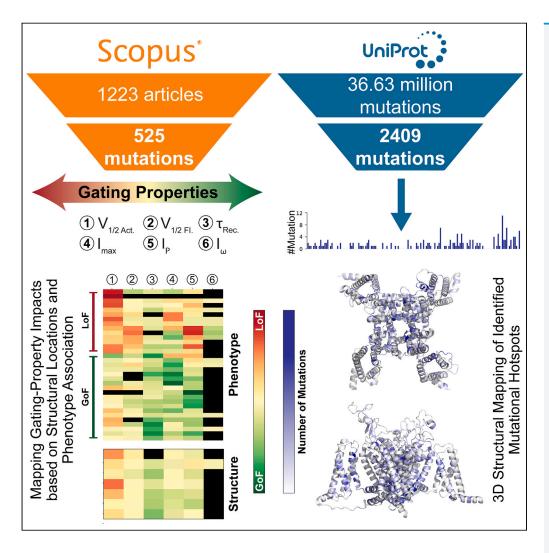
# **iScience**



# **Article**

Mapping structural distribution and gatingproperty impacts of disease-associated mutations in voltage-gated sodium channels



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#### Highlights

Mapped 2,400 mutations in Na<sub>v</sub> channels and identified clusters of mutation hotspot

Mapped gating-property impacts of 525 mutations from 366 electrophysiology studies

Revealed gating property is vital for precisely predicting variant effects in Na.

Identified patterns of gating-property impacts for key structural regions

Akbari Ahangar et al., iScience 27, 110678 September 20, 2024 © 2024 The Author(s). Published by Elsevier Inc. https://doi.org/10.1016/ j.isci.2024.110678



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# Mapping structural distribution and gating-property impacts of disease-associated mutations in voltage-gated sodium channels

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#### **SUMMARY**

Thousands of voltage-gated sodium (Na<sub>v</sub>) channel variants contribute to a variety of disorders, including epilepsy, cardiac arrhythmia, and pain disorders. Yet, the effects of more variants remain unclear. The conventional gain-of-function (GoF) or loss-of-function (LoF) classifications are frequently employed to interpret mutations' effects and guide therapy for sodium channelopathies. Our study challenges this binary classification by analyzing 525 mutations associated with 34 diseases across 366 electrophysiology studies, revealing that diseases with similar GoF/LoF effects can stem from unique molecular mechanisms. Utilizing UniProt data, we mapped over 2,400 disease-associated missense mutations across Na<sub>v</sub> channels. This analysis pinpoints key mutation hotspots and maps patterns of gating-property impacts for the mutations, respectively, located around the selectivity filter, activation gate, fast inactivation region, and voltage-sensing domains. This study shows great potential to enhance prediction accuracy for mutational effects based on the structural context, paving the way for targeted drug design in precision medicine.

#### **INTRODUCTION**

Bioelectrical signals, responsible for phenomena such as heartbeats, muscle contractions, and rapid cognitive processing, hinge on the function of ion channels. Among these, voltage-gated sodium ( $Na_v$ ) channels are particularly prevalent, playing a crucial role in initiating action potentials and underpinning electrical excitability. Progress in gene research and functional assays has led to the identification of thousands of  $Na_v$  channel mutations associated with a range of excitability disorders affecting the heart, muscles, and brain. For instance, the  $Na_v$ 1.5 channel, primarily associated with cardiac function, has been linked to an array of inherited arrhythmias due to a multitude of natural variants. Similarly, various forms of periodic paralysis are caused by mutations in the  $Na_v$ 1.4 channel, which is primarily found in skeletal muscles. In the realm of neurological disorders, mutations in the  $Na_v$ 1.1,  $Na_v$ 1.2,  $Na_v$ 1.3, and  $Na_v$ 1.6 channels, predominantly located in the brain, have been tied to genetic epilepsy, autism, migraines, and other neurological conditions. Authority disorders. In the  $Na_v$ 1.7 channel, largely situated in peripheral neurons, is implicated in a wide range of pain disorders.

Pathogenic mutations can disrupt the standard function of  $Na_v$  channels by either amplifying (gain-of-function, or GoF) or diminishing (loss-of-function, or LoF)  $Na^+$  current. <sup>14</sup> These opposite effects on channel function can result in a spectrum of disorders. <sup>7,15</sup> For example, GoF mutations in the  $Na_v$ 1.5 channel can trigger long QT syndrome type 3 (LQT3), while LoF mutations in the same channel have been linked to various conditions, such as Brugada syndrome (BRGDA1) and dilated cardiomyopathy (DCM). <sup>8,9</sup> Similarly, GoF missense mutations in the  $Na_v$ 1.7 channel have been found to induce primary erythermalgia (PEM) and paroxysmal extreme pain disorder (PEPD), while LoF mutations result in an insensitivity to pain. <sup>12</sup> Likewise, GoF variants in the  $Na_v$ 1.2 channel have been associated with conditions like infantile epileptic encephalopathy and benign familial infantile seizures (BFIS3), whereas LoF variants can lead to autism (autism spectrum disorder [ASD]) and/or intellectual disability. <sup>7,16</sup> This genotype-phenotype relationship is similarly observed in other  $Na_v$  channels. <sup>7</sup>

The GoF and LoF classifications in  $Na_{\nu}$  channels have frequently been employed to categorize disease-associated mutations for interpreting genotype-phenotype relationships, <sup>7,15</sup> predicting the functional impact of novel variants, <sup>17,18</sup> and guiding precision therapy <sup>19,20</sup> for sodium channelopathies. Recent studies have explored the correlation between phenotypes and the structural locations of mutations, and have detected the regional clusters and their relationship with overall GoF and LoF phenotype. <sup>17,19</sup> However, several critical questions cannot be addressed by the binary classification of GoF/LoF.

Firstly, the overall gain-of-function (GoF $_{o}$ ) or loss-of-function (LoF $_{o}$ ), which refers to the amplification or reduction of the total sodium current, respectively, does not provide critical details for the nuanced impacts on channel function. <sup>21</sup> Na $_{v}$  channels undergo three primary steps within their functional cycle: activation, inactivation, and recovery from inactivation. <sup>22</sup> Each of these steps encompasses several gating

https://doi.org/10.1016/j.isci.2024.110678



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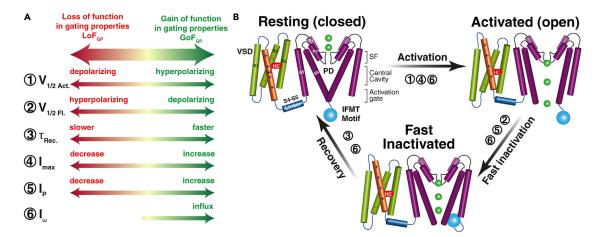


Figure 1. The gating properties and functional transitions of Na<sub>v</sub> channels

(A) Gating properties are listed with their  $GoF_{GP}$  (green) or  $LoF_{GP}$  (red) effects. These properties comprised maximal current amplitude ( $I_{max}$ ), half-activation voltage in steady-state fast inactivation ( $V_{1/2\ lnact}$ ), recovery rate ( $\tau_{rec}$ ), persistent current ( $I_P$ ), and gating pore current (or  $\omega$  current,  $I_{\omega}$ ).

(B) The gating properties with their relevant transitions in the functional cycle of  $Na_v$  channels. The  $Na_v$  structure has four similar subunits (I to IV), and each subunit comprises six transmembrane helices (S1-S6). The first four TMs (S1 to S4) form a voltage-sensing domain (VSD), and the TMs S5 and S6 contribute to the pore domain (PD). Sensing the membrane depolarization, VSDs undergo resting-to-activated structural transition. Then the channel inactivates mediated by allosteric blocking of IFMT motif when depolarization is prolonged to a certain timescale. Thirdly, the repolarization of membrane potential allows recovery from the fast inactivation to the resting state. The gating properties are labeled with their relevant functional step. Please check the supplementary materials for a colorblind-friendly version of this figure.

properties, capable of modifying the  $Na^+$  current at a specific phase (Figure 1B). The alterations in gating properties associated with these steps not only change the total sodium current but also modify the timing and shape of the action potential. Such changes in action potential, for instance in cardiac cells, could lead to differential conditions where the heart beats too fast, too slow, or irregularly. These diverse conditions can lead to distinct life-threatening arrhythmias, which cannot be accurately diagnosed or understood solely through the  $GoF_o/LoF_o$  classification.

Another challenging phenomenon is the occurrence of "overlapping syndromes", where a single mutation can lead to phenotypes with different or even opposing overall effects.  $^{8,23-25}$  For example, more than 30 mutations in Na<sub>v</sub>1.5 have been linked to both GoF<sub>o</sub>-associated LQT3 and LoF<sub>o</sub>-associated BRGDA1.  $^{23,26}$  The mystery of how a single point mutation can lead to both GoF<sub>o</sub> and LoF<sub>o</sub> phenotypes  $^{27,28}$  adds to the limitations of the conventional GoF<sub>o</sub>/LoF<sub>o</sub> classification system. Understanding these complexities requires a more nuanced examination of Na<sub>v</sub> channels and their mutations, going beyond the binary GoF<sub>o</sub>/LoF<sub>o</sub> model.

