

Quantifying variant evidence for precise probabilistic genomics

Introduction

Variant interpretation in clinical genetics has long relied on categorical labels such as pathogenic or benign. These labels simplify communication but collapse uncertainty, leaving most of the **statistical evidence unquantified**. A principled framework should instead account for **all possible outcomes**, including unobserved but plausible variants, and quantify their contributions to diagnostic probability. Our approach reframes interpretation as a **Bayesian inference problem**. Each variant is assigned a prior probability based on allele frequency, classification, and inheritance mode, then updated with sequencing evidence to generate a posterior probability distribution. The result is expectation-driven inference: **every variant**, observed or not, is integrated into a coherent probability model, and uncertainty itself becomes a measurable input to **diagnosis**.

1. Target set

The target set defines the scope of inference, from a **whole genome** or just a small region.

$$P_{\text{tot}} = \sum_{i \in T} p_i$$

2. Priors

Based on population genetics, each variant has a **probability of occurrence** from allele frequency or *de novo* mutation. **Mode of inheritance** maps this to disease **risk**.

$$p_{\text{disease},i} = 2p_i(1 - p_i)$$

$$p_i = \frac{1}{\max(\text{AN}) + 1}$$

$$P_{\text{AR}} = P_{\text{tot}}^2, \quad p_{\text{disease},i} = p_i \cdot P_{\text{tot}}$$

$$p_{\text{male},i} = p_i, \quad p_{\text{female},i} = 2p_i(1 - p_i)$$

3. Weighting

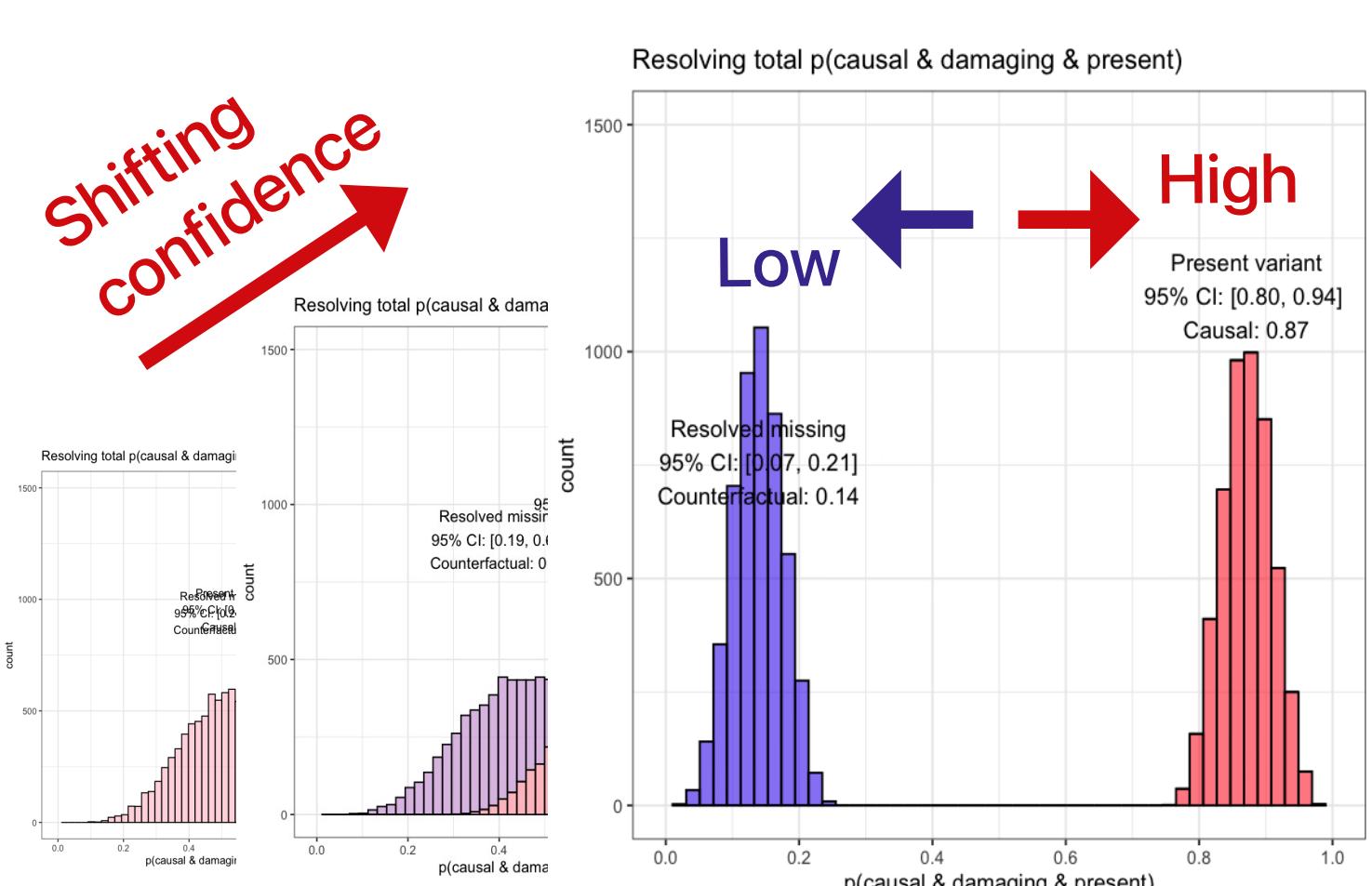
Evidence sources (e.g. ClinVar, ACMG) are converted to weights W_i that **scale** variant probabilities.

