

# Structure-based functional annotation of protein sequences guided by comparative models

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**Abstract** A strategy for functionally annotating protein sequences using sequence and predicted structural information is proposed. First, structural models are built using standard, web-based tools. The models are then annotated using the sequence and structure-based annotation method SeSAW, and the structure based ligand binding site alignment method GIRAF. Annotations for several sequences (ATPase-like domains 1 and 2 from mouse RIG-I, the TIR domain from mouse Toll-like receptor 9, and alternative oxidase from *Blastocystis*) are made and compared with known functional information. We find that the annotations in general make functional sense and provide more specific information than would be available from a purely sequence-based approach.

## 1 Introduction

High-throughput gene sequencing projects have revealed the complete genomes of over 180 organisms and are currently engaged in sequencing numerous others. To make biological sense of such large volumes of data, it is necessary to compare the protein sequences with those of proteins that have been biochemically characterized. Structural genomics (SG) efforts facilitate such comparisons by determining the structures for a large number of protein sequences, but most SG targets have not been functionally characterized. We have previously shown that functional details can nevertheless be inferred by sequence and structural comparison to other structures for which the functions are known [1]. This suggests that in order to learn the function of a protein sequence it may be useful to build a 3D model using a remote homolog as a structural template, even if the template has no functional annotation. The model can often then be partially annotated using a

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combination of sequence and structural comparison to known folds. In the second step it is crucial to optimize the integration of sequence and structural information in order to identify the most relevant functional template as well as the most important residue positions within this template.

Recently, we developed two structural alignment methods that facilitate such sequence or structure based functional annotations. Sequence-derived Structural Alignment Weights (SeSAW) is a method that optimally integrates sequence and structural information at the level of individual residues in order to identify conserved motifs [1]. Geometric Indexing with Refined Alignment Finder (GIRAF) is a template-based method that matches known ligand binding sites with similar sites in the query at the atomic level [2]. Both methods were originally developed for annotation of experimentally determined structures. Here we extend these methods to the functional annotation of sequences by using a structural model as an intermediate step. We demonstrate the utility of this approach using several examples where experimental structures for the sequences in question are not yet available, but some functional annotations exist.

## 2 Methods

### 2.1 Structural modeling

The full-length query sequence was first submitted to the HHpred server [3] in order to obtain approximate domain boundaries. The sequence segments corresponding to these domains were subsequently submitted to the HHpred server again using default settings. MODELLER [4] was used to build single-template models using the highest scoring template in each case.

### 2.2 GIRAF Queries

GIRAF is a method for finding ligand binding sites that are structurally similar at the atomic level to sub-structures in a query protein [2]. To define a local coordinate system, we use the Delaunay tessellation of protein atoms. Each Delaunay tetrahedron is characterized by its edge lengths, volume, and the compositions of atom types in the direction of each of the four faces. Tetrahedra thus obtained are used to describe the atomic coordinates of ligand binding sites, which are saved and indexed in a relational database. The use of the relational database offers an advantage for rapidly handling vast amounts of data for ligand binding sites. There are currently more than 180,000 such sites in the PDB.

A search is carried out in two phases. First, the query structures are transformed to local coordinate systems in the same manner as the templates. Owing to the database system and indexing, potential matches can be found with essentially one SQL expression (although some modifications are necessary for performance optimization). Second, potential candidates thus obtained are then subject to alignment refinement, which is carried out as follows: (1) The template and the query are superimposed based on the local coordinates defined by their respective tetrahedra; (2) Potential atom-atom correspondences (possibly many-to-many) are identified with a given distance cutoff, which yields a bipartite graph; (3) The Hungarian algorithm is applied to the bipartite graph to obtain the best alignment; (4) Based on the alignment, a new optimal superposition is calculated; (5)

The steps (2) to (4) are iterated until convergence. A statistical model for estimating the significance of a match is also introduced.

### 2.3 SeSAW Queries

SeSAW [5] is a functional annotation server that identifies conserved sequence and structural motifs in a query protein. SeSAW first identifies all entries in the Protein Data Bank (PDB) that are structurally related to the query. The functional significance of each structural match (template) is then assessed by profile-profile sequence comparisons anchored by the structure-based sequence alignments. Functional sites, when available, are then mapped from the templates onto the query-template alignments. A list of the templates, sorted by their functional significance is returned, with links to both the annotated alignments and the 3D structural superpositions.

