

## Structural bioinformatics

# CMV: visualization for RNA and protein family models and their comparisons

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### Abstract

**Summary:** A standard method for the identification of novel *RNAs* or *proteins* is homology search via probabilistic models. One approach relies on the definition of families, which can be encoded as covariance models (*CMs*) or *Hidden Markov Models* (*HMMs*). While being powerful tools, their complexity makes it tedious to investigate them in their (default) tabulated form. This specifically applies to the interpretation of comparisons between multiple models as in family clans. The *Covariance model visualization tools* (*CMV*) visualize *CMs* or *HMMs* to: I) Obtain an easily interpretable representation of *HMMs* and *CMs*; II) Put them in context with the structural sequence alignments they have been created from; III) Investigate results of model comparisons and highlight regions of interest.

**Availability and implementation:** Source code (<http://www.github.com/eggzilla/cmvm>), web-service (<http://rna.informatik.uni-freiburg.de/CMVS>).

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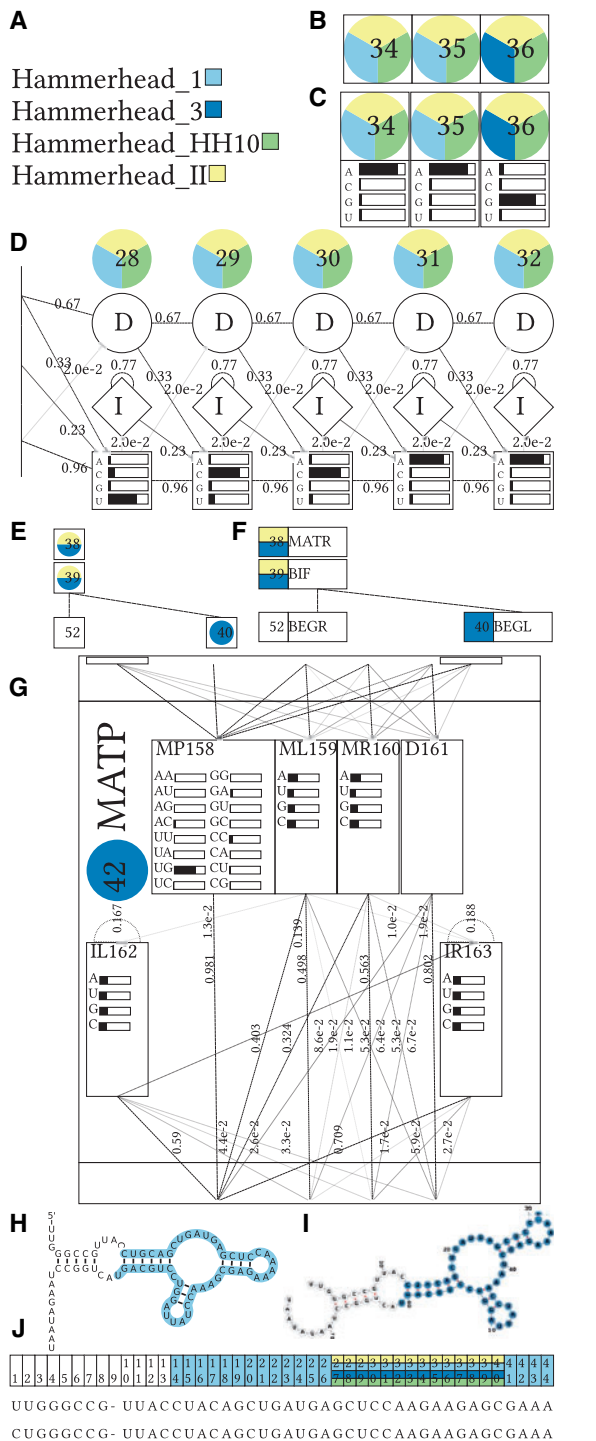
**Supplementary information:** [Supplementary data](#) are available at *Bioinformatics* online.

## 1 Introduction

Probabilistic models are constructed for specific *RNA* and protein families sharing a common ancestor and a biological function. The most prominent instances are the *HMM* architecture as used by *HMMER3* (Eddy, 2011) and the *CMs* utilized by *INFERNA* (Nawrocki and Eddy, 2013). Currently there are 2686 *RNA* families available from the *Rfam* (Burge *et al.*, 2012; Kalvari *et al.*, 2017; Nawrocki *et al.*, 2015) database and 16 712 from *Pfam* (Finn *et al.*, 2016). Visualization of the models provides an overview over whole regions and allows to directly inspect states, nodes and probabilities. A *HMM* visualization tool exists as part of *SAM* (Krogh *et al.*, 1994), while for *CMs*, as far as we are aware, no automatic solution exists.