$$p_i^* = W_i \cdot p_i$$

Result

7. The shift

Instead of classifying variants as pathogenic or benign, the method shifts from categorical labels to expectation-driven inference. Every variant, observed or not, is integrated. Updating the interpretation based on complete evidence gives a **new high confidence interval** for a single diagnosis.



4. Evidence and counterfactuals

q_i encodes presence, absence, or unsequenced status. Missing data are treated as **probabilistic** rather than ignored.

$$q_i \in \{1, 0, p_i\}$$

$$G_i^{(m)} \sim \text{Bernoulli}(q_i)$$

5. Posterior

Posterior diagnostic probability is obtained by combining weighted priors with observed or possible presence, yielding **credible intervals (CrI)**.

$$P_T^{(m)} = \sum_{i \in T} p_i^* \cdot G_i^{(m)}$$

6. Scenarios

Each variant in a genome, compared to all other candidates, represents a scenario. Scenarios show how observed and missing variants **shift the posterior**. Both certainty and residual uncertainty are quantified.

$$P_T \approx 1 \quad \text{Causal}$$

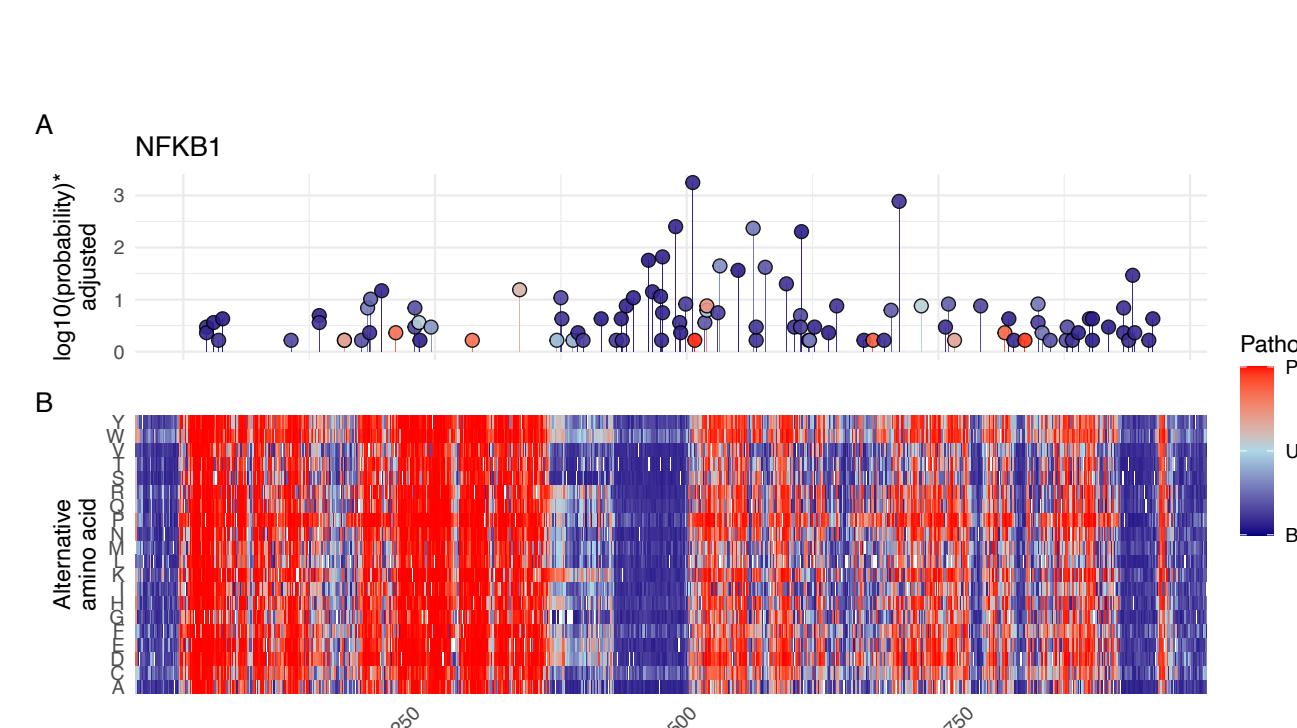
$$P_T = 0 \quad \text{Not causal}$$

$$P_T \approx 0.54 \quad (95\% \text{ CrI } 0.26-0.80)$$

Uncertainty

8. Validation

Validation is shown by accurate prediction of the national-scale disease frequency and cases in known causal genetic disease like dominant *NFKB1* or recessive *CFTR*. Tools like AlphaMissense predict pathogenicity. Now we can also model **likelihood**.



The quantitative omic epidemiology group, et al. "Quantifying prior probabilities for disease-causing variants reveals the top genetic contributors in inborn errors of immunity" medRxiv preprint (2025).

