

## Protein structure and evolution

GT MASIM

16 novembre 2017

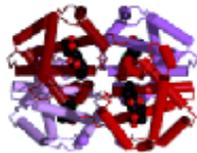
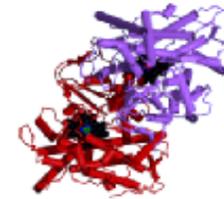
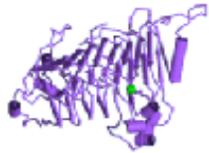
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MNHN – CNRS – UMPC - EPHE



# Atelier de BioInformatique (ABI) l'ISYEB (MNHN) since October 2015

## Permanent membres

G Achaz  
S Brouillet  
C Bertrand  
M Carpentier  
S Pasek  
J Pothier  
M Boccara

## Associated members

B Billoud  
E Duchaud  
G Sapriel  
H Soldano  
I Lafontaine  
P Brezellec



# Atelier de BioInformatique (ABI) ISYEB (MNHN) since October 2015

Spéciation  
Dynamique des populations

Modèles d'évolution  
Phylogénie

Evolution moléculaire

Alignement de séquences  
Anomalies de congruence

Topologie, repliement  
Modélisation moléculaire

Graphes de similarité  
Classification

Génomique  
Métagénomique

Structure des protéines,  
des ARN et morphogénèse

Extraction de motifs  
Data mining



# Protein structure comparison

## Structural database scanning

- Yakusa<sup>1,2</sup>

[www.rpsb.jussieu.fr/Yakusa/](http://www.rpsb.jussieu.fr/Yakusa/)

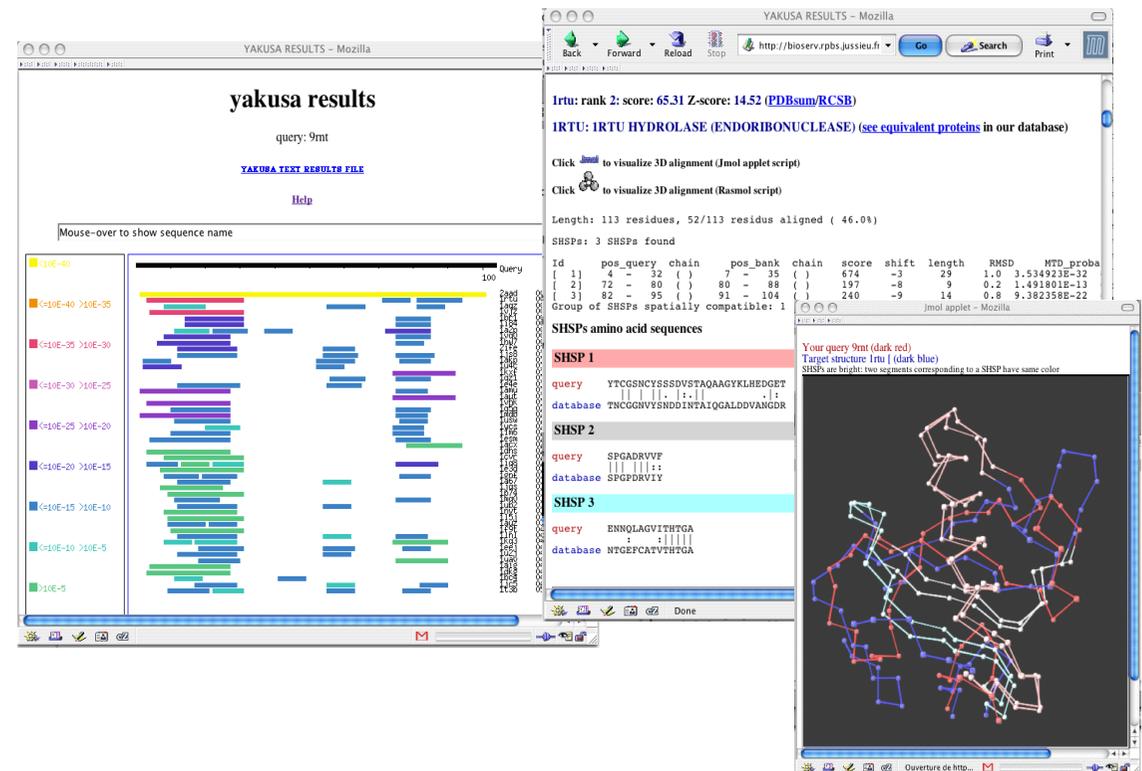
## Multiple structural alignment

- Gok (KMR + alpha angles)

- « m-diagonals » methods

- Gibbs sampler method

- Relational motifs (Triades)<sup>3,4</sup>



<sup>1</sup> M. Carpentier, S. Brouillet, J. Pothier, YAKUSA: a fast structural databases scanning method, Proteins: Structure, Function, and Bioinformatics, volume 61, issue 1, pages 137-51.

<sup>2</sup> C. Alland, F. Moreews, D. Boens, M. Carpentier, S. Chiusa, M. Lonquety, N. Renault, Y. Wong, H. Cantalloube, J. Chomilier, J. Hochez, J. Pothier, B.O. Villoutreix, J.-F. Zagury, P. Tuffery, ;

**RPBS: a web resource for structural bioinformatics**, Nucleic Acid Research, 2005, 33: W44-W49

<sup>3</sup> N. Pisanti, H. Soldano, M. Carpentier, J. Pothier. **A relational extension of the notion of motifs: application to the common 3D protein substructures searching problem**. J Comput Biol (2009) N. Pisanti, H. Soldano, M. Carpentier, **Incremental Inference of Relational Motifs with a Degenerate Alphabet**, Lecture Note in Computer Science (2005).

<sup>4</sup> N. Pisanti, H. Soldano, M. Carpentier, J. Pothier, **Implicit and Explicit Representation of Approximated Motifs** KCL series book, edited by C. Iliopoulos, K. Park and K. Steinhfel (2005)



# Comparison of sequence and structure alignment methods

- Do structure alignment methods detect homology?
- Are they better than sequence alignment methods?
- Is structure really more conserved than sequence?



# Comparison of sequence and structure alignment methods

Are structural alignments really better than sequence alignments ?

## Data

Reference dataset = Manually curated protein multiple alignments with resolved structures

- Balibase 2<sup>1</sup> : 29 alignments
- Balibase 3<sup>2</sup> : 38 alignments
- Sisyphus<sup>4</sup> : 94 alignments

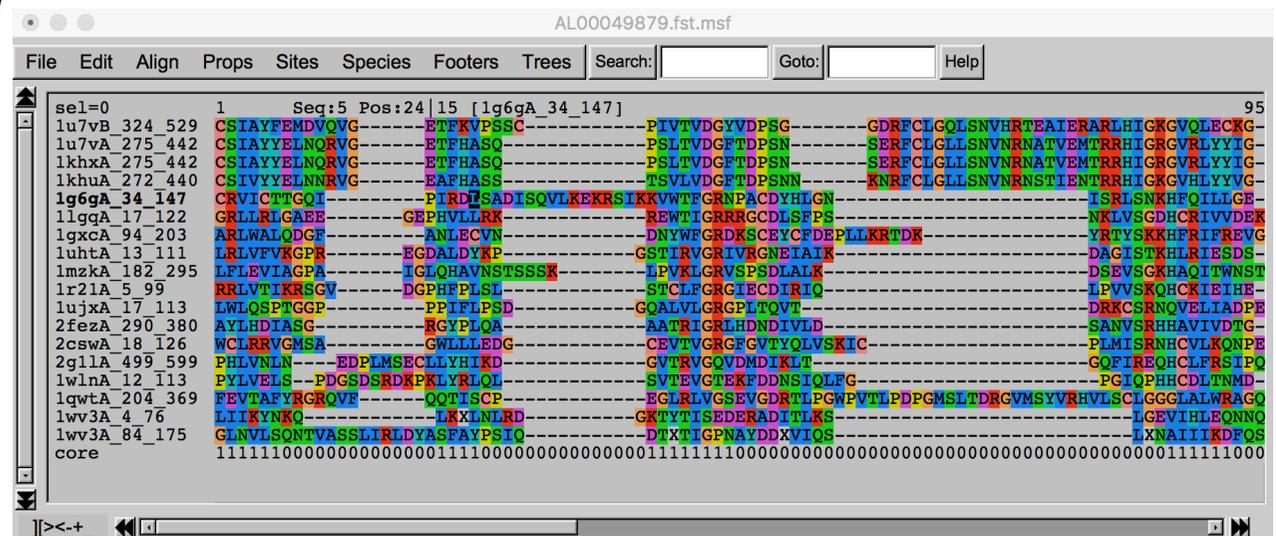
} 161 alignements

with a "core" alignment.

