

## COMMENT OPEN



# Diagnostic elusiveness of pathogenic variants in cases of autosomal recessive diseases

Jörg Schmidtke<sup>1,2</sup>✉, Sebastian Koch<sup>3</sup> and Michael Krawczak<sup>3</sup>

© The Author(s) 2024

*European Journal of Human Genetics* (2024) 32:474–476; <https://doi.org/10.1038/s41431-024-01574-2>

The combination of whole exome sequencing (WES) and subsequent Human Phenotype Ontology-based filtering of the results has become a standard approach in clinical genetics to identifying causative genetic variants in cases of rare human diseases [1]. As recently described by an article in this journal [2], however, the use of this strategy often results in the identification of only a single pathogenic variant for monogenic diseases that are typically bi-allelic. While such an outcome may not definitively resolve the case at hand, it cannot simply be ignored with a view to, for example, taking preventive measures or assessing the risks of relatives. It is intuitively clear that, the rarer the disease, the less likely it is that a single pathogenic allele will be detected in a patient by chance alone.

Here, we present a mathematical approach to evaluating the type of results described above, not least to provide guidance in deciding whether or not further testing (e.g. whole genome sequencing, WGS) should be initiated in a clinical setting. Our aim is to calculate the conditional probability of an ‘elusive’ second allele in cases of overt heterozygosity (genotype G) for a pathogenic variant in gene X, known to be associated with suspected autosomal recessive disease D. This probability depends upon three relevant parameters, namely

- the prevalence  $\pi$  of disease D,
- the analytical sensitivity  $s$  of the employed search method, i.e. the probability that a disease-causing variant in gene X is detected by that method,
- the frequency  $\rho$  of phenocopies of D, i.e. the prevalence of the patient’s phenotype P among people not affected by D.

Since the presence of a second pathogenic allele is logically equivalent to the unambiguous diagnosis of D, the sought-after conditional probability is

$$\begin{aligned}
 P(D|G, P) &= \frac{P(D) \cdot P(G, P|D)}{P(D) \cdot P(G, P|D) + (1 - P(D)) \cdot P(G, P|D^c)} \\
 &= \frac{\pi \cdot 2s(1 - s)}{\pi \cdot 2s(1 - s) + (1 - \pi) \cdot \frac{2s\sqrt{\pi}}{1 + \sqrt{\pi}} \cdot \rho} \\
 &= \frac{\pi \cdot (1 - s)}{\pi \cdot (1 - s) + \frac{(1 - \pi)}{1 + \sqrt{\pi}} \cdot \sqrt{\pi} \cdot \rho} \sim \frac{\pi \cdot (1 - s)}{\pi \cdot (1 - s) + \sqrt{\pi} \cdot \rho} = \frac{\sqrt{\pi} \cdot (1 - s)}{\sqrt{\pi} \cdot (1 - s) + \rho}
 \end{aligned}$$

assuming that P and G are conditionally independent in the absence of D (denoted by  $D^c$ ), i.e.  $P(G, P|D^c) = P(G|D^c) \cdot P(P|D^c)$ , and because

$$\begin{aligned}
 P(G|D^c) &= \frac{s \cdot 2\sqrt{\pi}(1 - \sqrt{\pi})}{(1 - \sqrt{\pi})^2 + (1 - s) \cdot 2\sqrt{\pi}(1 - \sqrt{\pi}) + s \cdot 2\sqrt{\pi}(1 - \sqrt{\pi})} \\
 &= \frac{s \cdot 2\sqrt{\pi}}{(1 - \sqrt{\pi}) + (1 - s) \cdot 2\sqrt{\pi} + s \cdot 2\sqrt{\pi}} = \frac{2s\sqrt{\pi}}{1 + \sqrt{\pi}}
 \end{aligned}$$

In practice, reliable prevalence estimates are often rare or even missing, especially if the ethnicity of the individual patient is to be accounted for [3]. Similarly, both the analytical sensitivity of WES and the proportion of phenocopies are mostly unknown for autosomal recessive diseases and their associated genes. Our mathematical derivations imply, however, that even with a high analytical sensitivity and a substantial proportion of phenocopies, a disease with realistic prevalence may still be reliably diagnosed by the detection of a single pathogenic allele, despite the second allele being ‘elusive’ (Fig. 1).

