



Modifiers of the Genotype-Phenotype Map: Hsp90 and Beyond

Rachel Schelle, Martin Mullise, Ian M. Ehrenreich*

Molecular and Computational Biology Section, Department of Biological Sciences, University of Southern California, Los Angeles, California, United States of America

- These authors contributed equally to this work.
- * ian.ehrenreich@usc.edu



Disruption of certain genes alters the heritable phenotypic variation among individuals. Research on the chaperone Hsp90 has played a central role in determining the genetic basis of this phenomenon, which may be important to evolution and disease. Key studies have shown that Hsp90 perturbation modifies the effects of many genetic variants throughout the genome. These modifications collectively transform the genotype—phenotype map, often resulting in a net increase or decrease in heritable phenotypic variation. Here, we summarize some of the foundational work on Hsp90 that led to these insights, discuss a framework for interpreting this research that is centered upon the standard genetics concept of epistasis, and propose major questions that future studies in this area should address.

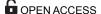
Perturbation of Hsp90 Impacts Heritable Phenotypic Variation

How particular genes modulate the heritable phenotypic variation that segregates within populations is not fully understood. Work on the chaperone Hsp90 has generated some of the most provocative insights into this problem. In a landmark paper, Rutherford and Lindquist demonstrated that perturbation of Hsp90 reveals heritable phenotypic variation among genetically distinct *Drosophila* isolates [1]. Similar experiments in *Arabidopsis* [2] and yeast [3] subsequently showed that this effect generalizes across species.

The initial interpretation of these results was that Hsp90 is a buffer that suppresses the effects of genetic variation on a global scale [1,2] (Box 1). Perturbation of Hsp90 was thus thought to uncover cryptic polymorphisms that do not typically show effects, thereby expanding the amount of heritable phenotypic variation in a population [1,2,4-7] (Fig 1A). Because of its role in buffering, Hsp90 began to be regarded as a capacitor that facilitates the accumulation of cryptic genetic variation [1-3,8-12].

The buffer and capacitor concepts were appealing because of Hsp90's function as a chaperone for many key signaling proteins and transcriptional regulators [13,14]. However, as additional studies examined the influence of Hsp90 on genetic variation, a more complex picture emerged. Contrary to previous findings, instances were found in which perturbation of Hsp90 reduced heritable phenotypic variation [3,8] (Fig 1B). This suggested that Hsp90 does not





Citation: Schell R, Mullis M, Ehrenreich IM (2016) Modifiers of the Genotype–Phenotype Map: Hsp90 and Beyond. PLoS Biol 14(11): e2001015. doi:10.1371/journal.pbio.2001015

Published: November 10, 2016

Copyright: © 2016 Schell et al. This is an open access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Funding: Alfred P. Sloan Foundation http://www.sloan.org (grant number). Received by IME. The funder had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript. National Science Foundation https://www.nsf.gov (grant number MCB1330874). Received by IME. The funder had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript. National Institutes of Health https://www.nih.gov (grant number R01GM110255). Received by IME. The funder had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

Competing Interests: The authors have declared that no competing interests exist.

Provenance: Commissioned; not externally peer reviewed.



Box 1. Glossary of Relevant Terms

Capacitor. A gene that facilitates the accumulation of cryptic genetic variation.

Cryptic genetic variants. Genetic variants that only show effects under atypical conditions, such as when specific genes are compromised or the environment markedly changes.

Epistasis. When the effect of one variant is influenced by one or more other variants.

Genetic buffer. A gene that suppresses the effects of one or more variants.

Genotype-phenotype map. The correspondence between genotypes and the phenotypes they produce.

Global modifier. A gene that acts as an epistatic modifier for many variants.

Magnitude epistasis. An epistatic interaction that involves a variant's effect size changing while its effect sign remains the same.

Modifier. A gene or variant that influences the effect of another through an epistatic interaction.

Mutation accumulation lines. Strains that have accumulated new mutations during many generations of minimal selection.

New mutations. Recently arisen variants that have not yet been exposed to natural selection.

Potentiator. A gene that enables certain variants to exhibit effects.

Sign epistasis. An epistatic interaction that involves a variant's effect changing in sign (i.e., from positive to negative or vice versa).

Standing genetic variation. Genetic variation that segregates within populations and may have been subject to natural selection.

always act as a genetic buffer but instead sometimes makes possible (or potentiates) the effects of genetic variation [3,8].