Moreover, the same phenotype can arise from different gating property changes, mediated by diverse mechanisms.  $^{23,24,29,30}$  For instance, over 200 LoF<sub>o</sub> mutations are associated with BRGDA1, but their functional impacts are mediated through a range of mechanisms, such as the depolarizing shift of activation, hyperpolarizing shift of inactivation, and/or slower recovery from inactivation.  $^{23}$  This adds another level of complexity to the application of  $\text{GoF}_{\text{o}}/\text{LoF}_{\text{o}}$  classification for predicting the mutation's effects and guiding precision therapy.

More importantly, although  $GoF_o/LoF_o$  classification has provided valuable guidance for therapeutic development and use over the past several decades, it is challenging to further improve the efficacy and accuracy for precision medicine. Given the broad array of mechanisms leading to  $GoF_o/LoF_o$  effects, developing a universal therapy capable of addressing all similar outcomes is unrealistic, as supported by extensive clinical evidence. For instance, channel blockers are a conventional strategy for treating  $GoF_o$  diseases, but numerous reports indicate that  $Na_v$  blockers are ineffective for some patients with  $GoF_o$  phenotypes. <sup>31,32</sup> Similarly, there is increasing evidence of a lack of response to  $Na_v$  blockers in individuals with  $GoF_o$  phenotype myotonias. <sup>33,34</sup> In one study, 23 out of 63 (36.5%) myotonia patients showed no improvement with sodium channel blocker treatment. <sup>33</sup> Alternatively, by categorizing mutations based on their impact on gating properties, it may be more promising to design selective drugs targeting groups of mutations that share similar mechanisms. This is why clinicians have started to adjust the medication based on changes in the channel's biophysical properties. <sup>35</sup> Therefore, we propose that therapeutic strategies in the era of precision medicine should not solely target  $GoF_o/LoF_o$  effects, but rather focus on correcting the altered gating properties induced by mutations.

In the current study, a large-scale analysis is undertaken, leveraging the most recent electrophysiological and genetic data to map the distribution of mutations and identify common patterns of mutational effects on gating properties. Firstly, a large number of research articles have measured the mutational effects on different gating properties over the past three decades. To synthesize this wealth of knowledge on variant effects, we conducted a meta-analysis of 366 independent studies on missense mutations based on human cell lines. A systematic literature search was performed to gather the gating properties of 525 mutations from previous electrophysiological measurements (Figure 2A). This meta-analysis enables us to compare homologous mutations across different channels and group mutations or phenotypes





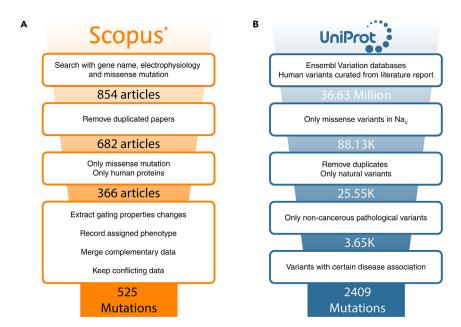


Figure 2. The workflow in the study for collecting electrophysiology and genetic data

(A) The workflow to search and extract electrophysiology research articles that study the mutational effects on gating properties. A total of 854 articles from Scopus were reviewed, and a rigorous selection process identified 366 articles relevant to this study. From these articles, 525 unique mutations with gating properties were identified and selected as the core data for further analysis and investigations.

(B) Data extraction steps to retrieve disease and variant data from UniProt. Initially, more than 36 million mutations in UniProt were filtered, resulting in a refined dataset of 2.4K non-cancerous pathogenic missense mutations in Na<sub>v</sub>.

based on alterations in gating properties (Figure 3), providing deeper insights into the fundamental principles underlying the disturbed biophysical impacts induced by various mutations. Furthermore, approximately 2,400 annotated disease-associated missense mutations of the nine human Na<sub>v</sub> channels from the UniProt database (Figure 2B) to equivalent positions are mapped into structural segments (Figure 4) and the multiple sequence alignment (MSA) (Figure 5). We can map mutation distributions (Figures 6 and 7), identify the most representative mutations with conserved functional significance (Table S1), and, crucially, explore the way to predict mutational effects based on their structural location and context.

#### **RESULTS**

#### Mapping the gating-property impacts of sodium channelopathies

We carried out an exhaustive literature search across Scopus, yielding 854 papers that reported electrophysiology measurements of gating properties for Na<sub>v</sub> channel mutants. Duplicate research articles were eliminated, and the records lacking a patch-clamp experiment on a pathogenic missense mutation of human Na<sub>v</sub> channels were excluded (Figure 2). Following this, we performed a thorough full-text analysis on 366 articles, documenting 525 variants and their influence on several crucial gating properties. These properties comprised maximal current amplitude ( $I_{max}$ ), half-activation voltage in steady-state activation ( $V_{1/2 \text{ Act}}$ ), half-inactivation voltage in steady-state fast inactivation ( $V_{1/2 \text{ Inact}}$ ), recovery rate ( $\tau_{rec}$ ), persistent current ( $I_P$ ), and gating pore current (or  $\omega$  current,  $I_{rec}$ ) (Figure 1). We recognize that protein expression, folding, trafficking, and post-translational modifications (PTMs) are also essential properties that can be influenced by mutations. Therefore, some of these properties are documented in Table S3. Often, such impacts can affect the peak current amplitude ( $I_{max}$ ), even if they do not directly alter the protein structure. Our review indicates that protein expression, folding, and trafficking are less frequently reported in electrophysiology studies compared to the gating properties (refer to Table S3). Due to the limited availability of relevant data, these properties are not explicitly included in our analysis.

In this study, we recognize that alterations in each gating property in all electrophysiology measurements lead to amplification or reduction of the  $Na^+$  current at specific steps in the functional cycle. To effectively summarize the mutational effects on each gating property from 366 research articles, we have categorized the impacts on each gating property based on gain-of-function or loss-of-function, referred to as  $GoF_{GP}$  (gain of function on a gating property) and  $LoF_{GP}$  (loss of function on a gating property), respectively (Figure 1). This terminology helps to distinguish the effects on individual gating properties from the overall gain-of-function ( $GoF_o$ ) or loss-of-function ( $LoF_o$ ) effects on  $Na_v$  channels. This distinction is crucial as it provides a more nuanced understanding of how mutations affect  $Na_v$  channel function at specific stages, further aiding in understanding mutation impacts more precisely.

To categorize the sodium channel pathies and compare their gating-property impacts, a  $GoF_o/LoF_o$  categorization was applied to 34 diseases across the nine  $Na_v$  channels based on overall effects in previous literature (Table S2). In order for a disease to be included in





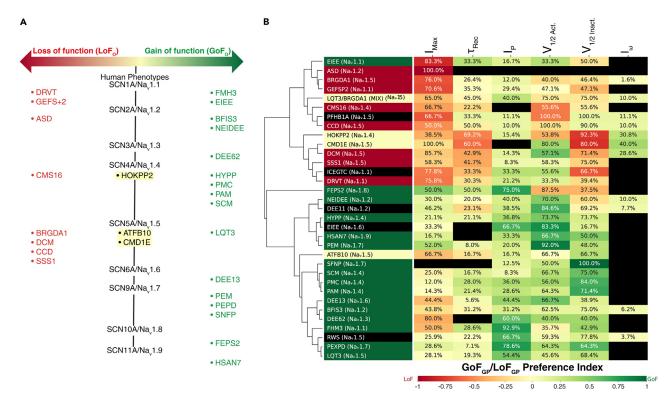


Figure 3. The classification of Na<sub>v</sub> associated diseases based on overall mutational effect or impacts on gating properties

(A) 34 sodium channelopathies are grouped based on a binary GOF<sub>o</sub>/LOF<sub>o</sub> classification according to previous literature (Table S2). Diseases are colored in green for GoF<sub>o</sub> phenotypes, red for LoF<sub>o</sub> phenotypes, and yellow for diseases with mixed overall effect (MIX<sub>o</sub>).

(B) Gating-property impacts of 536 mutations are mapped into their associated 34 diseases. The diseases are also clustered based on the similarity of the gating-property impacts of their associated mutations. The  $GoF_{GP}/LoF_{GP}$  preference index is depicted colorimetrically with dark green representing highly consistent  $GoF_{GP}$  effect, dark red for highly consistent  $LoF_{GP}$  effect, and black no such a gating-property data available. The percentage (%) of mutations affecting a certain gating property within a specific phenotype is shown in each grid. Please check the supplementary materials for a colorblind-friendly version of this figure.

this analysis, it had to have at least five associated mutants that were reported in previous electrophysiological studies (Table S3). Based on previous literature (Table S2), eight diseases were associated with inferred  $LoF_o$  effect, eighteen were associated with inferred  $GoF_o$  effect, three were suggested to have mixed effects, and the effects of five diseases remain unclear (See Figure 3A). Considering the fact that many mutants in  $Na_v1.5$  are associated with both LQT3 and BRGDA1, these mutants were exclusively grouped for a mixed phenotype (LQT3/BRGDA1). The mixed phenotype categorization highlights the complex relationships between specific mutations, channel functionality, and resulting diseases.

Sodium channelopathies, as identified in our analysis (Figure 3B), cluster into two primary branches based on their altered gating properties, predominantly aligning with the  $GoF_o/LoF_o$  categorization.  $EIEE(Na_v1.1)$  is the sole  $GoF_o$  phenotype grouped with most  $LoF_o$  diseases (Figure 3B), yet the overall effect of  $EIEE(Na_v1.1)$  remains a subject of ongoing debate.