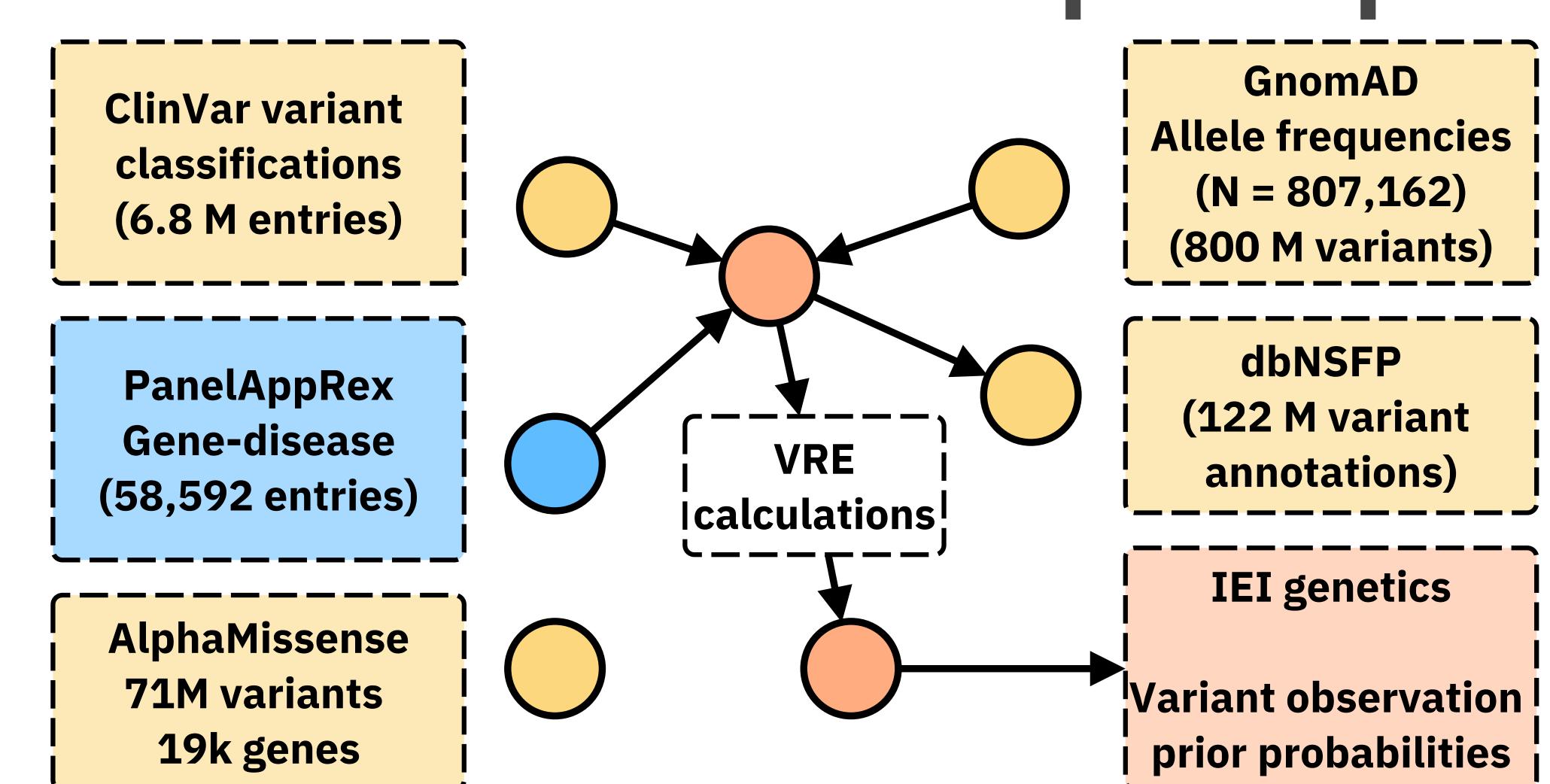
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