Review

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Computational studies of the mitochondrial carrier family SLC25. Present status and future perspectives

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Abstract: The members of the mitochondrial carrier family, also known as solute carrier family 25 (SLC25), are transmembrane proteins involved in the translocation of a plethora of small molecules between the mitochondrial intermembrane space and the matrix. These transporters are characterized by three homologous domains structure and a transport mechanism that involves the transition between different conformations. Mutations in regions critical for these transporters' function often cause several diseases, given the crucial role of these proteins in the mitochondrial homeostasis. Experimental studies can be problematic in the case of membrane proteins, in particular concerning the characterization of the structure-function relationships. For this reason, computational methods are often applied in order to develop new hypotheses or to support/explain experimental evidence. Here the computational analyses carried out on the SLC25 members are reviewed, describing the main techniques used and the outcome in terms of improved knowledge of the transport mechanism. Potential future applications on this protein family of more recent and advanced in silico methods are also suggested.

Keywords: membrane proteins; mitochondrial carrier family; molecular dynamics; protein structure modelling; solute carrier family 25.

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Introduction

Mitochondria and cytosol are involved in many metabolic processes that require the import/export of fundamental molecules (e.g., adenosine diphosphate (ADP), adenosine triphosphate (ATP), and phosphate for oxidative phosphorylation, substrates for the citric acid cycle, for fatty acid oxidation, for mitochondrial replication, etc.) [1]. Due to the impermeable nature of the inner membrane, only a few neutral molecules (such as O₂ and CO₂) can cross the mitochondrial membranes without protein mediation. The transport of a variety of metabolites, nucleotides, and cofactors through the inner mitochondrial membrane is performed by a family of membrane transporters known as mitochondrial carrier family (MCF) or solute carrier family 25 (SLC25). This family includes solute transporters, such as the mitochondrial tricarboxylate transport protein (SLC25A1) [2], the ADP/ATP translocase (SLC25A4) [3] and the carnitine–acylcarnitine carrier (SLC25A20) [3]. Although big efforts have been made to characterize this protein family (Table 1), a fifth of them still does not have a known function (SLC25A16, SLC25A25, SLC25A34, SLC25A35, SLC25A39, SLC25A40, SLC25A43, SLC25A45, SLC25A46, SLC25A48, SLC25A49, SLC25A50, and SLC25A53).

All MCs have common structural characteristics. different from those of any other SLC family member. The structural feature that makes their identification unequivocal is the presence of three homologous domains repeated in tandem, of about 100 amino acids in length. Each one contains two hydrophobic regions, separated by a large hydrophilic sequence. In detail, the structure is composed of six transmembrane α -helices (H1 to H6), linked by three short α -helices (h12, h34 and h56) on the matrix side, forming a funnel-shaped structure with the cavity open towards the cvtosol and closed on the side of the matrix. Proline residues of the conserved Px[DE]xx[RK] signature motifs make contact with the odd numbered transmembrane α -helices, while the charged residues of these motifs form an interhelices salt bridges network that closes the cavity on the matrix side. When the internal cavity is open towards the cytosol, the transporter is in the cytoplasmic state (c-state) conformation

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Table 1: SLC25 transporters known substrates, based on biochemical studies.