However, within each of these branches, there are diseases with significant differences in their altered gating properties. This observation implies that diseases with similar overall effects (either  $GoF_o$  or  $LoF_o$ ) are triggered by distinctive molecular mechanisms. For instance, among  $GoF_o$  phenotypes, both familial episodic pain syndrome 2 (FEPS2, associated with  $Na_v1.8$ ) and benign familial infantile 3 (BFIS3, associated with  $Na_v1.2$ ) belong to this branch. However, their variant effects on several gating properties are almost opposite: a large portion of FEPS2 mutations increase  $I_{max}$ , speed up recovery, depolarizing shift  $V_{1/2\ Act}$ , and hyperpolarizing shift  $V_{1/2\ Inact}$ , whereas similar proportions of BFIS3 mutations decrease  $I_{max}$ , slow down recovery, hyperpolarizing shift  $V_{1/2\ Act}$ , and depolarizing shift  $V_{1/2\ Inact}$  (Figure 3B). This clear distinction suggests that these two pain disorders are driven by entirely different mechanisms, and as a result, their treatments for restoring normal channel function should also be unique. A similar divergence is observed within the  $LoF_o$  branch, DCM (associated with  $Na_v1.5$ ) mutations cause hyperpolarizing shift of  $V_{1/2\ Act}$ , hyperpolarizing shift of  $V_{1/2\ Inact}$ , or slow  $\tau_{rec}$ . In contrast, most PFHB1A (associated with  $Na_v1.5$ ) mutations cause a depolarizing shift of  $V_{1/2\ Act}$ , lead depolarizing shift of  $V_{1/2\ Inact}$ , or speed up  $\tau_{rec}$ . Given that a large portion of mutations associated with these two diseases affect these three gating properties, it is clear that these two diseases, despite having a  $LoF_o$  effect, must be driven by distinct mechanisms

Our analysis shows that the same overall effect (either  $GoF_o$  or  $LoF_o$ ) can be caused by differential influences on different gating properties. This implies that certain gating properties might have a dominant role in shaping the overall effect, even when other gating properties are





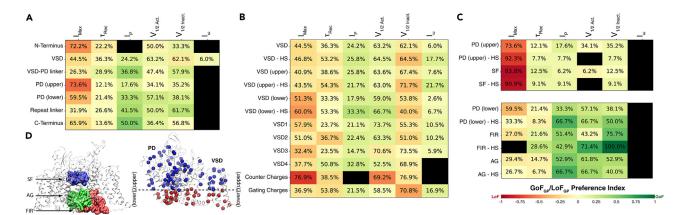


Figure 4. Preferences of gating-property impacts for disease-associated mutations in different structural segments

The variant effects on six gating properties of 525 mutations from 366 papers are mapped into seven major structural segments (A), different selections in VSDs (B), and PD (C). HS stands for the mutation hotspots of corresponding structural segments. The percentage (%) of mutations affecting a certain gating property within a specific structural segment is shown in each grid.  $GoF_{GP}/LoF_{GP}$  preference index is depicted colorimetrically with dark green representing highly consistent  $GoF_{GP}$  effect, dark red for highly consistent  $LoF_{GP}$  effect, and black for no such gating-property data available.

(D) Shows the selection for selectivity filter (SF), activation gate (AG), fast inactivation region (FIR), as well as the upper and lower part for PD and VSD. The disease-associated mutations are represented in blue (upper) and red (lower) spheres. Please check the supplementary materials for a colorblind-friendly version of this figure.

influenced in an opposite manner. For instance, in DEE13 (Nav1.6), 66.7% of mutations lead to a shift in the  $V_{1/2 \text{ Act}}$ , with the majority trending toward a hyperpolarizing direction, producing a  $GoF_{GP}$  effect. At the same time, 44.4% of DEE13 mutations alter  $I_{max}$ , with most reducing  $I_{max}$  resulting in a  $LoF_{GP}$  effect (Figure 3B). These two gating property changes are diametrically opposite, yet the net effect is categorized as  $GoF_{GP}$ . While in FEPS2 (Na<sub>v</sub>1.8), the mutations that alter  $V_{1/2 \text{ Act}}$  and  $V_{1/2 \text{ Inact}}$  lead to a LoF effect. However, a more dominant GoF effect is brought about by stronger impacts on the maximum ionic current ( $I_{max}$ ) and persistent current ( $I_{p}$ ) (Figure 3B). Similarly, in dilated cardiomyopathy 1E (CMD1E, Na<sub>v</sub>1.5), 80% of associated mutations prefer a hyperpolarizing shift of  $V_{1/2 \text{ Inact}}$  and 60% of these mutations tend to slow the recovery time constant ( $\tau_{rec}$ ). Although the mutational impact on the  $V_{1/2 \text{ act}}$  is  $GoF_{GP}$ , the alterations on  $V_{1/2 \text{ Inact}}$  and  $\tau_{rec}$  together bring about a  $LoF_{o}$  effect. In PFHB1A (Na<sub>v</sub>1.5), most associated mutations decrease  $I_{max}$  and cause a depolarizing shift of  $V_{1/2 \text{ Act}}$ , leading to the  $LoF_{o}$  effect, despite their  $GoF_{GP}$  effects on  $V_{1/2 \text{ Inact}}$ . In summary, the overall effect of a disease is not solely determined by the direction (either  $GoF_{GP}$  or  $LoF_{GP}$ ) of individual variant effects on gating properties. Instead, it is the cumulative effect of these alterations, with some gating properties potentially playing a more dominant role than others in determining the overall effect. Such cumulative effects of variant influences on gating properties are in line with established mathematical models, such as the single-compartment conductance-based model. This model, which incorporates detailed voltage-clamp data to predict neuronal excitability, has been effectively used to correlate electrophysiological scores with clinical s

An additional pattern observed in our analysis is that almost all LoF $_{o}$  diseases show mixed effects on different gating properties (Figure 3B). For instance, BRGDA1(Na $_{v}$ 1.5) demonstrates not only a robust LoF $_{GP}$  impact on I $_{max}$ , and moderate LoF $_{GP}$  effects on V $_{1/2}$  land, and  $\tau_{rec}$  but also GoF $_{GP}$  impacts on I $_{P}$  and I $_{\omega}$ . This is likely due to the fact that, as observed in electrophysiological measurements, impacts on I $_{P}$  and I $_{\omega}$  mostly prefer to be GoF $_{GP}$  for all phenotypes (Figure 3B). However, even when I $_{P}$  and I $_{\omega}$  are excluded, many LoF $_{o}$  diseases, such as DRVT(Na $_{v}$ 1.1), ICEGTC (Na $_{v}$ 1.1), DCM(Na $_{v}$ 1.5), PHFB1A(Na $_{v}$ 1.5), CCD(Na $_{v}$ 1.5), show opposite impacts on V $_{1/2}$  and V $_{1/2}$  Inact. Interestingly, almost all the diseases showing mixed GoF $_{GP}$ /LoF $_{GP}$  effects, including HOKPP2(Na $_{v}$ 1.4), CMD1E(Na $_{v}$ 1.5), and LQT3/BRGDA1(Na $_{v}$ 1.5) are clustered within the LoF $_{o}$  branch (Figure 3B). This reaffirms that mixed effects are a common feature for diseases within the LoF $_{o}$  branch. Conversely, although there are several diseases in the GoF $_{o}$  branch that present mixed effects, more diseases consistently show GoF $_{GP}$  effects on all gating properties (Figure 3B).

In this study, we also compared the variant effects of homologous residues across different  $Na_v$  channels, focusing on their biophysical impacts on gating properties and their  $GoF_o$  or  $LoF_o$  categorizations. Our analysis revealed that the biophysical impacts of mutations in identical residues across different  $Na_v$  channels were more likely to align, with 37 out of 44 pairs of identical disease-associated mutations in different  $Na_v$  channels resulting in similar alterations in gating properties (Table S4), equating to 86% biophysical agreement. This observation aligns with prior research indicating that analogous positions in  $Na_v$  channels may elicit similar biophysical outcomes due to mutations.<sup>19</sup> In contrast, only 60% (74 out of 123) of these mutations showed a consistent  $GoF_o/LoF_o$  agreement in their associated diseases (Table S5). There could be multiple reasons for the relatively lower agreement in phenotype classification compared to biophysical impact. Firstly, the predominant gating property influencing the overall effect could vary between different  $Na_v$  channels, leading to differential  $GoF_o/LoF_o$  effects. For instance, the change in a specific gating property might be amplified due to the interaction between this  $Na_v$  channel and other proteins.<sup>39</sup> Secondly, mutations associated with multiple diseases, encompassing both  $GoF_o$  and  $LoF_o$  phenotypes, might only be partially characterized in terms of their disease associations. Insufficient data could result in these variants being labeled as either  $GoF_o$  or  $LoF_o$  mutations.