The SeSAW server maintains a database of all-against-all structural alignments for a sequence-representative set of structural domains. This database is kept current with weekly updates. Functional information is extracted from UniProt and literature sources on a weekly basis. This information is then mapped onto the residue positions of each PDB entry. Structure-based sequence alignments indicating the per-residue SeSAW score are displayed using the Jalview java-based alignment applet [6]. Functional annotations, when available, and secondary structure assignments are indicated as well. Structural superpositions are visualized using the *jV* molecular graphics viewer [7]. A panel lists the aligned residue pairs, ranked by the per-residue SeSAW score. Each residue pair can be seen in stick form in the *jV* window or hidden. This feature is important because many high-scoring residue pairs are structurally important (e.g. proline, glycine, cystine, and other hydrophobic residues) and should be hidden in order to more easily locate putative functional sites (which tend to include more chemically active residues).

## 3 Results and discussion

Results for SeSAW queries are shown in figures 1-5. Results for GIRAF queries are summarized in Table 1. Individual results are discussed below.

### 3.1 Helicase domain from mouse RIG-I

The sequence for the helicase domain from mouse RIG-I was submitted to the HHpred profile-profile alignment server. The top structural match was to the Hef helicase domain from *Pyrococcus furiosus* (PDB identifier 1wp9). Examination of the alignment and template structure revealed that the fold consisted of two ATPase-like domains connected by a mostly helical domain. Although the predicted secondary structure for the RIG-I sequence segment that aligned to the helical domain was also predicted to be helical, the sequences did not match well in this region. For this reason, the RIG-I helicase domain sequence was split into three segments corresponding to the two ATPase-like domains and the helical region. The arrangement of domains is illustrated in figure 1. The three sub-domain sequences were resubmitted to the HHpred server. Subsequently, a 44% identical sequence homolog, human MDA5 helicase domain (PDB identifier 3b6e), was found for the first ATPase domain. A more remote 19% identical homolog, the ATP-dependent RNA helicase from fruit fly (PDB identifier 2db3) was located for the second ATPase domain. Both of these templates were SG targets and a primary literature reference existed only for 2db3. The first ATPase-like domain contains a DEXH ATP-binding

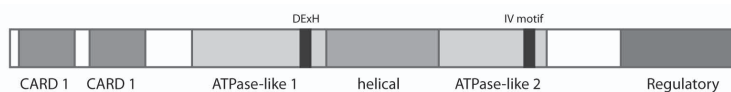


Figure 1: **Domain structure of RIG-I.** The figure shows the locations of the two ATPase-like domains in the context of the whole RIG-I protein sequence. The two ATPase-like domains, along with the helical domain make up the helicase functional domain.

motif. Thus, it was not surprising to see that these residues scored highly in the SeSAW alignment (figure 2B). More interestingly, a conserved lysine residue (here denoted K30) that also scored highly, was found to form a salt bridge to the aspartic acid (denoted as D132) in the DExH motif (figure 2C). Yoneyama and Fujita noted that mutating this lysine to alanine, rendered RIG-I a dominant inhibitor [8]. The GIRAF query returned a sodium binding site located in a loop formed near K30 and another residue that scored highly by SeSAW (P25).

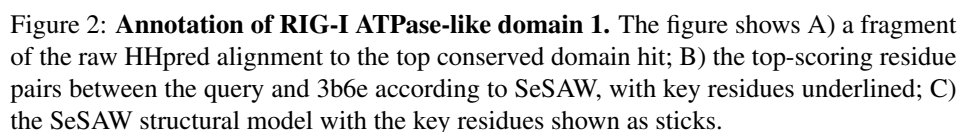
The second ATPase-like domain does not contain a DExH ATP binding motif. The highest-scoring residues in the SeSAW alignment are actually on the opposite side of the protein, and include a conserved arginine (R131) that forms a salt-bridge with a conserved aspartic acid (D104), as shown in figure 3C. The surface patch where the arginine is located maps to the helicase motif IV in the Hef helicase from *Pyrococcus furiosus* [9]. The GIRAF query indicated a sulfate binding site at the N-terminal helix, which is where the two ATPase domains are joined by the structurally uncharacterized alpha-domain. The significance of this binding site is not known. These observations suggest that the first domain might act as an ATPase, while the second domain probably has another function, such as nucleotide binding. RIG-I is known to sense double-stranded viral RNA as part of the innate immune response [8].