Homstrad<sup>3</sup> : 365 alignments

Problems:

alignment by CE,  
no manual curation,  
core=SSE



1 Thompson et al. 1999

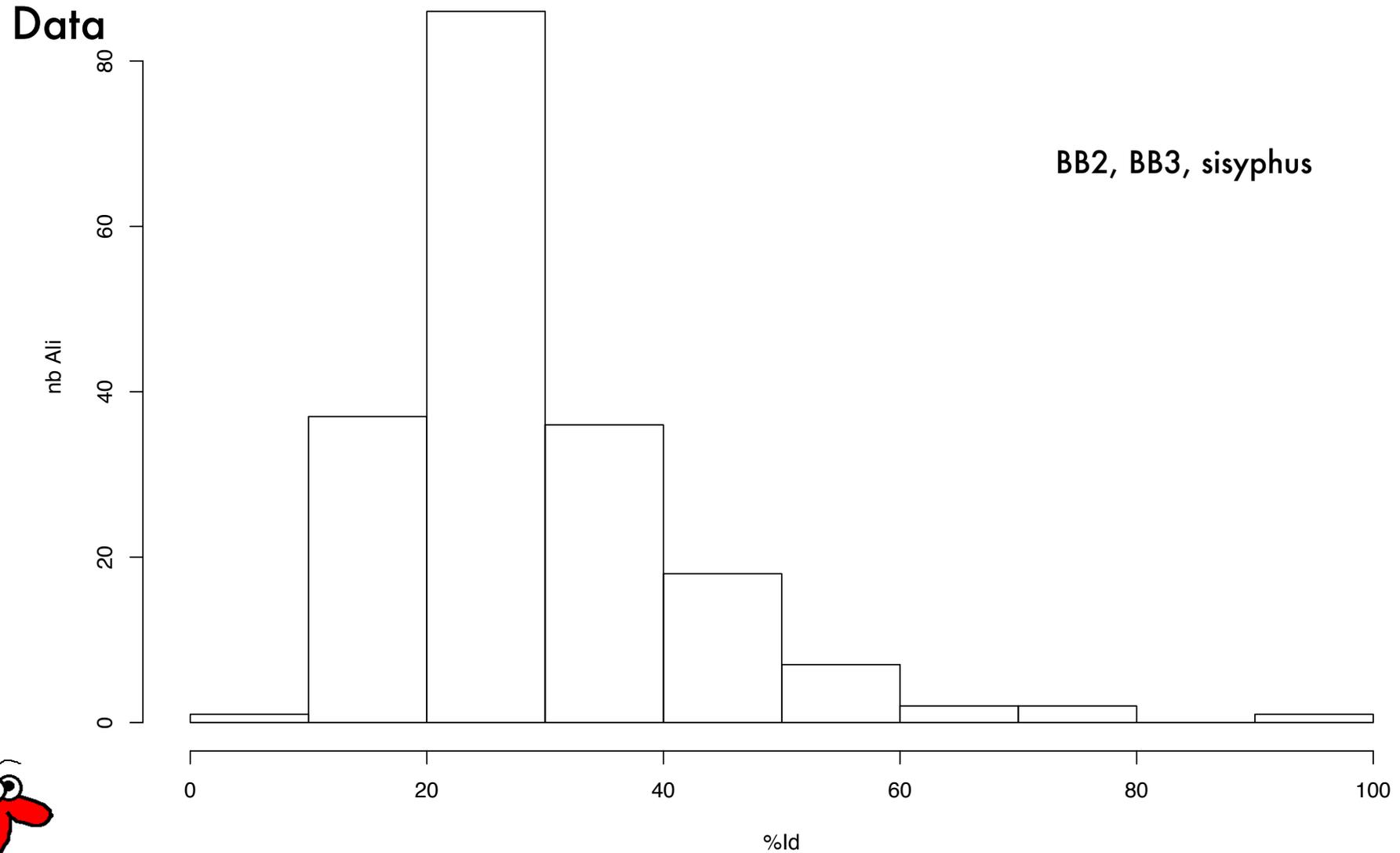
2 Thompson et al. 2005

3 Mizuguchi et al 1998

4 Andreeva et al 2007

# Comparison of sequence and structure alignment methods

distribution of core alignment % identity for all databases



# Comparison of sequence and structure alignment methods

## Scores <sup>1</sup>

- Sum of pairs (SP) : proportion of correctly aligned pairs

$$SP = \frac{\sum_{i=1}^M S_i}{\sum_{i=1}^{M_r} S_{ri}} \quad S_i = \sum_{j=1, j \neq k=1}^N \sum_{k=1}^N p_{ijk}$$

- Total Column (TC) : proportion of correctly aligned columns

$$CS = \frac{\sum_{i=1}^M C_i}{M}$$



# Comparison of sequence and structure alignment methods

## Sequence alignment methods

DIALIGN	Morgenstern et al.	1998
CLUSTALW	Thompson et al	1994
TCOFFEE	Notredame et al	2000
MAFFT	Katoh et al	2002
MUSCLE	Edgar	2004
PRANK	Loytnoja et al	2005
PROBCONS	Mhabhashyam et al	2005
CLUSTALO	Sivers et al.	2011



## Structural alignment methods

## Structure+Sequence alignment methods

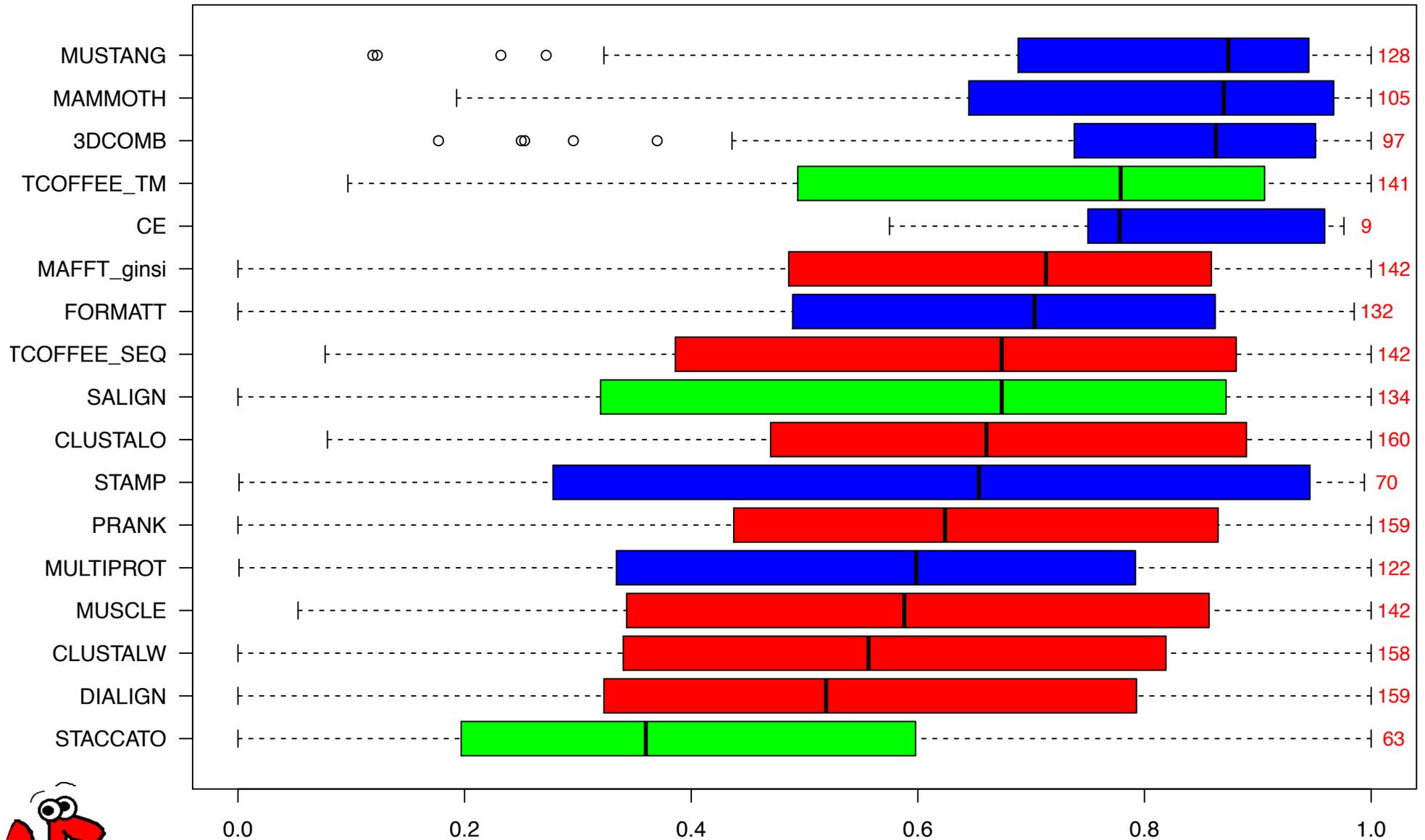
SSAP	C. Orengo & W. Taylor	1989
<b>STAMP</b>	<b>R. Russell and G. Barton</b>	<b>1992</b>
multal	Taylor, Flores et Orengo	1994
ProFit	ACR. Martin	1996
<b>CE/CE-MC</b>	<b>I. Shindyalov</b>	<b>2000</b>
<u>Matras</u>	<u>K. Nishikawa</u>	<u>2000</u>
PrISM	B. Honig	2000
MASS	O. Dror and H. Wolfson	2003
MolCom	S.D. O'Hearn	2003
<u>SSM</u>	<u>E. Krissinel</u>	<u>2003</u>
MALECON	S. Wodak	2004
<b>MultiProt</b>	<b>M. Shatsky and H. Wolfson</b>	<b>2004</b>
SWAPSC	Mario A. Fares	2004
C-BOP	E. Sandelin	2005
<b>MAMMOTH-mult</b>	<b>D. Lupyan</b>	<b>2005</b>
<b>MUSTANG</b>	<b>A.S. Konagurthu et al.</b>	<b>2005</b>
POSA	Y. Ye and A. Godzik	2005
TetraDA	J. Roach	2005
CBA	J. Ebert	2006

