

Ledidi: Designing genomic edits that induce functional activity

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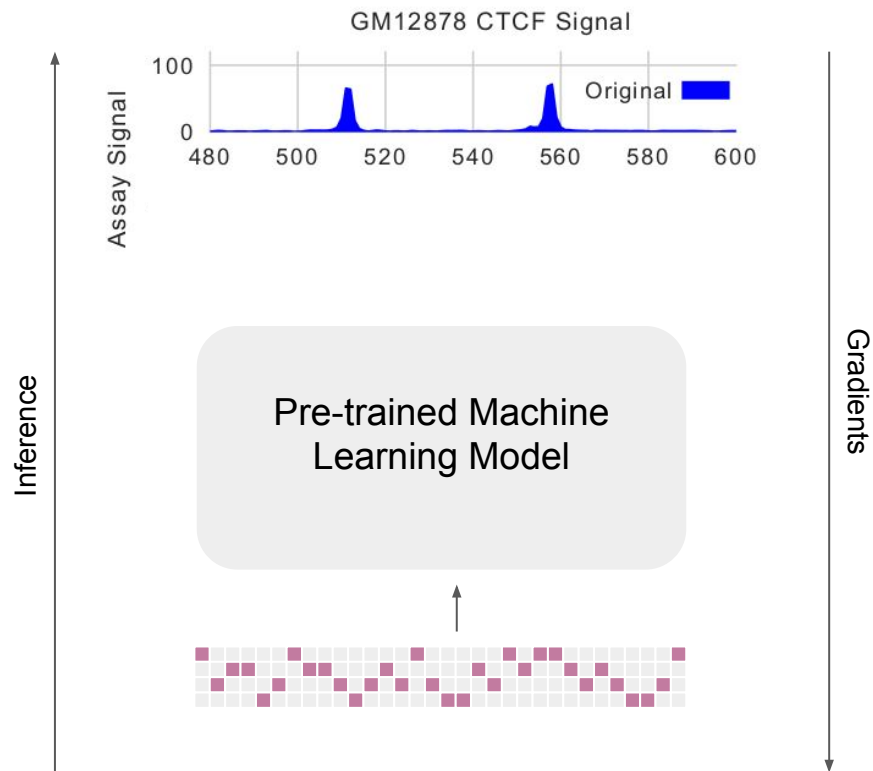


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Genome editing technologies show great promise but face challenges

1. How do you choose a set of edits that achieves a desired effect?
2. How do you ensure that these edits do not have unintended consequences?

Ledidi turns any machine learning model into a sequence editor



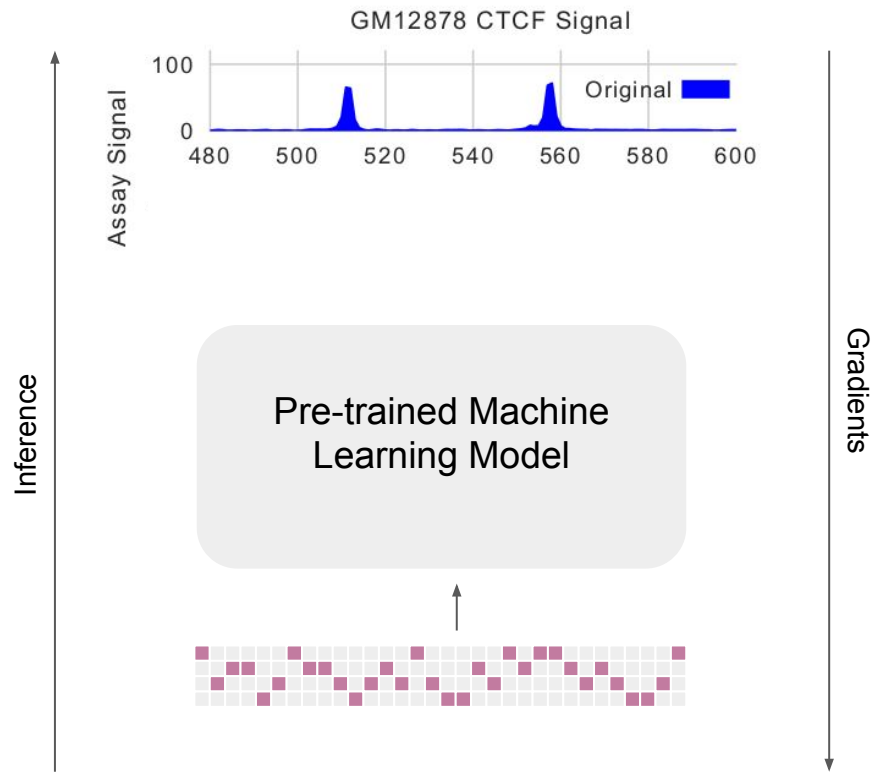
Ledidi optimizes the following mixture objective:

$$\min_X ||\boxed{X} - \boxed{X_0}||_1 + \lambda ||\boxed{f(X)} - \boxed{\hat{y}}||_2^2$$

the edited sequence
the original sequence

the predicted output
the desired output

Ledidi turns any machine learning model into a sequence editor



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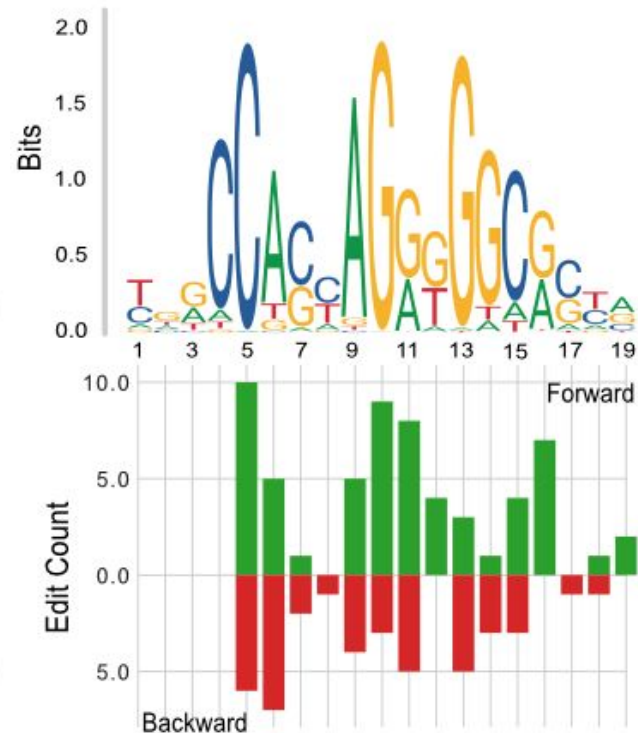
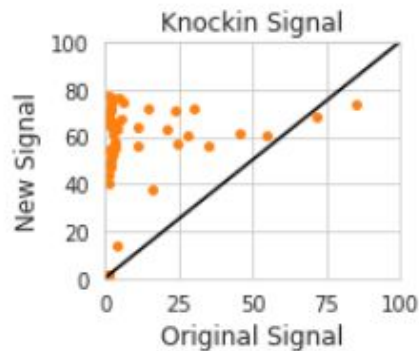
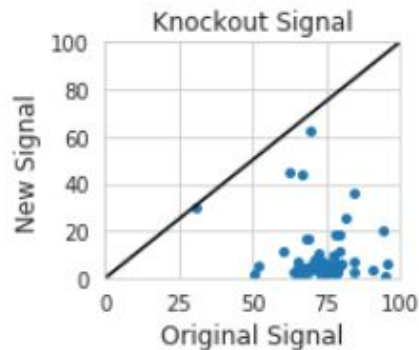
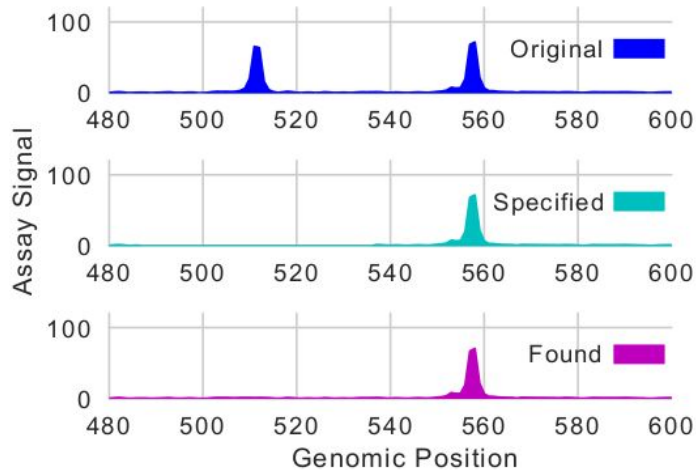
Directly optimizing discrete sequence is difficult so Ledidi uses the **Gumbel-softmax** reparameterization trick to replace X with a continuous representation, W .

$$g(W_{ij}) = \frac{(\exp(W_{ij} + z)/\tau)}{\sum_{j'=1}^d \exp((W_{ij'} + z)/\tau)}$$