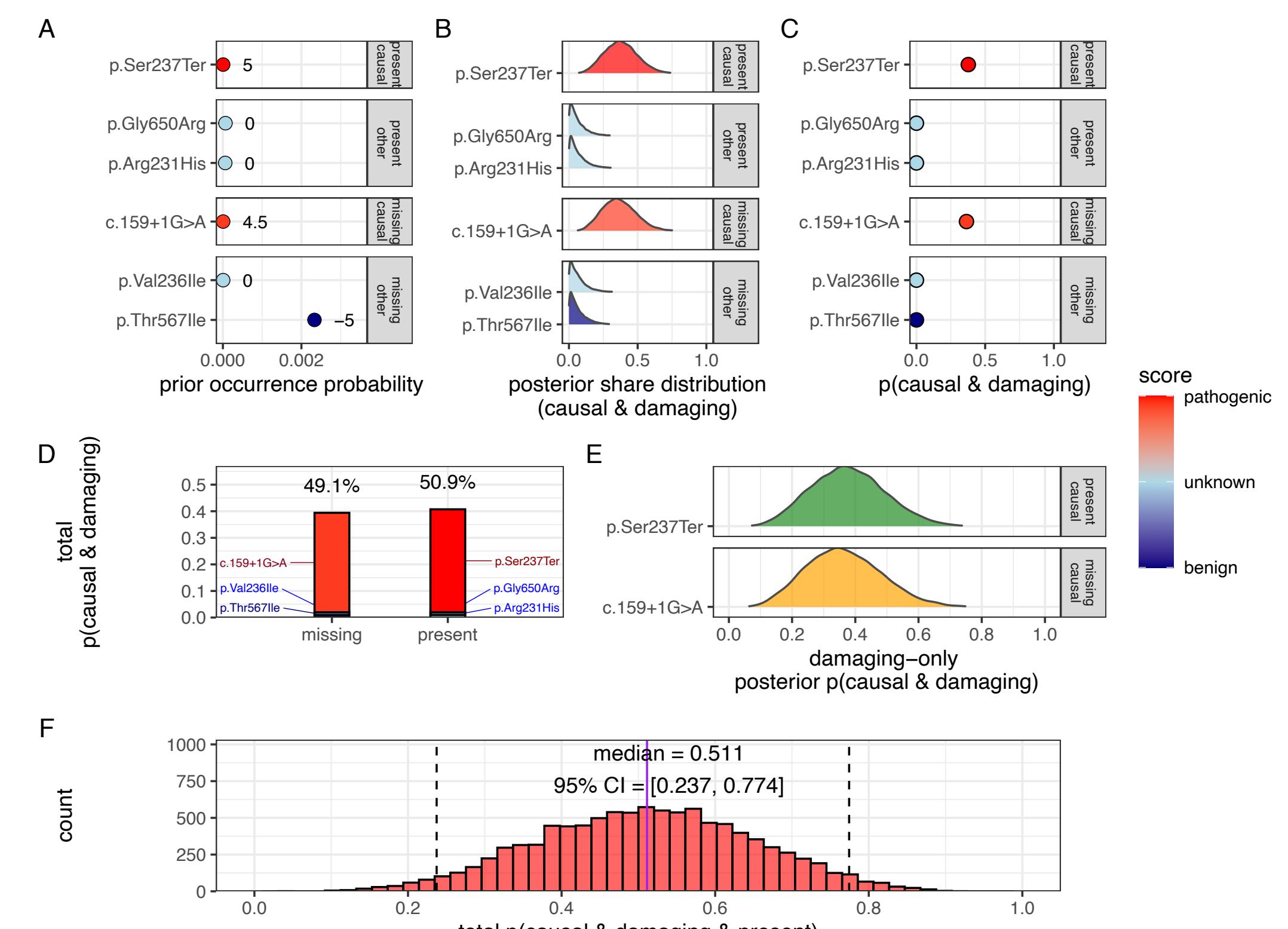
Diagnostic confidence given available evidence

