Data Article

# Distribution of evaluation scores for the models submitted to the second cryo-EM model challenge

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## A R T I C L E   I N F O

## A B S T R A C T

142 protein structure models were submitted to second Cryo-EM model challenge (2015–2016). Accuracy of the models was evaluated with 54 evaluation scores. Results of the descriptive statistical analysis of the scores are provided in this article.

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**Specifications table**

| | |
|---|---|
| Subject area | *Structural Biology* |
| More specific subject area | *Cryo-EM Models* |
| Type of data | *Figures* |

| How data was acquired | *Computational analysis* |
|---|---|
| Data format | *Analyzed* |
| Experimental factors | *None* |
| Experimental features | *None* |
| Data source location | *Rutgers University* |
| Data accessibility | http://model-compare.emdatabank.org/data/scores |
| | http://model-compare.emdatabank.org/em_score_boxplots.cgi |

## Value of the data

- The data reveal ranges of evaluation scores for models submitted to cryo-EM model challenge and provide descriptive statistics.
- The data show differences in accuracy of cryo-EM models generated with different modeling techniques.
- The data can serve as a benchmark for future cryo-EM modeling challenges.
- The data can be compared with the data in other structure modeling experiments (e.g., CASP [1]).

## 1. Data

142 protein structure models were submitted on eight modeling targets of the second Cryo-EM model challenge (2015–2016) [2]. A computational system was developed to estimate the accuracy of the models [3]. Each model was evaluated using a suite of 15 software packages and, as a result, 54 accuracy scores were generated per model. All scores are presented in tables and graphs of the dedicated web infrastructure (http://model-compare.emdatabank.org). Some scores were analyzed in the accompanying paper [3]. This article provides results of the descriptive statistical analysis of the complete set of evaluation scores.

## 2. Materials and methods

### 2.1. Model types

Each model submitted to the second cryo-EM model challenge was accompanied by basic information about the modeling technique used. This information indicated whether model was built *ab initio* by fitting coordinates to density maps or by optimizing already available related structures. Based on this information, models were binned into two categories: *ab initio* or optimized. Figs. 1–3 in this paper show distributions of the evaluation scores separately for *ab initio* and optimized models, while Figs. 4 and 5 show the distributions for all models in one dataset (see description of the data presented in the figures in Section 4.4 below).

### 2.2. Box plots

Data in the Figs. 1–5 are presented as box plots. Box boundaries correspond to the $Q_1 = $ 25th (bottom) and $Q_3 = $ 75th (top) percentiles in the data; the horizontal line inside the box corresponds to the median ($Q_2$). The height of the box defines the interquartile range (IQR = $Q_3$-$Q_1$). The height of the whiskers shows the range of the values outside the interquartile range, but within 1.5 IQR. The dots correspond to outliers, i.e. values outside the 1.5 IQR range.

## 2.3. Evaluation tracks and packages

Submitted models were evaluated in four evaluation tracks:

(1) directly from the model coordinates, i.e. without referring to density maps or other available struc-
tures (software packages used: *MolProbity 4.4* [4], *phenix.model_vs_map* module (from *PHENIX 1.11.1-
2575 distribution* [5])*, DFIRE* [6]*, ProQ3* [7]*, QMEAN* [8]);

(2) comparing the model coordinates to those of reference structures (software packages used: *LGA*
[9]*, TM* [10,11]*, LDDT* [12]*, CAD* [13]*, QS-score* [14]*, IFaceCheck* [15]*, phenix.chain_comparison*
module [5]);

(3) checking fit of the model coordinates to the experimental 3DEM density maps (software packages
used: *TEMPy 1.0* [16,17]*, EMRinger* [18]*, phenix.model_vs_map* module [5]);

(4) comparing coordinates of each model to those of other submitted models (software packages
used: *Davis-QAconsensus* [19]).

## 2.4. Score distributions

Detailed explanation of the evaluation scores is provided in the accompanying paper [3].
Fig. 1 illustrates distributions of evaluation scores calculated directly from model coordinates
(evaluation track 2.3.1). Panel (A) shows scores calculated on representative model subunits, while
panel (B) – on whole multimeric structures. The figure includes box plots for the following scores:

Panel (A):

- Molprb(mon) – MolProbity's combined MPscore;
- Molprb(mon):rot_out – MolProbity's rotamer outlier score;
- Molprb(mon):clash – MolProbity's clash score;
- Molprb(mon):ram_fv – MolProbity's Ramachandran favored score;
- Molprb(mon):ram_out – MolProbity's Ramachandran outlier score;
- Log(-DFIRE) – logarithm of negative DFIRE energy score;
- ProQ3 – score from the ProQ3 program ran with default parameters;
- QMEAN – score from the QMEAN program ran with default parameters.

