

FINAL MASTER PROJECT

**COMPUTATIONAL TOOLBOX TOWARDS
EVOLUTIONARY DOMAIN MAPPING OF
MEMBRANE PROTEINS**

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Abstract

Membrane proteins account for about 20% to 30% of all proteins encoded in a typical genome. They play central roles in multiple cellular processes mediating the interaction of the cell with its surrounding. Over 60% of all drug targets contain a membrane domain. The experimental difficulties of obtaining a crystal structural severely limits our ability or understanding of membrane protein function. Computational evolutionary studies of proteins are crucial for the prediction of 3D structures. In this project, we construct a tool able to quantify the evolutionary positive selective pressure on each residue of membrane proteins through maximum likelihood phylogeny reconstruction. The conservation plot combined with a structural homology model is also a potent tool to predict those residues that have essentials roles in the structure and function of a membrane protein and can be very useful in the design of validation experiments.

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1 Introduction

1.1 Membrane Proteins

Membrane proteins account for about 20% to 30% of all proteins encoded in a typical genome. They play central roles in multiple cellular processes mediating the interaction of the cell with its surrounding, such as the transport of nutrients and metabolites and in signalling of regulatory networks (Liang et al. 2012). Over 60% of all drug targets contain a membrane domain. One of the largest families of membrane proteins is G protein-coupled receptors (GPCRs), which are enriched in druggable target domains, and around of half of actual drugs are designed against them (Hofmann et al. 2009)(Russ & Lampel 2005).

The environment of membrane proteins is predominantly lipophilic, lacks hydrogen-bonding potential, and provides little screening of electrostatic interactions. At a primary sequence level, compared to water soluble proteins, there are significant differences in amino acid composition and the probabilities of amino acid substitutions during evolution, generally favouring residues with hydrophobic side chains, especially at the protein-lipid interface.

A major obstacle in studying membrane proteins is the difficulty in experimental determination of their three dimensional structures(Bill et al. 2011): many membrane proteins are difficult to crystallize, or are too large to be studied with NMR (Liang et al. 2012)(Pierri et al. 2010) and only represent <2% of crystal structures (Kozma et al. 2013) deposited in the Protein Data Bank. The 3D structure of membrane proteins is essential for the characterization of its molecular mechanisms and is crucial in the development of pharmacological agent targets.

1.2 Evolutionary studies

The absence of structural information severely limits our ability or understanding of membrane protein function. Computational evolutionary studies of proteins are crucial for the prediction of 3D structures (Marks et al. 2011) in order to understand their function (Pierri et al. 2010). Protein patterns and motifs are result of the selective pressure of evolution. Some residues play key roles either in structure or function (Liang et al. 2012) at specific positions. As an example, Pro⁵⁰ of bacteriorhodopsin is essential for lipid-protein and protein-protein interaction and consequently maintain the proper folding; and Pro⁹¹ is basic for the functionality of the active site (Perálvarez-Marín et al. 2008). Typically, the most accurate models of protein structures are achieved through homology modelling, where a known structure is used as a template for the construction of a model of a related protein (Forrest et al. 2006) revealing the parts which are changing rapidly and those residues shaped by natural selection(Holder & Lewis 2003).

Primary sequence evolutionary conservation as a tool to identify structural conservation is limited to its use in the case of membrane proteins. The same transmembrane fold can show an overall low conservation. However, within the same family of proteins, certain residues of conserved function or conserved structural stability cannot escape evolution. These residues are suffering what is called evolutionary pressure. This evolutionary pressure is so high, that even in the case that a mutation occurs in a key region of a protein; this mutation will be compensated by other mutations to ameliorate the effect of the first one.

Evolutionary studies of the sequence of membrane protein permits to estimate those residues with a high selective pressure during evolution. The identification of these positions and the experimental validation gives insight to the structure and function of the membrane protein (Marks et al. 2011)(Grishin 2012)(Nugent & Jones 2012).

1.3 Aim

Although certain statistical studies have dealt with the effect of conservation/mutation and co-evolution in specific membrane proteins, such as ABC transporters (Gulyas-Kovacs 2012), a useful tool should be able to deal with any kind of membrane protein. The aim of this study is to construct a tool able to quantify the evolutionary pressure on each residue or on each transmembrane segment from the sequence of any non determined membrane protein. The conservation plot combined with a structural homolgy model can be a potent tool to predict those residues that have an essential role in the structure and function of a membrane protein and can be very useful in the design of validation experiments.

A user-friendly web server interface is also under development. This, will also allow the user to set the parameters which best fits to the analysis.

Box 1-1. Keywords and Definitions

- **Positive selection:** Darwinian selection fixing advantageous mutations with positive selective coefficients. The term is used interchangeably with molecular adaptation and adaptive molecular evolution
 - **Algorithm:** A fixed procedure embodied in a computer program.
 - **Alignment:** The process or result of matching up the nucleotide or amino acid residues of two or more biological sequences to achieve maximal levels of identity and, in the case of amino acid sequences, conservation, for the purpose of assessing the degree of similarity and the possibility of homology.
 - **Identity:** The extent to which two (nucleotide or amino acid) sequences have the same residues at the same positions in an alignment, often expressed as a percentage.
 - **Similarity:** The extent to which nucleotide or sequences are related. Similarity between two sequences can be expressed as percent sequence identity and/or percent positive substitutions.
 - **Domain:** A discrete portion of a protein assumed to fold independently of the rest of the protein and possessing its own function.
 - **E-value:** The Expectation value or Expect value represents the number of different alignments with scores equivalent to or better than S that is expected to occur in a database search by chance. The lower the E value, the more significant the score and the alignment.
 - **Homology:** Similarity attributed to descent from a common ancestor. Homologous biological components (genes, proteins, structures) are called homologs.
 - **Orthologs:** Homologous biological components (genes, proteins, structures) in different species that arose from a single component present in the common ancestor of the species; orthologs may or may not have a similar function.
 - **Paralogs:** Homologous biological components within a single species that arose by gene duplication.
 - **Motif:** A short conserved region in a protein sequence. Motifs are frequently highly conserved parts of domains.
- <http://www.ncbi.nlm.nih.gov/books/NBK62051/>