Prior CrI 0.39-0.59
Posterior CrI 0.88-0.99



Data sources and validation studies. CrI (credible interval), IEI (inborn errors of immunity), VRE (variant risk estimate).

Gene: *NFKB1*



Scenario in *NFKB1*. Consider six variants as cause of disease. One known pathogenic variant *p.Ser237Ter* is **present**. Due to quality, a possible likely-pathogenic *c.159+1G>A* is **unaccounted for**. (A) Prior probability of observation, (B-D) posterior weights for each variant, and (E) decomposition of causal probability into observed (green) and missing (orange) sources. The posterior probability of a **complete diagnosis** is 0.54 (95% CrI 0.26-0.80). We must **confirm the missing candidate to maximise the confidence interval**.

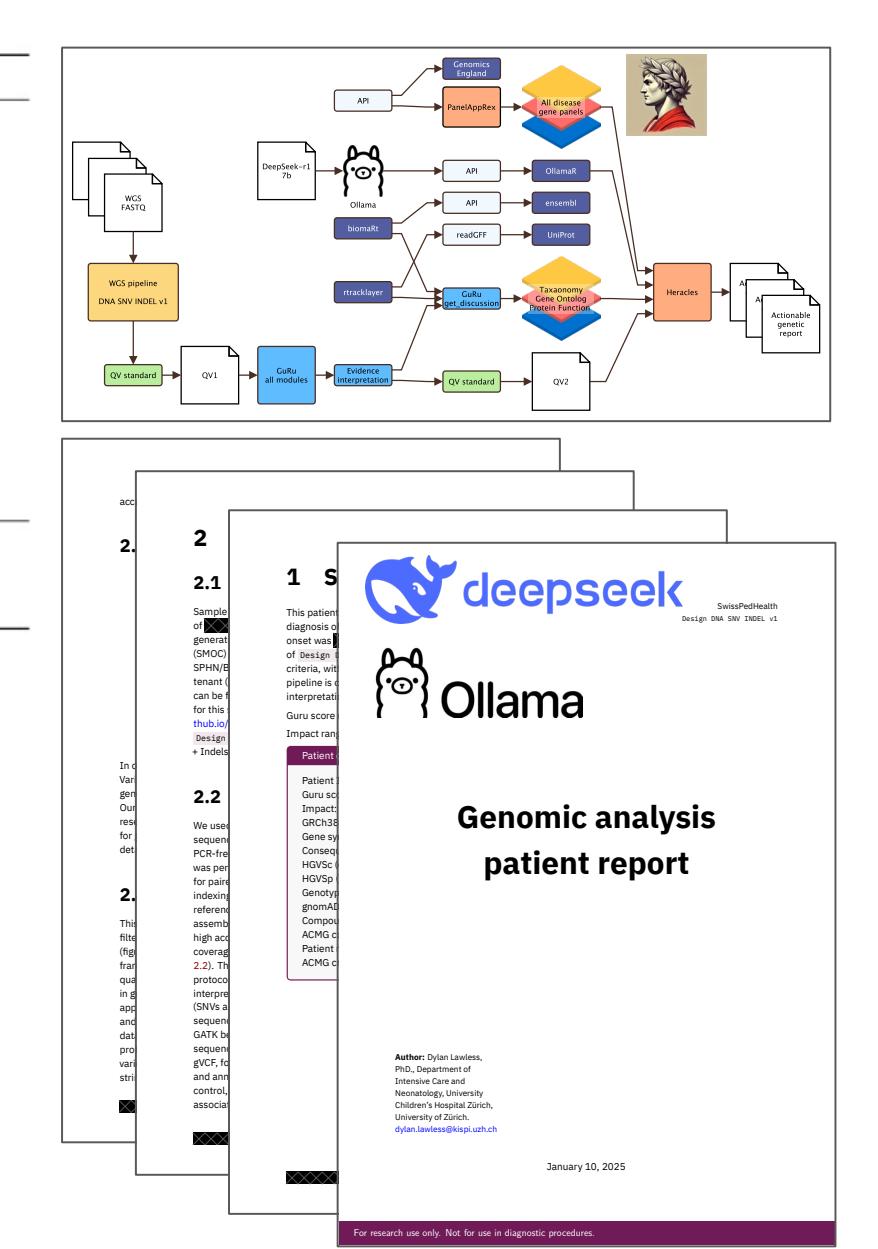
9. Actionable

Stable confidence intervals based on **evidence available**. We can judge empirically when stronger clinical or mechanistic evidence is required. Suitable for **decision-making** and AI integration.