### 3.2 Toll-like receptor-9 TIR domain from mouse

The model of the Toll/interleukin-1 receptor from mouse Toll-like receptor 9 (TLR-9 TIR domain) was built on human TLR-1 (1fyv) with a sequence identity of 20%. The highest-scoring residue pairs in the SeSAW alignment included a number of conserved hydrophobic residues (W16, W125, Y110, F135, W136), along with prolines (P45, P103, P126) that are characteristic of TIR domains. Moreover, five residues in a conserved patch that includes the 'cBB loop,' thought to be involved in receptor signaling [10], score highly as well, as indicated in figure 4B. The GIRAF query returned no hits, which is not unexpected because the TIR domain is involved in protein-protein interactions rather than ligand interactions. Differences between the TIR domain in TLR-9 and TLR-1 are consistent with a different signal cascades initiated by these two innate immune response receptors: TLR-9 detects unmethylated CpG DNA and TLR-1 detects lipoproteins derived from bacteria.

### 3.3 Alternative oxidase from *Blastocystis*

A model of alternative oxidase (AOX) from the intestinal parasite *Blastocystis* was built using bacterioferritin from *Mycobacterium smegmatis* (3bkn) as a template. The sequence identity was only 16% but nevertheless statistically significant due to the matching



of iron coordinating glutamic acid and histidine residues and secondary structure. The SeSAW query clearly identified these important residues, and also ranked a number of aspartic acids very highly. The significance of these aspartic acid residues is not known, but the iron-ligating residues that consist of two E...HxxE motifs, as well as the existence of a key tyrosine and tryptophan residue, have been established [11]. The two iron-binding motifs, along with the conserved tyrosine align and rank highly in the SeSAW alignment. As figure 5C shows, these residues form a tight cluster. The spatial clustering gives us more confidence in our model and annotation than a purely sequence-based alignment and annotation would. The GIRAF query returned a very strong match to a designed protein that binds dimethyl sulfide at the same location as the expected  $\text{Fe}^{2+}$  binding site (PDB identifier 1jm0). The next-best match was to the  $\text{Fe}^{2+}$  binding site in bacterioferritin. These two hits were much more significant than any of the other GIRAF queries, consistent with a precise  $\text{Fe}^{2+}$  binding signature, showing the utility of the atom-based GIRAF alignment in ligand binding site identification.

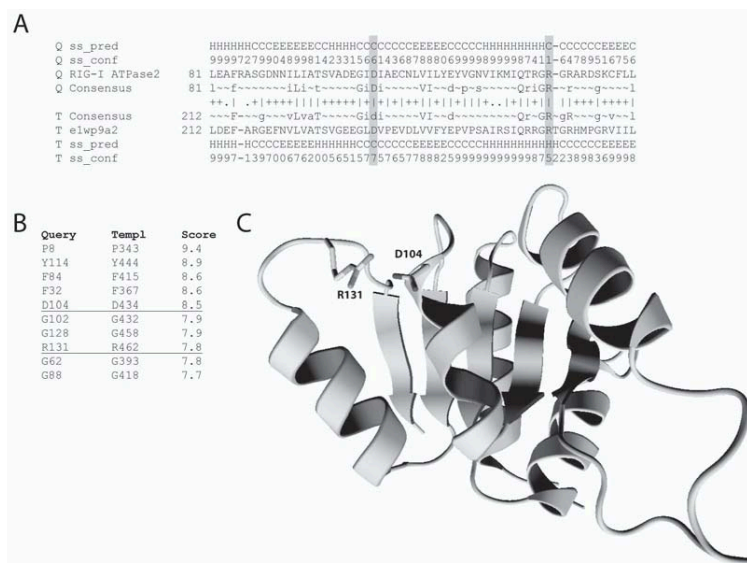
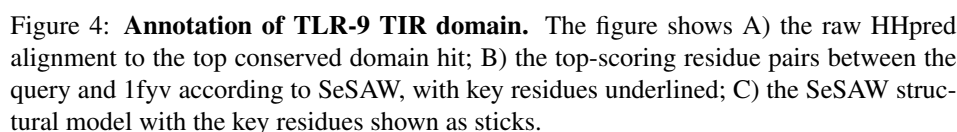