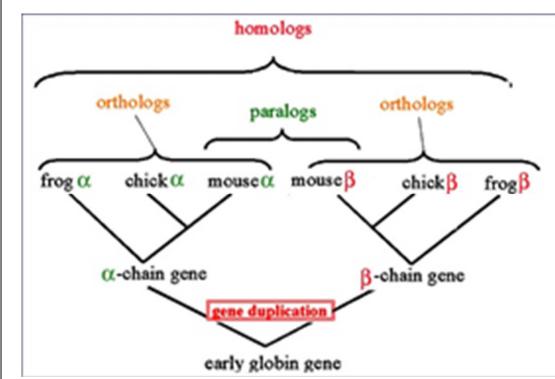
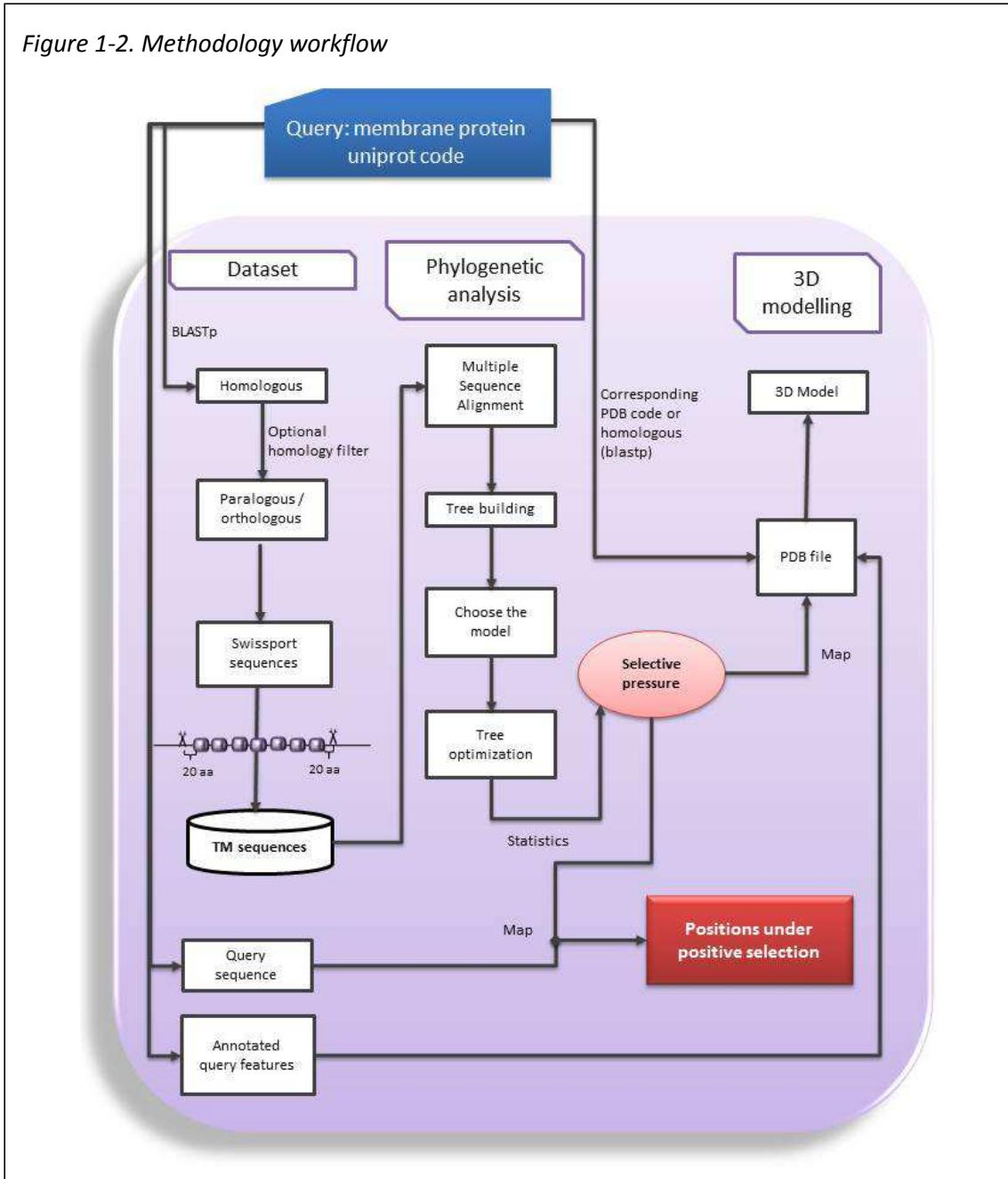
Figure 1-1. Homologs, orthologs & paralogs

Figure 1-2. Methodology workflow

2 Methods

The methodology presented in this work follows the general procedure of evolutionary studies. Starting from the membrane protein template or query, object of the analysis, find its homologous. Next, a multiple sequence alignment is performed followed by the phylogenetic tree construction, which ends up with an assigned log likelihood value to each position. Finally, a model is presented with a colour gradient of its associated value of the corresponding or homolog crystal structural.

