Protocols for all-atom reconstruction and high-resolution refinement of protein-peptide complex structures

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Summary

Structural characterizations of protein-peptide complexes may require further improvements. These may include reconstruction of missing atoms and/or structure optimization leading to higher accuracy models. In this work, we describe a workflow that generates accurate structural models of peptide-protein complexes starting from protein-peptide models in C-alpha representation generated using CABS-dock molecular docking. First, protein-peptide models are reconstructed from their C-alpha traces to all-atom representation using MODELLER. Next, they are refined using RosettaFlexPepDock. The described workflow allows for reliable all-atom reconstruction of CABS-dock models and their further improvement to high-resolution models.

Keywords

protein reconstruction, coarse-grained model, protein structure, protein refinement, proteinpeptide interaction

1. Introduction

In recent years, peptides have found many successful applications as therapeutic agents and leading molecules in drug design. Consequently, there is a large interest in structural characterization of protein-peptide interactions. Unfortunately, the experimental characterization can be difficult or impossible. Thus, a variety of computational approaches have been developed for structure prediction of the protein–peptide complexes [1]. Computational, or even experimental, structure characterizations often require reconstruction of missing atoms and/or models refinement to a higher resolution. This is also the case for the CABS-dock method [2,3] – a well-established tool for protein-peptide docking.

In this chapter, we present the protocols for all-atom reconstruction of protein-peptide complexes (CABS-dock predictions) from C-alpha trace and their further refinement to higher accuracy models. The software tools used for generating protein-peptide models (CABS-dock), all-atom reconstruction (MODELLER [4]) and refinement (Rosetta FlexPepDock [5]) are shortly presented in Section 2. In section 3, we describe step by step how to use the protocols and discuss their features. Finally, we describe protocol performance on a few example cases in Section 4. The described reconstruction workflow can be applied using input models from CABS-dock, other docking protocols, or sparse experimental data. The advantage of the presented protocols over other protein reconstruction or refinement tools is that they are specifically tailored for protein-peptide complexes. For example, there are many tools that effectively rebuild atomic details from the C α -trace protein chains (a detailed overview of the available methods can be found in our most recent review [6]). However, most of them cannot be easily used to handle more than one protein chain in the reconstructed structure, and use structural template(s) of the protein backbone to enhance the reconstruction accuracy or to maintain the appropriate interface of protein-peptide interaction. With regard to structure refinement of protein-peptide complexes, the performance robustness and accuracy of the Rosetta FlexPepDock tool has been demonstrated in many studies [7–11].

Materials CABS-dock

CABS-dock [2,3] uses an efficient multiscale approach for fast simulation of peptide folding and binding, that merges modeling at coarse-grained resolution with all-atom resolution. The main feature of the CABS-dock method is global flexible docking without a priori knowledge of the binding site and the peptide conformation. However, as an option it is possible to use some knowledge about the interaction interface or peptide conformation in the form of weak distance restraints. CABS-dock is available as a web server [2] and standalone application [3]. CABSdock has been applied in numerous docking studies, including docking associated with largescale conformational transitions [12,13]. It has been also extended to modeling protocols that allow for residue-residue contact map analysis of the binding dynamics [14], prediction of protein-protein interfaces [15] and docking using fragmentary information about protein-peptide residue-residue contacts [16].

2.2. MODELLER

MODELLER is a program for comparative modeling of protein structures by satisfaction of spatial restraints [4]. The restraints are given as a set of geometrical criteria, which are used to calculate the locations of all non-hydrogen atoms in the protein structure. Smart integration of various MODELLER modules and tailored definition of additional restraints facilitate many other tasks, such as *de novo* modeling of loops, structure refinement, energy optimization or simple all-atom reconstruction from coarse-grained models and addition of hydrogen atoms [17,18].

