phenix.mr_rosetta: molecular replacement and model rebuilding with *Phenix* and *Rosetta*

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Abstract The combination of algorithms from the structure-modeling field with those of crystallographic structure determination can broaden the range of templates that are useful for structure determination by the method of molecular replacement. Automated tools in *phenix.mr_rosetta* simplify the application of these combined approaches by integrating *Phenix* crystallographic algorithms and *Rosetta* structure-modeling algorithms and by systematically generating and evaluating models with a combination of these methods. The *phenix.mr_rosetta* algorithms can be used to automatically determine challenging structures. The approaches used in *phenix.mr_rosetta* are described along

The *phenix.mr_rosetta* tools and instructions for their use are available as part of *Phenix* (www.phenix-online.org). The *Rosetta* software is available from http://depts.washington.edu/uwc4c/ express-licenses/assets/rosetta/. A local installation containing both *Phenix* and *Rosetta* is necessary to run *phenix.mr_rosetta*. Sample scripts for running phenix.mr_rosetta, test data, and some of the data and scripts used in this work are all available at http://www.phenix-online.org/phenix_data/terwilliger/rosetta_2011/.

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with examples that show roles that structure-modeling can play in molecular replacement.

Keywords Molecular replacement · Automation · Macromolecular crystallography · *Rosetta* · *Phenix*

Introduction

Molecular replacement [1] is an exceptionally powerful technique for the determination of structures of macromolecules. In molecular replacement a template structure serves as an initial model for the structure to be determined. The orientation and location of the template in the crystallographic cell are found by optimizing the agreement between measured structure factors and those calculated from the placement of the template. Then the placed template is used to estimate the crystallographic phases, allowing calculation of a preliminary electron density map. A new model is then built using this map as a guide.

Molecular replacement accounts for over 70% [2] of the structures in the Protein Data Bank (PDB, [3]). Despite this success, molecular replacement is limited to situations where a suitable template structure is available. The template must normally represent a large fraction (usually more than 50%) of the structure and have a core whose atomic coordinates are superimposable within approximately 1.5–2 Å root mean square deviation (rmsd) of the target structure [4].

There are two steps in molecular replacement where the availability of a sufficiently similar template is crucial. The first is at the stage of finding the orientation and location of the template structure in the asymmetric unit of the structure to be determined. If the template is too different from

Characteristic	Crystallographic model-building (Phenix)	Structure-modeling (Rosetta)
Optimization	Interpretation of patterns of density	Creating physically plausible models
Model-building approach	Density search for secondary structure	Ab initio modeling or homology modeling
Fragment libraries	3-residue fragment library	3- and 9-residue libraries
Model-building target	Fit to density	Rosetta force field (optional density term)
Refinement target	Structure-factor likelihood	Rosetta force field (optional density term)

Table 1 Complementarity of model-building in macromolecular crystallography and in structure-modeling

the structure to be determined, the correct location and orientation may not be identifiable.

The second step that requires a template sufficiently similar to the structure to be determined is the rebuilding of a correctly-placed model. It is not uncommon for molecular replacement to yield a solution that is unambiguous in its placement yet leads to an electron density map that does not give any useful clues as to how to improve the model. In such cases it is again not feasible to proceed with structure determination.

These restrictions on the divergence between template and structure to be determined, along with the wide use of molecular replacement, mean that any improvements in the starting templates for molecular replacement, in methods for finding the location and orientation of the template, in methods for obtaining accurate phases from a preliminary model, or in methods for rebuilding molecular replacement models can substantially increase the number of structures that can be determined by molecular replacement.

There have recently been many important advances in all these areas. Improved starting templates for molecular replacement have been obtained by judicious pruning of parts of models that are less likely to be correct [5, 6, 7], by creating ensembles of templates [8, 9], using normal mode analysis [10, 11], and by systematic searches using many or all of the proteins in the Protein Data Bank [12, 13]. Improved methods for finding the placement of the template include the use of likelihood in scoring of placements and the development of approximations to the likelihood function that are accurate yet much more rapid [14]. Improvements in methods for obtaining phase information from a preliminary model include developments in algorithms for creating maps that optimally show unmodeled density [15] and developments in density modification procedures that reduce model bias [16]. Improvements in model-building algorithms include the use of iteration between model-building, refinement and map calculation or density modification [17, 18, 19] and the development of methods that can be used at resolutions lower than 3 Å [20, 21, 22, 23, 24, 25, 26, 27].