Selection Complicates Inferences about Buffering and Potentiation by Hsp90

The extent to which Hsp90 acts as a buffer or a potentiator has bearing on our expectations for how new mutations and standing genetic variants will affect heritable phenotypic variation.

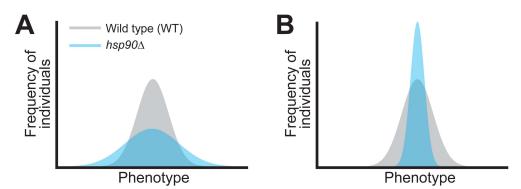


Fig 1. Effects of genetic buffers and potentiators on heritable phenotypic variation. In both A and B, the gray distributions indicate when a buffer or potentiator is functional, while the blue distributions show when a buffer or potentiator is perturbed. As shown in A, buffers suppress heritable phenotypic variation among individuals. If these buffers are compromised, heritable phenotypic variation increases. B illustrates how potentiators act in an opposite manner to buffers, with heritable phenotypic variation decreasing when potentiators are disrupted.

doi:10.1371/journal.pbio.2001015.g001



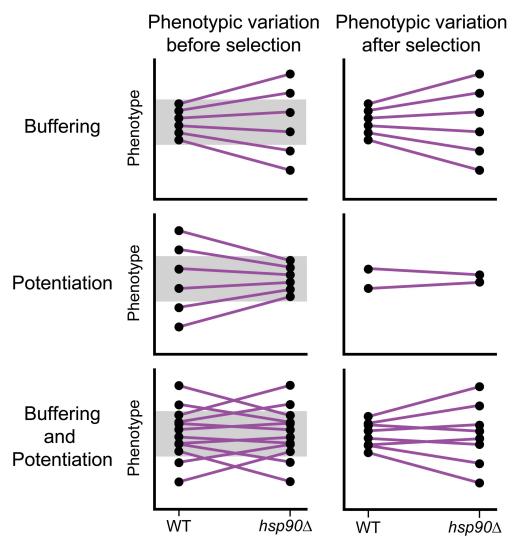


Fig 2. Inferences about the extent of buffering and potentiation are affected by natural selection. Here, we illustrate how selection may lead to misinterpretations regarding the extent to which Hsp90 acts as a buffer and a potentiator by disproportionately acting against Hsp90-potentiated heritable phenotypic variation. We present three scenarios: Hsp90 exclusively acts as a buffer, Hsp90 exclusively acts as a potentiator, and Hsp90 acts equally often as a buffer and a potentiator. In each case, we show the genotypes and heritable phenotypic variation that existed prior to selection as well as the genotypes and heritable phenotypic variation that remain after selection. Within a given Hsp90 state, black circles represent distinct genotypes. Purple lines indicate the change in an individual's phenotype upon Hsp90 perturbation. Gray boxes show the range of phenotypes that are tolerated by selection under normal conditions in which Hsp90 is functional. In this figure, we only consider selection that acts to stabilize the population around a particular mean value.

doi:10.1371/journal.pbio.2001015.g002

Defining how often Hsp90 occupies each of these roles is important but requires examining genetic variation that has not been exposed to natural selection. This is because Hsp90-potentiated phenotypic variation is visible to selection under normal conditions, whereas Hsp90-buffered phenotypic variation may not be (Fig 2). Thus, standing genetic variation might be biased to provide evidence for buffering (Fig 2).

In this issue of *PLOS Biology*, Geiler-Samerotte, Siegal, and coauthors measure the degree to which Hsp90 buffers and potentiates the effects of new mutations [15]. To do this, the authors utilize a panel of yeast mutation accumulation (MA) lines, which accrued mutations during



many generations of growth in the absence of selection. They measure the heritable phenotypic variation shown by these MA lines—as well as by wild isolates and cross progeny from the same species—before and after disruption of Hsp90. They then compare how these three groups, which differ in their exposure to selection, respond to Hsp90 perturbation.

Following Hsp90 impairment, heritable phenotypic variation is reduced in the MA lines but increased in the isolates [15]. Given that the MA lines have not been exposed to selection and the isolates have, this result implies that Hsp90 predominantly acts as a potentiator and that selection has acted against Hsp90-potentiated phenotypic variation in nature. Consistent with this interpretation, cross progeny that carry new combinations of standing variants also show reduced heritable phenotypic variation upon Hsp90 perturbation [15]. This finding suggests that standing variants with Hsp90-potentiated effects are common in nature, but combinations of these variants that produce extreme phenotypes are selected against. Together, the results from the MA lines and cross progeny, both of which represent groups of strains that have not been biased by selection, support a view that Hsp90 acts more as a potentiator than a buffer.