Approved symbol	Transported substrates	References
SLC25A1	Citrate, isocitrate, malate, phospho- enolpyruvate, and <i>cis</i> -aconitate.	[2, 4, 5]
SLC25A2	Histidine, homoarginine, mono- methylarginine, and asymmetric dime- thylarginine (ADMA).	[6]
SLC25A3	Phosphate, H⁺, OH⁻, copper.	[7, 8]
SLC25A4	adenosine triphosphate (ATP), adeno- sine diphosphate (ADP), H ⁺ .	[9, 10]
SLC25A5	ATP, ADP.	[10]
SLC25A6	ATP, ADP.	[11]
UCP1	H ⁺ .	[12]
(SLC25A7)		
UCP2	Fatty acids. H ⁺ , malate, oxaloacetate.	[13, 14]
(SLC25A8)	aspartate, malonate, sulfate, and	[,]
LICP3	H ⁺	[15]
(SI (25A9)		[10]
SLC25A10	Malonate, malate, succinate, phosphate, sulfate, sulfite, thiosulfate, and glutathione.	[16–18]
SLC25A11	Oxoglutarate, malate, oxaloacetate, and glutathione.	[18–20]
SLC25A12	Glutamate, H ⁺ , aspartate,	[21]
SLC25A13	Glutamate, H^+ , aspartate.	[22]
SLC25A14	Sulfate, sulfite, thiosulfate, phosphate,	[23]
(UCP5)	and dicarboxylates.	1 - 1
SLC25A15	Ornithine, lysine, arginine, and citrulline.	[24]
SLC25A17	Coenzyme A (CoA), flavin adenine dinu- cleotide (FAD), flavin mononucleotide (FMN), adenosine monophosphate (AMP), nicotinamide adenine dinucleo- tide (NAD ⁺), adenosine 3',5'-diphosphate (PAP), ADP.	[25]
SLC25A18	Glutamate, H⁺.	[26]
SLC25A19	Thiamine pyrophosphate.	[27]
SLC25A20	Carnitine, acylcarnitine.	[28]
SLC25A21	2-oxoadipate, 2-oxoglutarate, adipate, glutarate, pimelate, 2-oxopimelate, 2-aminoadipate, oxaloacetate, and citrate.	[29]
SI C25A22	Glutamate, H ⁺ .	[26]
SLC25A23	ATP. ATP-Mg. ADP. AMP. and phosphate.	[30]
SI C25A24	ATP. ATP-Mg. ADP. AMP. and phosphate.	[30]
SI C25A26	S-adenosylmethionine.	[31]
SLC25A27	H ⁺ .	[32]
(UCP4)		[]
SLC25A28	Fe.	[33]
SLC25A29	Arginine, lysine, homoarginine, methyl-	[34]
SLC25A30	Sulfate, sulfite, thiosulfate, phosphate,	[23]
(UCP6)	and dicarboxylates.	
SLC25A31		[35]
SLC25A32	Folate.	[36, 37]

Table 1: (co	ontinued
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Approved symbol	Transported substrates	References
SLC25A33	Uracil, thymine, guanine, and cytosine (deoxy)nucleoside di- and triphosphates.	[38]
SLC25A36	Uracil, thymine, guanine, and cytosine (deoxy)nucleoside di- and triphosphates.	[38]
SLC25A37	Fe.	[33]
SLC25A38	Glycine.	[39]
SLC25A41	ATP-Mg, phosphate.	[40]
SLC25A42	Coenzyme A, dephospho-CoA, ADP, and adenosine 3′,5′-diphosphate.	[41]
SLC25A44	Valine, leucine, and isoleucine.	[42]
SLC25A47	H⁺.	[43]
SLC25A51	NAD ⁺ .	[44]
SLC25A52	NAD ⁺ .	[44]

[45]. On the contrary, the charged residues of another motif [FY][DE]xx[RK] are responsible for a salt bridges network on the "cytoplasmic" side of the protein. It is assumed that, during a catalytic transport cycle, the alternating formation of the above salt bridges networks determines the MCs' transition from the c-state to a state with the cavity open to the matrix (the m-state). Therefore the central cavity is alternatively accessible to the substrate from the intermembrane space or the matrix (Figure 1) [45].

Mutations, insertions, and deletions in the sequence of these transporters often cause numerous diseases affecting 25] the metabolism or the energy production of the mitochondria (Table 2) [46]. Most of the missense mutations detected in patients suffering from MCs related diseases correspond to those regions of the transporters that are vital for their function [47]. For example, it is essential for the proper functioning of the transporter that no mutations occur at the substrate binding site or near the matrix/ cytosolic gate [1]. On the other hand, almost all positions corresponding to residues in contact with the lipid bilayer, as well as most of those participating in inter-helices interactions, tolerate substitution with cysteine or alanine [1].