A pipeline has been created through python, biopython and R scripts in Linux environment. Python programming is used to the basic local alignment, to obtain the protein sequences, to perform the multiple sequence alignment, mapping scores and plotting, and the chimera-python interface for the 3D homology model. R programming is used in phylogenetic trees generation.

2.1 Basic Local Sequence Alignment of the membrane protein in order to obtain homologous

Sequence alignments searches against databases are used to find homologous proteins. Basic local alignment search (BLAST) is an algorithm which has been optimised in order to find the optimal local alignment to a query in a speed search against databases (Altschul et al. 1990) (Altschul et al. 1997).

A protein BLAST search (blastp against protein database using a protein query) is carried out using as a template a protein Uniprot code of a membrane protein in order to find its homologs. The search is done against Swissprot database (Bairoch & Apweiler 2000), and the user could specify the desired values for the following parameters: sequence identity, E-value cut-offs, query coverage and hit list size.

From the list of uniprot accession codes obtained, the corresponding full sequences are extracted through Swissprot database with their corresponding transmembrane and mutagenesis regions annotated.

Considering the construction of reliable phylogenetic tree, sequences should be neither so similar nor so divergent (Castresana 2000). Optionally, a filter for paralogous sequences can be performed. In order to obtain the transmembrane bundle, and to avoid the extracellular or intracellular regions, only the region ranged from the first to the last transmembrane domain plus 20 amino acids for each extreme are extracted of all proteins to further analyse.

2.2 Multiple Sequence Alignment of the homologous

Multiple sequence alignment (MSA) is able to detect the evolutionary relationship between membrane proteins and key functional residues (Liang et al. 2012). Many successful approaches have been designed to overcome with MSA scoring system and consequently with its accuracy. MAFFT is a global MSA tool based on the fast Fourier transform (FFT), which allows rapid detection of homologous (Katoh et al. 2002), and has been considered one of the best programs (Edgar & Batzoglou 2006).

After the extraction of the transmembrane bundle of all homologous sequences, a MAFFT multiple sequence alignment (MSA) is performed with its default parameters (Katoh & Standley 2013).

2.3 Phylogenetic tree generation

Phylogenetic analysis reveals the selective pressure among sites for a given MSA. Between the phylogenetic methods described (Massingham & Goldman 2005) (Wong et al. 2004), such as SG method for nucleotides (Suzuki & Gojobori 1999) or its modification(Suzuki 2004), character based ones are the most widely used. These include the maximum parsimony (Wu et al. 2006) and maximum-likelihood (ML)(Yang & Bielawski 2000a)(Zhang et al. 2005)(Nielsen & Yang 1998) (Tamura et al. 2011) which evaluates and maximizes the probability that the chosen evolutionary model has generated the observed data (Brinkman & Leipe 2001) (Huelsenbeck & Bollback 2001). This allows the assessment of the reliability of each amino acid position in an alignment on the basis of all other positions (Yang et al. 2000)(Yang 1998)(Holder & Lewis 2003)(Williams & Lovell 2009)(Yang & Bielawski 2000b).

Phylogenetic inference from amino acid sequence data uses mainly empirical models of amino acid replacement and is therefore dependent on those models (Abascal et al. 2005). These models encompass estimate of the instantaneous substitution rates from any amino acid to another one within time (Le & Gascuel 2008). They are used to compute substitution probabilities along phylogeny branches and thus the likelihood of the data. Several have been specifically designed for different families and subfamilies of proteins. Some of them are specifically designed for soluble proteins and often are considered not appropriate for membrane proteins such as BLOSUM or PAM (Liang et al. 2012). These models assume very similar amino acid replacement across all positions. Nevertheless, conservation of protein function and structure imposes constraints on which positions can change. This evolutionary information can be inferred by considering a fraction of amino acids to be invariable ('+I'), or assigning each site a probability to belong to given gamma rate categories ('+G') (Abascal et al. 2005).

ML method provides a better estimation of the model of replacement. Moreover, it allows the use of different models of evolution depending on the examined dataset (Keane et al. 2006). However, it has a high computational cost (Whelan & Goldman 1995)(Holder & Lewis 2003) and it doesn't work for big datasets. This method has been implemented in R through "Phangorn" package (Schliep 2011). The replacement models used in this tool are a subset of the implemented for proteins: WAG(Whelan & Goldman 2001), LG(Le & Gascuel 2008), cpREV(Adachi et al. 2000), mtArt(Abascal et al. 2007), MtZoa(Rota-Stabelli et al. 2009), mtREV24(Adachi & Hasegawa 1996).

A phylogenetic tree is generated by ML method. Firstly, an initial tree is calculated through "bionj" algorithm (Gascuel 1997), which is a method for reconstructing phylogenetic trees from a matrix of pairwise evolutionary distances, and WAG model. This data is tested to the models inferred by both invariant sites and gamma rate categories. The model which best fits under BIC (Bayesian Information Criterion) is selected to perform the study.

The tree is optimized by the parameters NNI (branch swapping method), proportion of variable size, gamma rate, and edge lengths. Log likelihood is obtained for each MSA site and for the global tree.