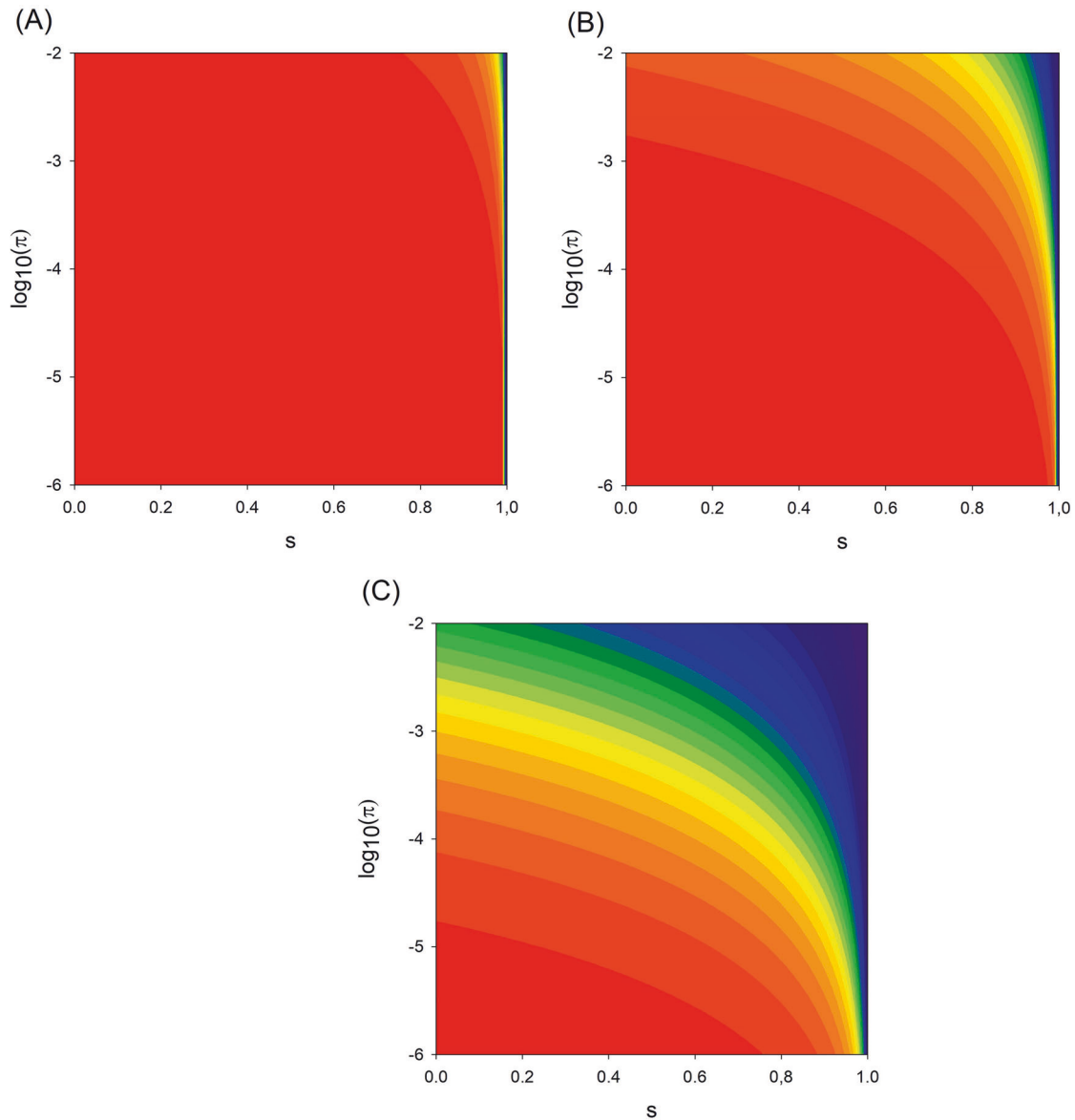
For example, even with an analytical sensitivity as high as 95%, a diagnosis based upon a single variant would still be correct with > 94% probability for a disease with a prevalence of 1:1000 or less and a 10-fold smaller frequency of phenocopies ( $\rho = 0.1 \cdot \pi$ , Fig. 1A). When disease and phenocopies are equally frequent ( $\rho = \pi$ , Fig. 1B), the probability of a correct diagnosis still exceeds 90% for an analytical sensitivity of 90% and a prevalence of 1:10,000 or less. Only if phenocopies clearly dominate ( $\rho = 10 \cdot \pi$ , Fig. 1C) does the probability of a correct diagnosis fall below 50% for that combination of prevalence and analytical sensitivity.