Figure 3: **Annotation of RIG-I ATPase-like domain 2.** The figure shows A) the raw HHpred alignment to the top conserved domain hit; B) the top-scoring residue pairs between the query and 2db3 according to SeSAW, with key residues underlined; C) the SeSAW structural model with the key residues shown as sticks.

## 4 Conclusions

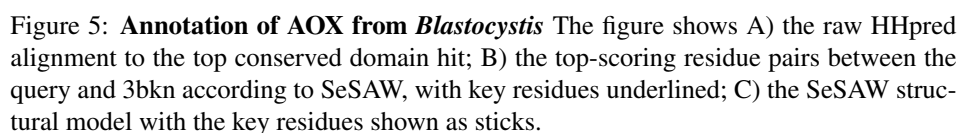
We have demonstrated here that structural modeling can be used as an intermediate step to map functional sites onto sequences without an experimentally-determined structure. The functional annotation methods used were developed by the authors, but alternate structure-based functional annotation tools [12, 13] could just as easily have been used. The two criteria required for this approach to work are 1) an accurate structural model must be built for at least the regions of interest and 2) distant homologs to the template that have been functionally characterized must exist. These criteria are less strict than those required for a direct sequence-based annotation approach. To demonstrate this, we have included the raw HHpred alignments in figures 2A-5A. As can be seen, many exact or high-scoring matches exist in each alignment, so identifying the functionally important residues from this set would be difficult without putting the matches into a structural context. SeSAW and GIRAF automate the process of identifying ‘interesting’ residues, but cannot, at this point, assign a function unambiguously except for in rather obvious cases. It is, therefore, necessary to scan the literature associated with each high-ranking template. Note that a high score from GIRAF or SeSAW can also be used as a criterion for model selection, in cases where the alignment is ambiguous.

The inclusion of structural information enables known sequence signatures to be expended. For example, in the case of the first ATPase-like domain of RIG-I, SeSAW indicated that K30 is important. This residue turns out to be essential for RIG-I function, which now seems reasonable given its spatial proximity to the known DExH motif. Be-



The agreement between SeSAW and GIRAF in the case of the first ATPase-like domain in RIG-I is encouraging. Moreover, the GIRAF p-value appears to correlate with functional significance. In the case of the TLR9 TIR domain, the lack of a GIRAF hit is consistent with its known protein-binding function, while in the one case where we are relatively confident of the ligand, AOX [11], the very low p-values validate the GIRAF statistical model.





In each case, the rank of some high-scoring residue pairs were attributed to structural conservation; such residues must be separated from those that appear to be more chemically active, and thus functionally important. When the similarity to the structural template, or the functional template, or both, is low, the location of the functional sites could be suggested but the exact function could not be determined. Such suggestions can in some cases (e.g., sulfate binding in RIG-I ATPase-like domain 1) be tested experimentally by binding assays coupled with mutational analysis. Thus the proposed method is complementary to traditional biochemical analytical methods for functional characterization.

Table 1: GIRAF results. The table shows all statistically significant ligand binding site hits from the current PDB as determined by the GIRAF p-value. In the case of the TLR-9 TIR domain, no hits were found.

Query	Pvalue	Ligand	Template	PDB ID	Comments
RIG-I ATPase-1	6x10 <sup>-14</sup>	Sodium	MDA5	3b6e	Corresponds to highest scoring SeSAW site
RIG-I ATPase-2	4x10 <sup>-13</sup>	sulfate	Putative transglycosylase	3czb	Significance unknown
TLR9 TIR	NA	NA	NA	NA	NA
AOX	3x10 <sup>-28</sup>	Dimethyl sulfide	Designed protein	1jm0	Fe <sup>2+</sup> binding site
AOX	4x10 <sup>-17</sup>	Fe <sup>2+</sup>	Bacterioferritin	1sof	Fe <sup>2+</sup> binding site



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