Panel (B):

- [Molprb(mult):ram_fv /Molprb(mult):clash /Molprb(mult):ram_out /Molprb(mult):rot_out] – MolProb-
ity's [Ramachandran favored score /clash score /Ramachandran outlier score /rotamer outlier] score;
- [PHENIX:bond_rmsd /PHENIX:angle_rmsd /PHENIX:planar_rmsd /PHENIX:chiral_rmsd /PHENIX:
dihedr_rmsd] – the RMSD on [bond /angle /planarity /chirality /dihedral angle] deviations calcu-
lated with the *phenix.model_vs_map* module;
- PHENIX:bond_max – the maximum deviation of bond distances from ideal values (in Å);
- PHENIX:angle_max – the maximum deviation of angles from ideal values (in deg.);
- PHENIX:planar_max – the maximum deviation of peptide bond planarity from ideal values
(in deg.);
- PHENIX:chiral_max – the maximum deviation of chirality score from ideal values;
- PHENIX:dihedr_max – the maximum deviation of dihedral angles from ideal values (in deg.).
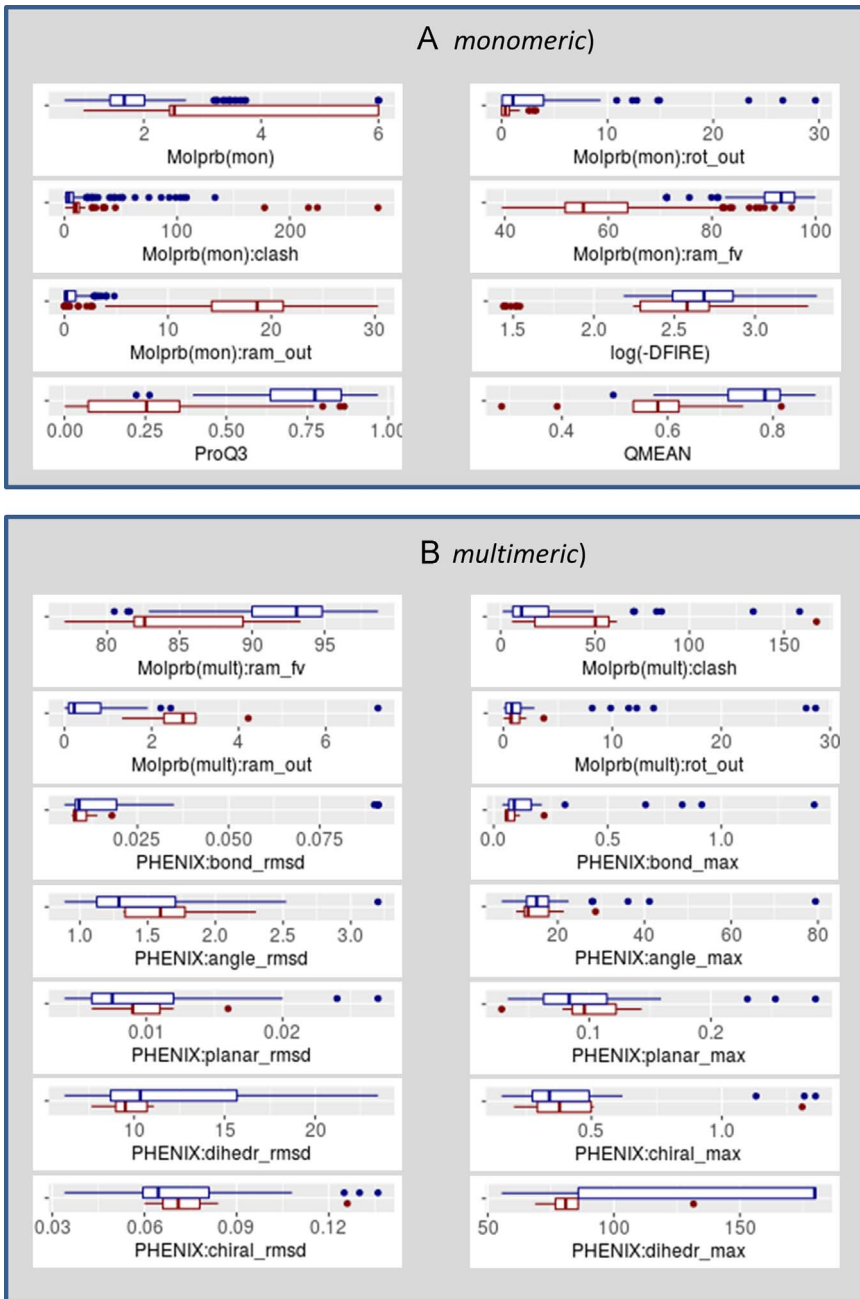
**Fig. 1.** Distribution of the evaluation scores calculated exclusively from the model coordinates for different types of models. For each measure (specified in the *x*-axis title), a blue boxplot shows the score distribution for models built starting from reference structure, while a red boxplot – for models built ab initio. Panel (A) shows evaluation scores for models' subunits (monomeric evaluation mode), while panel (B) for whole multimeric models.