<b>STACCATO</b>	<b>Shatsky et al.</b>	<b>2006</b>
STRAP	C. Gille	2006
UCSF Chimera	E. Meng <i>et al.</i>	2006
CURVE	D. Zhi	2006
CAALIGN	T.J. Oldfield	2007
CLEMAPS	W-M. Zheng	2007
<b>3DCOFFEE</b>	<b>Notredame et al.</b>	<b>2007</b>
PyMOL	W. L. DeLano	2007
<b>SALIGN</b>	<b>M.S. Madhusudhan et al.</b>	<b>2007</b>
Vorolign	Birzele F, Gewehr J E, Csai	2007
BLOMAPS	W-M. Zheng & S. Wang	2008
<b>Matt/Formatt</b>	<b>M. Menke</b>	<b>2008</b>
mistral	micheletti et orland	2009
SMOLIGN	H. Sun et al	2010
EpitopeMatch	S. Jakushev	2011
<b>3DCOMB</b>	<b>S. Wang and J. Xu</b>	<b>2012</b>
msTALI	P. Shealy & H. Valafar	2012
mulPBA	A.P. Joseph <i>et. al.</i>	2012
Fit3D[9]	F. Kaiser <i>et al.</i>	2015



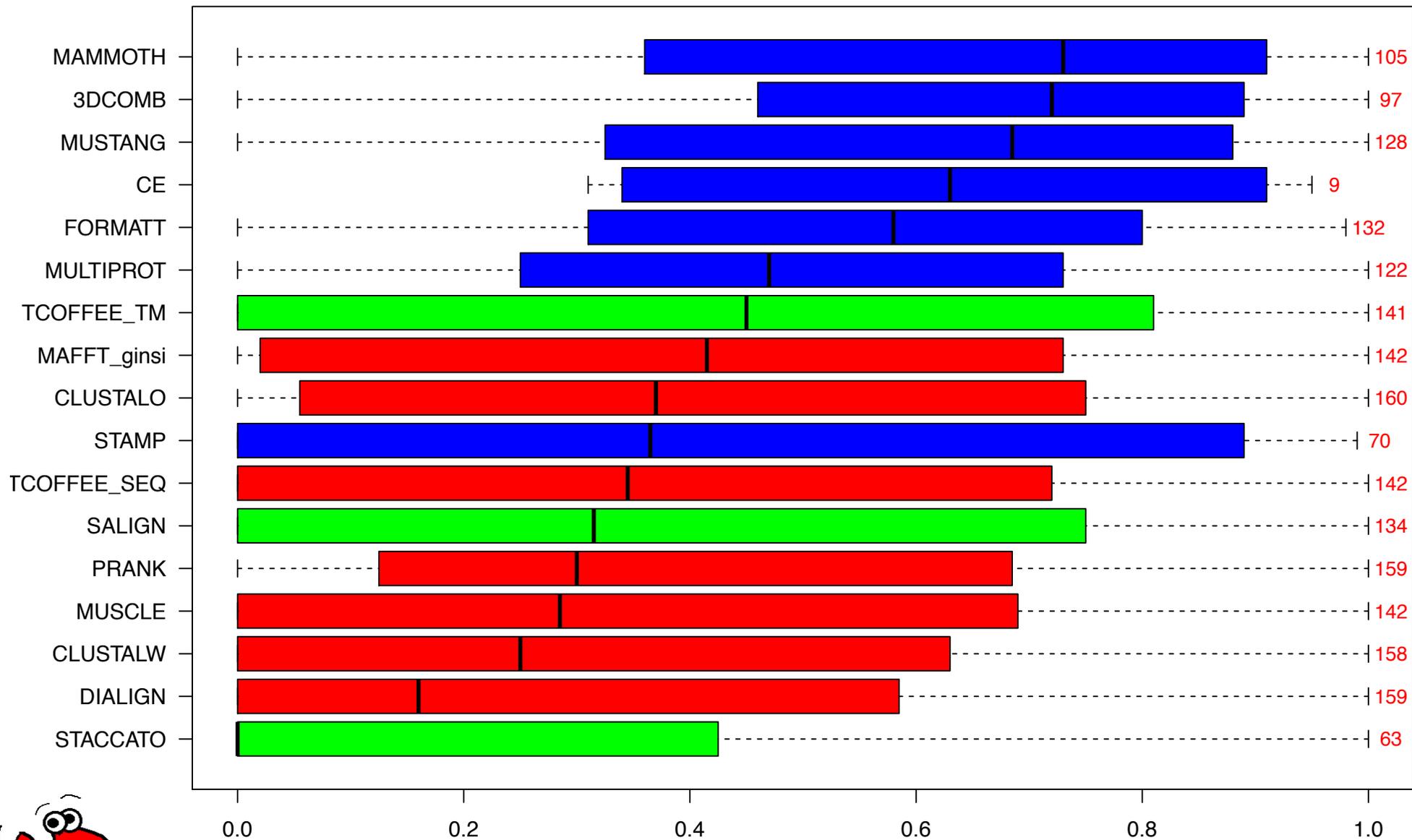
# SP (sum of pairs)

Boxplots of SP scores for BB2, BB3, sisyphus  
Number of alignments in red



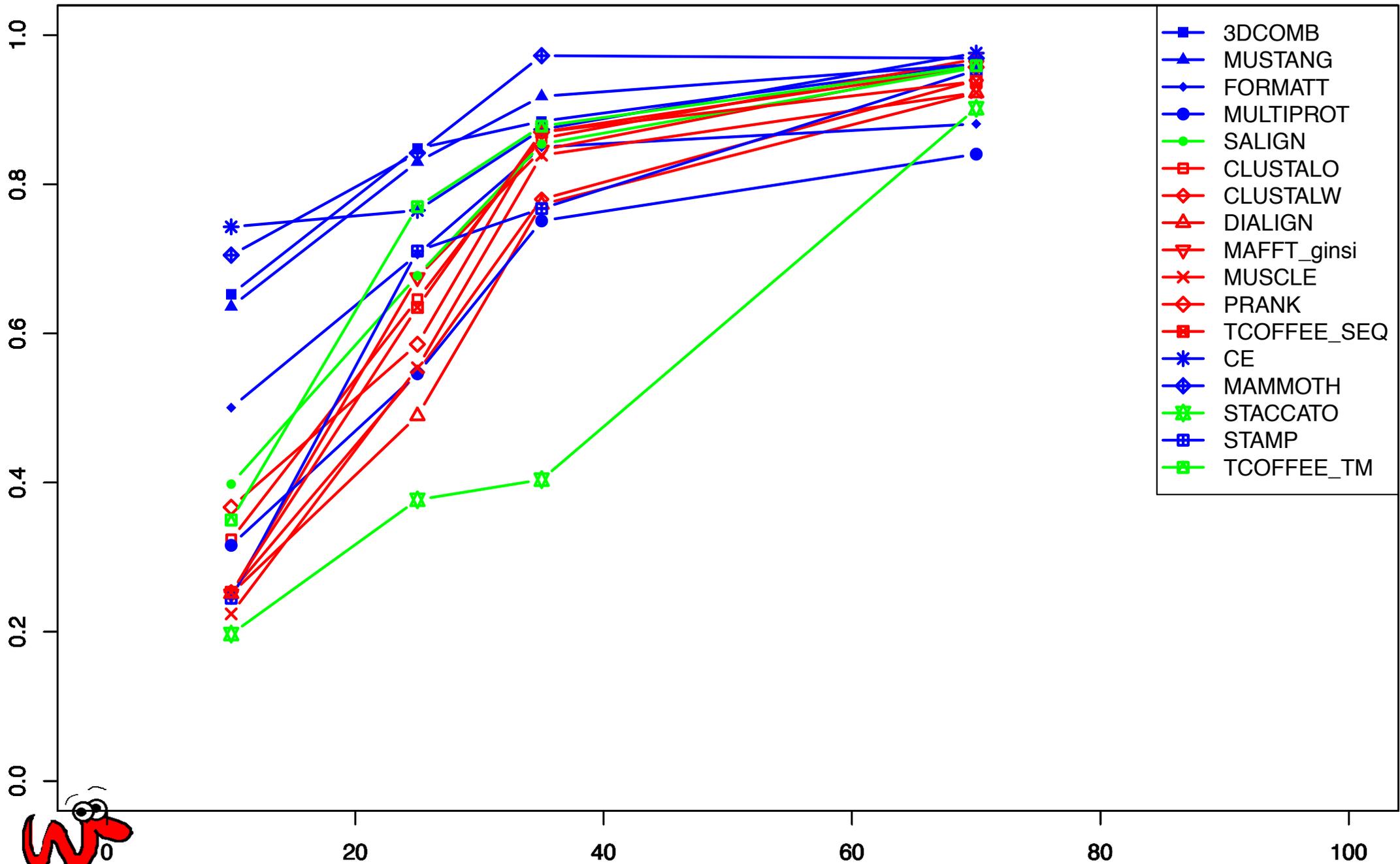
# TC (Total Columns)