The study of membrane proteins through experimental approaches can be nontrivial. In this regard, given the recent rise in terms of computational power and the development of newer and more efficient techniques, in silico studies can help to understand experimental observations or propose new mechanistic theories. Here, computational analyses of the SLC25 family members are reviewed. Furthermore, new in silico approaches are also discussed, in order to provide a future perspective on the potential application of innovative simulation techniques to the study of this family of transporters.



Mitochondrial matrix

Computational methods for membrane proteins analysis

In the absence of experimental data, the amino acid sequence of a protein represents the starting point for analyses aimed at understanding its structure and function. Multiple sequence alignments (MSAs) of protein sequences (e.g., proteins of a given family) can help to identify conserved motifs important for molecular function, or they could highlight critical differences due to divergence in the mechanism of action or substrate specificity. In the case of membrane proteins, the sequence can also tell us how and how many times the protein backbone crosses the bilayer membrane. Several web-servers, such as TOPCONS [48], are able to predict the topology of the protein and the presence of signal peptides, allowing to better understand the spatial organization of the protein's residues. Obviously, atomic coordinates are far more useful but often really hard to obtain.

The huge amount of data derived from annotated protein sequences and structures are now important resources used to model with great accuracy the threedimensional structure of proteins not yet solved. These approaches are divided in comparative (by homology) modeling and template-free modeling. While the first category is based on the sequence similarity between two proteins (for one of which the three-dimensional structure is known), the second can be used to build a protein's structural model from scratch. The most used comparative modeling software is MODELLER [49], where the choice of Figure 1: Representation of the cytoplasmic and matrix state of the mitochondrial carriers.

For the cytoplasmic state, the bovine ATP/ ADP carrier structure (PDB ID: 10KC) is depicted [3]; for the matrix state, the Thermothelomyces thermophilus ATP/ADP carrier structure (PDB ID: 6GCI) is shown [85]. Residues belonging to the matrix motif [P]x[DE]xx[RK] and involved in the matrix network salt bridges are shown as sticks and highlighted with green circles; residues belonging to the cytoplasmic motif [FY]x[DE] xx[RK] and involved in the cytoplasmic network salt bridges are shown as sticks and highlighted with yellow circles. This figure and the following ones have been drawn using UCSF Chimera molecular graphics software [177].

one or more suitable templates is crucial for the production of reliable results. The template structure should display at least a 30% sequence identity with the target (the protein to be modeled) and the resolution should not be above 3.5 Å [50, 51]. Historically, the I-TASSER software was the most used one for template-free modeling, this being one of the best web servers for modeling in terms of accuracy and performance [52, 53]. However, machine learning and deep learning algorithms have recently been used, which allow to achieve results never seen before (for further details about these modeling techniques see Section Structural modeling) [50]. Both the comparative and the template-free approaches resulted to be valid also for transmembrane proteins.

Once the structure is available, molecular dynamics (MD) simulations can be performed; allowing the system to explore several configurations by solving Newton's laws of motion according to interatomic forces calculated using a molecular force field [54]. With this technique, it is possible to analyze details of the conformational landscape of macromolecules that cannot be easily studied with wet lab experiments. In order to simulate membrane proteins, these must be embedded in a membrane bilaver that mimics their real molecular environment. The web-server CHARMM-GUI significantly helps users to accomplish such a task and it provides a large amount of different lipid types to build realistic biological membranes [55]. An extensive description about the setup of membrane proteins simulations can be found here [56, 57]. However, biologically relevant rare events, such as ligand binding or conformational transitions, are often very difficult to sample during atomistic simulations. Thus, several additional simulation

 Table 2: Diseases associated with SLC25 transporters, based on the Online Mendelian Inheritance in Man (OMIM) database annotations.