Fig. 2 illustrates distributions of evaluation scores calculated by comparing models with reference structures (evaluation track 2.3.2). Panel (A) shows scores calculated on representative model subunits, while panel (B) – on whole multimeric structures. The figure includes box plots for the following scores:

Panel (A):

- GDT_TS, GDT_HA – scores from the LGA package ran with parameters: '-3 -sda -d:4');
- LGA_S – score from the LGA package ran with parameters: '-4 -sia -d:4');
- RMSD – root mean square deviation on C$\alpha$ atoms of the representative chain (as reported by the LGA package);
- TMscore, TMalign – scores from the TM package ran with default parameters;
- CAD – CAD_aa variant of the CAD score calculated on all atoms;
- LDDT – a score from the LDDT package run with 15 Å inclusion radius.

Panel (B):

- [QS-global /QS-best] – Quaternary Structure score calculated on [all interfaces /best interface] with the *QS-score* package;
- [QS:LDDT /QS:RMSD] – [LDDT and /C$\alpha$ RMSD] scores calculated on all chains by the *QS-score* package;
- IFaceCheck:F1_max – maximum *F1* statistics from among those calculated on all interfaces calculated with the *IFaceCheck* package;
- IFaceCheck:Jd_min – the minimum *Jaccard distance* from among those calculated on all interfaces;
- IFaceCheck:prec_max – maximum *precision* from among those calculated on all interfaces;
- IFaceCheck:recall_max – maximum *recall* from among those calculated on all interfaces;
- IFaceCheck:RMSD_min – minimum RMSD on target interface atoms from among those calculated on all interfaces;