Hsp90 Is a Global Modifier That Shows Extensive Epistasis

With continued research, the utility of the terms buffer, capacitor, and potentiator becomes less clear. Not only do some of these words have meanings that seem mutually exclusive (e.g., buffer versus potentiator), but their relevance is also shaped by contextual factors, such as the type of genetic variation being examined and its exposure to selection. Moreover, these terms are often used to explain increases and decreases in heritable phenotype variation, which are in fact mediated by specific genetic variants that may show different types of responses to Hsp90 perturbation [3,15–17] (Fig 3).

In light of these considerations, the standard genetics concept of epistasis (or genetic interaction) may be a more straightforward way to communicate Hsp90's effect on heritable phenotypic variation [15,18]. Epistasis occurs when the effect of one variant depends on one or more other variants [19–22]. Thus, variants that show changes in effect upon Hsp90 perturbation by definition epistatically interact with Hsp90.

Examining response to Hsp90 perturbation from the perspective of epistasis has multiple advantages. This framing encompasses situations in which Hsp90 buffers or potentiates the effects of variants (Fig 3). However, it also accommodates quantitative changes in the effect magnitude or sign of epistatically interacting variants (Fig 3). These quantitative epistatic interactions have received limited discussion in the Hsp90 literature but are prevalent in nature [23,24,42].

Epistasis can also be used to convey Hsp90's global impact on the effects of genetic variants. Typically, a variant that influences the effect of another through an epistatic interaction is called a modifier. Therefore, we propose that Hsp90 be referred to as a global modifier because of the fact that it may show different types of epistatic interactions with many variants. The term global modifier is a more general way to describe Hsp90's effect on the genotype–phenotype map than the buffer, capacitor, and potentiator concepts. Notably, this term remains applicable across the different contexts in which one might investigate response to Hsp90 perturbation.

Questions Regarding Hsp90 and Other Global Modifiers

Research on Hsp90 has been instrumental in showing the significant influence that global modifiers can exert upon the genotype–phenotype map. Moving forward, it will be important to address multiple major questions in this area, including:



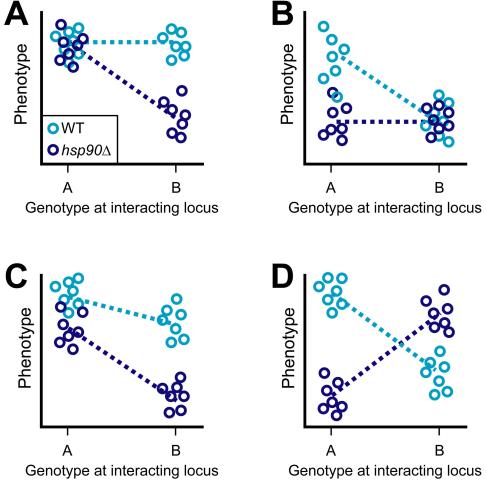


Fig 3. Hsp90 shows different forms of epistasis with individual genetic variants. Transformations of the genotype—phenotype map that occur following Hsp90 perturbation likely reflect the composite effect of multiple variants that show different types of epistatic interactions with Hsp90. In A and B, we illustrate how Hsp90 can buffer (A) or potentiate (B) the effects of individual variants. Furthermore, in C and D, we show how Hsp90 may also behave as a quantitative modifier that exhibits magnitude (C) or sign epistasis (D) with some variants. In each panel, the two alleles of a variant are shown along the x-axis, represented by "A" and "B." On the y-axis, the phenotypes associated with these variants are shown when Hsp90 is functional and compromised using light and dark blue, respectively. Each circle represents a genetically distinct haploid. For a given Hsp90 state, lines indicate the difference in phenotype between individuals carrying the alternate alleles of the interacting variant.

doi:10.1371/journal.pbio.2001015.g003

Which Genes Behave as Global Modifiers?

Evidence suggests that Hsp90 is not unique in its ability to act as a global modifier. For example, a number of studies have shown that genes involved in chromatin regulation and transcriptional repression uncover large amounts of cryptic variation when perturbed [7,25–27] and that prions [28–30] and proteins with regions of intrinsic disorder [31] can behave in a similar manner to Hsp90. Moreover, many genes buffer the effects of environmental variation; these genes might also modify the effects of genetic variation [32]. Future screens will hopefully clarify the space of genes that are global modifiers.