2.4 Positive Selective Pressure

For determining whether a concrete position of the query membrane protein is under positive selection, a FDR correction of the likelihood for multiple testing is performed as each site is tested for positive selection independently. The p-values are ranked from the lowest to the highest. A site is considered to be significant for positive selection if its adjusted p-value is smaller than the designed alpha divided by its rank (Wong et al. 2004). The pressure measure is obtained by alpha divided by the rank minus the adjusted p-value.

2.5 3D Model of the membrane protein

In this step is fundamental to dispose of the PDB file (Berman et al. 2000). If the query protein has been crystallized, the structure with maximum coverage and maximum resolution obtained by X-ray method is selected. Otherwise, the homology model will be constructed by the closest homologous protein crystal structure found by running a BLASTp against the PDB database.

The analysed sequence with its site log likelihood assigned is mapped to the original query sequence and to the corresponding or homologous protein crystal structure. In the case that two sequences are different, an alignment of the query versus the PDB sequence is previously performed (pairwise global alignment, using BLOSUM62 matrix, gap penalisation of -10 for opening an -0.5 for extending).

2.6 Conservation plot along the 3D model of the membrane protein

Chimera (Pettersen et al. 2004) python interface is used in order to obtain the conservational plot of the 3D Model of the studied protein. A gradient colour of the selective pressure measure is applied to the residues of the corresponding structure ranging from cyan to magenta, maximum to minimum correspondingly. Described mutagenesis residues are plotted in stick shape. Grey areas are the non-analysed residues.

2.7 Example of usage through bovine rhodopsin

Bovine rhodopsin (P02699) is one the most well characterized membrane proteins. It is one of the most abundant and stable membrane proteins and it was soon crystallised (Bill et al. 2011). Experimental information regarding of the role of some residues is available (Palczewski et al. 2000).

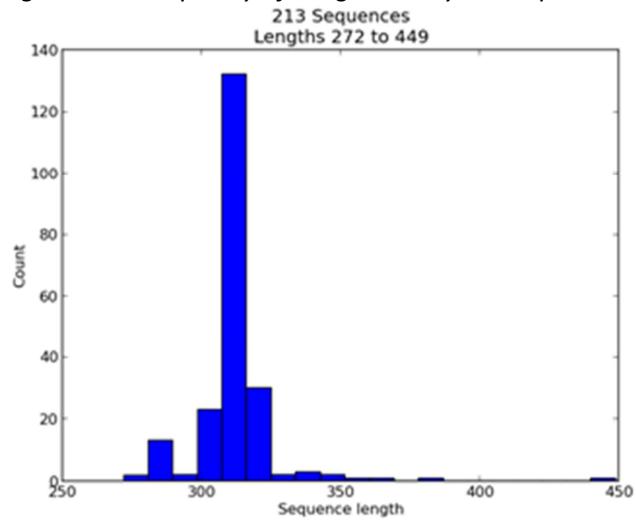
For this example we set the blastp parameters as follows: 25% sequence identity, which is in the middle of the called twilight zone(Rost 1999), ensuring to find enough similar sequence to perform an acceptable MSA and taking into account that TM structure of most membrane proteins have a strong conservation at low-sequence identity (Olivella et al. 2013); E-value cut-offs of 1×10^{-4} , query coverage of 70% and hit list of size 10,000. Afterwards we filtered the paralogous sequences. The alpha value is set up at 0.05.

3 Results and Discussion

We identified 213 orthologous sequences. After keeping the transmembrane bundle for all of them, their lengths range from 272 to 449. (See figure 3-3). The figure 3-4 shows a partial view of the MAFFT Multiple Sequence Alignment.

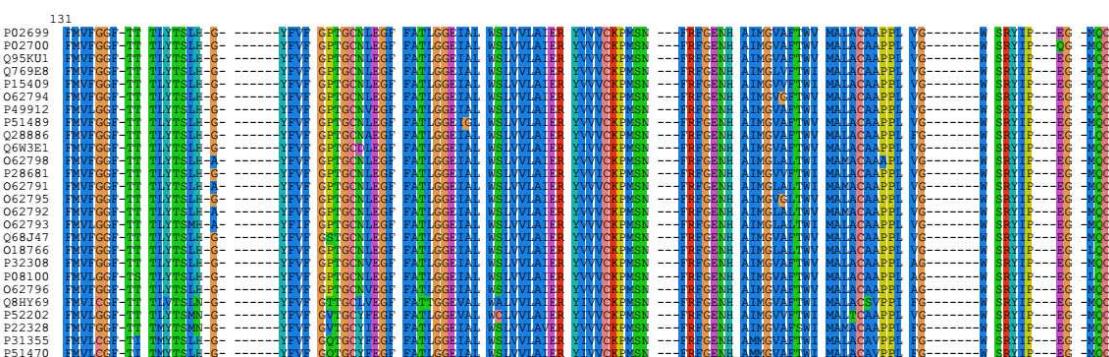
Thanks to ML methodology it is possible to evaluate the model which best fits to the data. Table 3-2 shows the evaluation of the initial constructed phylogenetic tree to determine which model best fits considering invariable sites ('+I'), and assigning each site a probability to belong to a given rate ('+G'). In this case, the model which minimizes Bayesin Information Criterion (BIC) is LG+G+I.

Figure 3-3. Frequency of Lengths analysed sequences.



This graph represents the frequencies of sequences length of the selected area for the analysis, which ranges 20 amino acids up and down from the first TM domain to the last one. There is a total of 213 sequences after filtering the paralogues which passes the blastp search criteria (25% sequence identity; E-value cut-offs of 1×10^{-4} , cover query of 70% and hitsize list of 10,000).