Approved symbol	Phenotype	References
SLC25A1	Combined D-2- and L-2-hydroxyglutaric aciduria	[110, 111]
	Myasthenic syndrome, congenital, 23, presynaptic	[112–114]
SLC25A3	Mitochondrial phosphate carrier deficiency	[115–117]
SLC25A4	Mitochondrial DNA depletion syndrome 12A (cardiomyopathic type) AD	[118]
	Mitochondrial DNA depletion syndrome 12B (cardiomyopathic type) AR	[119–123]
	Progressive external ophthalmoplegia with mitochondrial DNA deletions, autosomal dominant 2	[124–126]
SLC25A10	Mitochondrial DNA depletion syndrome 19*	[127]
SLC25A11	Paragangliomas 6	[128]
SLC25A12	Developmental and epileptic encepha- lopathy 39	[129, 130]
SLC25A13	Citrullinemia, adult-onset type II	[131–134]
	Citrullinemia, type II, neonatal-onset	[135–137]
SLC25A15	Hyperornithinemia-hyper-	[109, 138–
	ammonemia–homocitrullinemia syndrome	142]
SLC25A19	Microcephaly, Amish type	[143, 144]
	Thiamine metabolism dysfunction syn- drome 4 (progressive polyneuropathy	[144]
	type)	
SLC25A20	Carnitine–acylcarnitine translocase deficiency	[145–152]
SLC25A21	Mitochondrial DNA depletion syndrome 18*	[153]
SLC25A22	Developmental and epileptic encepha- lopathy 3	[154–156]
SLC25A24	Fontaine progeroid syndrome	[157–162]
SLC25A26	Combined oxidative phosphorylation deficiency 28	[163]
SLC25A32	Exercise intolerance, riboflavin- responsive*	[164]
SLC25A38	Anemia, sideroblastic, 2, pyridoxine- refractory	[165]
SLC25A42	Metabolic crises, recurrent, with vari- able encephalomyopathic features and neurologic regression	[166–168]
SLC25A46	Neuropathy, hereditary motor and sen- sory, type VIB	[169–172]
UCP2	Obesity, susceptibility to, BMIQ4**	[173, 174]
UCP3	Obesity, severe, and type II diabetes**	[175, 176]

*Provisional phenotype-gene relationship. **Susceptibility.

methods are being developed and applied. These can be divided in four groups: methods that take advantage of the thermal energy and fluctuations, such as replica exchange

molecular dynamics (REMD) [58]; techniques that need different conformations of the protein in order to identify a minimum free energy path between them (e.g., milestoning [58]): other techniques that also exploit the end-point states, aiming to find a free energy difference between them [59] (in general, these are more suitable for small perturbations such as ligand binding or single point mutations); and finally, methods that apply a bias potential on a set of collective variables (CVs) (e.g., dihedral angles, distances, etc.) responsible for the slowest degrees of freedom of the system, allowing the system to overcome free energy barriers. This last group includes methods such as metadynamics [60] or adaptive biasing force [61]. The above described classification concerning the use of advanced MD sampling techniques for the study of membrane proteins is thoroughly reviewed in the work of Harpole and Delemotte [62].

Computational studies of the SLC25 protein family members

In this section, an historical perspective on the computational studies of the SLC25 protein family members is reported.

Comparative sequence/structure analyses

The first hypothesis of a common substrate binding site in MCF was formulated by Robinson and Kunji, combining experimental evidence, and computational analyses [63]. This study was conducted on the Saccharomyces cerevisiae MCs, as 19 of them had been already characterized at that time. In detail, these were classified into three major subfamilies, based on the functional groups of the experimentally identified substrates: keto acids carriers, amino acids carriers, and carriers of adenine-containing substrates. The MSA alone was not sufficient to assign a function to several residues identified by evolutionary conservation. For this reason, comparative structural models of the carriers (in the c-state) were built, using the structure of the mitochondrial bovine ADP/ATP carrier (bAAC, Protein Data Bank (PDB) ID: 10KC [3]) as template. Then, the distances between the functional groups of each substrate were used to obtain positional and chemical constraints for the identification of potential binding residues.