Parameter	present	missing
Gene	<i>NFKB1</i>	<i>NFKB1</i>
HGVSc	c.710C>G	c.159+1G>A
HGVSp	p.Ser237Ter	
Inheritance	AD	AD
Patient sex	Male	Male
gnomAD frequency	6.57e-06	6.57e-06
95% CrI lower	0.000	NA
95% CrI upper	0.551	NA
Posterior p(causal)	0.377	0.384
Interpretation	Reported causal; variant not observed	Reported causal; variant not detected -- consider follow-up
Summary	Overall probability of correct causal diagnosis due to SNV/INDEL given the currently available evidence: 0.511 (95% CrI 0.237-0.774)	

Verifiable evidence interpretation RAG:

"Multiomic analysis showed that the nonsense variant is technically robust and functionally deleterious. RNA sequencing confirmed that the transcript is preserved without evidence of decay, yet proteomic profiling demonstrated absence of the normal protein product, consistent with truncation and loss of function. Metabolomic readouts supported disruption of..."

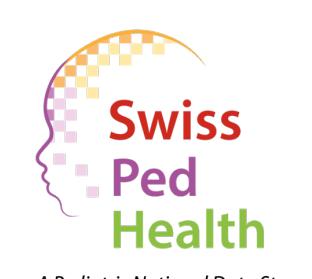


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