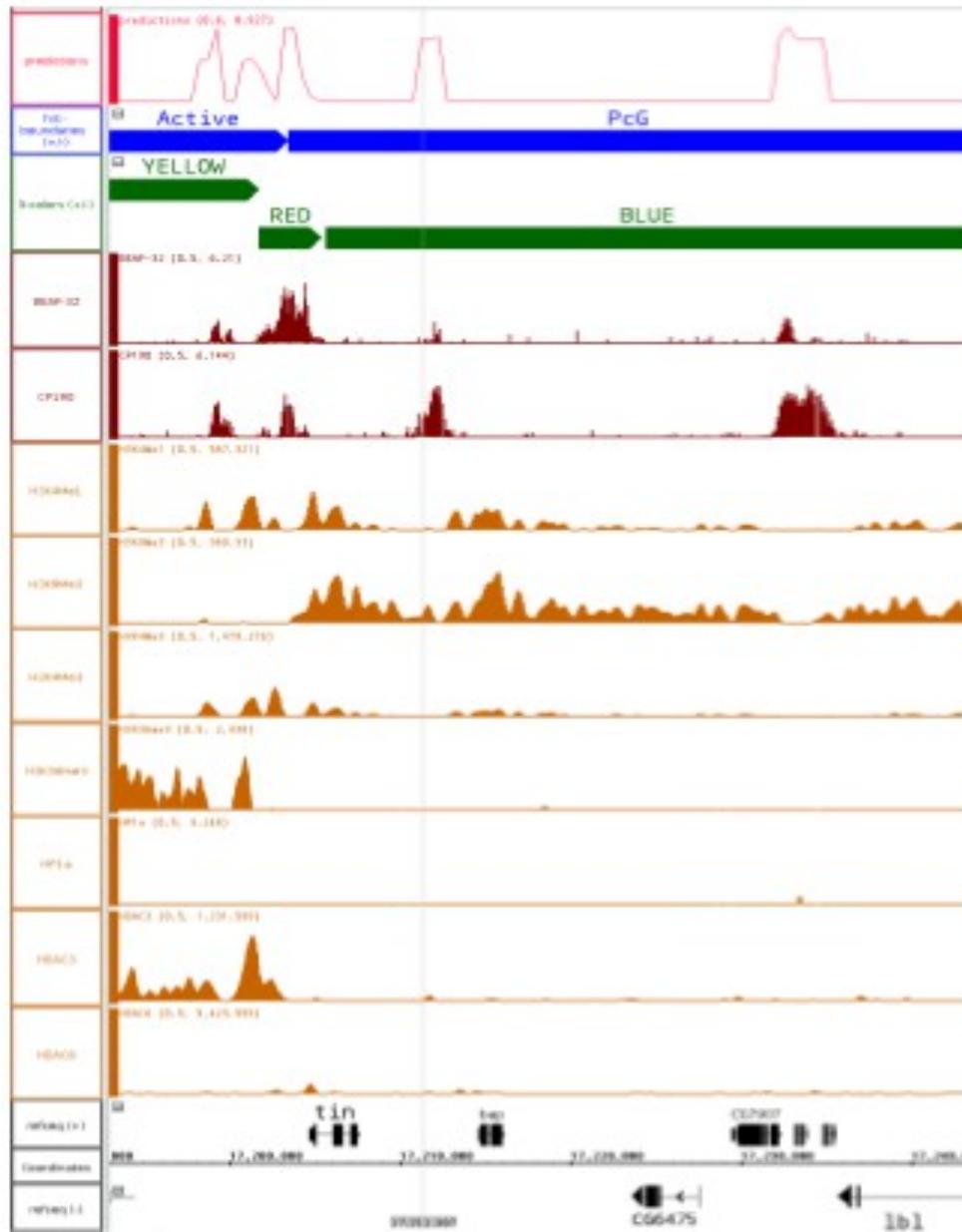


DamID validation results



Impact of signals

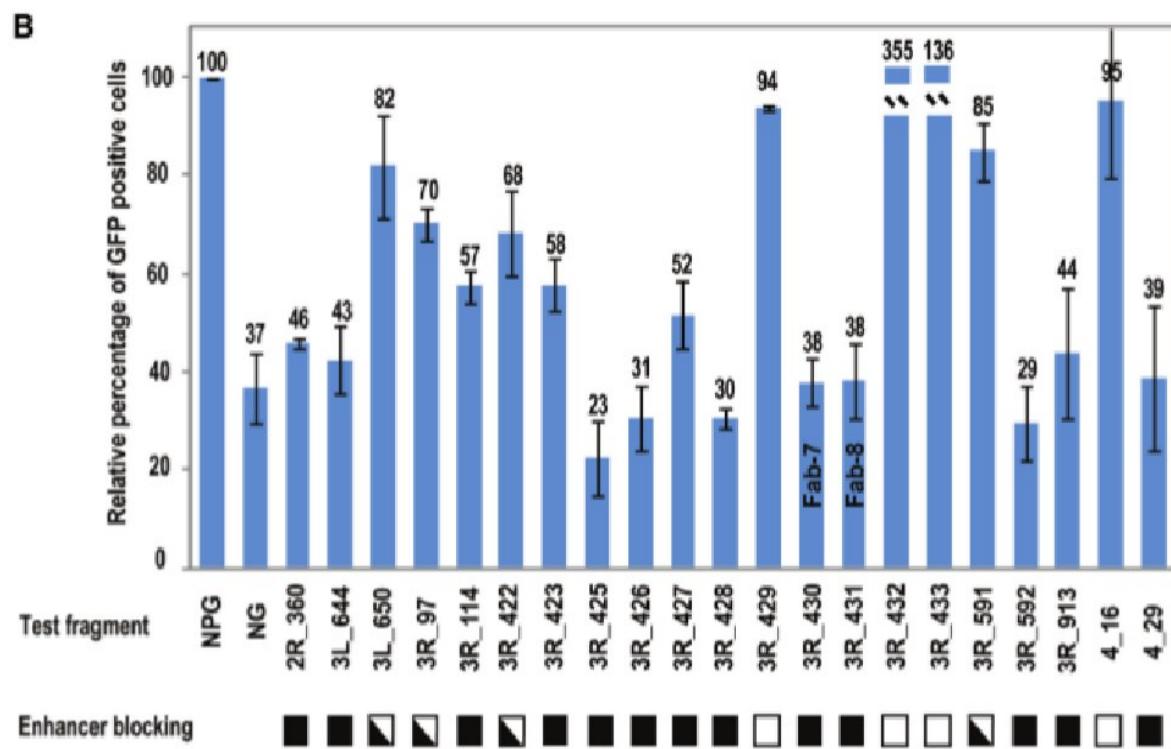
# Some predictions are unexpected



# Assaying insulator activity of predictions



- K. Mishra group used transgenic reporter assay to test their predictions from cdBEST method
- Our method predicts 14 out of 17 positive cases



# Podsumowanie

- Używając zarówno cech sekwencyjnych jak i modyfikacji histonów można dobrze przewidywać lokalizację miejsc funkcjonalnych DNA
- W przypadku cech sekwencyjnych może nam pomóc porównanie spokrewnionych gatunków
- Ta metoda działa nie tylko dla enhancerów ale też dla miejsc izolatorowych