Using this approach, some conserved residues, located in the even numbered transmembrane helices (H2, H4, and H6) of the three domains, resulted to have important correlations within their subfamilies (Figure 2).



Figure 2: Schematic representation of the three contact points.

The three contact points are highlighted in red and circled, using the bovine ATP/ADP carrier structure (PDB ID: 10KC) as reference [3]. For each contact point, a list of the corresponding residues involved in the recognition of particular ligand moieties, depending on the ligand subclass, are reported.

The residues in the first domain, collectively identified as "contact point I", were found out to discriminate between different substrates of the same class (e.g., different amino acids): basic residues [RK] are involved in carboxyl or phosphate groups recognition, acidic residues [DE] stabilize substrates' basic amino groups, aromatic residues [FY] interact with aromatic moieties and hydrophobic amino acids [ILV] are needed to form Van der Waals interactions with hydrophobic portions of the ligands.

On the contrary, the residues at the second domain, identified as "contact point II", were predicted to distinguish between different substrates classes: in the amino acid subfamily, the motif R[DE] is able to recognize the amine $(-NH_3^+)$ and carboxyl $(-COO^-)$ functional groups of the transported molecule; in the keto acid subfamily, the motif R[QHNT] interacts with the negatively charged keto group; and in the adenine nucleotide subfamily, the hydrophobic motif G [IVLM] recognizes the adenine moiety of the substrate.

Finally, the residues (generally R or K) located at the third domain ("contact point III") are able to recognize carboxyl or phosphate groups, stabilizing the substrate binding [63, 64]. The region of the protein in which all these contact points are located was defined as the common substrate binding site.

In a following work [45], sequence-based analyses of the 3-fold pseudo-symmetrical repeats showed that the subfamily's conserved asymmetric residues were all located in a central region of the transporters, colocalized with the previously described common substrate binding site. The symmetry analyses also suggested a 3-fold mechanism in which the transition, c- to m-state, occurs with a symmetric rotatory movement of the six α -helices.

Molecular dynamics and enhanced sampling simulations

Around the same years, there were also several attempts to analyze the transport process of MCs, exploiting computational techniques such as MD. In 2006, the first in silico study of the bAAC (PDB ID: 10KC [3]), was published [65]. A MD simulation of the transporter, inserted in a palmitovloleoyl-phosphatidyl-choline (POPC) bilayer membrane, allowed hypothesizing the potential role of the α -helices during the conformational changes. Notwithstanding the relatively short length of the simulation (20 ns in total), due to the limited computational resources available at that time, flexibility of the odd-numbered helices kink was pointed out through fluctuation and geometrical analyses. Three proline residues (Pro27, Pro132 and Pro229), of the conserved motif Px[DE]xx[RK], were suggested to function as hinges, critical for the movement of the helices during the transition from the c- to the m-state. Moreover, significant variations were found for the rotation angles of the even-numbered helices, and for the salt bridges connecting the transmembrane helices.

In 2008, the role of the electrostatic potential in driving the translocation of the substrate, in the AAC carrier, was investigated [66, 67]. Two papers were published, in both of which unbiased and biased MD simulations of the crystal structure of the AAC were carried out, in the presence and absence of the transported solutes ADP and/or ATP. Although in the two studies different strategies and different biased methodologies were employed, these obtained common results, pointing to a crucial role of the protein-generated electrostatic potential in attracting the negatively charged nucleotide ADP toward the bottom of the transporter. In particular, both studies identified a common interaction of the diphosphate moiety of the substrate with residues Lys22, Arg79, and Arg279; these interactions were responsible for the disruption of the matrix network salt bridges, suggesting a possible mechanism for the conformational transition.