Figure 3-4. Multiple Sequence Alignment



Partial view of the top MSA from position 131 by using SeaView (Gouy et al. 2010).

Table 3-1. Model Test

Model	df	logLik	AIC	BIC
WAG	631	-49146.50	99554.99	102370.18
WAG+I	632	-49039.78	99343.56	102163.21
WAG+G	632	-48081.00	97426.00	100245.64
WAG+G+I	633	-48051.74	97369.47	100193.58
LG	631	-48848.30	98958.60	101773.79
LG+I	632	-48767.16	98798.32	101617.97
LG+G	632	-47666.16	96596.32	99415.97
LG+G+I	633	-47648.51	96563.03	99387.14
cpREV	602	-49255.83	99715.66	102401.46
cpREV+I	603	-49159.01	99524.02	102214.29
cpREV+G	603	-48108.11	97422.23	100112.49
cpREV+G+I	604	-48087.02	97382.05	100076.77
mtArt	533	-51180.56	103427.12	105805.08
mtArt+I	534	-51121.19	103310.39	105692.81
mtArt+G	534	-49202.02	99472.03	101854.46
mtArt+G+I	535	-49193.75	99457.50	101844.39
MtZoa	603	-50038.74	101283.47	103973.74
MtZoa+I	604	-49980.51	101169.01	103863.74
MtZoa+G	604	-48268.15	97744.29	100439.02
MtZoa+G+I	605	-48258.16	97726.33	100425.52
mtREV24	600	-50873.63	102947.25	105624.13
mtREV24+I	601	-50776.43	102754.86	105436.21
mtREV24+G	601	-49387.93	99977.86	102659.21
mtREV24+G+I	602	-49365.41	99934.83	102620.63

Results from the test performed to establish the model that fits the best under BIC. Df: degrees of freedom. LogLik: overall likelihood ratio. AIC: Akaike Information Criterion. BIC: Bayesian Information Criterion.

Once the tree is optimised, a log likelihood value for each position is obtained (See appendix). After calculating the selective pressure, a total of 275 residues are under selective positive pressure, leaving 36 out. This means that the first ones are susceptible to mutations in more or less degree (see appendix for detailed information of the measure of the positive selection).

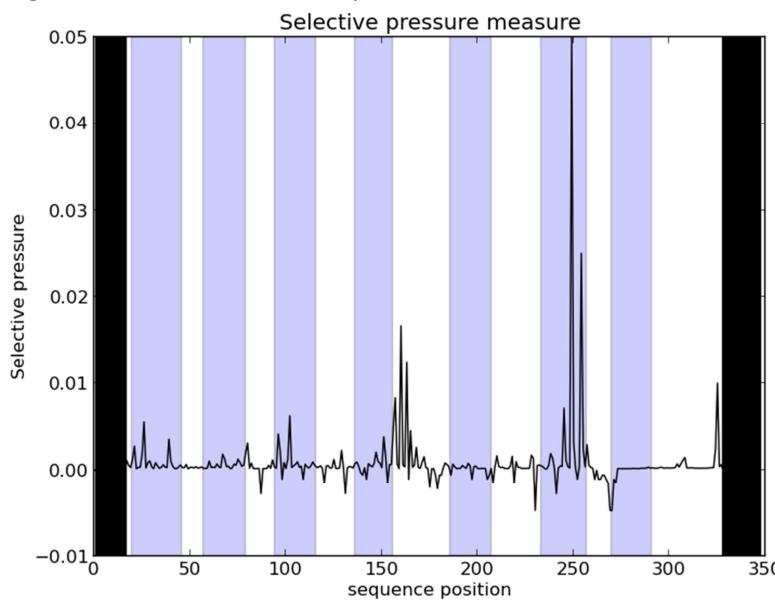
Table 3-3 shows the positions and its corresponding amino acid under positive selective pressure.

Table 3-3. Positive Selected residues

45 G	81 T	117 A	153 A	189 G	227 E	267 T	305 A
46 P	82 T	118 W	154 F	190 G	228 Y	268 L	306 F
47 M	83 Y	119 Y	155 D	191 V	229 L	269 L	307 Y
48 I	84 I	120 E	156 M	192 E	230 T	270 R	308 F
49 F	85 F	121 R	157 Y	193 F	231 T	271 G	309 I
50 Q	86 F	122 L	158 F	194 R	232 P	272 F	310 S
51 G	87 C	123 H	159 L	195 G	233 P	273 I	311 T
52 H	88 V	124 L	160 S	196 M	234 F	274 M	312 V
53 V	89 V	125 C	161 H	197 G	235 L	275 L	313 F
54 W	90 V	126 G	162 A	198 G	236 V	276 M	314 V
55 I	91 Q	127 G	163 E	199 F	237 L	279 K	315 L
56 T	92 L	128 S	164 Y	200 L	238 N	280 L	316 I
57 Q	93 Y	129 V	165 N	201 C	239 R	281 L	317 G
58 A	94 I	130 G	166 V	202 V	240 Y	282 W	318 A
59 L	95 Y	131 F	167 S	203 H	241 V	283 M	319 T
60 F	96 F	132 T	168 A	204 L	242 V	284 I	320 I
61 M	97 S	133 L	169 P	205 T	243 Q	285 E	321 V
62 P	98 V	134 A	170 F	206 I	244 F	286 I	322 S
63 G	99 L	135 N	171 V	207 V	245 A	287 Y	323 F
64 F	100 T	136 C	172 A	208 M	246 P	288 E	324 P
65 A	101 G	137 E	173 F	209 F	247 M	289 I	325 G
66 V	102 W	138 Q	174 E	210 Y	248 C	290 K	326 L
67 A	103 T	139 F	175 L	211 A	249 Q	291 A	327 E
68 A	104 W	140 K	176 R	212 P	250 P	292 A	
69 I	105 F	141 K	177 G	213 M	251 Y	293 R	
70 E	106 P	142 I	178 Q	214 V	256 H	294 E	
71 C	107 T	143 Q	179 L	215 T	257 L	295 Q	
72 I	108 F	144 C	180 N	216 Y	258 T	296 Q	
73 N	109 A	145 H	181 V	219 S	259 V	297 I	
74 P	110 S	146 S	182 N	220 A	260 V	298 L	
75 G	111 I	147 L	183 E	221 P	261 V	299 P	
76 F	112 V	148 M	184 P	222 S	262 A	300 N	
77 N	113 K	149 P	185 F	223 A	263 T	301 T	
78 D	114 D	150 M	186 G	224 A	264 A	302 A	
79 Y	115 Y	151 I	187 L	225 K	265 T	303 E	
80 G	116 E	152 I	188 V	226 L	266 A	304 I	