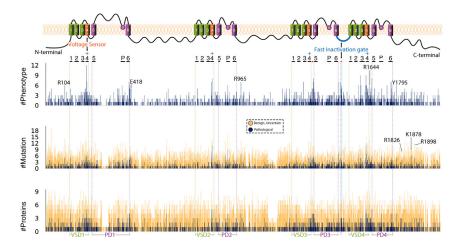


Figure 5. Mapping the mutation hotspots in Na<sub>v</sub> channels

The annotated disease-associated mutations from UniProt are mapped to equivalent positions of MSA of the 9 human  $Na_{\nu}$  channels and the linear protein structure of the channel. The number of phenotypes (upper panel), the number of mutations (middle panel), and the number of proteins with mutation at the same position (lower panel) are used to determine the mutation hotspots. The data for pathogenic missense mutations are shown in blue bars and all information related to all missense (including pathogenic, benign, and uncertain) variants are shown in orange. Hotspots in the N terminal, intracellular, and extracellular loops of the proteins are shown in this figure with residue IDs from  $Na_{\nu}1.5$ .

Consequently, predicting the impact of a new variant based on the known biophysical effects of equivalent mutations in other  $Na_v$  channels appears to be a more reliable approach than relying on the documented  $GoF_o/LoF_o$  classification of the same mutation.

#### Clustering mutations and their biophysical impacts in 3D structure

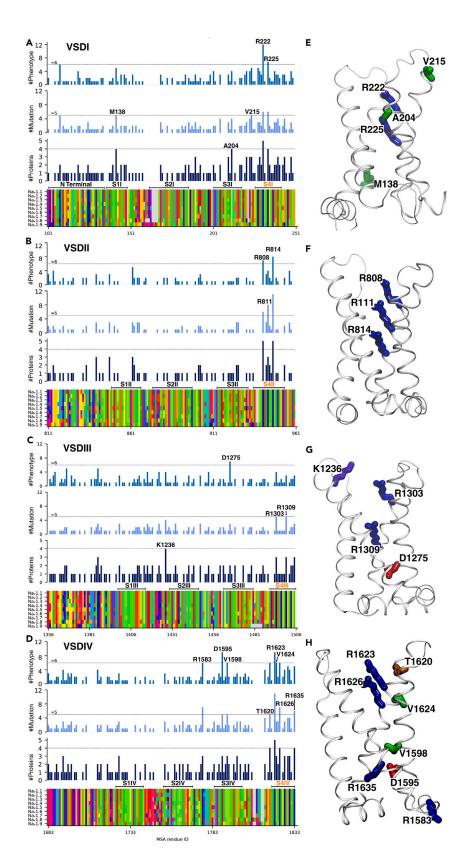
The biophysical/functional impact of a mutation should highly depend on its structural role, thus, mapping all disease-associated mutations in Nav channels and their impacts on gating properties in 3D structure would help us to understand and predict the mutational effects of the undocumented variants. The recurrence of mutations across independent samples in disease-associated cases is a robust indicator of functional significance. Na<sub>v</sub> channels share high sequence, structure, and function similarity. Considering mutations in analogous positions could cause similar biophysical effects in Na<sub>v</sub> channels, this evolutionarily conserved nature allows us to extrapolate the concept of recurring mutations from a single gene/protein to the Na<sub>v</sub> channel family. Based on MSA across nine human Na<sub>v</sub> channels, we mapped 2,409 annotated missense mutations from the UniProt database (Figure 2) to their corresponding positions, thus identifying a series of mutation hotspots (Figure 5). These pathogenic mutation hotspots were subsequently visualized within the 3D structure of human Na<sub>v</sub>1.5 (PDB:7DTC) to display their distribution. Thus, the residues discussed in the following sections are referred to using their residue ID in Na<sub>v</sub>1.5. Our structural mapping underscores that a significant number of mutation hotspots are predominantly situated within three distinct regions: (1) the voltage-sensing domain (VSD), (2) the upper section of the pore domain (PD [upper])—near the selectivity filter (SF) and pore helices, and (3) the lower part of the pore domain (PD [lower])—including the fast-inactivation segment and activation gate (AG).

In this comprehensive study, we also mapped the effects of known  $Na_v$  channel mutations on six gating properties, across respective domains including VSDs, PD (upper), PD (lower), N/C terminals, and additional detailed structural segments (Figure 4). This thorough mapping procedure sheds light on the intricate relationships between the structural locations of mutations and their functional outcomes. While it is evident that mutations within each structural segment can influence most gating properties, no single segment appears to uniformly affect all gating properties in a consistent  $GoF_{GP}$  or  $LoF_{GP}$  direction. Beyond these general patterns, each structural segment showcases unique traits, displaying differential preferences for specific gating properties or exhibiting characteristic influences on channel behavior. These unique attributes may shape the manifestation of associated diseases. Thus, a detailed understanding of these individual segment features is imperative for gaining insight into disease mechanisms, which could be exploited for the prediction of undocumented mutational effects and the development of targeted therapeutic interventions.

#### Diverse variant effects in VSDs are highly sensitive to structural context

A major cluster of mutations is located within the VSDs (Figures 4 and 5), critical structural components that sense membrane potential and trigger structural transitions of  $Na_v$  channels. Several features characterize the distribution of mutation hotspots within the VSDs. The first distinguishing feature of VSD mutations is their diverse impacts across a wide array of gating properties. Between one-third and two-thirds of these variants affect key properties such as  $I_{max}$ ,  $\tau_{rec}$ ,  $V_{1/2\ Act}$ , and  $V_{1/2\ Inact}$ . As shown in Figure 4A, there is no strong preference between  $GoF_{GP}$  and  $LoF_{GP}$  effects on these gating properties. In addition, only mutations within VSDs can induce gating pore currents, also termed









#### Figure 6. The mutation hotspots in VSDs

(A–D) The hotspots showing in the MSA of Nav channels for 4 VSDs. All mutation hotspots in VSDs are labeled with the residue IDs in Na $_{v}$ 1.5. (E–H) Mapping the hotspots in the structure of VSDs. Residues are shown in licorice and colored according to Taylor color scheme.

omega-pore currents ( $l\omega$ ).  $^{44,45}$  These currents are produced by protons or cations that pass the channel directly through the VSD.  $^{46-49}$  Consistently, VSD variants are implicated in most (32 out of 34) sodium channelopathies (Figure 8), each presenting with GoF<sub>o</sub>, LoF<sub>o</sub>, or mixed GoF<sub>o</sub>/LoF<sub>o</sub> effect. More intriguingly, some hotspots have been identified as overlap-syndrome mutations that are linked to both GoF<sub>o</sub> and LoF<sub>o</sub> diseases. For instance, mutations like R222Q, R225W, and R1623Q in Na<sub>v</sub>1.5 are associated with both LQT3 (GoF<sub>o</sub>) and BRGDA1 (LoF<sub>o</sub>).  $^{28,50,51}$  Similarly, R225W in Na<sub>v</sub>1.4, an equivalent mutation to R225W in Na<sub>v</sub>1.5, is linked to both congenital myasthenic syndrome (CMS16, LoF<sub>o</sub>) and sodium channel myotonia (SCM, GoF<sub>o</sub>).  $^{10,52,53}$ 

The second noteworthy feature is the prevalence of mutation hotspots within the S4 helix, specifically gating charges, i.e., R1635 (R5 in VSD<sub>IV</sub>) (Figure 6D). Na<sub>v</sub> channel structures consistently illustrate that the structural transition of VSDs is mediated by the sliding of the S4 helix through the remaining portion of this domain (Figure 1B).<sup>22,54–56</sup> Arrayed along the S4 helix across the membrane, four to six gating charges (arginine or lysine) named R1 to R6 from the extracellular to intracellular side, serve as the voltage sensors in VSDs. Our hotspot analysis indicates that mutations of gating charges tend to recur more frequently in diseases compared to non-gating charge mutations, thereby affirming their functional significance. Interestingly, these mutation hotspots are predominantly distributed in R1 to R3, including R808 (R1 in VSD<sub>II</sub>), R1303 (R1 in VSD<sub>II</sub>), R1623 (R1 in VSD<sub>II</sub>), R222 (R2 in VSD<sub>I</sub>), R811 (R2 in VSD<sub>II</sub>), R1626 (R2 in VSD<sub>IV</sub>), R225 (R3 in VSD<sub>I</sub>), R814 (R3 in VSD<sub>II</sub>), and R1309 (R3 in VSD<sub>II</sub>) (Figure 6). In contrast, fewer hotspots are observed in the gating charges near the intracellular side, with only one hotspot in R5 (R1635 in VSD<sub>IV</sub>) and no hotspot in R4 in any VSD. Additionally, several conserved countercharge residues, like D1274 (VSD<sub>II</sub>) and D1595 (VSD<sub>IV</sub>), are also identified within mutation hotspots. As these countercharges form salt bridges with gating charges, they also contribute to voltage dependence and structural transition.<sup>57</sup> However, hotspots in countercharges are considerably fewer than those in gating charges, and most countercharge hotspots are situated at the intracellular negatively charged region (INC) (Figure 6).