- [IFaceCheck:F1_avg /IFaceCheck:Jd_avg /IFaceCheck:prec_avg /IFaceCheck:recall_avg /IFaceCheck:RMSD_avg] – the [F1 /Jaccard distance /precision /recall /interface RMSD] scores averaged over all interfaces;
- [PHENIX:CA-score /PHENIX:seq_match] –scores generated with the *phenix.chain_comparison* module.
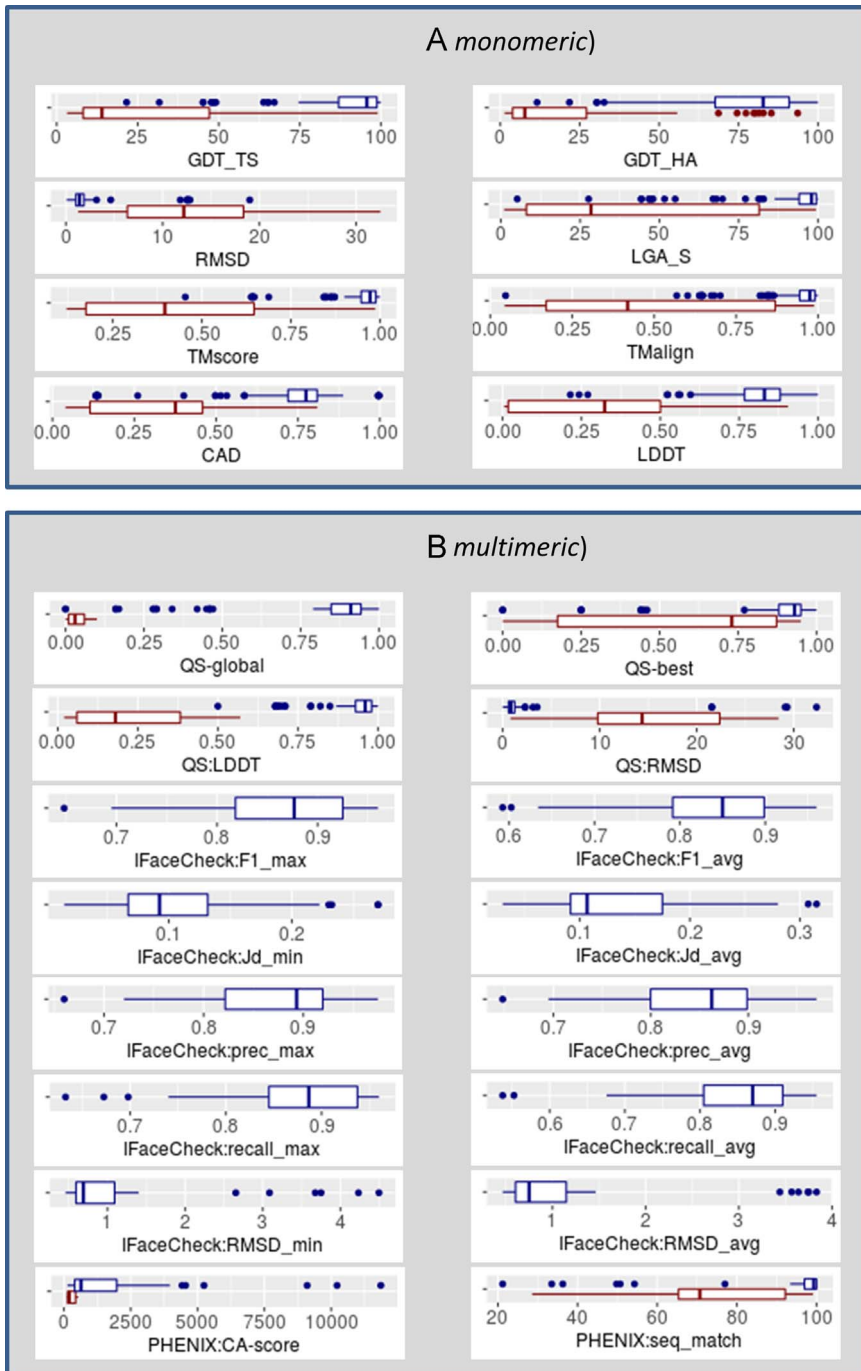
**Fig. 2.** Distribution of the evaluation scores calculated by comparing models with reference structures. For each measure (specified in the x-axis title), a blue boxplot shows the score distribution for models built starting from reference structure, while a red boxplot – for models built *ab initio*. Panel (A) shows evaluation scores for models' subunits (monomeric evaluation mode), while panel (B) for whole multimeric models.

Fig. 3 illustrates distributions of evaluation scores estimating fit of models to density maps (panel A, evaluation track 2.3.3) and similarity of models to other submitted models (panel B, evaluation track 2.3.4). The figure includes box plots for the following scores:

Panel (A):

- [PHENIX:overall_FSC /PHENIX:boxCC] – the [overall Fourier Shell Correlation in reciprocal Fourier space /per-chain box cross-correlation] calculated with the *phenix.model_vs_map* module;
- [TEMPy:CCC /TEMPy:LAP /TEMPy:ENV /TEMPy:MI] – TEMPY's [cross-correlation coefficient /Laplacian-filtered cross-correlation /envelope /mutual information] scores;
- EMRinger – EMRinger score calculated using the *phenix:emringer* module.