What Is the Genetic Architecture That Underlies Response to a Global Modifier's Perturbation?

Much of the work on global modifiers to date has inferred alterations to the genotype–phenotype map from increases or decreases in heritable phenotypic variation. Yet, such changes do not provide direct insights into the number of genetic variants and forms of epistasis underlying these responses. This information can be obtained through statistically powerful genetic mapping experiments focused on standing genetic variation [23,33] or comprehensive analysis of MA lines that harbor known new mutations [15,26].

What Are the Mechanisms by Which Global Modifiers Act?

Systematically resolving the exact variants that interact with particular global modifiers can shed light on how these genes influence heritable phenotypic variation. Epistatic interactions between a global modifier and variants may arise through a mixture of direct and indirect functional relationships. For instance, Hsp90 physically interacts with an array of client proteins, and amino acid changes in these clients might impact response to Hsp90 perturbation [13,14]. At the same time, epistatic interactions can involve variants in genes that have less direct functional relationships if these genes act in regulatory networks [7,34–36] or in compensatory or parallel cellular processes [37].

To What Extent Do Global Modifiers Harbor Functional Variation?

Although global modifiers influence the effects of genetic variants in other genes, how much polymorphisms in global modifiers themselves contribute to heritable phenotypic variation remains unclear. For example, *cis* regulatory polymorphisms causing decreases in Hsp90 expression segregate in wild populations of *Drosophila* and alter the effects of other variants [38]. However, these Hsp90 polymorphisms are highly deleterious and quite rare, suggesting they are not a major source of heritable phenotypic variation. In contrast, the discoveries of variants that affect levels of phenotypic variability in mapping studies [39,40] or show epistatic interactions with many other variants [41] are consistent with the possibility that polymorphisms in global modifiers might contribute to heritable phenotypic variation in some populations.

Conclusion

Hsp90 significantly influences the genotype–phenotype map through to its epistatic interactions with genetic variants on a global scale. For this reason, it is appropriate to describe Hsp90 and genes that behave similarly as global modifiers. Major questions to address in this area moving forward regard the broader space of genes that can act as global modifiers, the mechanisms by which Hsp90 and other global modifiers modulate the genotype–phenotype map, and the extent to which functional polymorphisms in global modifiers themselves affect heritable phenotypic variation. Research on these topics should improve our understanding of the relationship between genotype and phenotype.

Acknowledgments

We thank Jonathan Lee, Takeshi Matsui, and Fabian Seidl for comments on a draft of this manuscript.