The required input is an alignment of the query amino acid sequence with known template structures and the corresponding structures data in PDB format. The optional input is a starting structure, e.g. obtained as a result of coarse-grained modeling. The initial structure and templates have to contain at least alpha carbons, but in comparison with all-heavy-atom templates this loses homology information, such as backbone atom distances and side chain dihedrals. The

position of a selected type of atoms (e.g. $C\alpha$) or chain fragment can be frozen during modeling if necessary.

The MODELLER software is available free of charge to academic use, but a license key valid for a term of 5 years is required. The license key and the software package can be obtained from the website <u>https://salilab.org/modeller/</u>. MODELLER is a command-line only tool and runs on most Unix/Linux systems, Windows, and MacOS. The MODELLER commands are usually provided in a Python script. The user should have basic skills in Python language scripting, but many useful examples of task-dedicated scripts can be found in the *examples* directory.

2.3. Rosetta FlexPepDock

FlexPepDock is a high-resolution refinement protocol for modeling of protein-peptide complexes developed within Rosetta framework [19]. FlexPepDock usually requires an approximate pre-defined localization of the binding site. It uses the Monte Carlo-with-minimization approach (MCM) to optimize the rigid body orientation of the peptide, including full flexibility of peptide backbone as well as all receptor side chains. The FlexPepDock is highly effective if the initial peptide conformation is located within 5Å backbone RMSD from the target conformation [5].

The required input is an initial structure of protein-peptide complex. As optional input a reference structure of the protein-peptide complex, such as the native bounded structure, can be provided for RMSD calculations and evaluation of convergence. The initial structure of the complex needs to provide all heavy backbone atoms, including C β . The receptor chain coordinates should appear before the peptide coordinates.

The software is available free of charge to academic use, after signing licensing agreement to download the package (https://www.rosettacommons.org/software/license-and-Rosetta download). Rosetta FlexPepDock available via is also а web server at http://flexpepdock.furmanlab.cs.huji.ac.il/.

3. Methods

Figure 1 presents the reconstruction and refinement scheme described in this work. The scheme uses ca2all script based on the MODELLER [20] and FlexPepDock [11] protocol.



Figure 1. Pipeline of all-atom reconstruction (A) and refinement (B) of protein-peptide complexes. The coarse-grained CABS-dock docking procedure provides n (default n = 10) Catraces of top-scoring complex structures. The atomic details for each of these models can be reconstructed using the ca2all.py script based on the MODELLER software. Optionally, the receptor can be replaced by, e.g. the free receptor structure (see the section 4). After removal of clashes in the receptor (using the FlexPepDock prepack protocol), final refinement (using the FlexPepDock refine protocol) is performed. This should include at least 200 independent refinement trajectories (N = 200 optimization runs), of which the top K are extracted and further analyzed (usually K = 10).

3.1. Reconstruction of all-atom representations from C-alpha traces using MODELLER

The CABS-dock standalone package [3] offers automatic reconstruction of top-scored models from C α -trace to atomic resolution using the *ca2all.py* script (available from our

repository: https://bitbucket.org/lcbio/ca2all/) based on the MODELLER [20] software. Note that CABS-dock releases 0.9.15 and earlier use previous versions of *ca2all.py* script, which may lack some of the functionalities described below.

In order to rebuild top-scored models use the *--aa-rebuild* (or *-A*) command-line CABS-dock flag, as in the example below.

USAGE:

\$ CABSdock – i protein-pdb-code – p peptide-sequence:peptide-secondary-structure -A

\$ CABSdock –i 2FVJ:A	-p HKLVQLLTT	Т:СННННННСС -А
OUTPUT:	Is default?	description
 model.pdb 	YES	output all-atom protein-peptide complex structure

Note that the *ca2all.py* requires MODELLER to be installed. The program offers comprehensive reconstruction and refinement options, as well as some additional user-friendly (fancy) options:

INPUTS	5:	Is required?	Description
•	model_CA.pdb	YES	CA-trace of protein-peptide complex; CABS-dock output models in this work
•	receptor.pdb	NO	all-atom template structure of protein receptor (see description in the text)
PYTHO	N SCRIPT:		Location
٠	ca2all.py		https://bitbucket.org/lcbio/ca2all/
USAGE	:		
\$ pyt	thon ca2all.py -i model_C/	A.pdb -ii 1 -t re	eceptor.pdb -o output.pdb -n 1 -v -k
OPTIO	NS	Is required?	Description
-i NAME -ii NUM	E 	YES NO	input-pdb, input PDB file with CA-trace (initial) structure index-of-model, index of model to be rebuilt; default NUM = 1 and means first model, 0 – all models
-t NAM	E	NO	template-pdb, input PDB file of all-atom receptor structure
-o NAM -m NUN	lE Λ	YES NO	output-pdb, output PDB file with rebuilt complex structure modeller-iterations, number of models generated by
		NO	modeller; default NUM=1
-v -k		NO	add-hydrogens, add hydrogen atoms to final all-atom structure; default False
OUTPU	JT:	Is default?	Description
٠	output.pdb	NO	output PDB file with rebuilt complex structure (PDB)

The procedure uses an *automodel()* class to build one or more (--*modeller-iterations, -m* option) comparative models based on the CABS-dock-provided final C α -trace. Note that protein conformations generated by coarse-grained modeling may exhibit some unphysical distortions [21]. This is also the case of the CABS-dock C-alpha trace models obtained from CABS coarse-grained protein model [21]. Those distortions may be not well tolerated by a reconstruction algorithm, since it is not always trivial to keep the desired global topology while maintaining a sound local atomic geometry. We address this issue using appropriate template structures. Based on these, MODELLER creates a set of restraints (mainly distances and angles using heavy atoms and topology). The more detailed the template structure is, the more restrains are provided. For this reason, the reconstruction procedure can use as a template not only the final C α -chain (from CABS-dock, referred to as *initial*) but also the known all-atom structure of the receptor (referred to as *template*). At the same time, the local geometry of the main chain and the orientation of the side chains for the receptor can be significantly improved by more accurate restraints from the *template* (unpublished results).

The final structure (including alpha carbon atoms) is optimized with the variable target function method with conjugate gradients and refined using molecular dynamics with simulated annealing. Alpha carbon positions are frozen in the first optimization step and freed in the second. By default, the structure returned by *ca2all.py* contains all heavy atoms only, but using the *--add-hydrogens* (or *-k*) option will ensure the addition of hydrogen according to geometric criteria (with heavy atoms unchanged). Receptor structures containing chain breaks are not an obstacle to CABS-dock modeling. If a complete sequence of protein is provided, it is possible to rebuild the missing part of the structure using script *rebuild_loops.py*, which is publicly available in our repository (https://bitbucket.org/lcbio/ca2all/).

Using the *ca2all.py* reconstruction protocol it is also possible to reconstruct selected models from the CABS-dock trajectory. By default, this is always the first model in the file, but the *--index-of-model* (or *-ii NUM*) option enables user selection of other models, by specifying *NUM*, the model index (*NUM*=0 means that all models from the trajectory will be processed). If the trajectory is large and you would like to speed up calculations, use our script *divide_tra* (available from our repository: <u>https://bitbucket.org/lcbio/ca2all/</u>) that divides the trajectory file into smaller ones and run them parallel on multiple cores.

3.2. Refinement of CABS-dock models using Rosetta FlexPepDock

CABS-dock models can be improved by additional structure refinement using FlexPepDock protocol. For the refinement of an individual protein-peptide complex, one can use the online server (available at: http://flexpepdock.furmanlab.cs.huji.ac.il/). Here we will present a variant using the standalone version, *i.e.*, a locally installed Rosetta package. Note that Rosetta is written in c++ and needs to be compiled. Detailed description of compilation on different systems can be found at *https://www.rosettaccommons.org/docs/latest/build_documentation/Build-Documentation*. After successful installation, some useful scripts for input preparation or results analysis can be found in the directory: ~/Rosetta/tools/protein_tools/scripts/. Some of them needed in this pipeline, such as *clean_pdb.py* are described below. The executables of the applications for Rosetta protocols, here *FlexPepDocking* or *extract_pdbs*, can be found in the velocity, and the database is located in ~/Rosetta/main/databa,e/. In this section we describe how to prepare input files, refine the structure using FlexPepDock and evaluate the results.