A recent approach to obtaining improved templates for molecular replacement is to apply tools from the structure modeling field before or after placing the template in the crystallographic cell [28, 6, 29, 30]. The key idea in this approach is that crystallographic model-building and structure modeling use fundamentally different sources of information so that combining them can yield a more powerful approach to model-building than either alone.

Table 1 compares the algorithms and information used in crystallographic model-building and in structure modeling. Crystallographic model-building of macromolecules is based on interpretation of patterns of electron density. The presence of a polypeptide backbone, side-chains, and secondary structure are used directly in interpreting an electron density map in terms of an atomic model. In contrast, the core aspect of structure modeling is the use of specialized force fields capable of distinguishing a physically plausible model from one that is not. The algorithms in the structure modeling field are in optimal cases able to generate and refine structures with near-native conformations without the use of experimental information. For example Das and Baker [31] estimated that about one in six proteins under 100 amino acids in length can be modeled ab initio with sufficient accuracy for phasing by molecular replacement.

Crystallographic model-building does make use of force fields as well. After model-building, crystallographic structures are refined using a combination of the agreement with crystallographic data and a simple set of geometric restraints. The restraints used in crystallographic modelbuilding are normally much less sophisticated than the force fields used in the structure modeling field, however. They often do not include electrostatic or hydrogen bonding interactions for example. In contrast to refinement with force fields used in structure modeling, refinement of a structure with geometric restraints in the absence of crystallographic data typically is highly unlikely to converge to near-native conformations.

Qian et al. [29], Ramelot et al. [30], DiMaio et al. [28] and Mao et al. [6] have shown that *Rosetta* structure modeling can be used to improve homology models to make them more useful for finding their locations in a crystallographic cell, the first step in molecular replacement. Qian et al. [29] have shown that in some cases ab initio models created with *Rosetta* from sequence information alone can be sufficiently accurate to be useful

in this step. DiMaio et al. [28] have shown further that augmentation of *Rosetta* structure modeling with pseudoenergy terms representing fit of model to electron density can greatly improve the rebuilding of models in the second key step of molecular replacement.

The procedures used by DiMaio et al. [28] for combining Rosetta structure modeling and crystallographic model-building require considerable manipulations and familiarity with both crystallographic and structure-modeling tools. To make the use of these procedures more accessible to a broader range of structural biologists, we developed software in the Phenix crystallographic computing environment [32] that provides simultaneous access to Rosetta structure modeling and Phenix crystallographic model-building [28]. This *phenix.mr_rosetta* software allows a user to identify suitable templates for molecular replacement available in the PDB, edit them to match the target sequence, optionally refine their structures with Rosetta prior to molecular replacement [29], carry out molecular replacement, and rebuild the resulting models with *Rosetta* [28] and *Phenix* autobuilding [19] algorithms. Alternatively the same software can begin with a partial or complete model already placed in a crystallographic cell and rebuild the model with Rosetta and Phenix autobuilding approaches. These procedures can be carried out using simple keyworded scripts that specify the input data and the procedures to be used. Here we describe the methods used in *phenix.mr* rosetta and present examples that help show how the approach works.

Methods

Steps in molecular replacement and model rebuilding by *phenix.mr_rosetta*

The basic data required to run the *phenix.mr_rosetta* procedure consists of the sequence of the structure to be determined and the measured crystallographic structurefactor amplitudes for this structure. Additionally either a file from the *hhpred* server (http://toolkit.tuebingen.mpg.de/ hhpred; [33]) listing similar proteins in the PDB and their alignments, or one or more templates edited to match the target sequence are required. For loop-building in *Rosetta*, files containing 3-residue and 9-residue fragments from the PDB tailored for the target protein are also required. These fragments can be obtained from the *Robetta* fragment server (http://robetta.bakerlab.org/fragmentsubmit.jsp) [34].

The overall procedure used in *phenix.mr_rosetta* consists of six steps. These are (1) downloading suitable templates and editing them to match the target sequence, (2) optional optimization of the models with *Rosetta* without using X-ray data, (3) placement of templates using

molecular replacement, (4) refinement and calculation of density-modified electron density maps, (5) model rebuilding with *Rosetta* including density information, and (6) model rebuilding with *phenix.autobuild*.