## 2 Approach

Each tool of *CMV* accepts one or more models (*INFERNA*, *HMMER3* format) and optionally one or more corresponding alignments (*Stockholm* format) as input. The tools for comparison visualization require inputs in *CMCompare* (Eggenhofer *et al.*, 2013; Höner zu Siederdisen and Hofacker, 2010) format. Additional parameters can be set that control the level of detail of the visualization. In the minimal setting only the index for each node is shown, while full details provide states and probabilities. Moreover it is possible to select if emission probabilities should be displayed as numerical values or using a graphical representation. The number of entries in the alignment, the image size and the output format (svg, png, eps, pdf) can also be defined via options.



**Fig. 1.** Visualization of *HMM* (**B, C, D**) and *CM* (**E, F, G**) consensus secondary structure (**H, I**) and Stockholm Alignment (**J**) for the *Hammerhead RNA\_HH9* in comparison with families from the Hammerhead RNA family clan (**A**). Color labels indicate to which other model an alignment column or node has been linked via *CMCompare* (Complete figures are shown in [Supplementary Material](#)). **A**: Color Legend for the compared models; **B**: minimal *HMM* details show nodes with indices, **C**: simple *HMM* details show emission probabilities as well; **D**: detailed *HMM* view shows states with emission and transition probabilities; **E**: minimal *CM* details show nodes with indices; **F**: simple *CM* details add node type information; **G**: detailed *CM* view shows nodes with states and emission and transition probabilities; **H** and **I** show secondary structure visualization via *R2R* and *forna*; **J** shows a slice of input alignment, each line corresponds to one family member. Numbers on top of the columns represent the column index stored in the corresponding *CM* node

The tools have been written using the *diagrams* library with a *cairo* back-end for visualization. Processing takes on average, for the first 100 *Rfam* models, 13 s for a model with detailed output (see [Supplementary Table 1](#)).

The tools create one visualization output file per input model. If the Stockholm alignment for the family was provided, then a second output file is generated per alignment.

It is possible to select from three levels of visualization detail (minimal, simple, detailed) for family models and, exclusively for *CMs*, linear or tree layout. The minimal detail setting shows each node (roughly corresponding to paired nucleotides or single aminoacids or nucleotides) of the model as a box labeled with the index of the node. When the detail level is set to simple, emission probabilities are included in the visualization for each node in case of *HMMs* and the node type in case of *CMs*. The detailed level shows the individual states (encoding match, insertion and deletion options) per node, with emission and transition probabilities (see [Fig. 1B–G](#)). Emission probabilities are either shown as numerical values (score, probability) or as graphical bars. Transition probabilities are visualized as arrows between states, with probabilities indicated by increasing opacity, as well as text labels. For more information and figures see the [Supplementary Material](#).

Results of model comparison are visualized by labeling nodes with colors encoding the linked models (see [Fig. 1A](#)). Since the alignment columns corresponding to a node are known via the column index, the comparison information is also annotated in the alignment visualization (see [Fig. 1J](#)).

In the case of (structured) *RNAs* this comparative information can be mapped back to the consensus secondary structure of the family, thus enabling the identification of specific motifs or regions that are linked. This is done via labeling a secondary structure visualization of *R2R* ([Weinberg and Breaker, 2011](#)) or alternatively an input file for *forna* ([Kerpedjiev et al., 2015](#)) (see [Fig. 1H and I](#)).

The tool also is available as a web-service, along with documentation and precomputed examples in three detail levels for all available models in the *Rfam* database and the first 1500 models of the *Pfam* database.

### 3 Conclusion

We provide an open-source tool and web-service for the visualization of *HMMs*, *CMs*, their alignments and, for *RNA*, their consensus secondary structure. The visualizations can supplement models in the *Pfam* and *Rfam* databases and enable convenient inspection of newly constructed models with *RNAlien* ([Eggenhofer et al., 2016](#)), *RNAseqClust* ([Miladi et al., 2017](#)), or the *RNA workbench* ([Backofen et al., 2017](#); [Grüning et al., 2017](#)). Nodes linked by comparison to other models are highlighted in the visualization, which allows to investigate sequence and structure elements shared among family clans. This simplifies the identification of domains, respectively secondary structure elements, with potentially related biological functionality.

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*Conflict of Interest:* none declared.

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