Prepare an initial complex structure: FlexPepDock protocol requires as input a structure of the protein-peptide complex that includes at least all heavy atoms of the backbone and beta carbon atoms. Coarse-grained CABS-dock models reconstructed to all-atom representation using the MODELLER satisfy this criterion. If CABS-dock models reconstructed with MODELLER contain local structure distortions, replacing the receptor with the experimental structure of the unbound receptor conformation may be helpful (see Discussion in Section 4).

FlexPepDock requires keeping the proper order of coordinates in the file: first the chains of the receptor, then the peptide. It is recommended to keep only the "ATOM" section, although other molecules can be kept if needed (see the Rosetta tutorial "<u>prepare ligand tutorial</u>"). An effective method is to use the Rosetta *clean_pdb.py* script, which prints the selected chains in the desired order. The Rosetta refinement protocol only requires the initial structure of the complex, but additional information can also be used if available. The unbound receptor structure is an additional source of rotamers to side chains packing, and the native protein-peptide structure can be used as a reference for the evaluation of refinement results.

INPUT	5:	Is required?	description
•	initial_complex.pdb	YES	top-scoring CABS-dock model in all-atom representation
ROSET	TA SCRIPT:		location
٠	clean_pdb.py		~/Rosetta/tools/protein_tools/scripts/clean_pdb.py
USAGE	:		
\$~/F	Rosetta/tools/protein_tools/	scripts/clean_	_pdb.py model.pdb receptor_chain_id peptide_chain_id
OUTPL	JT:	Is default?	description
		VEC	initial as we also started on white a second such as a final second

model_AB.pdb YES initial complex structure with proper order of chains

Prepack the initial complex structure: Note that the final Rosetta score (*total_score*) takes into account not only the interactions of the protein-peptide interface but also the energy of internal interactions in each monomer. The initial structure of the protein-peptide complex may contain local distortions, especially side chain clashes or backbone distortions in the receptor structure that will result in high Rosetta's energy penalties and will not reliably identify best refined models. In order to avoid the effects of non-uniform conformational background in non-interface regions, Rosetta repacking with the *-flexpep_prepack* flag is recommended. If several models are generated from a specific starting model, it is suggested to use the same prepacked structure as starting point. In Section 4, we describe a modeling option in which we replace protein receptor coordinates in CABS-dock models with experimentally determined unbound receptor structures (see Note 1 and Section 4). This can be helpful if distortions at the backbone level occur that are not removed by side chain repacking.

INPUTS:	Is required?	description
 model_AB.pdb 	YES	initial protein-peptide complex structure
ROSETTA PROTOCOL:		location
• FlexPepDocking		~/Rosetta/main/source/bin/FlexPepDocking
USAGE:		

** ~Rosetta/main/source/bin/FlexPepDocking.linuxgccrelease* @prepack.flagfile

FLAGFILE (prepack.flagfile)	Is required?	description
-database /Rosetta/main/database	YES	Rosetta database location
-s model_AB.pdb	YES	initial protein-peptide complex structure
-ex1	YES	extra rotamers for chi1 angles (side chain packing)
-ex2aro	YES	extra rotamers for aromatic chi2 angles