Next figure 3-6 shows the selective pressure for each position of the query.

Figure 3-6. Position Selective pressure



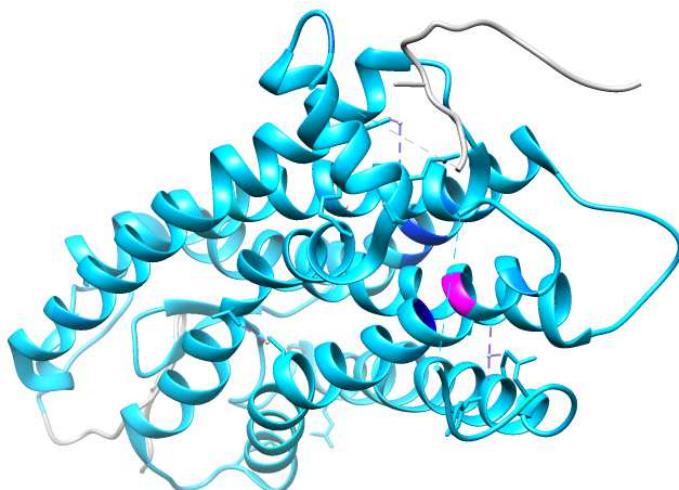
The plot shows the calculated selective pressure measure for each position from the P02699 peptide. Black areas are the extracellular and cytoplasmatic domains (correspondingly) which has not been taken into account for obtaining the score. Gray areas corresponds to the TM domains. Positives values are under positive selective pressure.

In general traits selective pressure is very close to 0. Some values are clearly positives whereas just a few are negative. Regarding the positive coincide with positive results, those values needs to be studied carefully for the user.

Once the selective pressure is calculated, a 3D model is set. In this case the template is the pdb code 1F88, a crystal structure obtained by X-ray. In this example, the protein entirely

coincides with the original query. In other cases, an alignment is performed between the 2 sequences and then the selective pressure measure is mapped. As an output a chimera session is generated.

Figure 3-7. 3D model



1F88 crystal structure. A gradient colour of the selective pressure measure is applied to the residues of the corresponding structure ranging from cyan to magenta, maximum to minimum correspondingly. Described mutagenesis residues are plotted in stick shape. Grey areas are the non-analysed residues.

4 Conclusions

The results obtained through this tool need to be validated by the experimental scientist at the laboratory and through bibliography and experiments.

We generate a tool able to identify from a given membrane protein, which positions are under positive selective pressure. It is able to give hints to the experimental researchers on which positions of a membrane protein can or/and cannot mutate in order to validate the results.

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6 Appendix

Proteins which pass the blastp criteria (E-value cutoffs of 1x10-4, cover query of 70% and hitsize list of 10,000) and filtered by paralogous. A total of 213 are obtained.