For the molecular genetic diagnosis of a rare autosomal recessive disease, the non-detection of a second disease-causing mutation must not mean the end of it. On the contrary, under realistic assumptions about disease prevalence and analytical sensitivity, the detection of initially only one potentially causative genetic variant in a gene known to be associated with the disease of interest can already mean a sufficiently reliable diagnosis. Regardless of this, however, an attempt should always be made to discover the second ‘elusive’ allele and thus to provide patients and their families with final certainty about their case.

<sup>1</sup>Hannover Medical School, Carl-Neuberg-Str. 1, 30625 Hannover, Germany. <sup>2</sup>amedes MVZ wagnerstibbe, Georgstrasse 50, 30159 Hannover, Germany. <sup>3</sup>Institute of Medical Informatics and Statistics, Kiel University, Brunswiker Strasse 10, 24105 Kiel, Germany. ✉email: schmidtke.joerg@mh-hannover.de

Received: 9 February 2024 Accepted: 20 February 2024

Published online: 6 March 2024



**Fig. 1** Conditional probability of an 'elusive' second allele in cases of overt heterozygosity for a pathogenic variant in a gene associated with an autosomal recessive disease. The probability is color-coded from blue (0) to red (1).  $\pi$ : disease prevalence,  $s$ : analytical sensitivity. **A:** prevalence of phenocopies  $\rho = 0.1 \cdot \pi$ , **B:**  $\rho = \pi$ , **C:**  $\rho = 10 \cdot \pi$ .

## REFERENCES

1. Cipriani V, Pontikos N, Arno G, Sergouniotis PI, Lenassi E, Thawong P, et al. An improved phenotype-driven tool for rare Mendelian variant prioritization: benchmarking Exomiser on real patient whole-exome data. *Genes*. 2020;11:460–84.
2. Horton AE, Lunke S, Sadedin S, Fennell AP, Stark Z. Elusive variants in autosomal recessive disease: how can we improve timely diagnosis? *Eur J Hum Genet*. 2023;31:371–74.
3. Schmidtke J, Philipp P, Rommel K, Glaubitz R, Epplen JT, Krawczak M. PanelDesign: integrating epidemiological information into the design of diagnostic NGS gene panels. *Genes*. 2022;13:684–9.

## AUTHOR CONTRIBUTIONS

JS: conceptualization, writing - original draft, writing - review and editing. SK: methodology, writing - review and editing. MK: methodology, writing - review and editing

## FUNDING

This work did not receive any external funding. Open Access funding enabled and organized by Projekt DEAL.

## CONFLICT OF INTEREST

JS is an employee of amedes MVZ wagnerstibbe, Hannover, Germany. SK and MK declare no conflicts of interest.

## ADDITIONAL INFORMATION

**Correspondence** and requests for materials should be addressed to Jörg Schmidtke.

**Reprints and permission information** is available at <http://www.nature.com/reprints>

**Publisher's note** Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.



**Open Access** This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the

article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit <http://creativecommons.org/licenses/by/4.0/>.

© The Author(s) 2024