-use_in	put_sc	YES	extra rotamers from initial structure of complexes							
-unboundrot receptor.pdb		NO	add the position-specific rotamers of the specified structure to the rotamer library (this is helpful when they are not represented well by the rotamer library)							
-nstruc	t 1	YES	create one pre-packed output structure							
-scorefi	ile prepack_score.sc	YES	name of the output scorefile							
-flexpep_prepack		YES	flag for running FlexPepDock prepack							
-flexpe	p_score_only	YES	adds FlexPepDock specific scores to scorefile							
OUTPU	т:	Is default?	description							
•	prepack_score.sc model_prepacked.pdb	NO YES	scorefile containing an energy description (SCOREFILE) pre-packed protein-peptide complex structure (PDB)							

Refine the prepacked complex structure: FlexPepDock refinement protocol uses an iterative Monte Carlo with energy minimization scheme to optimize the position of the peptide backbone relative to the receptor and the orientation of the side chains in the interaction interface. It is recommended to generate at least 200 of refined models (*-nstruct* flag), whereas each of them is an independent event. Additional improvement can be achieved through initial pre-optimization at the coarse-grained stage (Rosetta centroid representation) by using *-lowres_preoptimize* flag.

INPUTS:	Is required?	description
model_prepacked.pdbnative_complex.pdbub_receptor.pdb	YES NO NO	pre-packed protein-peptide complex structure known structure of protein-peptide complexes known structure of free (unbound) receptor
ROSETTA POTOCOL:		location
• FlexPepDocking		~/Rosetta/main/source/bin/FlexPepDocking

USAGE:

\$ ~/Rosetta/main/source/bin/FlexPepDocking.linuxgccrelease @refine.flagfile

FLAGFILE (refine. <i>flagfile</i>)	Is required?	description
-database / <i>Rosetta/main/database</i> -s model_prepacked.pdb -native native_complex.pdb -ex1 -ex2aro -use_input_sc -unboundrot ub_receptor.pdb -nstruct 250	YES YES NO YES YES YES NO YES	Rosetta database location initial protein-peptide complex structure reference structure for RMSD calculations extra rotamers for chi1 angles (side chain packing) extra rotamers for aromatic chi2 angles extra rotamers from initial structure of complexes extra rotamers from unbound receptor create 250 output decoys
-scorefile refine_score.sc	YES	name of the output scorefile

-out:file:silent refined.silent	YES	name of the output silent file
<pre>-out:file:silent_struct_type binary</pre>	YES	type of silent file
-pep_refine	YES	flag for running FlexPepDock refinement
-lowres_preoptimize	NO	coarse-grained optimization before all-atom refinement
-flexpep_score_only	YES	adds FlexPepDock specific scores to scorefile
OUTPUT:	Is default?	description
 refine_score.sc refined.silent	YES YES	scorefile containing an energy description (SCOREFILE) refined protein-peptide complex structure (SILENT)

Analysis of refinement results: The refined output models are saved to a file (-out:file:silent flag). The silent file is a Rosetta output format that is used to store compressed ensembles of structures. Each frame in a silent file has a unique identifier, which is called the decoy-tag. The unique decoy-tag is located at the end of each line that belongs to the respective frame and enables to identify and extract selected frames. The second output file is a score file (-scorefile flag) that contains the energy description of each of the output models and various root-mean-square deviation (RMSD) parameters in relation to reference complex structure (if provided) or to initial complex structure. This file allows to analyse the energy landscape sampled during the refinement procedure (by ploting score vs. rmsd), or select top-best models (sorted according to Rosetta energy criterion). To evaluate FlexPepDock refinement results it is recommended to use interface_score (I_{sc}), reweighted_score ($reweighted_{sc}$, the weighted sum of total score, I_{sc} and pep_{sc}) rather than the total score $rmsBB_if$ (peptide backbone interface RMSD). Selected top-scoring models can be extracted into pdb format by using Rosetta extract_pdbs protocol.