Panel (B):

- Davis-QA – a model consensus score calculated by averaging the GDT_TS scores from pairwise comparisons of the model to all others.
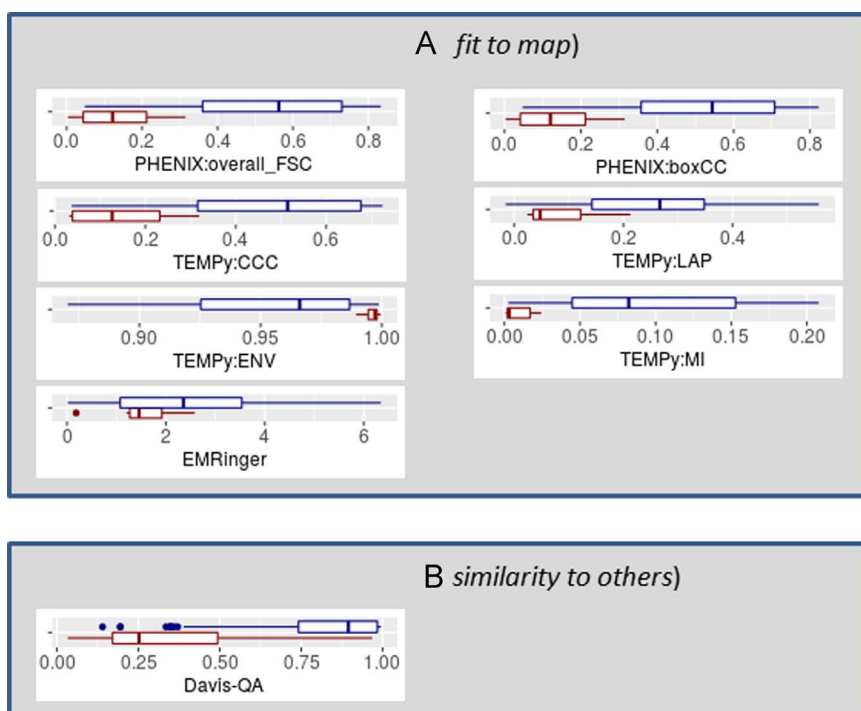


**Fig. 3.** Distribution of the evaluation scores estimating fit of models to density maps (panel A) and similarity of models to other submitted models (panel B). For each measure (specified in the *x*-axis title), a blue boxplot shows the score distribution for models built starting from reference structure, while a red boxplot – for models built *ab initio*.

Figs. 4 and 5 illustrate distributions of evaluation scores presented in Figs. 1–3 when all models (optimization and *ab initio*) are grouped in one dataset. Score names are as described above for Figs. 1–3.
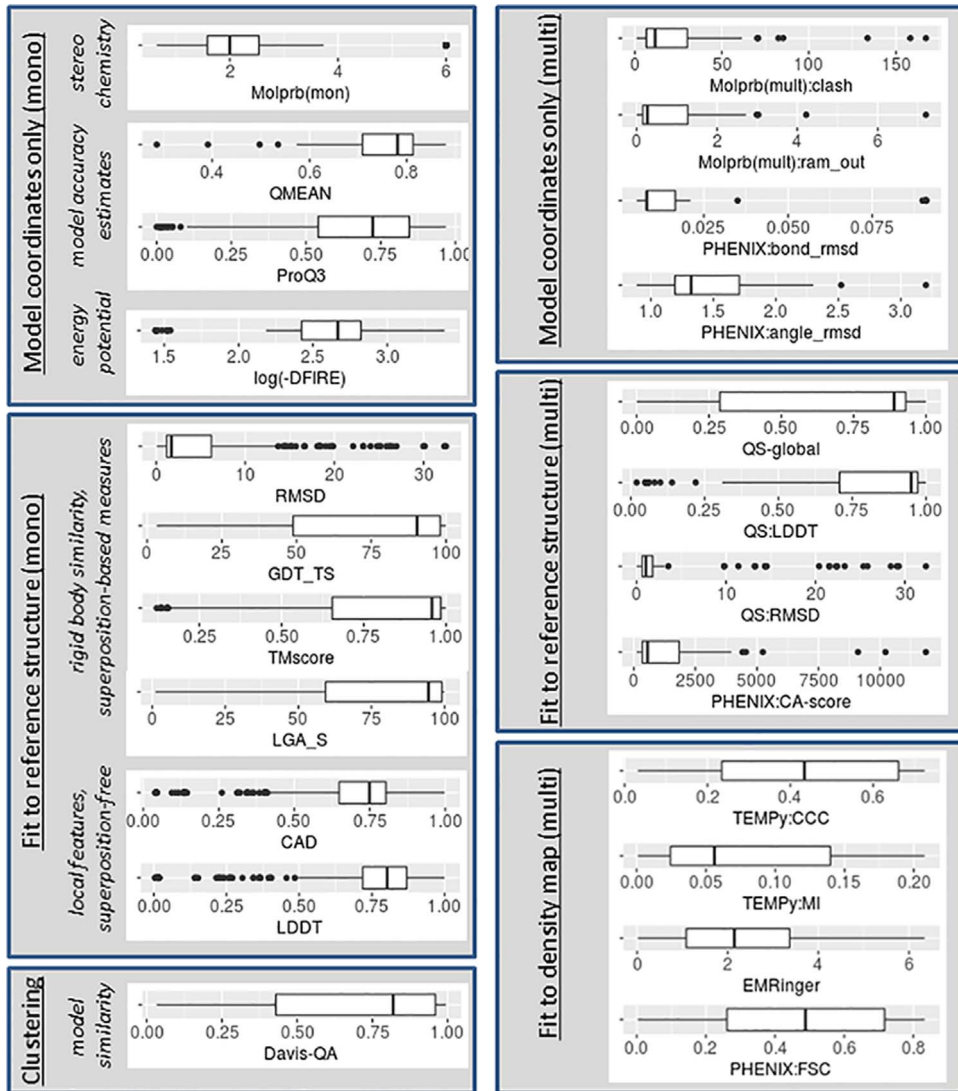