Eight years later, due to the advances in the computational field, atomistic simulations were able to capture and describe the transition from the c- to the m-state of the AAC [68]. The structure of the human AAC was built by homology modeling using as a template the crystal structure of bAAC [3]. A biased MD approach, the well-tempered metadynamics with multiple interacting walkers [69, 70]. was used to predict the structural changes of the transporter linked to changes in free energy. The gyration radii (R_g) of three crucial regions were used as collective variables (CV); these were calculated considering the residues involved in the cytoplasmic network and aromatic gate (Rg c-gate), the substrate binding site residues (Rg center) and the matrix network residues together with the closest Pro and Gly residues (Rg m-gate). Two free energy minima were identified at the extreme values of the R_g c-gate and R_g m-gate, corresponding to the c-state and m-state conformations of the protein. Between the two minima, another free energy basin resulted to be associated with an intermediate conformation, where both the c- and m-networks are in a more closed configuration. The transition from the c- to the m-state was characterized by an activation barrier, which was reduced by the binding of ATP or ADP. Of note, the free energy minimum of the intermediate-state was deeper with the inactive nucleotides (i.e. adenosine monophosphate [AMP], guanosine triphosphate [GTP], guanosine diphosphate [GDP], and guanosine mono-[GMP]), preventing the conformational phosphate transition.

At the same time, a Markov model of the molecular kinetics [71], describing the stochastic motion of this carrier, was published [72]. This model, fitted on experimental data, confirmed that cytoplasmic and matrix networks have crucial roles for the conformational changes of the transporter. In particular, when the energy values of these networks are similar to each other and to the substrate binding energy, the energy barrier is minimized and the transport flow is maximized. Thus, the optimal binding of the substrate to the intermediate conformation would be responsible for the reduction of the energy barrier between c- and m-conformations.

A further study, aimed at describing the conformational transition, was carried out using a different biased MD

method, called Linear Response Path Following (LRPF), which allows simulating large structural changes without knowledge of the target conformation [73, 74]. In the c- to the m-state transition, packing of the cytoplasmic network residues was observed, with a large asymmetric movement of the first domain (H1–h12–H2). This was characterized by a disruption of the salt bridge between Glu29 and Arg279, whose formation had been observed by Wang and collaborators in the simulations of the translocation of ADP [66].

Recently, an extensive unbiased MD simulation (three independent 3 µs trajectories) showed highly asymmetric interactions between the residues of the matrix network in the apo c-state of AAC [75]. In particular, a Glu29–Arg279 interaction was observed, supporting the hypothesis that this salt bridge is critical for the conformational transition. Moreover, Arg30, Arg139 and Arg236 were suggested to be responsible for the stabilization of the odd-numbered helices, through the interaction with the negative electric dipole on the C-terminal ends of these helices.

Cardiolipin-AAC interactions

Noteworthy, none of the above-mentioned studies used a bilayer membrane mimicking the inner mitochondrial membrane (IMM), where SLC25 members reside. All the systems were built homogeneously using only POPC. Instead, the IMM is made up by a mix of phospholipids, the most abundant being phosphatidylcholine (PC), phosphatidylethanolamine (PE), and cardiolipin (CL) [76]. The latter is a peculiar component of this membrane with one or two negative charges, which was experimentally described to interact with and regulate the AAC transporter [77, 78].

For this reason, several groups tried to analyze the characteristics of this interaction *in silico*.

Coarse-grained (CG) and atomistic simulations were applied to investigate the binding of CL to bovine and yeast AAC (PDB ID: 10KC [3]; PDB ID: 4C9G [79]) and UCP2 (uncoupling protein 2; PDB ID: 2LCK [80]) [81]. CL molecules were predicted to bind at three different sites with the phosphate groups inserted in the cavities produced by the three short α -helices (h12, h34, and h56), in correspondence of the highly conserved [YWF][RK]G and [YF]xG motifs, consistent with what had been observed experimentally [3, 82].