Similar to all variants in VSDs, mutations of gating charges yield diverse effects on a variety of gating properties. Statistically, these gating-charge mutations show only a moderate preference toward LoF<sub>GP</sub> on I<sub>max</sub>,  $\tau_{rec}$ ,  $V_{1/2 \, lact}$ ,  $V_{1/2 \, lact}$ , and I<sub>P</sub>. Notably, gating-charge mutations are the primary variants that lead to gating-pore currents (I<sub>ω</sub>), which more frequently bring a GoF<sub>GP</sub> effect in Na<sub>v</sub> channels at the molecular level. These mutations, which lead to the gating-pore current, represent clinically distinct entities that were previously termed "S4 disorders". These mutations provide quintessential examples that the impacts of mutations are strongly influenced by the structural context. For instance, mutations of R2 in VSD<sub>I</sub> and VSD<sub>II</sub> can lead to diverse impacts due to the unique interactions within each VSD. Specifically, R2 mutations in VSD<sub>II</sub> are likely to result in a hyperpolarizing shift in V<sub>1/2 Act</sub>, and V<sub>1/2 InAct</sub>, 48,59 or increasing the maximum sodium current. Conversely, the same mutations in VSD<sub>II</sub> can cause a depolarizing shift in V<sub>1/2 Act</sub>, a hyperpolarizing shift in V<sub>1/2 InAct</sub>, and a reduction in both maximum current amplitude and persistent current. Use this is important to note that studies on R2 mutations in VSD<sub>II</sub> have reported mixed effects from these mutations, 63-66 indicating varying outcomes. However, mutations in VSD<sub>II</sub> consistently exhibit a clear LoF<sub>o</sub> effect. As such, predicting the effects of a gating-charge mutation remains a challenging task, given that the effects are highly sensitive to nearby residues in different structural states.

The third feature lies in the non-uniform distribution of mutation hotspots across the four VSDs. Specifically, VSD<sub>IV</sub> hosts more mutation hotspots compared to the other three VSDs. These hotspots encompass the gating charges (R1623, R1626, R1635), countercharge (D1595), a positively charged residue in the S2-3 loop (R1583), as well as neutral residues (V1598, T1620, V1624) (Figure 6). Prior studies have illustrated that the initial three VSDs collectively activate the channel, while VSD<sub>IV</sub> serves as the critical determinant for both the onset of fast inactivation and recovery. <sup>67–69</sup> The unique functional roles of the VSDs could potentially explain the disparity in the distribution of hotspots. VSD<sub>IV</sub>, in particular, plays a pivotal and distinctive role, mirroring its higher concentration of mutation hotspots. This functional variation among the VSDs is further reflected in their impacts on gating properties. For VSD<sub>I</sub> and VSD<sub>II</sub>, there are more mutations influencing the V<sub>1/2 Act</sub> than V<sub>1/2 Inact</sub>. Conversely, more mutations in VSD<sub>IV</sub> affect V<sub>1/2 Inact</sub> than V<sub>1/2 Act</sub>. In addition, more mutations in VSD<sub>IV</sub> impact the recovery rate ( $\tau_{rec}$ ) than do those in VSD<sub>II</sub> to VSD<sub>II</sub> (Figure 4).

#### Most mutations reduce ion conductivity in the upper pore domain

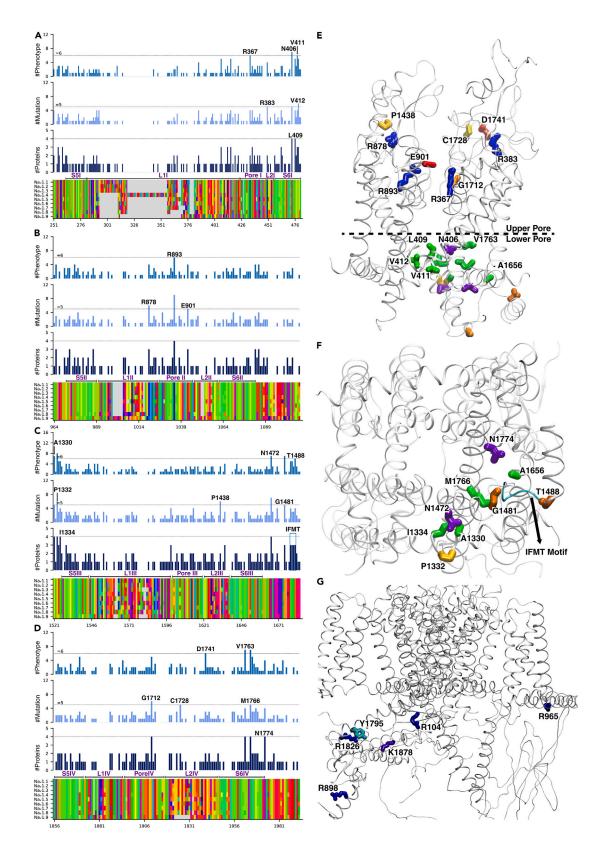
Being the pivotal structure of  $Na_v$  channels, the PD governs the permeation of  $Na^+$  ions via three key functional transitions: activation, inactivation, and recovery. Thus, it is reasonable that our disease-associated mutation map identifies an abundance of mutation hotspots in the PD. These hotspots are predominantly concentrated in two areas: the upper (PD [upper]) and lower (PD [lower]) parts of the PD.

Within the PD (upper), mutations are widespread in regions such as S5, S6, pore helices, pore loops, and extracellular loops (Figure 7). However, the majority of the mutation hotspots are found in structural segments proximate to the SF, including pore helices (L1 and L2) and the pore loop (Figure 7). Apart from a few non-charged residues (P1438 [L2 $_{III}$ ), G1712 [P1 $_{IV}$ ), and C1728[L2 $_{IV}$ )), most hotspots in this region are charged residues such as R367 (P1 $_{II}$ ), R878 (L1 $_{II}$ ), R893 (P1 $_{II}$ ), E901 (P1 $_{II}$ ), and D1741(L2 $_{IV}$ ). Pathogenic effects invariably ensue from mutations of these charged residues. For example, mutations such as R878C, R893C, and E901K in Na $_{V}$ 1.5 all induce BRGDA1, <sup>28,70</sup> while R367C (P1 $_{II}$ ) exhibits mixed effects, being associated with both LQT3 and BRGDA1. <sup>28,50,71,72</sup>

Contrary to VSD mutations, mutations in the PD (upper) region demonstrate greater consistency in their impacts on gating properties. 93.8% of mutations located near the SF affect  $I_{max}$  and most of them result in reduced  $I_{max}$  of  $Na_v$  channels, and only approximately 10% of mutations affect other gating properties such as  $\tau_{rec}$ ,  $I_P$ ,  $V_{1/2}$  Act, and  $V_{1/2}$  Inact (Figure 4). Our hypothesis is that these mutations disrupt











#### Figure 7. The mutation hotspots in the pore domain

(A-D) The hotspots in PD showing in the MSA of  $Na_v$  channels. (E-G) Mapping of the hotspots in the PD of the  $Na_v$ 1.5 structure from the sideview (E) and bottom view (F). The mutation hotspots at the intracellular loops are shown in the right bottom image (G).

critical interactions adjacent to the SF, such as salt bridges, potentially causing conformational changes to the SF and altering ion permeability. For instance, R893 directly forms salt bridges with two glutamate residues, E898 (SF<sub>II</sub>) and E901 (P2<sub>II</sub>). Notably, both R893C and E901K have been associated with BRGDA1.<sup>28</sup> Similarly, R878 forms a salt bridge with D1430 (P2<sub>II</sub>) from the neighboring repeat. It's noteworthy that the probability of mutations impacting  $I_{max}$  in the entire PD (upper) decreases to 73.6%, whereas the mutations affecting  $V_{1/2 \text{ Act}}$  or  $V_{1/2 \text{ Inact}}$  increase to one-third (Figure 4C). This suggests that these non-SF mutations affect the structural transitions rather than disrupting the SF conformation. Many of these residues are proximate to the VSD/PD interface, suggesting they likely influence VSD transitions through non-canonical coupling observed in other voltage-gated ion channels.<sup>73</sup>

#### GoF<sub>GP</sub> impacts of mutations in the lower pore domain

The PD (lower) contains the AG and encompasses the receptor site of the fast-inactivation IFMT motif situated at the edge of the AG (Figure 1).  $^{74}$  When mutations occur near the AG or in the fast-inactivation region (FIR), they are primarily associated with GoF<sub>o</sub> phenotypes such as LQT3 in Na<sub>v</sub>1.5<sup>50,75</sup>. The AG, mechanically coupled with the VSDs, responds to the membrane-potential depolarization by opening during activation and subsequently closing during repolarization to revert to the resting state.  $^{22}$  The hotspot mutations (N406 [S6I], V411 [S6I], V412 [S6I], V1763 [S6IV], M1766 [S6IV], and N1774 [S6IV]) are all situated near the intracellular end (Figure 7), a region critical to the opening and closing of the gate. The mutations of most AG residues are consistently linked with GoF<sub>o</sub> phenotypes (Table S2), aligning with our analysis of their effects on gating properties. The majority of these AG mutation hotspots induce a higher persistent current (I<sub>P</sub>), hyperpolarize the V<sub>1/2 Inact</sub> (Figure 4). Accordingly, we propose that these GoF<sub>o</sub> mutations may either facilitate the opening of the gate, stabilize the open state, or hinder its complete closure of the gate. Notably, it is observed that some AG mutations can also decrease I<sub>max</sub>, potentially explaining why a few residues in this region are associated with LoF<sub>o</sub> phenotypes.