**Fig. 4.** Distribution of the evaluation scores shown in Fig. 8 of Ref. [3] for all submitted models (optimization and *ab initio* models pulled together). Left set of boxplots shows scores from multimeric evaluations, right set – from monomeric ones.
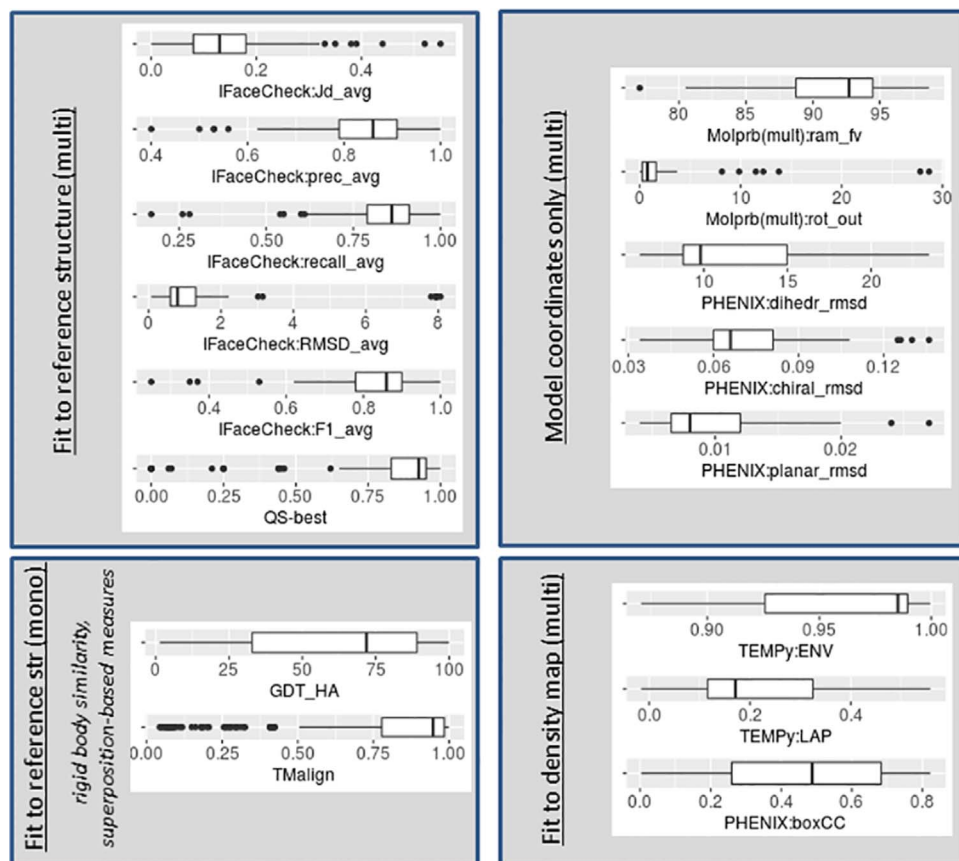
**Fig. 5.** Distribution of the evaluation scores not included in Fig. 4 for all submitted models.

## Acknowledgements

## Transparency document. Supplementary material

Transparency data associated with this article can be found in the online version at http://dx.doi.org/10.1016/j.dib.2018.08.214.

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