These findings were confirmed by Duncan and colleagues [83], who also analysed lipid–AAC interactions performing multiscale simulations (both CG and atomistic). Of note, they observed that the residence time of CL was very peculiar, as it was significantly higher than the residence time of PC and PE. Moreover, the simulations performed by Yi and collaborators showed that the conserved CL-binding motifs [YWF] [RK]G and [YF]xG were organized in β -turn structures, responsible for the interaction and stabilization of the three Pro kink regions, but not in a symmetric manner [75].

The same group recently reported an additional computational study of the CL–AAC binding [84], in which a long simulation (13 μ s) allowed to observe a dynamic interaction in three different protein regions, previously described as binding sites. However, in one binding site the CL molecule had mostly inter-domain interactions (domain 2 and 3), while in the other two binding sites CLs mainly established intradomain interactions (domain 1 or 3). Again, these asymmetrical binding modes were consistent with their previous study [75] and it suggested a physiological relevance for the displacement of domain 1 observed in the recently solved AAC structure in the m-state [85].

These results suggest an asymmetrical behavior of the transporter, a hypothesis supported also by other MD studies [73, 86].

Future perspectives

Structural modeling

During the last years, thanks to new powerful algorithms, computational techniques for the modeling of protein structures significantly improved, as resulted also during the 13th Critical Assessment of protein Structure Prediction (CASP13), where the artificial intelligence (AI)-based method developed by DeepMind, AlphaFold, outperformed all other methods [87]. This is a co evolution based method that uses the protein's MSAs to detect the residues that co-evolve, predicting a probability distribution over the pairwise distances between the residues pairs. This can be translated into a statistical potential function and then optimized with a simple gradient descent algorithm to generate a folded protein structure [88, 89]. A similar approach was implemented in a method developed by Jinbo Xu's group, named RaptorX [90], and in a method from Baker's group, called trRosetta [91]. The big advancement in this field could clearly allow generating highly reliable structural models of MC family members whose structure is not available yet.

As an example, using the two latter methods, different conformations of bAAC and *Thermothelomyces thermophilus* AAC (TtAAC) (PDB ID: 10KC [3]; PDB ID: 6GCI [85]), were obtained (Figure 3) (Pasquadibisceglie &

Polticelli, unpublished data). In particular, compared to the experimentally solved structures, the modeled structures display lower gyration radii of the cytoplasmic network residues (using the open-source, communitydeveloped PLUMED library [92], version 2.7 [93]), pointing out a more closed conformation of the cytoplasmic side. Conversely, compared to the experimentally solved structures, the gyration radii of the matrix networks were higher in the case of the bAAC model structure, but lower for the TtAAC model structure. This is due to the different conformations of the two crystal structures (bAAC in c-state, while TtAAC in m-state) (Table 3). Moreover, the presence of inhibitors and/or antibody fragments in the solved structures, used to block the proteins in a precise conformation, are likely to cause structural distortions. in line with what Falconi and Dehez, independently, observed [65, 67]. However, it should be noted that the two above-mentioned modeling approaches exploit the information about co evolving residues; this could result in favoring lower distances between the interacting residues of the matrix and cytoplasmic networks, thus producing intermediate-like conformations.



Figure 3: Superimposition of the three-dimensional structures and the molecular models of the bovine ATP/ADP carrier (bAAC), and the ATP/ADP carrier from *Thermothelomyces thermophilus* (TtAAC) [3, 80, 85]. View from the inner mitochondrial space (top), and from the matrix (bottom). The structure solved experimentally is colored in tan, the structure modelled with RaptorX in light blue [90] and the structural model produced by trRosetta in pink [91].

 Table 3: Radius of gyration analysis performed on the alpha carbons of the matrix and cytoplasmic network residues.