Once the entire cycle of 6 steps has been carried out, a partially or completely built model may be obtained. If all chains in the model are found in the molecular replacement step (step 3) but the model is not fully rebuilt after carrying out these steps, then steps (4–6) of this procedure can be iterated to complete and further improve the resulting models. Alternatively, if some chains in the model are not found in molecular replacement, those that are found can be rebuilt in steps (4–6). Then the resulting model can be used as a fixed model for another molecular replacement attempt, and the resulting model can be rebuilt as before. The six steps are described in more detail below.

Downloading suitable templates and editing them to match the target sequence

The simplest starting point for *phenix.mr_rosetta* is a list of proteins in the PDB that are likely to have similar structures to the target protein. The hhpred server (http://toolkit. tuebingen.mpg.de/hhpred) [33] provides a rapid analysis of homologous sequences that are present in the PDB and lists these PDB entries along with their sequence alignments to the target structure. If the resulting summary file is supplied, *phenix.mr_rosetta* will use the tool *phenix.mr_model_preparation* to download a specified number of these PDB entries and edit them to match the sequence of the target protein. These edited templates can then either be the starting points for structure optimization by *Rosetta* or serve as search models for molecular replacement.

This simple procedure is limited to structures that can be represented by a single template from the PDB. Normally this means that it is suitable for structures with a single type of polypeptide chain. Structures that contain several different chains or chains that require several templates to be represented can be built with *phenix.mr_rosetta* but the initial molecular replacement steps must be carried out separately. The tool *phenix.mr_model_preparation* can be used to download and edit multiple templates and the molecular replacement tool *phenix.automr* can then be used to carry out molecular replacement with *Phaser* [14] to place and combine these templates. Then any number of the resulting potential molecular replacement solutions (placed models) can be used as the starting point for *phenix.mr_rosetta* beginning in step (4) below.

Optional optimization of the models with Rosetta

Once a template structure is available, *Rosetta* modeling tools [29] can optionally be applied to remodel the

template. The information that is available for this remodeling is the sequence alignment between the template and the target molecule and the starting structure of the template. *Rosetta* can be used to rebuild the template, making its structure more compatible with the sequence of the target molecule and creating new chains for any gaps where the template did not match the target sequence. This process is carried out without reference to any crystallographic data. Normally 1,000–2,000 *Rosetta* models are created and the top-scoring model (based on the standard *Rosetta* energy function) is used as a search model in the molecular replacement step.

Placement of search models using molecular replacement

Once search models are available, molecular replacement is carried out using the crystallographic data along with each search model in turn. In cases where the size of the asymmetric unit of the crystal can accommodate more than one copy of the search model, the number of copies of the search model to be found can be specified, or phenix.mr_rosetta can try all plausible numbers of copies. If the number of copies to be found is a multiple of the number of copies of the template in its original crystallographic asymmetric unit, then the corresponding multimer of the template is tested in molecular replacement as well as the monomer. For example, if the template was a dimer in its original crystal form and four copies of the molecule can fit in the asymmetric unit of the target structure, then both the monomer and dimer of this template would be considered in separate runs of molecular replacement by phenix.mr_rosetta.

As there may be several search models and several numbers of copies to be tested, the entire molecular replacement step can produce a number of possible models. These models are rescored with the *Phaser* log-likelihood scoring procedure [9] using a fixed value of the estimated rmsd between template and target structure (typically using the smallest value of the estimated rmsd for all the search models considered). The best-scoring model or models are then considered as starting points for map calculation and *Rosetta* rebuilding.

Refinement and calculation of density-modified electron density maps

Once a potential molecular replacement solution is obtained, it is refined with *phenix.refine* [35] and the resulting model is used along with the experimental data to create a model-based density-modified electron density map with *Resolve* density modification [19]. If more than one copy of the template is present in the molecular replacement model, then non-crystallographic symmetry is included in the density modification procedure [36].

If the starting point for the entire procedure is a model already placed in the crystallographic cell, then this model is refined and a density-modified map is created in the same way. In this case the model can consist of any number of copies of any number of different chains. This allows the application of later steps in *phenix.mr_rosetta* to structures that are more complicated than those that can be described with a single sequence.