References

- Rutherford SL, Lindquist S. Hsp90 as a capacitor for morphological evolution. Nature. 1998; 396 (6709):336–42. doi: 10.1038/24550 PMID: 9845070
- Queitsch C, Sangster TA, Lindquist S. Hsp90 as a capacitor of phenotypic variation. Nature. 2002; 417 (6889):618–24. doi: 10.1038/nature749 PMID: 12050657
- 3. Jarosz DF, Lindquist S. Hsp90 and environmental stress transform the adaptive value of natural genetic variation. Science. 2010; 330(6012):1820–4. doi: 10.1126/science.1195487 PMID: 21205668
- Gibson G, Dworkin I. Uncovering cryptic genetic variation. Nat Rev Genet. 2004; 5(9):681–90. doi: 10. 1038/nrg1426 PMID: 15372091
- Hermisson J, Wagner GP. The population genetic theory of hidden variation and genetic robustness. Genetics. 2004; 168(4):2271–84. doi: 10.1534/genetics.104.029173 PMID: 15611191
- Paaby AB, Rockman MV. Cryptic genetic variation: evolution's hidden substrate. Nat Rev Genet. 2014; 15(4):247–58. doi: 10.1038/nrg3688 PMID: 24614309
- Taylor MB, Phan J, Lee JT, McCadden M, Ehrenreich IM. Diverse genetic architectures lead to the same cryptic phenotype in a yeast cross. Nat Commun. 2016; 7:11669. doi: 10.1038/ncomms11669 PMID: 27248513
- Cowen LE, Lindquist S. Hsp90 potentiates the rapid evolution of new traits: drug resistance in diverse fungi. Science. 2005; 309(5744):2185–9. doi: 10.1126/science.1118370 PMID: 16195452
- Rohner N, Jarosz DF, Kowalko JE, Yoshizawa M, Jeffery WR, Borowsky RL, et al. Cryptic variation in morphological evolution: Hsp90 as a capacitor for loss of eyes in cavefish. Science. 2013; 342 (6164):1372–5. doi: 10.1126/science.1240276 PMID: 24337296
- Le Rouzic A, Carlborg O. Evolutionary potential of hidden genetic variation. Trends Ecol Evol. 2008; 23 (1):33–7. doi: 10.1016/j.tree.2007.09.014 PMID: 18079017
- Masel J, Siegal ML. Robustness: mechanisms and consequences. Trends Genet. 2009; 25(9):395–403. doi: 10.1016/j.tig.2009.07.005 PMID: 19717203
- Ehrenreich IM, Pfennig DW. Genetic assimilation: a review of its potential proximate causes and evolutionary consequences. Ann Bot. 2016; 117(5):769–79. doi: 10.1093/aob/mcv130 PMID: 26359425
- 13. Taipale M, Jarosz DF, Lindquist S. Hsp90 at the hub of protein homeostasis: emerging mechanistic insights. Nat Rev Mol Cell Biol. 2010; 11(7):515–28. doi: 10.1038/nrm2918 PMID: 20531426
- Jarosz DF, Taipale M, Lindquist S. Protein homeostasis and the phenotypic manifestation of genetic diversity: principles and mechanisms. Annu Rev Genet. 2010; 44:189–216. doi: 10.1146/annurev. genet.40.110405.090412 PMID: 21047258
- Geiler-Samerotte KA, Zhu YO, Goulet BE, Hall DW, Siegal ML. Selection transforms the landscape of genetic variation interacting with Hsp90. PLoS Biol. 2016; 14(10). doi: 10.1371/journal.pbio.2000465
- 16. Sangster TA, Salathia N, Lee HN, Watanabe E, Schellenberg K, Morneau K, et al. Hsp90-buffered genetic variation is common in *Arabidopsis thaliana*. Proc Natl Acad Sci U S A. 2008; 105(8):2969–74. doi: 10.1073/pnas.0712210105 PMID: 18287064
- Sangster TA, Salathia N, Undurraga S, Milo R, Schellenberg K, Lindquist S, et al. Hsp90 affects the expression of genetic variation and developmental stability in quantitative traits. Proc Natl Acad Sci U S A. 2008; 105(8):2963–8. doi: 10.1073/pnas.0712200105 PMID: 18287065
- Siegal ML, Leu JY. On the nature and evolutionary impact of phenotypic robustness mechanisms. Annu Rev Ecol Evol Syst. 2014; 45:496–517. doi: 10.1146/annurev-ecolsys-120213-091705 PMID: 26034410
- Mani R, St Onge RP, Hartman JLt, Giaever G, Roth FP. Defining genetic interaction. Proc Natl Acad Sci U S A. 2008; 105(9):3461–6. doi: 10.1073/pnas.0712255105 PMID: 18305163
- Phillips PC. Epistasis—the essential role of gene interactions in the structure and evolution of genetic systems. Nat Rev Genet. 2008; 9(11):855–67. doi: 10.1038/nrg2452 PMID: 18852697
- Mackay TF. Epistasis and quantitative traits: using model organisms to study gene-gene interactions. Nat Rev Genet. 2014; 15(1):22–33. doi: 10.1038/nrg3627 PMID: 24296533
- Taylor MB, Ehrenreich IM. Higher-order genetic interactions and their contribution to complex traits.
 Trends Genet. 2015; 31(1):34–40. doi: 10.1016/j.tig.2014.09.001 PMID: 25284288
- Bloom JS, Ehrenreich IM, Loo WT, Lite TL, Kruglyak L. Finding the sources of missing heritability in a yeast cross. Nature. 2013; 494(7436):234–7. doi: 10.1038/nature11867 PMID: 23376951
- Bloom JS, Kotenko I, Sadhu MJ, Treusch S, Albert FW, Kruglyak L. Genetic interactions contribute less than additive effects to quantitative trait variation in yeast. Nat Commun. 2015; 6:8712. doi: 10. 1038/ncomms9712 PMID: 26537231