	Cytoplasmic network	Matrix network
bAAC (10KC)	14 Å	7.5 Å
bAAC (RaptorX)	9.5 Å	7.3 Å
bAAC (trRosetta)	8.3 Å	7.4 Å
TtAAC (6GCI)	7.9 Å	11.8 Å
TtAAC (RaptorX)	8.5 Å	7.3 Å
TtAAC (trRosetta)	7.9 Å	7.5 Å

Finally, to improve the accuracy of the model of a protein structure the refinement step is crucial. MD simulations are often used to accomplish such a task. However, it is nontrivial to consistently improve a structural model and select the conformation closer to the native state [94]. This is especially true for membrane proteins models, where the scoring function has to take into account the presence of a lipid bilayer. In this regard, refinement protocols and scoring functions developed specifically for membrane proteins [95] could improve the modeling accuracy for this class of proteins in general and for the SLC superfamily members in particular.

System setup for MD simulations

As several studies showed, CL is a crucial phospholipid for the IMM and for the MCs, affecting their dynamics [75, 77, 78, 81–84]. For this reason, MD simulations would be more accurate and reliable if the transporters were embedded in a lipid bilayer that mimics the concentration of CL and the relative asymmetric distribution, this phospholipid being predominant in the inner leaflet with respect to the outer one, in a 3:1 ratio [76, 96]. Also the fatty acids composition often does not reproduce that of a realistic IMM, characterized by a high degree of unsaturation [97, 98]. Nowadays, thanks to the great advances in the field of atomistic and CG force fields, more realistic membrane models are being used for MD simulations, trying to reproduce complex systems and interactions, and in this regard CHARMM-GUI represents a valuable resource [55, 99].

Sampling of rare events

Biological processes, such as the m- to the c-state transition or the substrate translocation, occur in the timescale of microseconds to seconds.

One solution to sample these rare events could be that of extending the simulation length, but this is not really convenient due to the effort needed in terms of computational resources. A larger time step allows extending the simulation time with a lower computational effort. This can be easily achieved using the method of hydrogen mass repartitioning (HMR), where the mass of heavy atoms is redistributed onto their bonded hydrogens, slowing their motions without introducing significant additional errors [99]. In a recent study, the use of HMR for membrane-containing systems (with CHARMM36 FF) has been extensively tested, showing negligible differences with respect to a conventional approach. However, the authors pointed out that, using the CHARMM36 lipid FF, a cutoff different from 12 Å with a force switching function starting from 8 to 10 Å could generate significant deviations on several parameters [99].

Anyhow, biologically relevant rare events are often very difficult to sample during atomistic simulations, even during microseconds-long trajectories. In this regard, two enhanced sampling strategies have been used to study the transport mechanism of the AAC, and its relative free energy landscape [68, 73]. Nevertheless, the application of new methods could better clarify several aspects of this and other systems. For example, supervised and unsupervised machine learning algorithms could be exploited for the selection of CVs, to better understand the properties of a simulated system, or to accelerate the sampling during the trajectory (i.e., enhanced sampling) [100]. Moreover, other advanced MD techniques are being developed, such as the on-the-fly probability-enhanced sampling (OPES) that avoids the sampling of unphysical states and that allows a better exploration of the free energy surface [101].

Conclusions

The studies here reviewed showed how computational approaches could suggest new hypotheses or support experimental evidences: comparative analyses identified critical residues for the substrate recognition [63, 64], further supported by MD simulations [66, 67], cocrystallized inhibitors [3] and photolabeling studies [102]. In a similar way, the salt bridges networks involved in the conformational changes were identified from comparative studies [45], crystallized structures [3, 85] and mutagenesis experiments [79], whereas MD evidenced the dynamical behavior of these interactions [66, 68, 73, 75]. Finally, several groups pointed out the relevance of cardiolipin binding through crystal structures [3, 82], phosphorous nuclear magnetic resonance (NMR) [77], and thermostability studies [103], as well as atomistic and coarse-grained simulations [81, 83, 84].

Thus, the newest modeling methods together with the most recent and powerful MD techniques will allow to study with higher accuracy the AAC transporter and all the other SLC25 family members, for which very few structural data are available in literature, suggesting and/or supporting new mechanistic hypotheses [104–109].

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