Model rebuilding with Rosetta including density information

Once a model has been placed in the crystallographic cell and a density map has been created, a Rosetta modeling procedure is carried out in which the Rosetta energy function is augmented with a term describing the fit of the model to the density [37, 28]. This Rosetta modeling procedure can rebuild existing segments of the model as well as build short loops (typically up to 8 residues in length) in gaps of the model. There can still be segments that are missing in the model, however. The resulting models with the best *Phaser* likelihood scores [9] are then refined with phenix.refine and used to create a new set of densitymodified maps. These maps are averaged to yield a single averaged density-modified map. The refined Rosetta models are then rebuilt one more time with Rosetta using the fit to this averaged map in scoring and the best-scoring models are refined with phenix.refine and used as the starting point for *phenix.autobuild* automated model rebuilding.

In cases where more than one copy of a chain is present in the model, a single copy is supplied to *Rosetta* along with the density map corresponding to that chain. Then the resulting *Rosetta* model is copied to the locations of each of the copies in the original model to form a new *Rosetta*based model with idealized non-crystallographic symmetry. In cases where more than one type of chain is present, one copy of each type of chain is supplied at a time to *Rosetta*. In this way any number of copies of any number of types of chains can be rebuilt with *Rosetta* including a density term.

Model rebuilding with phenix.autobuild

Model rebuilding is continued using *phenix.autobuild*. The starting points are the models rebuilt as described above with *Rosetta*, including a density term in the *Rosetta* energy. These models are rescored using the *Phaser* like-lihood score [9]. The top models (typically 2) are then rebuilt with *phenix.autobuild* [19] based on the crystallographic data and the sequence of the target macromolecule. This automated model-building procedure uses the starting model and any non-crystallographic symmetry to create a

density-modified map in the same way as in step (3) above. The density-modified map is used as the basis for crystallographic model-building and recombination of the newlybuilt model with the existing model, and the resulting model is refined using the crystallographic data [35]. The overall rebuilding procedure is iterated until the R-value comparing the crystallographic data with data expected from the model does not change substantially from cycle to cycle.

In the model-building process some polypeptide chain can be built in regions that are not represented in the *Rosetta* model used to start the autobuilding process. The sequences corresponding to such chains may be identified by the correspondence between the sequence of the target structure and the shapes of side chains visible in the electron density map along the polypeptide chain. However some chains may be built that cannot automatically be assigned to sequence. These are normally discarded if further cycles of *Rosetta* model-building are to be carried out as *Rosetta* model-building requires a knowledge of the sequence of the model to be rebuilt.

At the conclusion of autobuilding, the model with the lowest R-value and the corresponding density-modified map are saved. This model and map can be suitable for further rebuilding with semi-automated tools or re-used as the input for further cycles of *Rosetta* and *phenix.autobuild* rebuilding.

Results and discussion

Application of *phenix.mr_rosetta* to challenging structure determinations

Recently we have used a combination of *Rosetta* and *Phenix* to determine 13 new structures that had proven difficult or not possible to determine by a variety of other approaches [28]. The procedures used in *phenix.mr_rosetta* are automated versions of the procedures used in that work. Here we describe the application of *phenix.mr_rosetta* to two of these structures to illustrate how the combination of structure modeling and crystallographic model-building can enhance structure determination by molecular replacement.

Structure-modeling of an NMR model prior to molecular replacement

One of the structures determined by a combination of *Rosetta* modeling and *Phenix* autobuilding was the structure of the *radA* intein (structure #12 in [28, 38]). X-ray diffraction data were available to a resolution of 1.7 Å, and a dimer of the molecule is present in the asymmetric unit of

the crystal in space-group $P2_12_12_1$. Additionally, an NMR model potentially suitable for use in molecular replacement was available (this NMR model was not a final model, but rather one that had been generated from NMR data using rapid automated procedures). Molecular replacement with the automatically-generated NMR model had not succeeded, but the structure could be determined by applying *Rosetta* structure modeling to the automatically-determined NMR model, choosing the best-scoring *Rosetta* model, and using that model in molecular replacement followed by *Phenix* autobuilding [28, 38].

