



# Figures and figure supplements

On the mechanistic nature of epistasis in a canonical cis-regulatory element

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Figure 1. The different types of epistasis between two point mutations. Two point mutations, A and B (grey), individually increase the measured quantitative phenotype (gene expression, for example) compared to the wildtype. In this study, we use the multiplicative expectation of how the phenotypic effects of two mutations contribute to the double mutant phenotype, according to which epistasis =  $f_{m12}$  / ( $f_{m1}f_{m2}$ ), where  $f<sub>m12</sub>$  is the relative fluorescence of a double mutant  $(m_{12})$ , and  $f_{m1}$  and  $f_{m2}$  the relative fluorescence of the two corresponding single mutants ( $m_1$  and  $m_2$ ), respectively. An alternative to the multiplicative assumption would be the additive one, in which the effect of the double mutant in the absence of epistasis is the sum of the effects of single mutants. The multiplicative model is a better assumption for gene expression data, as there is a lower limit on this trait (Cordell, 2002). In the absence of an interaction between mutations ('no epistasis' scenario, represented by a grey circle), the phenotype of the double mutant is the product of the individual mutation. If the effect of the double mutant is greater or lower than the multiplicative expectation, the two mutations are said to be in positive (blue) or negative (orange) magnitude epistasis, respectively. Sign epistasis (dark green) occurs when one mutation has the opposite effect in the presence of the other (as for mutation B above). Reciprocal sign epistasis (light green) indicates a situation when both mutations have the opposite effect when in the presence of the other, compared to when they occur independently on the wildtype background. DOI: [10.7554/eLife.25192.003](http://dx.doi.org/10.7554/eLife.25192.003)



Figure 2. Experimental system. The  $P_R$  promoter system used in the empirical measurements consists of a strong lambda phage  $P_R$  promoter (RNAP-binding site) and two CI operator sites (transcription factor binding sites  $O_{R1}$ and  $O_{R2}$ , which control the expression of a venus-yfp reporter gene. cl is encoded on the opposite strand, separated by a terminator and 500 bp of random sequence, and under the control of an inducible promoter  $P_{TET}$ . Both venus-yfp and cI genes are followed by a terminator sequence. (a) In the absence of CI, the promoter is fully expressed. (b) CI binds cooperatively to two operators in order to repress the promoter. DOI: [10.7554/eLife.25192.004](http://dx.doi.org/10.7554/eLife.25192.004)





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The following source data is available for figure 3:

Source data 1. Fluorescence measurements of single and double mutants, and the calculated values for epistasis for the random mutant library. DOI: [10.7554/eLife.25192.006](http://dx.doi.org/10.7554/eLife.25192.006)

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Figure 3-figure supplement 1. Relative fluorescence of single mutants. Bars are mean fluorescence relative to wildtype in the a) absence and b) presence of the repressor CI. Mean fluorescence shown in ascending order. The dotted line shows the wildtype fluorescence. Error bars are standard deviations.

Figure 3—figure supplement 1 continued on next page



Figure 3—figure supplement 1 continued

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Figure 3—figure supplement 2. Relative fluorescence of double mutants. Bars are mean fluorescence relative to wildtype in the a) absence and b) presence of the repressor CI. Mean fluorescence shown in ascending order. The dotted line shows the wildtype fluorescence. Error bars are standard deviations.

Figure 3—figure supplement 2 continued on next page



Figure 3—figure supplement 2 continued

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## b) Predictions of epistasis from the thermodynamic model



## c) Thermodynamic model predicts that sign of epistasis depends on sign of individual mutation effects



e) Epistasis when single mutants affect only RNAP or repressor







Figure 5. Overview of the generic model. The theoretical approach used in this study, originally developed to describe gene regulation by the lambda bacteriophage repressor CI (Ackers et al., 1982), relies on statistical thermodynamics assumptions to model initiation of transcription. (a) In this framework, each DNA-binding protein is assigned a binding energy (E<sub>i</sub>) to an arbitrary stretch of DNA. Given a set of DNA-binding proteins (a generic RNAP-like and a generic repressor-like TF, in this case) and a promoter sequence, a Boltzmann weight can be assigned to any configuration of these TFs on the promoter. By assigning a Boltzmann weight to all configurations, one can calculate the probability of finding the system in a configuration Figure 5 continued on next page