The fast-inactivation segment, located in the intracellular loop connecting the third and fourth domains (III-IV linker) (Figure 7), 76 is crucial for fast inactivation by binding to its own site at the edge of the AG (Figure 1).<sup>74</sup> The IFMT motif, a triple-hydrophobic motif combined with a polar residue in the III-IV linker (Figure 7), is the essential motif for binding.<sup>77</sup> According to our analysis of mutation hotspots, mutations associated with LQT3 are primarily located in the IFMT motif and its receptor site, with all four amino acids in the IFMT, identified as mutation hotspots (Figure 7). While mutations linked to BRGDA1 or overlap syndromes (both LQT3 and BRGDA1) are also seen among the hotspot mutations, they occur less frequently. For instance, F1486L, M1487L, and T1488R mutations are all associated with LQT3, while I1485V is linked to BRGDA1.<sup>50</sup> The III-IV linker, an elongated loop containing approximately 60 amino acids, also contains mutation hotspots like N1472S and G1481E (Figure 7). Near these residues, additional mutation hotspots can be found in other structural segments, such as the S4-S5III linker, the intracellular ends of S5III and S6III (Figure 7), S4-S5IV linker, and the C-terminal domain (CTD). For example, A1330 from the S4-S5III linker and N1472 from the III-IV linker (Figure 7), both mutation hotspots, are in contact and associated with LQT3.50 Nearby A1330, residues P1332 and 11334 are also mutation hotspots. I1334V is associated with LQT3, 50 while P1332L is linked to BRGDA1.28 These residues contribute to fast inactivation by binding the III-IV linker to the PD, thereby allosterically blocking the AG. According to our gating property map, 100% of mutation hotspots in the fast inactivation region (FIR) depolarize V<sub>1/2 Inact</sub>, thus leading to a GoF<sub>GP</sub> effect on channel activity. Fewer FIR residues impact the maximal current (I<sub>max</sub>) compared to AG mutations. Our analysis of variant effects on gating properties confirms that rather than directly blocking the AG, the fast-inactivation segment blocks the gate allosterically. This is consistent with the allosteric blocking mechanism for fast inactivation in Na<sub>v</sub> channels.<sup>78,79</sup>

#### Gating-property impacts of mutations in other structural segments

Although structural segments such as N/C terminals, VSD-PD linkers, and repeat linkers are significantly less conserved than VSDs and PDs, they host a substantial number of disease-associated mutations and exhibit distinct tendencies in their impacts on gating properties. Approximately 60% of mutations located in the VSD-PD linkers and repeat linkers favor a depolarizing shift in  $V_{1/2 \text{ lnact}}$ , a characteristic LoF<sub>GP</sub> effect. Over one-third of mutations in these linkers also show a strong propensity to increase  $I_P$ , another LoF<sub>GP</sub> effect (Figure 4). These effects mirror those observed in the lower PD, which could be attributed to the fact that these linkers also contribute to fast inactivation. Notably, over 70% of mutations in the N-terminus tend to reduce  $I_{max}$  (Figure 4), likely due to the influential role of residues in this region on  $Na_v$  channel expression and folding. On the other hand, mutations in the C-terminus have the highest likelihood to increase  $I_P$  (Figure 4). Although the structural role of the C-terminus remains largely undeciphered, the observed impacts on gating properties underscore its crucial role in maintaining the channel impermeable in its inactivated and resting states.

#### The relationship between phenotypes and structural segments

Mapping mutations corresponding to each phenotype onto the structural segments of the sodium channels shows no evident pattern for the overall effect of each phenotype based on their distributions across structural segments (Figure 8). There is even no significant preference for  $GoF_o$  (or  $LoF_o$ ) phenotypes for their structural distributions. Only in the case of CMD1E ( $Na_v1.5$ ) are all mutations located in one structural segment (VSDs). Additionally, the mutations associated with ASD and HOKPP2 are located in only two structural segments. For most other phenotypes, mutations are found in at least three distinct structural segments. This observation underlines the fact that mutations across



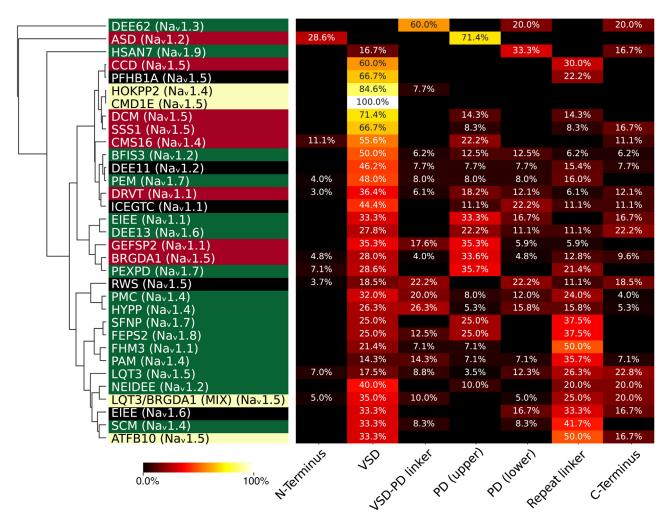


Figure 8. Mapping the phenotypes based on the gating-property impacts of associated mutations

Phenotype clustering of missense mutation in  $Na_v$  based on the similarity of gating-property impacts. Black cells represent no data for the corresponding disease segment. The heatmap is colored based on the percentage (%) of mutations affecting a certain gating property within a specific phenotype. Diseases are colored in green ( $GoF_o$ ), red ( $LoF_o$ ), yellow ( $MiX_o$ ), and black for undetermined phenotypes. Please check the supplementary materials for a colorblind-friendly version of this figure.

different regions of the sodium channels are capable of similarly altering the channel function, leading to comparable phenotypic effects. It highlights the complexity of the relationships between genetic mutations, the structural domains of ion channels, and the phenotypic outcomes of these mutations, suggesting that the overall effect on channel function is determined by a combination of alterations in multiple channel properties and regions.

On the other hand, when a phenotype displays a dominant distribution in specific structural segments, it often aligns with the structural preference for gating properties. For instance, mutations situated in VSD-PD linkers and D linkers preferentially demonstrate a GoF $_{\circ}$  effect. Correspondingly, conditions such as DEE62 (Na $_{\circ}$ 1.3), where 60% of mutations are located in the VSD-PD linker, and several other phenotypes (including FHM3(Na $_{\circ}$ 1.1) and SCM(Na $_{\circ}$ 1.4)) with close to 50% mutations in repeat linkers, are mainly categorized as GoF $_{\circ}$  overall effect phenotypes (Figure 8). In contrast, a large portion of mutations in the upper pore domain (PD (upper)) reduce the maximum current ( $l_{max}$ ), causing a loss of function (LoF<sub>GP</sub>) effect. Several phenotypes with over 30% mutations in PD (upper), such as ASD (Na $_{\circ}$ 1.2), BRGDA1 (Na $_{\circ}$ 1.5), and GEFSP2 (Na $_{\circ}$ 1.1), tend to be classified as LoF $_{\circ}$  phenotypes. Nonetheless, there are exceptions showing a GoF $_{\circ}$  effect, including PEPD (Na $_{\circ}$ 1.7) and EIEE (Na $_{\circ}$ 1.1). There is only one phenotype, HSAN7 (Na $_{\circ}$ 1.9), with over 30% mutations in the lower pore domain (PD (lower)). HSAN7 (Na $_{\circ}$ 1.9), along with several other diseases with over 20% mutations in PD (lower) (such as DEE62(Na $_{\circ}$ 1.3) and EIEE (Na $_{\circ}$ 1.6)), tend to show GoF $_{\circ}$  overall effect phenotypes. Many phenotypes exhibit 30% mutations in VSDs, but there is no clear preference for GoF $_{\circ}$  or LoF $_{\circ}$  effect. This is congruent with the observation that mutations in the VSD have diverse impacts on all gating properties and display modest preferences on a range of gating properties.





#### Pathogenic mutations are rich in arginine

In terms of amino acid mutation frequencies, a significant feature is that the pathogenic mutations of arginines (Arg) are enriched in voltage-gated sodium channels. The probability of a disease mutation at different amino acids was calculated and shown in Figure S1A. For comparison, the probability of benign or uncertain mutations and expected frequencies were also calculated (Figure S1B). Accordingly, a mutation at an Arg residue has the highest probability of causing a disease. These results demonstrate the influence probability of the specific amino acid change across the variants. As a positively charged amino acid, Arg is often involved in many essential biochemical processes. Arg mutation is well-known for its high pathogenicity mainly due to the fact that Arg mutates to residues with very different chemical properties, such as glutamine (Gln), glycine (Gly), cysteine (Cys), histidine (His), and tryptophan (Trp). Different from Arg, another positively charged residue, lysine (Lys) shows the lowest relative pathogenicity in its mutations. This difference indicates that the highest probability of disease mutations at Arg may be related to important and unique structural roles in voltage-gated ion channels.

Almost all Arg mutation hotspots are located in three critical regions. These Arg residues either work as gating charges in VSDs, located in the upper part of PD behind the SF, or distributed in intracellular loops. As the essential voltage sensors in VSDs, it is reasonable that the mutations of gating charges change activation or inactivation voltage dependence and then induce dysfunctions of ion channels. ~70% of the gating-charge mutations exhibit a strong preference to hyperpolarize V<sub>1/2 Inact</sub>. The Args behind the SF, such as R367, R383, R878, and R893, form salt bridges with negatively charged residues (Figure 7A). Breaking critical salt bridges, these Arg mutations can induce the conformational changes of the SF and then reduce the ion permeability. Meanwhile, pathogenic Arg mutations are also popular in different intracellular loops, such as R104 in the N-terminal, R965 in repeat (II-III) linker, R1583 in S2-3 linker of VSD4, R1644 in VSD-PD linker of repeat 4, and R1826 as well as R1898 in the C-terminal. Due to their locations, these Arg may play key roles in fast inactivation, persistent current, membrane protein orientation, <sup>81</sup> protein-lipid interactions, <sup>82</sup> protein-protein interactions, <sup>83</sup> and even interaction between residues and PTMs. All of these pathogenic Arg mutations indicate that Na<sub>v</sub> channels evolved diverse voltage-dependent mechanisms, not only for activation/inactivation, but also for regulation by lipids, PTMs, or other proteins.