This structure determination can be reproduced with phenix.mr_rosetta by supplying the automatically-generated NMR model, the sequence of the protein, and the X-ray diffraction data, and specifying that the model is to be prerefined with Rosetta prior to molecular replacement. Figure 1 illustrates how the Rosetta refinement (without X-ray data) improves the automatically-generated NMR model sufficiently for it to be useful in molecular replacement. Figure 1 compares the final model of this structure (in yellow) with the NMR model (in blue), after superimposing the NMR model on the final model. The rmsd between the main-chain atoms of these models is about 2.1 Å (excluding residues 118-133 that are completely different), so it is not surprising that the automatically-generated NMR model is not successful in molecular replacement. For the 1,000 Rosetta models built in the phenix.mr_rosetta run, the mean value of this rmsd is 1.7 Å, with a range from 1.1 to 2.6 Å. Figure 1 shows the highest-scoring Rosetta model (in purple). This model is considerably better than an average Rosetta model, with an rmsd to the final structure of 1.5 Å (though not as accurate as the best Rosetta model). This improvement of the starting model from an rmsd of 2.1 to 1.5 Å is the critical step in the solution of this structure. Beginning with this highest-scoring Rosetta model, molecular replacement is successful (the top Phaser solution is correct), and refinement of the molecular replacement solution yields R and free R-values of 0.38 and 0.44. Subsequent rebuilding with Rosetta and Phenix autobuilding leads to a largely-correct model (the model in green in Fig. 1) with an R-value and free R-value of 0.24 and 0.27, respectively.

Structure-modeling with density to yield critical improvements in a placed model

A structure for which *Rosetta* modeling substantially aided crystallographic model-building is the protease *XMRV PR* [39], structure #6 in [28]. Efforts to determine this structure by standard molecular replacement approaches had failed, and the structure was determined by a combination of extensive molecular replacement and Rosetta modeling with electron density restraints using X-ray data collected



Fig. 1 Comparison of models for the structure *radA* intein. The final refined structure [28] is shown in yellow. The NMR template is shown in *blue*. The best-scoring *Rosetta* model is in *purple*, and the *phenix.mr_rosetta* structure is in *green* (nearly superimposing on the final refined structure)

to a resolution of 2 Å [39]. The structure was determined by creating a symmetric dimer from chain A of the HIV-1 protease structure 2hs1 [40] with a sequence identity of 30%. There is a dimer of *XMRV PR* in the asymmetric unit of the crystal. The location of a symmetric dimer from the template 2hs1 could be determined by molecular replacement, but the resulting model was too different from the template to yield a useful electron density map for rebuilding [28]. Rebuilding this model with *Phenix* autobuilding failed (with free R-value of 0.57).

Figure 2a illustrates why this autobuilding failed. This figure shows the placed template (a symmetric dimer) from 2hs1 in blue, the final refined model of XMRV PR in green, along with the density-modified electron density map based on this placed template. This density map has a correlation of 0.56 to a map calculated from the final XMRV PR model. The map is difficult to interpret in many places and it is therefore not simple to improve the model. Rosetta modeling using the density map was able to improve the template considerably. Figure 2b shows the best-scoring Rosetta model (in purple), also along with the final refined model. The density-modified map obtained by averaging the density-modified maps from the top 4 best-scoring Rosetta models is shown. This map is substantially clearer than the one based on the placed template (it has a correlation of 0.82 to the final map) and allowed rebuilding of the best-scoring Rosetta model with Phenix autobuilding. At the end of this cycle of phenix.mr_rosetta building, the R-value and free R-value were 0.29 and 0.34, respectively, and the map correlation was 0.85 (Fig. 2c).

Application of phenix.mr_rosetta to 13 previously-solved structures

We tested the *phenix.mr* rosetta tool by applying it to 13 structures previously solved using a combination of molecular replacement, structure-modeling and crystallographic model building [28]. Table 2 (column F) lists the free R-values of models obtained using phenix.mr rosetta for each of these 13 structures. In most cases phenix.mr_rosetta was initiated with sequence alignments (listed with starting points of "sequence alignment" in Table 2), and in others (listed as "placed template") the process was started after molecular replacement had been carried out. The structures in Table 2 are sorted according to the resolution of the data. For structures where highresolution data (<2.5 Å) was available, the models obtained by phenix.mr_rosetta are quite accurate (with free R-values of 0.34 or better). For structures with lower-resolution data, phenix.mr rosetta produced less-accurate models, but in all cases the maps obtained were of good or very good quality (map correlations to final refined structures ranged from 0.5 to 0.85). Overall, 11 of 13 of these datasets led to structures with free R-values of 0.42 or lower with *phenix.mr_rosetta*. The remaining two had free R-values of 0.44. Based on these results, it appears that the use of phenix.mr rosetta would have been sufficient to solve all of these structures.