Boxplots of TC scores for BB2, BB3, sisyphus  
Number of alignments in red



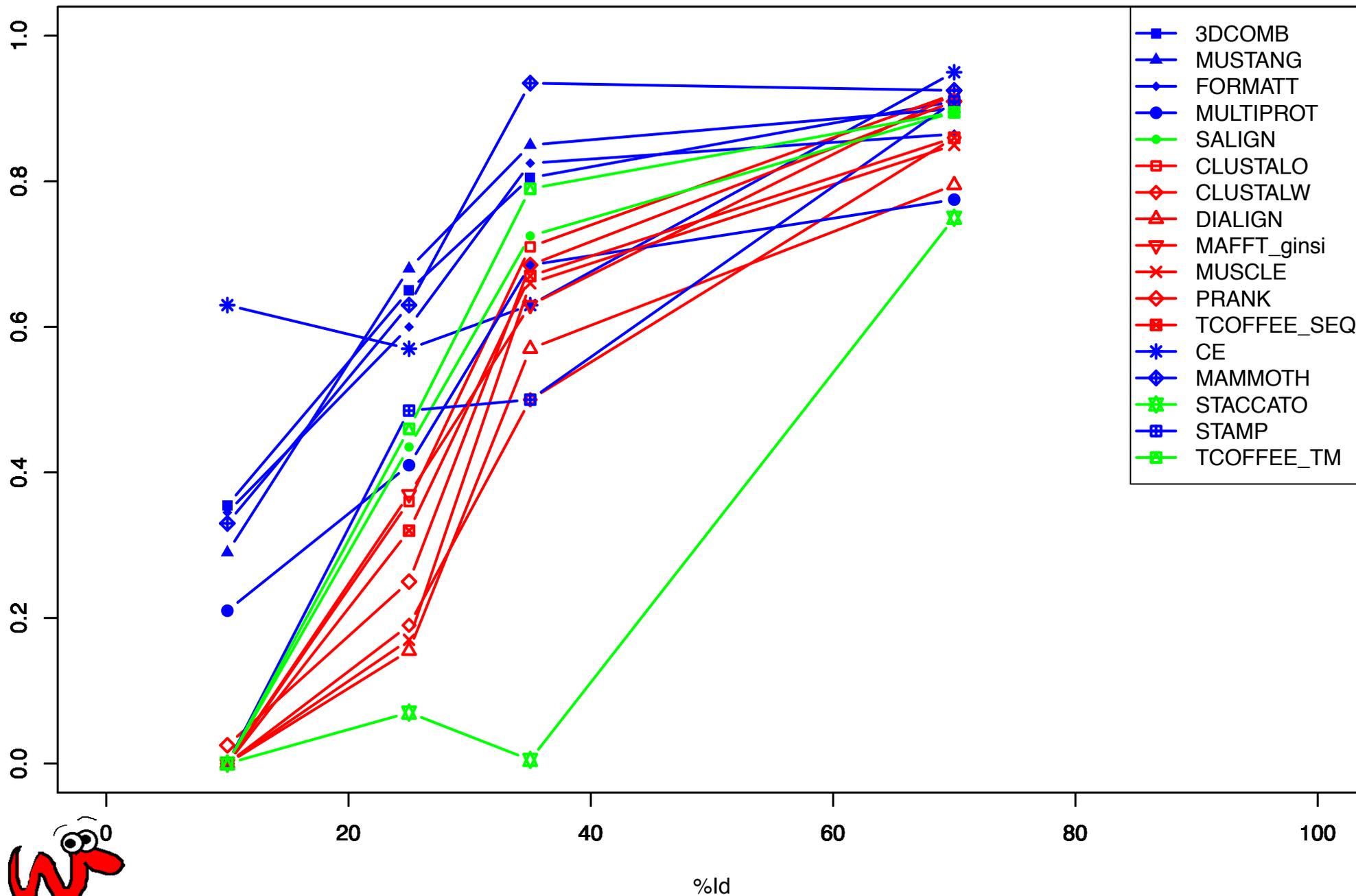
# Results

## Median SP for each program for BB2, BB3, sisyphus

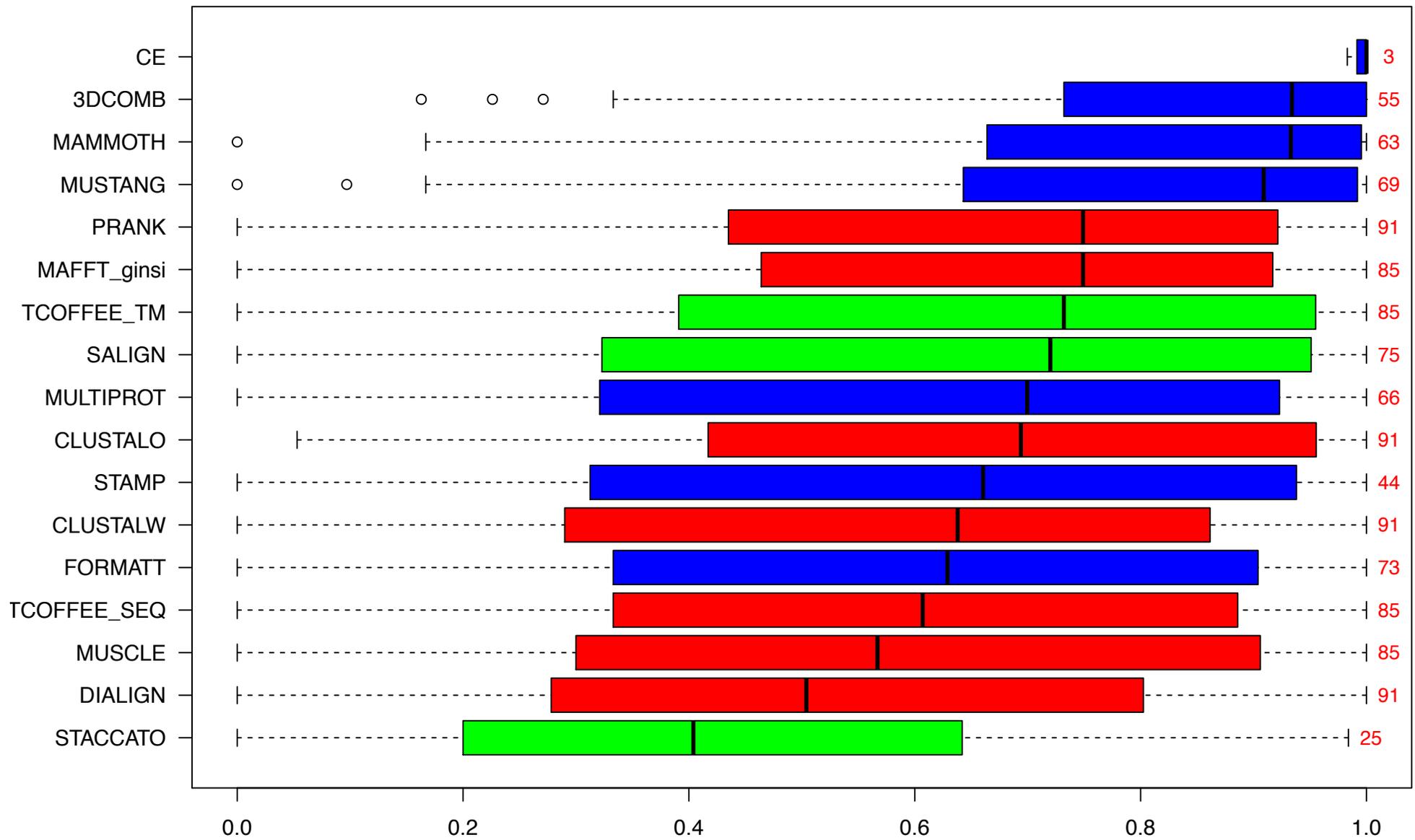


# Results

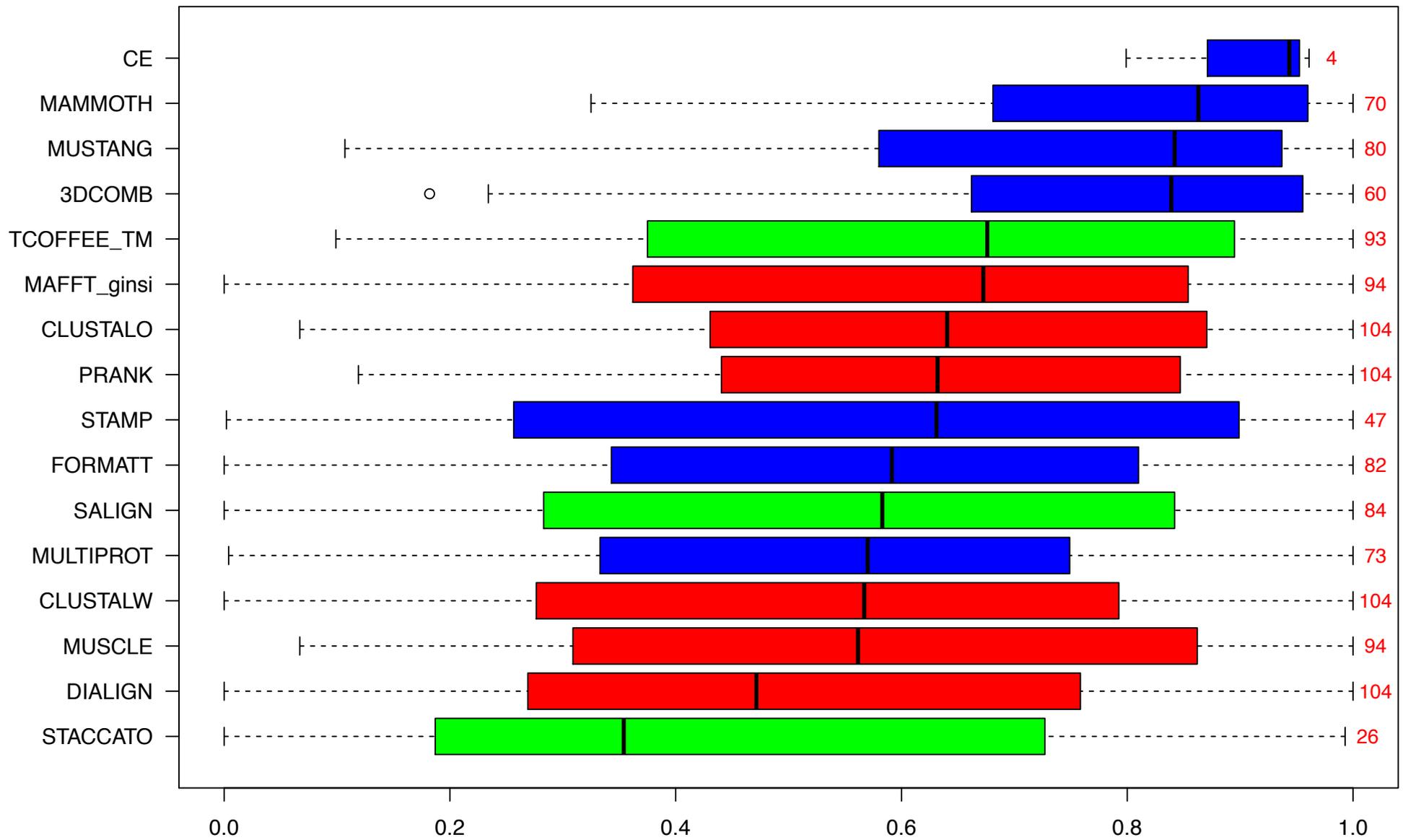
## Median TC for each program for BB2, BB3, sisyphus