#### **DISCUSSION**

The ability to predict variant effects on gating properties based on their structural location is highly dependent on the precise location of the mutation. Mutations in the PD (upper), particularly those near the SF, are highly likely to significantly reduce the I<sub>max</sub> (Figure 4). Conversely, within the PD (lower), mutations in the FIR are likely to shift V<sub>1/2 lnact</sub> in the depolarizing direction, while mutations in the AG often enhance I<sub>D</sub> (Figure 4). For mutations within the VSDs, predicting their impacts on gating properties proves to be a challenging task. Our analysis illustrates that mutations in VSDs can have a broad range of effects on all gating properties with modest preferences toward V<sub>1/2 Act</sub>, V<sub>1/2 Inact</sub>,  $au_{rec}$ , and  $I_{max}$ . As the voltage-sensing components of  $Na_v$  channels, VSDs initiate all three major functional transitions: activation, inactivation, and recovery. 22,68 Mutations within VSDs can either enhance or reduce channel activity by altering the structural transition between the resting ("down") and activated/inactivated ("up") states. When a mutation introduces or disrupts specific interactions, it could potentially influence the conformational equilibrium between the "up" and "down" states, as well as the rates of their transitions. In some instances, mutations can result in leaky channels directly via the VSD, leading to the generation of omega pore currents ( $l\omega$ ). These combined factors account for the extensive range of functional effects associated with VSD mutations, providing a structural foundation for their diverse impacts. The impacts of VSD mutations are highly sensitive to the structural context of the mutated residue. Notably, this structural context is dependent on the state, selective to the subtype, and varies across VSDs of the same channel. Therefore, theoretically, if the interactions between a specific residue and its neighboring amino acids (or other molecules) across multiple functional states (including intermediates between the "down" and "up" states) are known, it could be possible to predict its impacts on gating properties based on structures in different functional states.

Our analysis shows that the mapping of phenotypes to their mutant-located structural segments does not reveal a significant correlation between structural distribution and phenotypes. The weak relationship between phenotype and structural distribution could be attributed to several factors. First, residues in different structural segments may have similar impacts on gating properties. Consequently, mutants associated with the same phenotype are not necessarily concentrated in a specific structural segment. Second, the number of identified mutations for many phenotypes is still insufficient, and the accuracy of phenotype association requires improvement. With the discovery of more disease-associated mutations, a clearer pattern may emerge linking the structural distribution of mutations, their effects on gating properties, and associated phenotypes. Thus, the ongoing discovery and characterization of disease-associated mutations will likely continue to refine our understanding of the relationship between mutations, structural segments, gating properties, and diseases.

The study's mapping of gating-property impacts on 34 sodium channel opathies reveals that even within the same overall effect ( $GoF_o$  or  $LoF_o$ ) classification, different phenotypes demonstrate unique patterns of gating property alterations. This suggests that the same overall effect (either  $GoF_o$  or  $LoF_o$ ) can result from different molecular mechanisms. The similarities in overall effects across certain phenotypes may be coincidental and arise from dominant impacts of different gating properties or accumulative effects of distinctive alterations. This finding highlights the challenges of the binary prediction model of gain or loss of function, both for interpreting pathophysiology and designing personalized treatments. Conversely, phenotypes belonging to the same sub-branch (as shown in Figure 3), such as PEPD ( $Na_v1.7$ ) vs. LOT3 ( $Na_v1.5$ ), show high similarities in gating properties. This implies that categorizing diseases based on altered gating properties may provide a more accurate clustering of diseases driven by similar pathophysiological mechanisms. This nuanced understanding of gating property impacts has the potential to improve prediction accuracy and the design of more effective treatments. There may also be opportunities for repurposing drugs that treat a particular phenotype for the treatment of other diseases with a similar effect on gating properties.



#### Limitations of the study

We would like to note several potential limitations that suggest a cautious interpretation of the data collected in this study. Firstly, despite efforts to standardize, the electrophysiological experiments included in this study were conducted under varying conditions in different papers. Similarly, not all gating properties were measured uniformly across these experiments, with some, such as I<sub>max</sub>, being more frequently reported than others, like I<sub>ω</sub>, leading to a disproportionate representation in this dataset. In addition, terminologies such as "overall GoF" and "LoF" are not always consistently defined across different studies. The GoF/LoF at the molecular level might be mixed with effects at the cellular level and nuanced descriptions like "mild" or "moderate" GoF/LoF could be used for benign cases as well. Furthermore, there might be an ascertainment bias in the phenotypic and electrophysiological data collected, as well as potential uncertainties arising from pooling variants from different genes, which may not behave uniformly in different cell environments. It is recommended to consider all these factors when repurposing the dataset for other studies.

#### **RESOURCE AVAILABILITY**

#### Lead contact

Further information and requests for further information and resources should be directed to lead contact, Dr. Jing Li (jli15@olemiss.edu).

#### Materials availability

This study did not generate new unique reagents.

#### Data and code availability

- Data: This paper analyzes existing, publicly available data. The accession numbers for the datasets are listed in the key resources table. All data have been reported as supplementary material and are attached with the paper.
- Code: This paper does not report original code. The code related to the analysis can be accessed by reaching out to the lead contact.
- Additional Information: Any additional information required to reanalyze the data reported in this paper is available from the lead contact upon request.

#### **ACKNOWLEDGMENTS**

Discussions with Drs. Claudio Grosman, Joao Luis Carvalho De Souza, John Bankston, and Tamer M. Gamal El-Din are gratefully acknowledged. Computer resources came from a Maximize ACCESS allocation through project BIO210015, an allocation (MCB200085P) on Antons at the Pittsburgh Supercomputing Center provided by the National Center for Multiscale Modeling of Biological Systems through National Institutes of Health grant P41GM103712-1 and from a loan from D.E. Shaw Research, and a Frontera Pathways allocation (MCB21012) at the Texas Advanced Computing Center (TACC). Research reported in this publication was supported by an Institutional Development Award (IDeA) from the National Institute of General Medical Sciences of the National Institutes of Health under award number P20GM130460, the Data Science/Al Research Seed grant (SB3002 IDS RSG-03), and an IDS Data Science and Al Fellowship from Institute for Data Science at the University of Mississippi.

#### **AUTHOR CONTRIBUTIONS**

Conceptualization: A.A., E.E., H.B., and J.L.; methodology: J.L. and A.A.; investigation: A.A., E.E., and H.B.; visualization: A.A.; supervision: J.L.; writing—original draft: J.L.; writing—review and editing: A.A., E.E., H.B., and J.L.

#### **DECLARATION OF INTERESTS**

The authors declare no competing interests.

#### DECLARATION OF GENERATIVE AI AND AI-ASSISTED TECHNOLOGIES IN THE WRITING PROCESS

During the preparation of this work, the author(s) used ChatGPT in order to assist with polishing the text. After using this tool/service, the author(s) reviewed and edited the content as needed and take(s) full responsibility for the content of the publication.

#### **STAR**\*METHODS

Detailed methods are provided in the online version of this paper and include the following:

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  - Data analysis
- QUANTIFICATION AND STATISTICAL ANALYSIS
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#### **SUPPLEMENTAL INFORMATION**

Supplemental information can be found online at https://doi.org/10.1016/j.isci.2024.110678.





Received: January 9, 2024 Revised: June 18, 2024 Accepted: August 2, 2024 Published: August 23, 2024

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#### **STAR**\*METHODS

#### **KEY RESOURCES TABLE**

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Deposited data		
Index of Protein Altering Variants	Uniprot	2022_03
Index of human variants curated from literature reports	Uniprot	2022_03
'TITLE-ABS-KEY (SCNXA AND electrophysiology AND mutation) AND (LIMIT-TO (DOCTYPE, "ar") )	Scopus	March 29th, 2023
7DTC	https://opm.phar.umich.edu/	-
OMIM	https://www.omim.org/statistics/update	2022_AUG
Software and algorithms		
MAFFT	Jalview	5
Jalview	Jalview	2.11.2.6
VMD - Visual Molecular Dynamics	https://www.ks.uiuc.edu/Research/vmd/	1.9.4
Python	Python	3.10
Pandas	https://pandas.pydata.org/	2.0.3
Numpy	https://numpy.org/	1.25.2
BioPython	https://biopython.org/	1.81
Matplotlib	https://matplotlib.org/	3.5.2
seaborn	https://seaborn.pydata.org/	v0.12.2

#### **METHOD DETAILS**

#### Data gathering and search strategy

In this study, we utilized two major databases to obtain pathogenic mutations in  $Na_{\nu}$  channels and gather functional data related to these mutations.