SCORE:	score	 reweighted_sc	 I_sc	 pep_sc	 rmsBB_if	 decription
SCORE:	-141.009	 -117.833	 6.454	 16.722	 4.117	 model_refined_0001
SCORE:	-215.024	 -199.562	 4.598	 10.864	 2.006	 model_refined_0155

Example of sorting refined decoys by *reweighted_sc* and selecting 10 top-scoring models

INPUTS:	Is required?	description
• refine_score.sc	YES	score file
OUTPUT:	Is default?	description
• top10-tags	NO	10 top-scoring models

INPUTS	5:	Is required?	descriptionselected decoy-tag for 10 top-scoring models
•	top10-tags	YES	selected decoy-tag for 10 top-scoring models
ROSET	TA PROTOCOL:		location
٠	extract_pdbs		~/Rosetta/main/source/bin/extract_pdbs
USAGE	:		
\$~/F	Rosetta/main/source/bin/ext -in:file:silent refined.sile	ract_pdbs.linu ent -in:file	xgccrelease e:tagfile top10-tags
OUTPL	IT:	Is default?	description
•	model_refined_0010.pdb	YES	separtate PDB file for each of 10 models

Example of extracting PDB coordinates for selected decoy-tags

4. Case Studies

We detail here the implementation and results of the above described protocol for the atomic reconstruction and refinement. The starting point are CABS-dock predictions of four different protein-peptide complexes from our previous study by Blaszczyk et al. [16]. For each proteinpeptide complex, we reconstructed 10 top-scored CABS-dock models to all-atom structure using the *ca2all* script. Next, in each reconstructed model we replaced the receptor structure with the unbound receptor structure (see Note 1). Note that this is an optional step in the reconstruction and refinement procedure described in this work. Introduction of conformational flexibility in the receptor can be important to identify binding sites in cases where the receptor changes considerably upon binding. However, introduction of conformational flexibility might also lose features of the receptor that are crucial to allow the high-resolution step to identify the native conformation among other false positive minima in the energy landscape. Thus, by replacing the receptor with the solved structure of the unbound receptor conformation, we allow both the detection of cryptic binding sites in the first step, and the refinement starting from an informative crystal structure in the second step. The peptide coordinates were taken directly from CABSdock modeling. In order to remove all possible internal clashes and to create a uniform energy background, the receptor unbound structure was prepacked using the Rosetta -flexpep_prepack protocol. Prepacking was performed once, and the same receptor structure was used for all simulations. Finally, each resulting model was further refined with the FlexPepDock refinement protocol, and the 10 top-scored models were selected for quality assessment. Figure 2 shows

comparison of the top-scoring refined model with CABS-dock models and experimental reference structures. As presented in the Figure, FlexPepDock refinement can significantly improve the modeling accuracy to sub-Ångstrom level, as measured by i-RMSD (interface root mean square deviation from the reference experimental structure). Motivated by these promising results we are now applying this protocol on large and representative benchmark set.



Figure 2. Comparison of CABS-dock models before and after FlexPepDock refinement, to experimental structures. The figure presents four example cases of protein-peptide complexes (1N7E, 209S, 2AM9 and 2QHN). For each complex, only peptide conformations are shown (after superimposition of the receptor structures). Reference experimental structures are shown in pink, CABS-dock models before refinement in blue and after in green. The numbers in the corresponding colors indicate i-RMSD values.

5. Notes

Note 1. In order to replace the structure of receptor, you should first align the CABS-dock model of the complex and the unbound receptor using, e.g., Theseus[22] (or PyMOL):

INPUTS:	Is required?	Description
model_AB.pdbunbound.pdb	YES YES	selected decoy-tag for 10 top-scoring models CABS-dock (all-atom) protein-peptide complex structure known structure of free receptor

Theseus:		download					
• theseus		https://theobald.brandeis.edu/theseus/					
USAGE:							
\$ these us $-s0-120 - o \mod AB$.	.pdb unboun	d.pdb	# -s option is the receptor residues selection				
OUTPUT:	Is default?	description					
• theseus_sup.pdb	YES	unbound recept	or superposed on CABS-dock receptor				

In the next step you need to cut the peptide coordinates from the *model_AB.pdb* file, which is possible using the already known Rosetta *clean_pdb.py* script and then add peptide to the free receptor *theseus_sup.pdb* file.