Ref name	Uniprot code	Organism		
OPSD_BOVIN	P02699	Bos taurus	OPSD_SALPV	Q9YGZ3
OPSD_SHEEP	P02700	Ovis aries	OPSD_GOBNI	Q9YGZ2
OPSD_FELCA	Q95KU1	Felis catus	OPSD_ZOSOP	Q9YGY9
OPSD_OTOCR	Q769E8	Otolemur crassicaudatus	OPSD_GAMAF	P79756
OPSD_MOUSE	P15409	Mus musculus	OPSD_NEOSA	P79812
OPSD_PHOVI	O62794	Phoca vitulina	OPSD_SARDI	P79898
OPSD_RABIT	P49912	Oryctolagus cuniculus	OPSD_MYRVI	P79807
OPSD_RAT	P51489	Rattus norvegicus	OPSD_NEOAR	P79808
OPSD_MACFA	Q28886	Macaca fascicularis	OPSD_MYRBE	P79798
OPSD_CALPD	Q6W3E1	Caluromys philander	OPSD_PETMA	Q98980
OPSD_TURTR	O62798	Tursiops truncatus	OPSD_SARMI	P79901
OPSD_CRIGR	P28681	Cricetus lusitanicus	OPSD_SARXA	P79914
OPSD_DELDE	O62791	Delphinus delphis	OPSD_SARPU	P79902
OPSD_PAGGO	O62795	Pagophilus groenlandicus	OPSD_SARTI	P79911
OPSD_GLOME	O62792	Globicephala melas	OPSD_POMMI	P35403
OPSD_MESBI	O62793	Mesoplodon bidens	OPSD_SARSP	P79903
OPSD_LOXAF	Q68J47	Loxodonta africana	OPSD_NEAOU	P79809
OPSD_PIG	O18766	Sus scrofa	OPSD_GECGE	P35357
OPSD_CANFA	P32308	Canis familiaris	OPSD_ICTPU	O42268
OPSD_HUMAN	P08100	Homo sapiens	OPSD_COTIN	O42330
OPSD_TRIMA	O62796	Trichechus manatus	OPSD_ABYKO	O42294
OPSD_SMICR	Q8HY69	Sminthopsis crassicaudata	OPSD_PROJE	O42451
OPSD_ALLMMI	P52202	Alligator mississippiensis	OPSD_BATMU	O42300
OPSD_CHICK	P22328	Gallus gallus	OPSD_COTBO	O42307
OPSD_RANPI	P31355	Rana pipiens	OPSD_COMDY	O42327
OPSD_LITCT	P51470	Lithobates catesbeiana	OPSD_BATNI	O42301
OPSD_RANTE	P56516	Rana temporaria	OPSD_PARKN	O42452
OPSD_AMBTI	Q90245	Ambystoma tigrinum	OPSD_LIMBE	O42427
OPSD_BUFBM	P56515	Bufo marinus	OPSD_LIMPA	O42431
OPSD2_ANGAN	Q90215	Anguilla anguilla	OPSD_LEOKE	Q90373
OPSD_BUFBU	P56514	Bufo bufo	OPSD_TAUBU	O42466
OPSD_XENLA	P29403	Xenopus laevis	OPSD_COTGR	O42328
OPSD_DANRE	P35359	Danio rerio	OPSP_COLLI	P51476
OPSD_ANOCA	P41591	Anolis carolinensis	OPSU_MELUD	O57605
OPSD_SCYCA	Q93459	Scyliorhinus canicula	OPSB_SAIBB	O13092
OPSB_CONCO	O13227	Conger conger	OPSL_CALJA	P34989
OPSD_LITMO	Q9YH00	Lithognathus mormyrus	OPSR_CAPHI	Q95170
OPSD_DIPVU	Q9YH04	Diplodus vulgaris	OPSG_CAVPO	Q9R024
OPSD_GALML	Q93441	Galeus melastomus	OPSG_SCICA	O35478
OPSD_SPAAU	Q9YH02	Sparus aurata	OPSO_RUTRU	Q7T3Q7
OPSD_SARPI	Q9YGZ0	Sardina pilchardus	OPSR_HORSE	O18912
OPSD_DIPAN	Q9YH05	Diplodus annularis	OPSG_ODOVI	O18911
OPSD_SARSL	Q9YH03	Sarpa salpa	OPSO_SALSA	O13018
OPSD_LEUER	P79863	Leucoraja erinacea	OPN4_PODSI	Q4U4D2
OPSD_MUGCE	Q9YGZ9	Mugil cephalus	OPN4_PHOSU	Q5XXP2
OPSD_CYPCA	P51488	Cyprinus carpio	OPN4B_GADMO	Q804Q2
OPSD_LIZAU	Q9YGZ6	Liza aurata	OPSD1_MIZYE	O15973
OPSD_LIZSA	Q9YGZ7	Liza saliens	OPS6_DROME	O01668
OPSD_TETNG	Q9DGG4	Tetraodon nigroviridis	OPSD_LOLFO	P24603
OPSD_DICLA	Q9YGZ4	Dicentrarchus labrax	OPSC2_HEMISA	Q25158
OPSD_CARAU	P32309	Carassius auratus	OPSD_SEPOF	O16005
OPSD_ASTFA	P41590	Astyanax fasciatus	OPSD_ALLSU	Q17094
OPSD_CHELB	Q9YGZ8	Chelon labrosus	OPSD_ENTDO	P09241
OPSD_LAMJA	P22671	Lampetra japonica	OPSO_LIMPO	P35361
OPSD_ZEUFU	O42604	Zeus faber	OPSD_PROML	O16020
OPSD_ORYLA	P87369	Oryzias latipes		
OPSD_SOLSO	Q9YGZ5	Solea solea		
OPSD_MULSU	Q9YH01	Mullus surmuletus		
OPSD_POERE	P79848	Poecilia reticulata		
OPSD_ATHBO	Q9YGZ1	Atherina boyeri		