#### Figure 5 continued

that leads to the initiation of transcription. (b) When considering only the binding of a single protein to DNA (for example 'RNAP' only), if mutations have a negative effect on protein-DNA binding, the model predicts negative epistasis between them in terms of expression. This prediction arises from the non-linear relationship between binding energy and gene expression  $p_{on}$  (dotted line). In this illustration, we show a relative change in binding energy compared to the sequence with highest possible binding, in kT. (c) By generalizing the properties of the relationship between binding and gene expression, we conclude that the sign of epistasis depends only on the sign of individual mutation effects (p<sub>1</sub> and p<sub>2</sub>) upon binding. When both 'RNAP' and 'repressor' are present in the system, epistasis depends on the 'repressor' concentration and the magnitude of single mutation effects on 'RNAP' and 'repressor' binding (d,e,f,g). (d) One point mutation negatively affects only 'RNAP' binding, while the other only 'repressor' binding. (e) Under such circumstances, the system shows no epistasis at low 'repressor' concentrations, but is in positive epistasis when 'repressor' concentration increases. Finally, at very high repressor concentrations, epistasis approaches 0. (f) Point mutations negatively affect both 'RNAP' and 'repressor' binding. (g) Under such conditions, epistasis changes the sign from negative to positive as repressor concentration increases. DOI: [10.7554/eLife.25192.010](http://dx.doi.org/10.7554/eLife.25192.010)



Figure 6. The thermodynamic model accurately predicts sign of epistasis and its environment-dependence. In order to conduct an independent test of the assumptions of the generic model, we expanded the generic model to include specific information about the two TFs relevant to the experimental system – namely, the energy matrices for RNAP (Kinney et al., 2010) and CI (Sarai and Takeda, 1989). We could not use the 141 random mutants to validate the model, as most of them contained mutations that were in the regions of the CRE that were poorly characterized by the energy matrices. Therefore, using the energy matrices, we had to create a new library consisting of five random double mutants for each category from Table 1. As we could not identify any single point mutations that simultaneously improved the binding of both RNAP and repressor, we tested if empirical measurements of epistasis conformed to model predictions in 30 mutants. The model predictions of the sign of epistasis and its environment dependence were based only on the sign of individual mutation effects on RNAP and repressor binding. The location of points corresponds to the experimental measurement of epistasis for each mutant, while the color indicates the model prediction: (i) blue - double mutants predicted to be in negative epistasis both in the absence and in the presence of the repressor CI; (ii) orange - double mutants that are always in positive epistasis; (iii) grey - double mutants predicted to change the sign of epistasis in the two environments. The color intensity indicates significance – lighter shades represent non-significant, darker shades represent significant epistasis in both environments (see 'Empirical verification of the thermodynamic model' section in Online Methods). Six replicates of each mutant were measured. The data underlying this figure is presented in Figure 6-source data 1. The quantitative test of how well the thermodynamic model predicts the magnitude of epistasis in this dataset is presented in Figure 6-figure supplement 1. DOI: [10.7554/eLife.25192.013](http://dx.doi.org/10.7554/eLife.25192.013)

The following source data is available for figure 6:

Source data 1. Fluorescence measurements of single and double mutants, and the calculated values for epistasis for the validation mutant library.

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Figure 6-figure supplement 1. The thermodynamic model predicts the magnitude of epistasis. By incorporating specific information about the biological system studied, in the form of energy matrices for RNAP (Kinney et al., 2010) and CI (Sarai and Takeda, 1989), we could test if the model Figure 6—figure supplement 1 continued on next page



#### Figure 6—figure supplement 1 continued

predicts not only the sign, but also the magnitude of epistasis. Linear regression between empirical measurements and the model predictions of epistasis is shown (dashed line) for all mutants in [Figure 5](#page-9-0) that exhibited significant epistasis. Epistasis was estimated in the (a) absence; and (b) presence of CI. Grey lines show no epistasis (epistasis value of 1). DOI: [10.7554/eLife.25192.015](http://dx.doi.org/10.7554/eLife.25192.015)