USAGE:								
\$	~/Rosetta/tools/protein_tools/	scripts/clean_	pdb.py model_AB.pd	lb B	# cut peptide (chain B)			
\$	cat theseus_sup.pdb model_AB_B.pdb > model.pdb			# paste unbound receptor and peptide				
οι	TPUT:	Is default?	description					
	• model.pdb	YES	free receptor and CA	BS-dock mode	eled peptide			

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References

- Ciemny, M.; Kurcinski, M.; Kamel, K.; Kolinski, A.; Alam, N.; Schueler-Furman, O.; Kmiecik, S. Protein–peptide docking: opportunities and challenges. *Drug Discov. Today* 2018, *23*, 1530–1537, doi:10.1016/j.drudis.2018.05.006.
- 2. Kurcinski, M.; Jamroz, M.; Blaszczyk, M.; Kolinski, A.; Kmiecik, S. CABS-dock web server for the flexible docking of peptides to proteins without prior knowledge of the binding site. *Nucleic Acids Res.* **2015**, doi:10.1093/nar/gkv456.
- Kurcinski, M.; Ciemny, M. P.; Oleniecki, T.; Kuriata, A.; Badaczewska-Dawid, A. E.; Kolinski, A.; Kmiecik, S. CABS-dock standalone: a toolbox for flexible protein-peptide docking. *Bioinformatics* 2019, doi:10.1093/bioinformatics/btz185.
- 4. Webb, B.; Sali, A. Comparative protein structure modeling using MODELLER. *Curr. Protoc. Bioinforma.* **2016**, *54*, 5.6.1-5.6.37, doi:10.1002/cpbi.3.
- 5. Raveh, B.; London, N.; Schueler-Furman, O. Sub-angstrom modeling of complexes between flexible peptides and globular proteins. *Proteins Struct. Funct. Bioinforma.* **2010**, *78*, 2029–40, doi:10.1002/prot.22716.