OPSD_TODPA	P31356	Todarodes pacificus	CCR5_CHLSB	Q9TV43	Chlorocebus sabaeus
OPSD_CATBO	Q17296	Cataglyphis bombycina	CCR5_MIOTA	Q95NC3	Miopithecus talapoin
OPS1_CALVI	P22269	Calliphora vicina	CCR5_NOMILE	Q97883	Nomascus leucogenys
OPS1_DROPS	P28678	Drosophila pseudoobscura pseudoobscura	CCR5_HYMLIL	Q95NC0	Hylobates moloch
OPSD_CAMAT	Q17292	Camponotus atriceps	CCR5_SAISC	Q8HZT9	Saimiri sciureus
OPSD_CAMSC	O16018	Cambarellus shufeldtii	CCR5_CERAT	O62743	Cercocebus atys
OPN4_BRABE	Q4R1I4	Branchiostoma belcheri	CCR5_MANSP	Q95ND1	Mandrillus sphinx
OPS1_SCHGR	Q94741	Schistocerca gregaria	CCR5_CERN	Q9TV45	Cercopithecus nictitans
OPSD_SPHSP	P35362	Sphodromantis sp.	BRS4_BOMOR	P47751	Bombina orientalis
OPSD_ORCVI	O16019	Orconectes virilis	CCR5_THEGE	Q95NC1	Theropithecus gelada
OPSD_PROCL	P35356	Procambarus clarkii	GPR18_AMPAM	Q93127	Amphibalanus amphitrite
OPSD_CAMLU	O16017	Cambarus ludovicianus	CCR3_CHLAE	P56492	Chlorocebus aethiops
OPS1_MANSE	O02464	Manduca sexta	FSHR_CAIMO	Q7ZTV5	Cairina moschata
OPSCE_BOMMO	Q95Y13	Bombyx mori	CCR5_MANLE	Q95ND2	Mandrillus leucophaeus
OPSD_PROOR	O18485	Procambarus orcinus	CCR5_CALHU	Q6WN98	Callithrix humeralifera
OPSD_APIME	Q17053	Apis mellifera	CCR5_CERCP	Q9TV47	Cercopithecus cebus
OPSD_CAMHU	O18312	Cambarus hubrichti	BKR1B_TUPMI	Q8HZP1	Tupaia minor
OPSD_ORCAU	O18481	Orconectes australis	CCR5_ATEGE	Q95NC4	Ateles geoffroyi
OPSD_CAMMA	O18315	Cambarus maculatus	CCR5_CERAS	Q9TV48	Cercopithecus ascanius
OPSD_PROSE	O18486	Procambarus seminolae	ITR_CATCO	Q90334	Catostomus commersonii
NK2R_MESAU	P51144	Mesocricetus auratus	V1AR_MICMA	Q9WTV8	Microtus montanus
OPRM_MACMU	Q9MYW9	Macaca mulatta	CNR1B_TAKRU	Q98895	Takifugu rubripes
OPS4_DROVI	P17646	Drosophila virilis	V1AR_MICOH	Q9WTV9	Microtus ochrogaster
NPR11_CAEEL	Q18179	Caenorhabditis elegans	GLHR_ANTEL	P35409	Anthopleura elegantissima
GPR54_ORENI	Q6BD04	Oreochromis niloticus	FSHR_MACEU	Q6YNB6	Macropus eugenii
OPRM_PANTR	Q5IS39	Pan troglodytes	CTR2_OCTVU	Q5WA50	Octopus vulgaris
NK1R MERUN	Q5DUB1	Meriones unguiculatus	ADRB1_MELGA	P07700	Meleagris gallopavo
APJ_XENTR	Q4VA82	Xenopus tropicalis	CCR5_ALOSE	Q95NC9	Alouatta seniculus
GNRR2_CLAGA	O42329	Clarias gariepinus	ADRB2_TSCTR	Q4KWL2	Tscherksia triton
CCRS_CERSO	Q9BGN6	Cercopithecus solatus	FSHR_EQUS	Q95179	Equus asinus
CCRS_CERLH	Q9XT76	Cercopithecus lhoesti	C3AR_ONCMY	Q2WED0	Oncorhynchus mykiss
GR101_LYMST	P46023	Lymnaea stagnalis	PAR1_CRILO	Q00991	Cricetulus longicaudatus
GHSR_MUSPF	A5A4L1	Mustela putorius furo	VGE1_EHV2	Q89609	Equine herpesvirus 2
CCRS_ERYP	Q95ND0	Erythrocebus patas	CNR1_TARGR	Q9PUI7	Taricha granulosa
CCRS_GORGO	P56439	Gorilla gorilla gorilla	CXCR4_TUPCH	Q7YS92	Tupaia chinensis
CCRS_PONPY	Q97881	Pongo pygmaeus	GPER1_MICUN	B0F9W3	Micropogonias undulatus
CCRS_HYLSY	Q95NC5	Hylobates syndactylus	CXCR4_PAPAN	P56491	Papio anubis
CCRS_TRAJO	Q95NC6	Trachypithecus johnii	CNR1_TAEGU	P56971	Taeniopygia guttata
CCRS_NASLA	Q95NC7	Nasalis larvatus	CNR1_RANES	Q33S9	Rana esculenta
CCRS_TRAFR	Q97878	Trachypithecus francoisi	GPR85_PONAB	Q5RBG7	Pongo abelii
CCRS_TRAPH	Q97879	Trachypithecus phayrei	VK02_SWPVK	Q08520	Swinepox virus
CCRS_COLPO	Q95NC8	Colobus polykomos	CXCR6_MACNE	O19024	Macaca nemestrina
CCRS_PYGBI	Q97880	Pygathrix bieti	V027_FOWPN	Q9J5H4	Fowlpox virus
OAR1_LOCMI	Q25321	Locusta migratoria	DRD1_DIDVI	P42288	Didelphis virginiana
CCRS_RHIAV	Q97962	Rhinopithecus avunculus	US28_HCMVM	F5HF62	Human cytomegalovirus
CCRS_MACAR	Q97975	Macaca arctoides			
CCRS_PYGNE	Q97882	Pygathrix nemaeus			
EDNRB_COTJA	Q90328	Coturnix coturnix japonica			
CCRS_CERTA	Q95NE8	Cercopithecus tantalus			
CCRS_CALMO	Q95NC2	Callicebus moloch			
CCRS_CERPY	Q9TV42	Cercopithecus pygerythrus			
CCRS_LOPAT	P61755	Lophocebus aterrimus			
CCRS_CERGA	Q9TV49	Cercocebus galeritus			