We demonstrate that Ledidi can design functional edits using Basenji

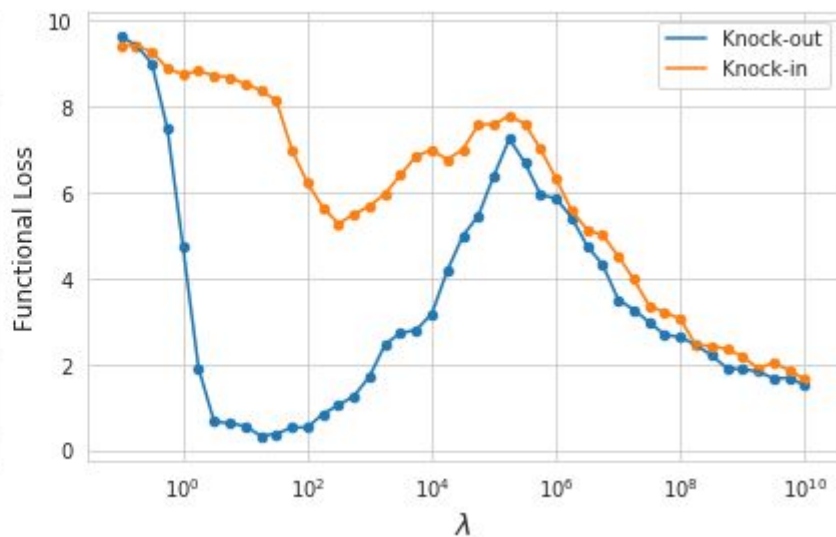
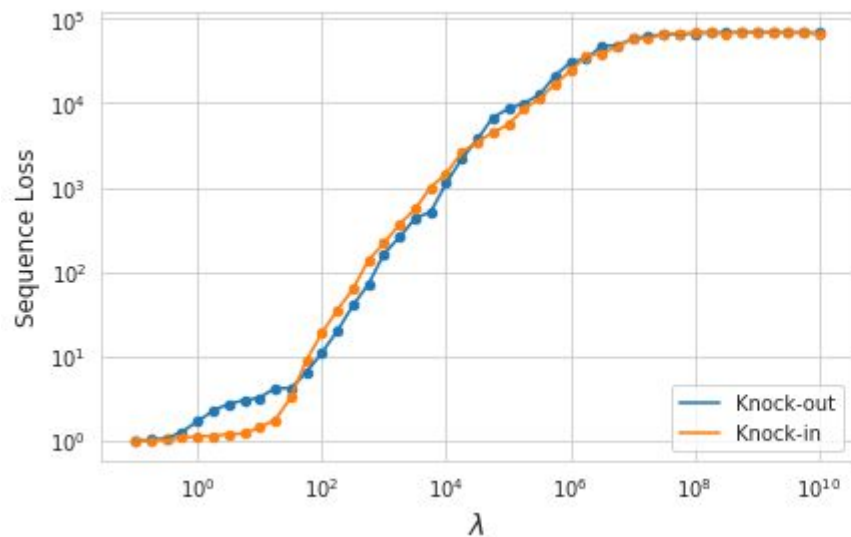


GM12878 CTCF Signal

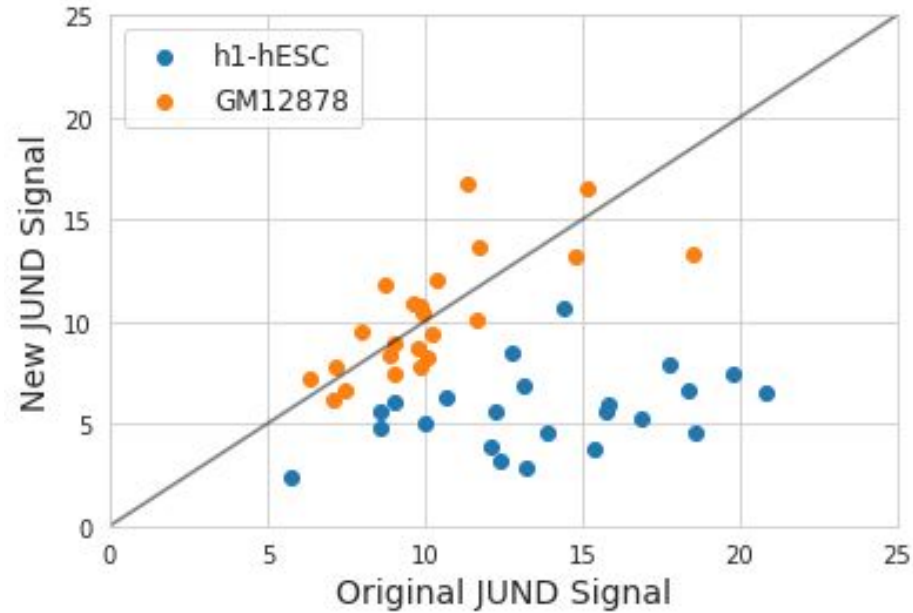


Changing the regularization strength affects the found edits

$$\min_X ||X - X_0||_1 + \lambda ||f(X) - \hat{y}||_2^2$$



Ledidi can design edits that induce cell-type-specific JUND binding



Acknowledgements



Yang Lu



William
Noble



eScience Institute

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National Science Foundation
WHERE DISCOVERIES BEGIN