These 13 structures and their experimental data have been examined quite extensively [28] and many different approaches for structure determination have been applied to each of them. In previous work the key question was how much information was contributed by the use of Rosetta modeling. To answer this question, the comparisons among methods all began with templates placed in the crystallographic unit cell using Phaser molecular replacement, and the effectiveness of each method in improving these placed models was examined [28]. Those comparisons showed that for two of the structures (radA intein and pc0265), Rosetta modeling was essential for the first step in molecular replacement to succeed. For 6 additional structures (XMRV PR, thiod, pc02153, tirap, hp3342 and estan) Rosetta modeling with density after molecular replacement yielded substantially better models than the other methods tried. The next-best method for these 6 structures consisted of deformable elastic network (DEN) refinement [41] followed by Phenix autobuilding. For the final 5 structures (fk4430, bfr258e, niko, fj6376 and cab55348) several methods, including Rosetta modeling with density, could be used to determine the structures.

Table 2 (columns G and H) lists the free R-values obtained by using *phenix.autobuild* (without including *Rosetta* structure-modeling) to rebuild the templates placed

Table 2 Structure determinations with <i>phenix.mr_rosetta</i>								
A Structure	B Resolution (Å)	C Sequence identity (%)	D NCS ^a copies	E Starting point ^b	F <i>mr_rosetta</i> free R	G Autobuild free R (from mr_rosetta placed templates)	H Autobuild free R (from DiMaio et al. templates)	
radA intein	1.7	100	2	NMR template	0.27	0.55	0.51	
cab55348	1.9	31	1	Alignment file	0.28	0.32	0.52	
XMRV PR	2.0	30	2	Alignment file ^c	0.34	0.37	0.57	
fk4430	2.1	22	1	Alignment file	0.31	0.33	0.31	
thiod	2.1	22/15	1	Placed template	0.29	0.51	0.56	
bfr258e	2.2	19	2	Alignment file	0.30	0.29	0.29	
niko	2.5	27	2	Alignment file	0.28	0.31	0.34	
estan	2.5	18	1	Alignment file	0.28	0.55	0.55	
fj6376	2.7	21	4	Alignment file	0.30	0.30	0.30	
pc02153	2.8	29	1	Alignment file	0.44	0.45	0.54	
pc0265	2.9	29	2	Placed template	0.40	0.42	0.46	
tirap	3.0	22	1	Alignment file	0.44	0.44	0.46	
hp3342	3.2	20	1	Placed template	0.41	0.51	0.50	

The names of the structures and correspondences with the structure numbers used in [28] are those provided at http://www.phenix-online.org/phenix_data/terwilliger/rosetta_2011/ except that the structure radA intein is alternatively referred to as ag9603a

^a NCS copies is the number of copies of the molecule in the asymmetric unit of the crystal related by non-crystallographic symmetry

^b The starting point for each structure determination with *phenix.mr_rosetta* (column F) was a sequence alignment obtained with the hhpred server (http://toolkit.tuebingen.mpg.de/hhpred; [33]; indicated as "alignment file" in column E), or an NMR model (indicated with "NMR template"), or an edited template structure, placed in the correct position by Phaser [14] as used in DiMaio et al. [28]; indicated with "placed template". In column G the free R-values obtained by rebuilding the placed model from the corresponding phenix.mr_rosetta analysis with phenix.autobuild are shown. In column H the free R-values obtained by rebuilding the placed models used in DiMaio et al. [28] are shown (the phenix.autobuild runs are different and consequently the free R-values differ somewhat from those reported in [28])

^c The structure XMRV PR could be solved either automatically with phenix.mr_rosetta beginning with just the sequence alignment (in column F of this Table) or beginning with a placed symmetric dimer (as in Fig. 2). The automated phenix.mr_rosetta structure determination beginning with a sequence alignment (column F) yielded a molecular replacement solution using the dimer of 2hs1 [40] and this molecular replacement solution could be rebuilt either with (column F) or without (column G) Rosetta modeling. The symmetric dimer molecular replacement solution shown in Fig. 2 could only be rebuilt using Rosetta modeling with density (poor free R value for rebuilding with phenix.autobuild alone shown in column H)

with phenix.mr_rosetta (column G) or the templates used in DiMaio et al. [28]. Rebuilding the templates used in the previous analysis [28], with *phenix.mr_rosetta* (column H) gave results similar to those reported previously [28]. In only 4 of 13 cases did autobuilding yield free R-values of 0.42 or better. This shows the need for other approaches such as Rosetta modeling to improve these models before crystallographic autobuilding could be used.