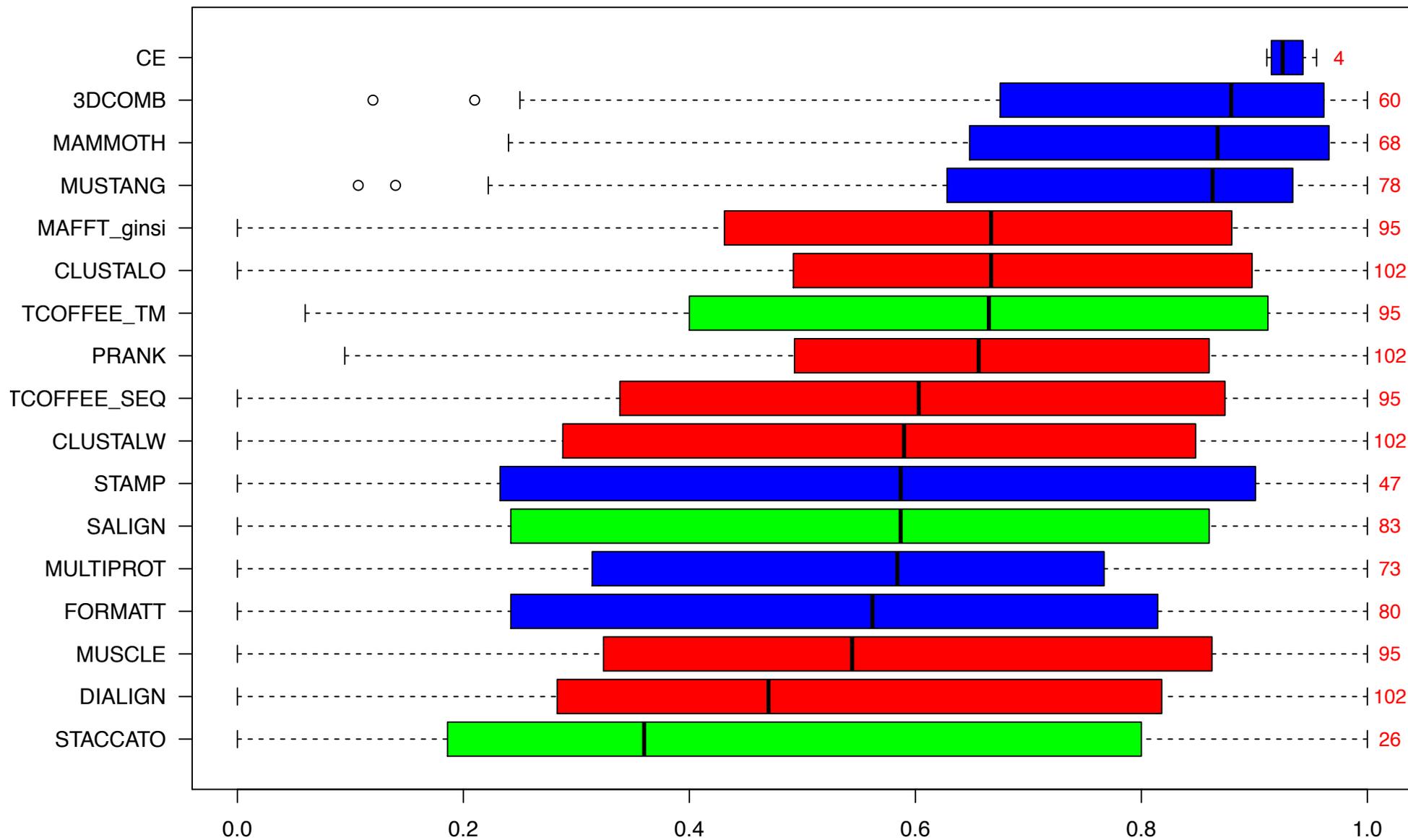
## SP Residues in helices



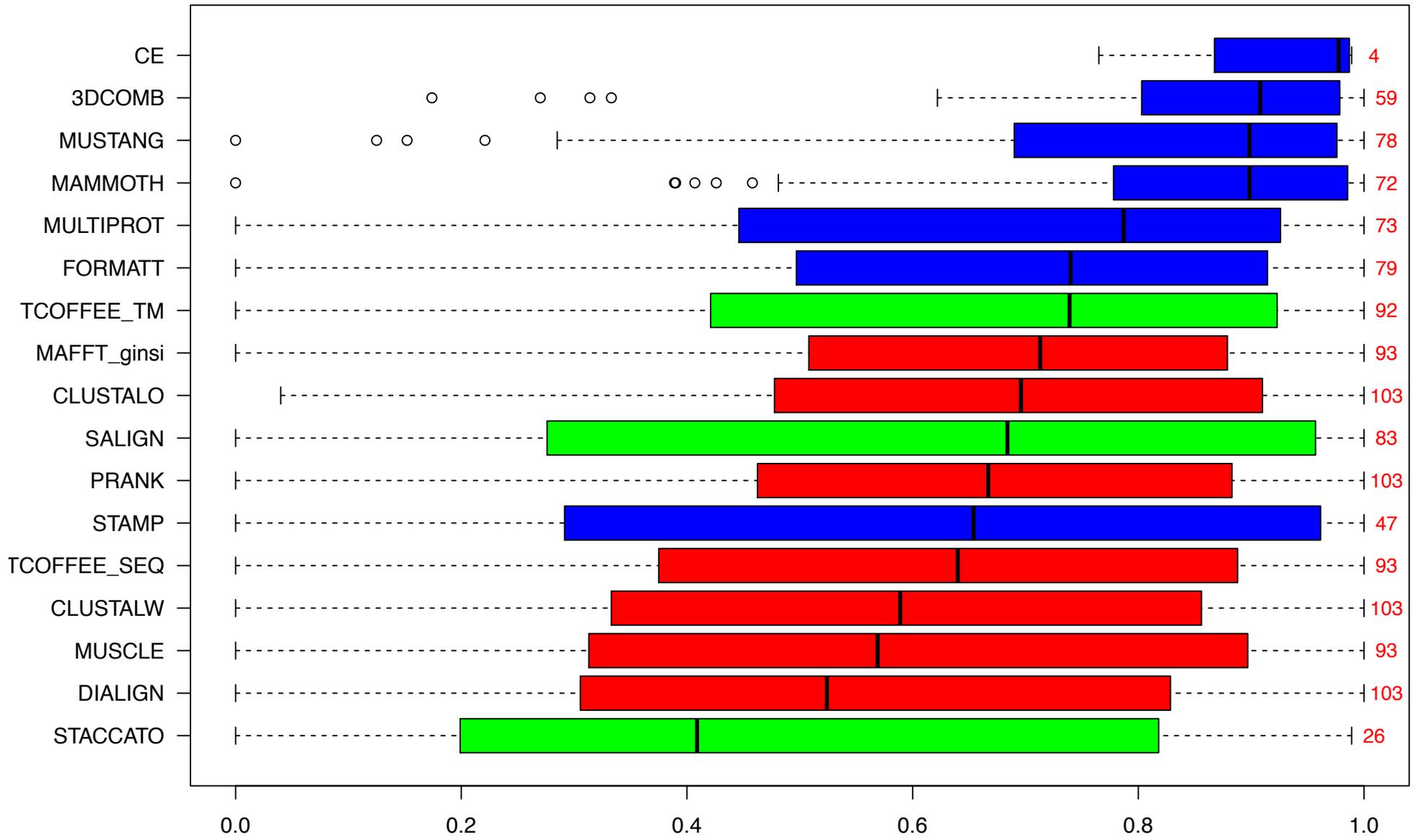
## SP Residues in strands



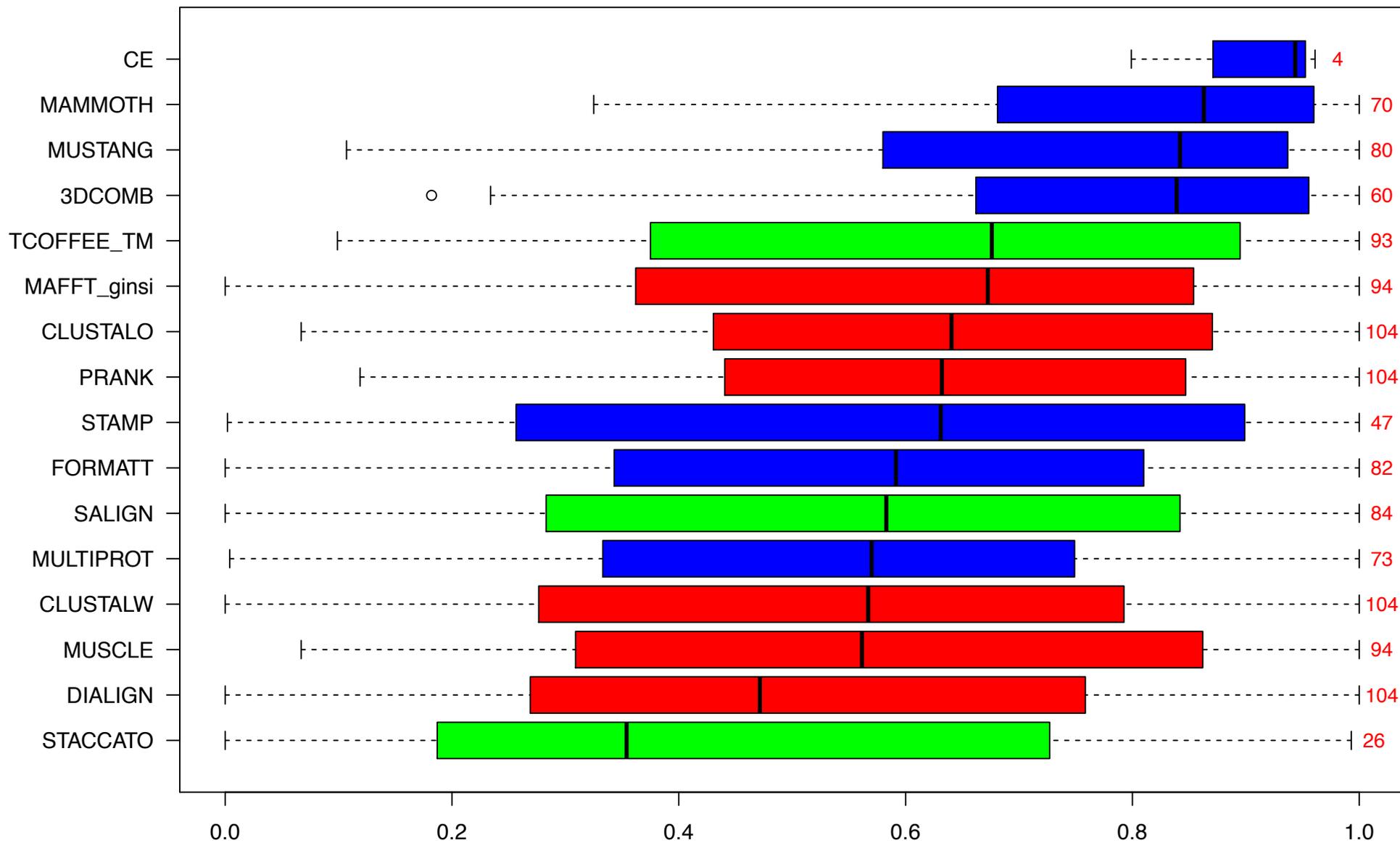
## SP Other residues

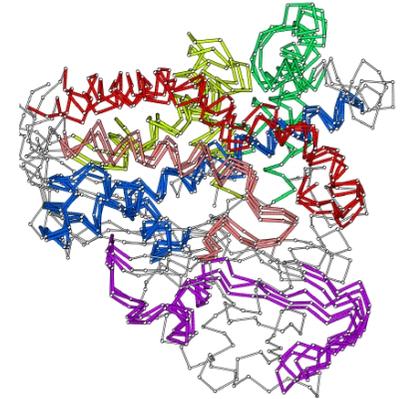


# SP Buried residues



## SP Exposed residues





### Protein structure alignments

- Do structure alignments methods detect homology?  
=> yes
- Are they better than sequence alignment methods?  
=> yes
- Does structure really more conserved than sequence?  
=> yes

How to combine structure and sequence information ?

### Structure evolution

- How a structure is modified by a substitution or an insertion/deletion?
- Can we define a « structural profile »?