- 6. Badaczewska-Dawid, A. E.; Kolinski, A.; Kmiecik, S. Computational reconstruction of atomistic protein structures from coarse-grained models. *Comput. Struct. Biotechnol. J.* **2019**.
- Alam, N.; Goldstein, O.; Xia, B.; Porter, K. A.; Kozakov, D.; Schueler-Furman, O. High-resolution global peptide-protein docking using fragments-based PIPER-FlexPepDock. *PLoS Comput. Biol.* 2017, 13, e1005905, doi:10.1371/journal.pcbi.1005905.
- Alam, N.; Schueler-Furman, O. Modeling peptide-protein structure and binding using monte carlo sampling approaches: Rosetta flexpepdock and flexpepbind. In *Methods in Molecular Biology*; 2017.
- 9. Marcu, O.; Dodson, E. J.; Alam, N.; Sperber, M.; Kozakov, D.; Lensink, M. F.; Schueler-Furman, O. FlexPepDock lessons from CAPRI peptide–protein rounds and suggested new criteria for assessment of model quality and utility. *Proteins Struct. Funct. Bioinforma.* **2017**, *85*, 445–462, doi:10.1002/prot.25230.
- Liu, T.; Pan, X.; Chao, L.; Tan, W.; Qu, S.; Yang, L.; Wang, B.; Mei, H. Subangstrom accuracy in pHLA-I modeling by rosetta FlexPepDock refinement protocol. *J. Chem. Inf. Model.* 2014, 54, 2233–42, doi:10.1021/ci500393h.
- 11. London, N.; Raveh, B.; Cohen, E.; Fathi, G.; Schueler-Furman, O. Rosetta FlexPepDock web server - High resolution modeling of peptide-protein interactions. *Nucleic Acids Res.* **2011**, *39*, W249-53, doi:10.1093/nar/gkr431.
- 12. Blaszczyk, M.; Kurcinski, M.; Kouza, M.; Wieteska, L.; Debinski, A.; Kolinski, A.; Kmiecik, S. Modeling of protein-peptide interactions using the CABS-dock web server for binding site search and flexible docking. *Methods* **2016**, doi:10.1016/j.ymeth.2015.07.004.
- 13. Ciemny, M. P.; Debinski, A.; Paczkowska, M.; Kolinski, A.; Kurcinski, M.; Kmiecik, S. Proteinpeptide molecular docking with large-scale conformational changes: The p53-MDM2 interaction. *Sci. Rep.* **2016**, *6*, doi:10.1038/srep37532.
- 14. Ciemny, M. P.; Kurcinski, M.; Kozak, K.; Kolinski, A.; Kmiecik, S. Highly flexible protein-peptide docking using cabs-dock. *Methods Mol. Biol.* **2017**, *1561*, 69–94, doi:10.1007/978-1-4939-6798-8_6.
- 15. Ciemny, M. P.; Kurcinski, M.; Blaszczyk, M.; Kolinski, A.; Kmiecik, S. Modeling EphB4-EphrinB2 protein-protein interaction using flexible docking of a short linear motif. *Biomed. Eng. Online* **2017**, doi:10.1186/s12938-017-0362-7.
- 16. Blaszczyk, M.; Ciemny, M. P.; Kolinski, A.; Kurcinski, M.; Kmiecik, S. Protein–peptide docking using CABS-dock and contact information. *Brief. Bioinform.* **2018**, *bby080*, doi:10.1093/bib/bby080.
- 17. Martí-Renom, M. A.; Stuart, A. C.; Fiser, A.; Sánchez, R.; Melo, F.; Sali, A. Comparative protein structure modeling of genes and genomes. *Annu. Rev. Biophys. Biomol. Struct.* **2000**, *29*, 291–325, doi:10.1146/annurev.biophys.29.1.291.
- 18. Fiser, A.; Do, R. K. G.; Šali, A. Modeling of loops in protein structures. *Protein Sci.* **2000**, *9*, 1753–73, doi:10.1110/ps.9.9.1753.
- 19. Leaver-Fay, A.; Tyka, M.; Lewis, S. M.; Lange, O. F.; Thompson, J.; Jacak, R.; Kaufman, K.; Renfrew,

P. D.; Smith, C. A.; Sheffler, W.; Davis, I. W.; Cooper, S.; Treuille, A.; Mandell, D. J.; Richter, F.; Ban, Y. E. A.; Fleishman, S. J.; Corn, J. E.; Kim, D. E.; Lyskov, S.; Berrondo, M.; Mentzer, S.; Popović, Z.; Havranek, J. J.; Karanicolas, J.; Das, R.; Meiler, J.; Kortemme, T.; Gray, J. J.; Kuhlman, B.; Baker, D.; Bradley, P. Rosetta3: An object-oriented software suite for the simulation and design of macromolecules. *Methods Enzymol.* **2011**, *487*, 545–74, doi:10.1016/B978-0-12-381270-4.00019-6.

- 20. Fiser, A.; Šali, A. MODELLER: Generation and Refinement of Homology-Based Protein Structure Models. *Methods Enzymol.* **2003**, *374*, 461–91, doi:10.1016/S0076-6879(03)74020-8.
- 21. Kmiecik, S.; Gront, D.; Kolinski, M.; Wieteska, L.; Dawid, A. E.; Kolinski, A. Coarse-Grained Protein Models and Their Applications. *Chem. Rev.* **2016**, *116*, doi:10.1021/acs.chemrev.6b00163.
- 22. Theobald, D. L.; Wuttke, D. S. THESEUS: Maximum likelihood superpositioning and analysis of macromolecular structures. *Bioinformatics* **2006**, *22*, 2171–2172, doi:10.1093/bioinformatics/btl332.