Firstly, adhering to the PRISMA guidelines,  $^{84}$  we systematically searched Scopus on March 29th, 2023, to identify English-language studies describing the functional characteristics of missense variants using the following mesh query: 'TITLE-ABS-KEY (SCNXA AND electrophysiology AND mutation) AND (LIMIT-TO (DOCTYPE, "ar")),' where X represents the corresponding sodium channel number and "ar" stands for a research article. Furthermore, we conducted a manual search of sodium channel mutation databases and reviewed relevant bibliographies obtained for our search. We specifically selected missense variants whose effects were characterized through whole-cell patch clamp electrophysiology using human  $Na_v$  channels. Mutations without any functional effects (no changes in biophysical properties) and double mutations were excluded. In cases where contradictory findings existed, duplicated data were considered as additional data points (Table S3). This process led to the selection of unique 525 mutations with their functional data (Figure 2A). Eighty mutations from this dataset were later added to the next dataset to address some missing phenotypes in UniProt (e.g., Autism Spectrum Disorder (ASD) in  $Na_v$ 1.2). Three researchers, namely A.A.A., E.E., and H.B., independently reviewed the data.

Secondly, we utilized UniProt's "Index of Protein Altering Variants" (Release:  $2022_{-}03$ ) in conjunction with UniProt's "Index of human variants curated from literature reports" (Release:  $2022_{-}03$ )<sup>85</sup> to extract pathogenic mutations within this protein family. We queried the combined database to identify non-cancerous missense mutations with clear OMIM disease assignments across all nine members of Na<sub>v</sub> channels, including their respective naturally occurring isoforms (Figure 2B). Duplicate mutations resulting in the same phenotype within each family member were excluded. Manual annotations were performed to ensure consistency with OMIM, addressing certain phenotype assignments (e.g., LQTs in Na<sub>v</sub>1.5 to LQT3, PEXPD to PEPD in Na<sub>v</sub>1.7). This process led to the selection of 2409 mutations out of the 36.63 million presented in UniProt. Additionally, we employed a similar workflow to collect benign and uncertain mutations, resulting in a total of 10,348 mutations in this category.

#### **Data analysis**

MSA was conducted using MAFFT<sup>86</sup> to align all naturally occurring  $Na_v$  isoforms and was visualized in JalView<sup>87</sup> 2.11.2.6. Subsequently, the pathogenic mutations obtained from UniProt were mapped onto this alignment to identify recurrent mutations and their respective phenotype in each residue throughout the alignment. The number of mutations, phenotypes, and proteins associated with these variants were tallied and graphed in relation to the MSA. The top 2% of mutations meeting any of the following criteria: more than 6 phenotypes, 5 mutations,





or 4 proteins reported from a single residue position were selected as hotspots. Mapping these hotspots in protein sequences and visualizing them in 3D structure was carried out using VMD $^{88}$  and Python  $^{3.10}$ ,  $^{89}$  utilizing Pandas,  $^{90}$  Numpy,  $^{91}$  BioPython,  $^{92}$  and Matplotlib $^{93}$  packages.

Mutations are mapped on different regions to characterize their structural distribution. The selectivity filter region (SF) is defined as including residues within 5 Å of the four filter-forming residues (D372, E898, K1419, A1711 $^{26}$ ). Similarly, the activation gate region (AG) also includes residues within 5 Å of gating residues (A413, L938, I1470, I1771 $^{94}$ ). Fast inactivation region (FIR) is the residues within 5 Å of residues (1467–1500 $^{94}$ ). The choice of 5 Å corresponds to a conservative range for the effective distance of non-covalent interactions, such as hydrogen bonds, hydrophobic interactions, and salt bridges, typically observed in protein structures. This distance was chosen to ensure that direct interactions are captured, but it does not preclude the possibility of longer-range effects, such as allosteric communications. The midpoints are used to separate the "upper" and "lower" portions of both PD and VSD. The midpoint is determined by calculating the z-coordinate midpoint of the lowest atom in the SF and the highest atom in the AG, whereas the midpoint of VSDs is the z-coordinate of the C $\alpha$  atom of the aromatic residue (either Y or F) in the hydrophobic constriction site in each VSD. The residues in each structural selection were determined using VMD based on a Na $_v$ 1.5 (PDB: 7DTC $^{26}$ ) structure from the Orientations of Proteins in Membranes (OPM) database. All residues from other Na $_v$  channels are also selected for each protein based on the multiple sequence alignment.

Gating properties altered by variants are documented in the literature, and they were categorized as either gain-of-function on a certain gating property ( $GoF_{GP}$ ) or loss-of-function ( $LoF_{GP}$ ) (Figure 1A).  $GoF_{GP}$  effects include an increase in maximal current amplitude ( $I_{max}$ ), an elevation in persistent current ( $I_P$ ), a decrease in the numerical values of recovery rate ( $\tau_{rec}$ ) from fast inactivation, a hyperpolarizing shift in half-activation voltage in steady-state activation ( $V_{1/2 \, Act}$ ), a depolarizing shift in half-inactivation voltage ( $V_{1/2 \, Inact}$ ), and the presence of inward gating pore current (or  $\omega$  current,  $I_{\omega}$ ). Conversely,  $LoF_{GP}$  effects represented opposing effects on the same parameters (Figure 1A). Information regarding the phenotypes and the corresponding  $GoF_{GP}$  or  $LoF_{GP}$  assignment of each mutation, if provided in the literature, was recorded (Figure 2A). These mutations were then mapped onto distinct structural segments of the protein to examine the structural distribution of biophysical property changes (Figure 3). To assess the impact preference of a selected group of mutations (e.g., within a specific structural segment or associated with a certain disease) on a certain gating property, we calculate the  $GoF_{GP}/LoF_{GP}$  Preference Index (GLPI). The GLPI for a certain gating property i is determined by two factors. The first factor is calculated based on the difference between the number of relevant mutations with  $GoF_{GP}$  effect ( $n_{GoF}$ ) and those with  $LoF_{GP}$  effect ( $n_{LoF}$ ), divided by the total number of mutations within the selected group ( $p_i$ ), marked as X% in each grid of Figures 3, 4, and 8, was calculated by dividing the number of mutations showing property alterations by the total number of mutations reported for the selected group.

GoF / LoF preference index (GLPI<sub>i</sub>) = 
$$\frac{n_{GoF} - n_{LoF}}{n_{GoF} + n_{LoF}}$$
. $p_i$ 

The assignment of phenotypes to specific mutations required meticulous attention and involved cross-referencing various sources such as review articles, research papers, and online databases, including UniProt and OMIM. However, this task presented considerable challenges due to the limitations of manual annotation and lack of widely used standardized disease nomenclature within the field. In this study, UniProt served as the primary source for obtaining phenotype names. In instances where UniProt did not furnish a specific phenotype name, we turned to the original paper that initially reported the mutation. This approach ensured consistency in nomenclature throughout our analysis. The phenotype association dataset for mutations was subsequently clustered into different groups. This process involved iterating through various clustering algorithms and distance metrics for hyperparameter tuning using Seaborn's clustermap and employing the cosine 96,977 metric to compute the similarity:

$$d(u, v) = 1 - \frac{u.v}{||u||_2||v||_2}$$

where u or v respectively represents the  $GoF_{GP}/LoF_{GP}$  Preference Index (GLPI) of a certain group of mutations,  $\|*\|_2$  is the 2-norm of its argument \*, and u.v is the dot product of u and v. The similarity measure, d(u,v), was used to assess the relative "closeness" of phenotypes based on the resulting biophysical changes (GLPI), with the average of the cosine similarities across all phenotype pairs being used to determine overall cluster cohesion.

#### **QUANTIFICATION AND STATISTICAL ANALYSIS**

#### Statistical analyses and software

- Software Used: MAFFT<sup>86</sup> for Multiple Sequence Alignment (v7.487), JalView<sup>98</sup> for visualization (v2.11.2.6), VMD<sup>88</sup> (v1.9.3), and Python<sup>89</sup> (v3.10) with Pandas,<sup>90</sup> Numpy,<sup>91</sup> BioPython,<sup>92</sup> and Matplotlib.<sup>93</sup>.
- Statistical Tests: GoF/LoF Preference Index (GLPI) calculated to assess the impact of mutations on gating properties.

#### Statistical details

• n Values:

525 unique mutations with functional data.
2409 pathogenic mutations extracted from UniProt.





13282 total mutations including benign and uncertain variants.

• Definitions:

GoF/LoF effects classified based on changes in gating properties. Hotspots identified based on thresholds: >6 phenotypes, 5 mutations, or 4 proteins per residue.

• Dispersion Measures: GLPI calculated as:

GoF / LoF preference index (GLPI<sub>i</sub>) = 
$$\frac{n_{GoF} - n_{LoF}}{n_{GoF} + n_{LoF}} \cdot p_i$$

where  $n_{GoF}$  and  $n_{LoF}$  are the counts of GoF and LoF mutations, and  $p_i$  is the percentage of mutations affecting the property.

#### Significance definition

- Significance Measures: Differences in the GLPI values across various structural segments and phenotype groups.
- Randomization and Sample Size: Not applicable due to the nature of data extraction from literature and databases.
- Inclusion/Exclusion Criteria:

Included: Missense variants characterized through whole-cell patch clamp electrophysiology. Excluded: Mutations without functional effects, double mutations, and duplicates unless showing contradictory findings.

#### Clustering and similarity measures

- · Clustering: Seaborn's clustermap with cosine similarity used to group phenotype associations based on GLPI values.
- Cosine Similarity:

$$d(u, v) = 1 - \frac{u.v}{||u||_2||v||_2}$$

where u and v represent GLPI vectors.

All statistical details can be found in the figure legends, figures, and results sections.