- Is it possible to define an evolutionary model taking into account structure and sequence ?



Merci de votre attention !

Et Merci à :

**ABI**

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Henry Soldano

Nadia Pisanti

Sophie Brouillet

Guillaume Achaz

Martine Boccaro

Guillaume Santini

**IMPMC**

Jacques Chomilier

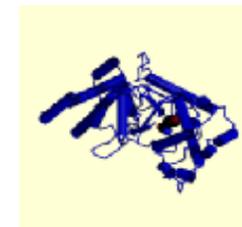
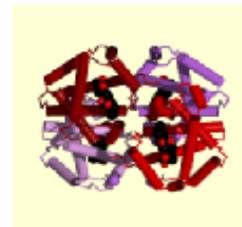
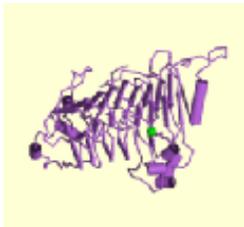
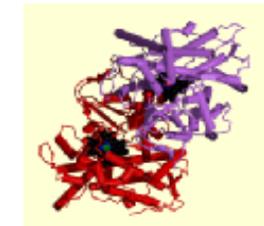
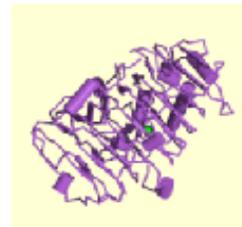
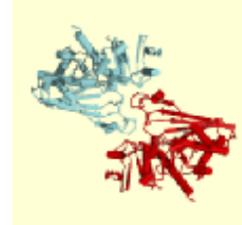
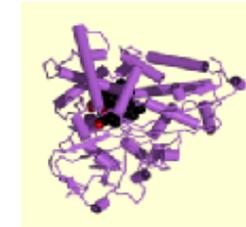
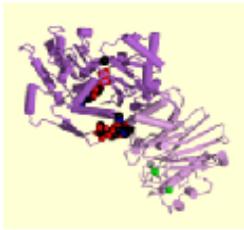
**UFIP**

Yves-Henri SANEJOUAND

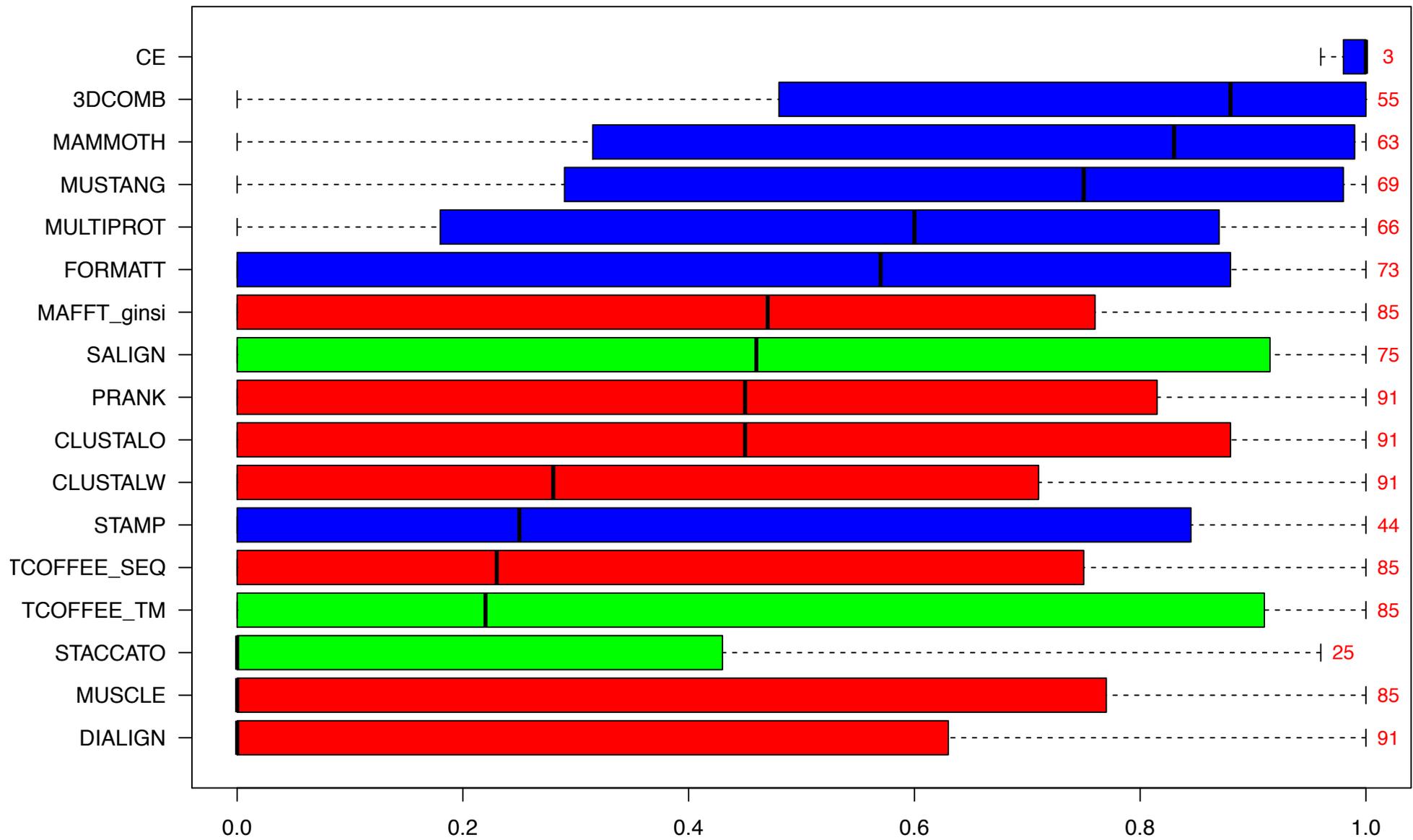
Et merci aux étudiants :