Some of the template placements found in the molecular replacement step by phenix.mr rosetta were closer to the final structures than those used in DiMaio et al. [28]. The molecular replacement searches carried out by phenix.mr_rosetta in Table 2 (column F) were in some cases quite extensive. Some used as many as 13 starting templates. Others tested various possibilities for the number of copies in the asymmetric unit or various possibilities for the number of chains from the deposited structures used as templates in the molecular replacement search. The result of the extensive search approach can be seen from column G of Table 2, in which the templates placed by phenix.mr_rosetta were used directly in autobuilding (without the use of Rosetta). Using phenix.autobuild with these templates, 7 of the 13 structures could be determined with free R-values of 0.42 or better. This result is consistent with the known utility of extensive searches with a variety of molecular replacement templates (e.g., [12, 13].

Conclusions

The combination of structure modeling with Rosetta and crystallographic model-building techniques can substantially increase the range of templates that are suitable for molecular replacement [28]. The automated tools in phe*nix.mr* rosetta simplify the application of these combined approaches by integrating the Phenix and Rosetta algorithms and by systematically generating and evaluating models with a combination of these methods. As



demonstrated here, the *phenix.mr_rosetta* algorithms can be used to automatically determine some of the most challenging structures determined by manual combination of molecular replacement and *Rosetta*.

The *Rosetta* and *Phenix* tools available in *phe-nix.mr_rosetta* can address each of the steps in molecular replacement that can fail because of lack of a template that is close enough to the target molecule. In cases where the

Fig. 2 Models and maps for XMRV PR structure determination starting from a symmetric dimer placed by molecular replacement. An arbitrary region of the structure is shown that is generally representative of the overall maps and model. Maps are contoured at 1.5 σ. Figures generated with Coot [42]. a Placed template (*blue*) and final refined model [28, 39]; in green. The density-modified electron density map is based on refined placed template, including non-crystallographic symmetry in the density modification procedure. b Best-scoring Rosetta model (purple) created from the placed template and using the density map shown in a. The final refined model is shown in green. The averaged density-modified map created from the four best-scoring Rosetta models is shown. c Model produced by phenix.autobuild starting from the Rosetta model and averaged map shown in b

template is so different that it cannot be successfully placed in the crystallographic cell, phenix.mr_rosetta can use Rosetta modeling to improve the template. As shown above for the radA intein structure, this improvement can be sufficient to allow molecular replacement and the subsequent rebuilding. In cases where the template is similar enough to the target structure for placement of the model, but too different for model rebuilding, phenix.mr_rosetta can use *Rosetta*, along with an electron density map, to improve the placed template. This was illustrated with the XMRV PR structure determination described above. The key step in this structure determination was the slight improvement in the model obtained by Rosetta rebuilding with density. Without this improvement, the model was too poor to yield a map that is interpretable, but with it the map was improved enough to allow rebuilding. This is the essence of the combination of Rosetta modeling with crystallographic model-building. The combination allows borderline cases, which are apparently quite frequent, to be solved by incorporating some complementary information from the Rosetta modeling that moves the starting model closer to the target structure.

The approaches used in *phenix.mr_rosetta* are likely to be applicable not only to molecular replacement, as in the examples described here, but also to other situations where model rebuilding is challenging but the sequence of the model being built is known. For example, it is not uncommon for an experimental structure determination to lead to a mostly-complete model that is outside the range of convergence of current refinement procedures. This can occur if the resolution is low or if the quality of the experimental electron density map is too poor to build an accurate model. The sequence associated with the model might be known or a limited number of possibilities for sequence assignment might be obtained. In such cases phenix.mr_rosetta tools may be useful in rebuilding the models, bringing in information from structure-modeling to improve the quality of the models and the resulting electron density maps, and ultimately leading to more complete and accurate models.

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