- Tirosh I, Reikhav S, Sigal N, Assia Y, Barkai N. Chromatin regulators as capacitors of interspecies variations in gene expression. Mol Syst Biol. 2010; 6:435. doi: 10.1038/msb.2010.84 PMID: 21119629
- Richardson JB, Uppendahl LD, Traficante MK, Levy SF, Siegal ML. Histone variant HTZ1 shows extensive epistasis with, but does not increase robustness to, new mutations. PLoS Genet. 2013; 9(8): e1003733. doi: 10.1371/journal.pgen.1003733 PMID: 23990806
- Taylor MB, Ehrenreich IM. Transcriptional derepression uncovers cryptic higher-order genetic interactions. PLoS Genet. 2015; 11(10):e1005606. doi: 10.1371/journal.pgen.1005606 PMID: 26484664
- 28. True HL, Lindquist SL. A yeast prion provides a mechanism for genetic variation and phenotypic diversity. Nature. 2000; 407(6803):477–83. doi: 10.1038/35035005 PMID: 11028992
- 29. True HL, Berlin I, Lindquist SL. Epigenetic regulation of translation reveals hidden genetic variation to produce complex traits. Nature. 2004; 431(7005):184–7. doi: 10.1038/nature02885 PMID: 15311209
- Halfmann R, Jarosz DF, Jones SK, Chang A, Lancaster AK, Lindquist S. Prions are a common mechanism for phenotypic inheritance in wild yeasts. Nature. 2012; 482(7385):363–8. doi: 10.1038/nature10875 PMID: 22337056
- Chakrabortee S, Byers JS, Jones S, Garcia DM, Bhullar B, Chang A, et al. Intrinsically Disordered Proteins Drive Emergence and Inheritance of Biological Traits. Cell. 2016; 167(2):369–81 e12. doi: 10.1016/j.cell.2016.09.017 PMID: 27693355
- Levy SF, Siegal ML. Network hubs buffer environmental variation in Saccharomyces cerevisiae. PLoS Biol. 2008; 6(11):e264. doi: 10.1371/journal.pbio.0060264 PMID: 18986213
- Ehrenreich IM, Torabi N, Jia Y, Kent J, Martis S, Shapiro JA, et al. Dissection of genetically complex traits with extremely large pools of yeast segregants. Nature. 2010; 464(7291):1039–42. doi: 10.1038/ nature08923 PMID: 20393561
- Bergman A, Siegal ML. Evolutionary capacitance as a general feature of complex gene networks. Nature. 2003; 424(6948):549–52. doi: 10.1038/nature01765 PMID: 12891357
- **35.** Omholt SW, Plahte E, Oyehaug L, Xiang K. Gene regulatory networks generating the phenomena of additivity, dominance and epistasis. Genetics. 2000; 155(2):969–80. PMID: 10835414
- Gjuvsland AB, Hayes BJ, Omholt SW, Carlborg O. Statistical epistasis is a generic feature of gene regulatory networks. Genetics. 2007; 175(1):411–20. doi: 10.1534/genetics.106.058859 PMID: 17028346
- Costanzo M, Baryshnikova A, Bellay J, Kim Y, Spear ED, Sevier CS, et al. The genetic landscape of a cell. Science. 2010; 327(5964):425–31. doi: 10.1126/science.1180823 PMID: 20093466
- Chen B, Wagner A. Hsp90 is important for fecundity, longevity, and buffering of cryptic deleterious variation in wild fly populations. BMC Evol Biol. 2012; 12:25. doi: 10.1186/1471-2148-12-25 PMID: 22369091
- Ronnegard L, Valdar W. Detecting major genetic loci controlling phenotypic variability in experimental crosses. Genetics. 2011; 188(2):435–47. doi: 10.1534/genetics.111.127068 PMID: 21467569
- 40. Nelson RM, Pettersson ME, Li X, Carlborg O. Variance heterogeneity in Saccharomyces cerevisiae expression data: trans-regulation and epistasis. PLoS ONE. 2013; 8(11):e79507. doi: 10.1371/journal.pone.0079507 PMID: 24223957
- Forsberg SKG, Bloom JS, Sadhu MJ, Kruglyak L, Carlborg O. Accounting for genetic interactions is necessary for accurate prediction of extreme phenotypic values of quantitative traits in yeast. bioRxiv. 2016. Preprint. http://dx.doi.org/10.1101/059485
- Hallin J, Märtens K, Young Al, Zackrisson M, Salinas F, Parts L, et al. Powerful decomposition of complex traits in a diploid model. Nat Commun. 2016; 7:13311. doi: 10.1038/ncomms13311. PMID: 27804950