Clément Joubert

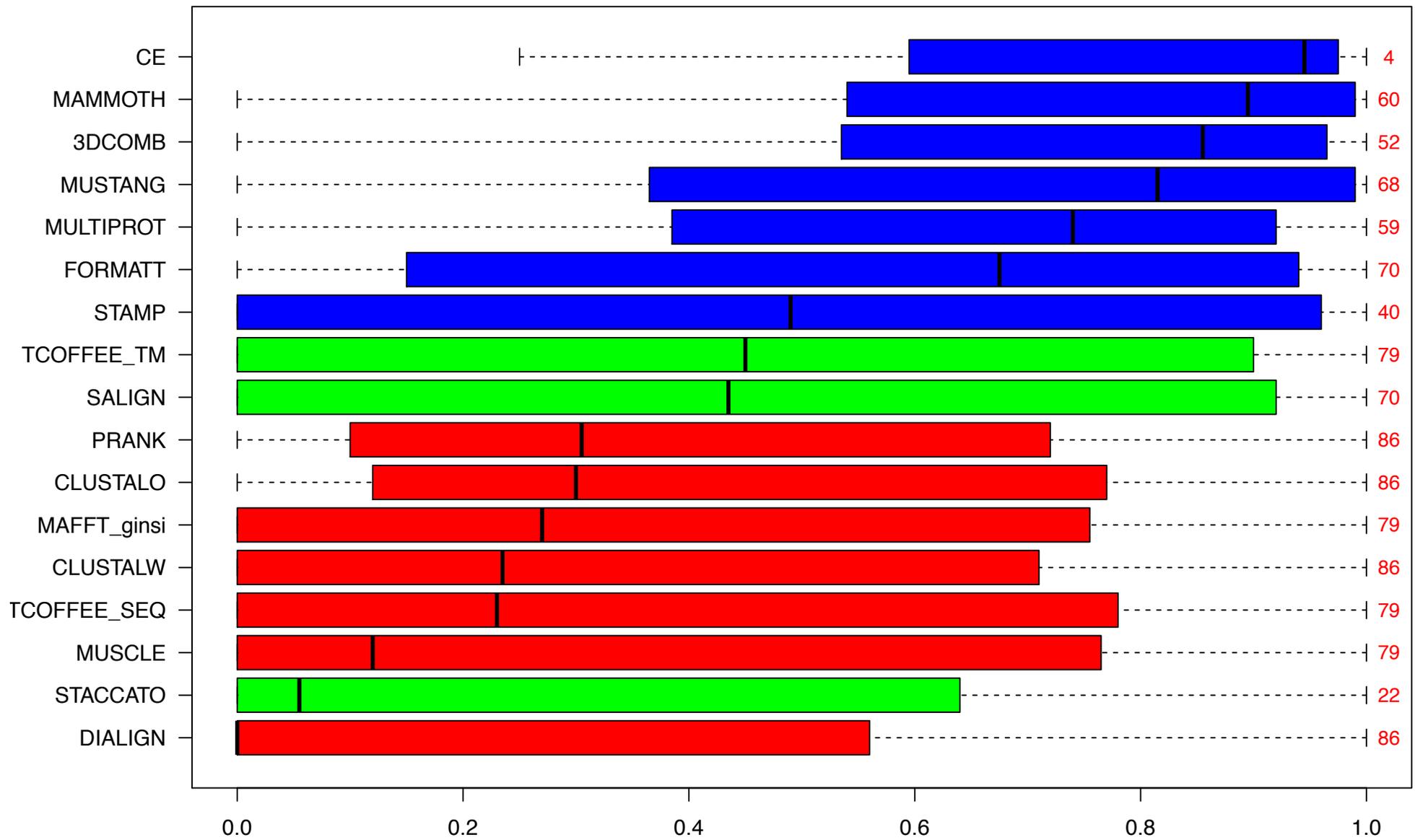
Suvethigaa Shanthirabalan



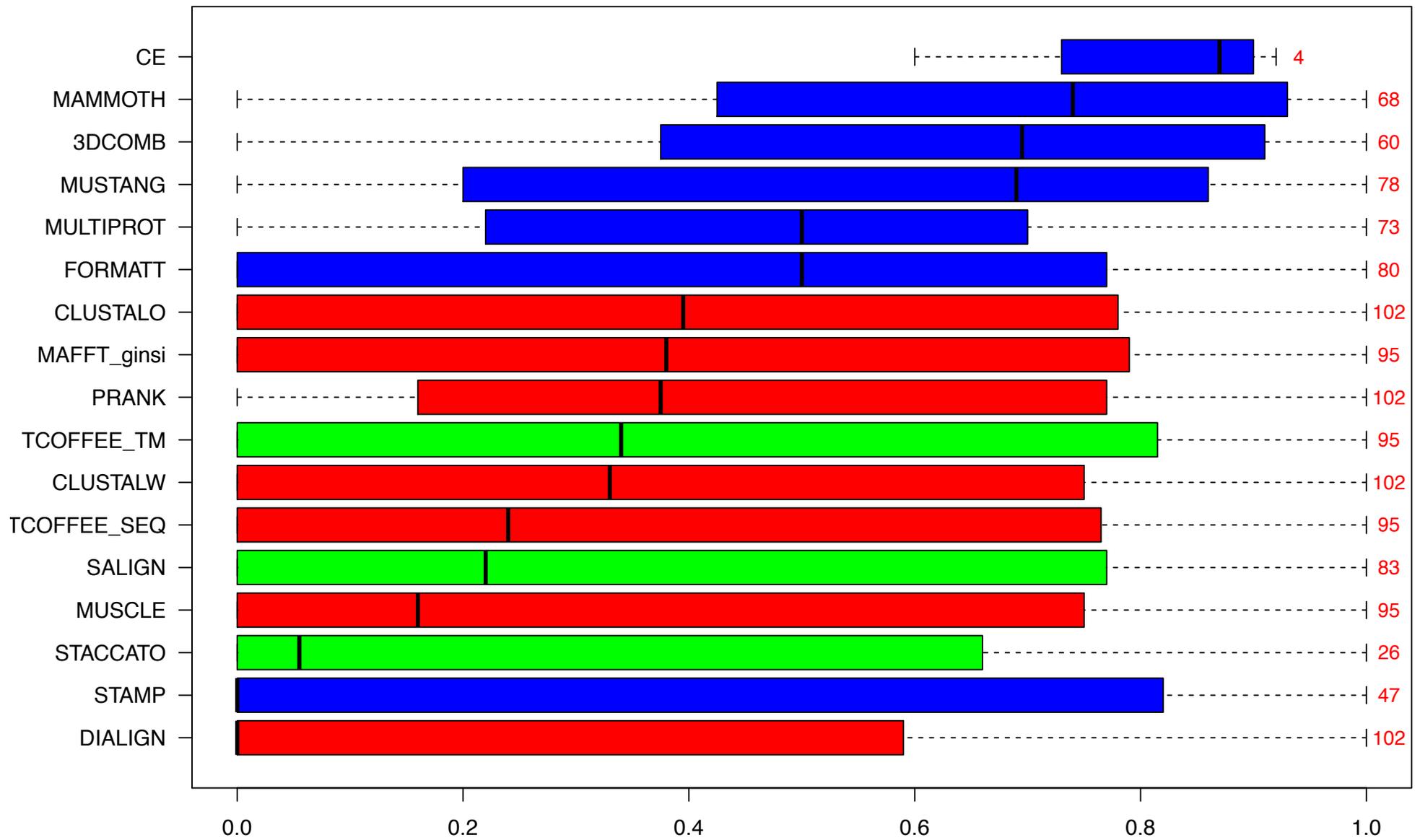
## TC Residues in helices



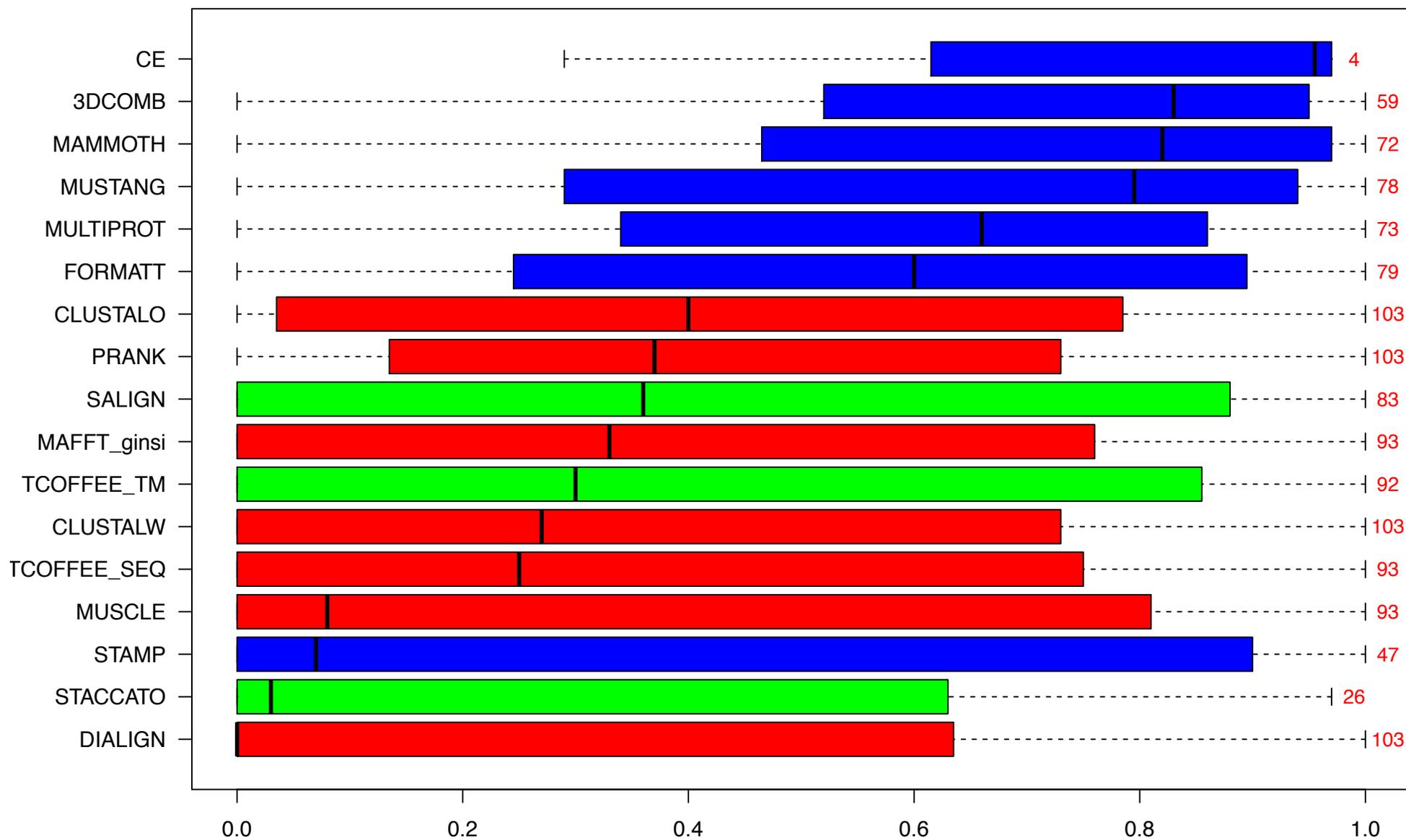
## TC Residues in strands



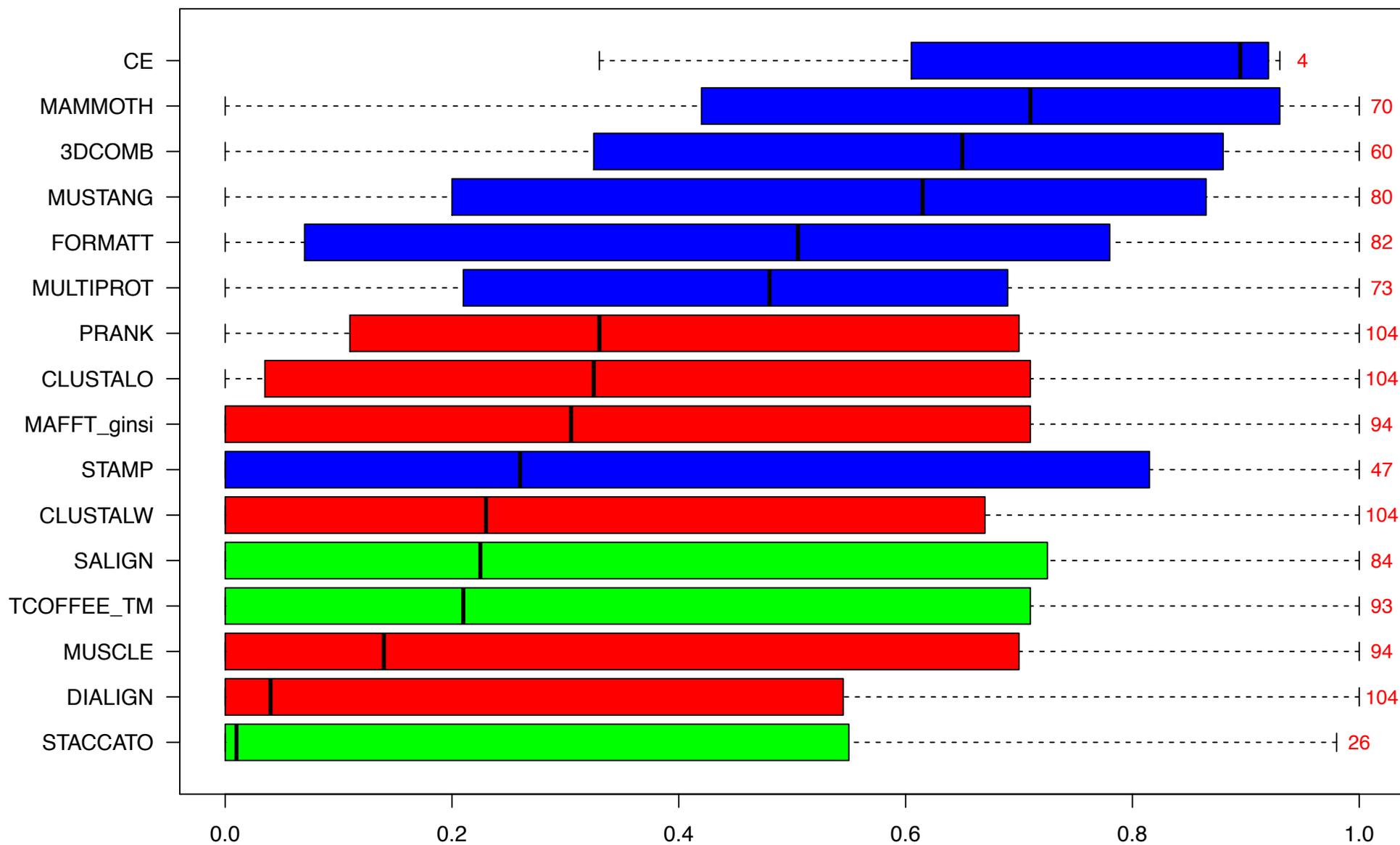
## TC Other residues



## TC Buried residues

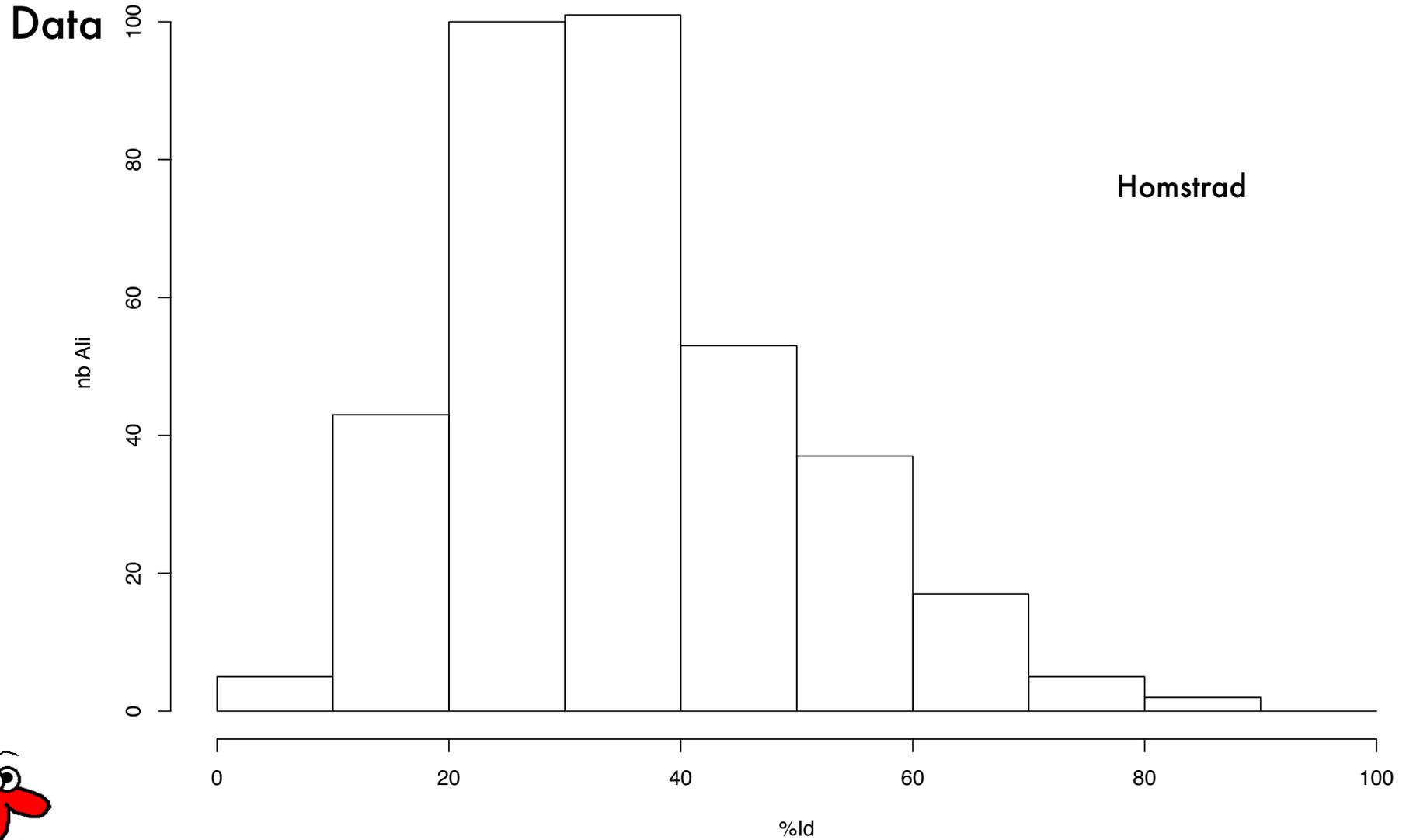


## TC Exposed residues



# Comparison of sequence and structure alignment methods

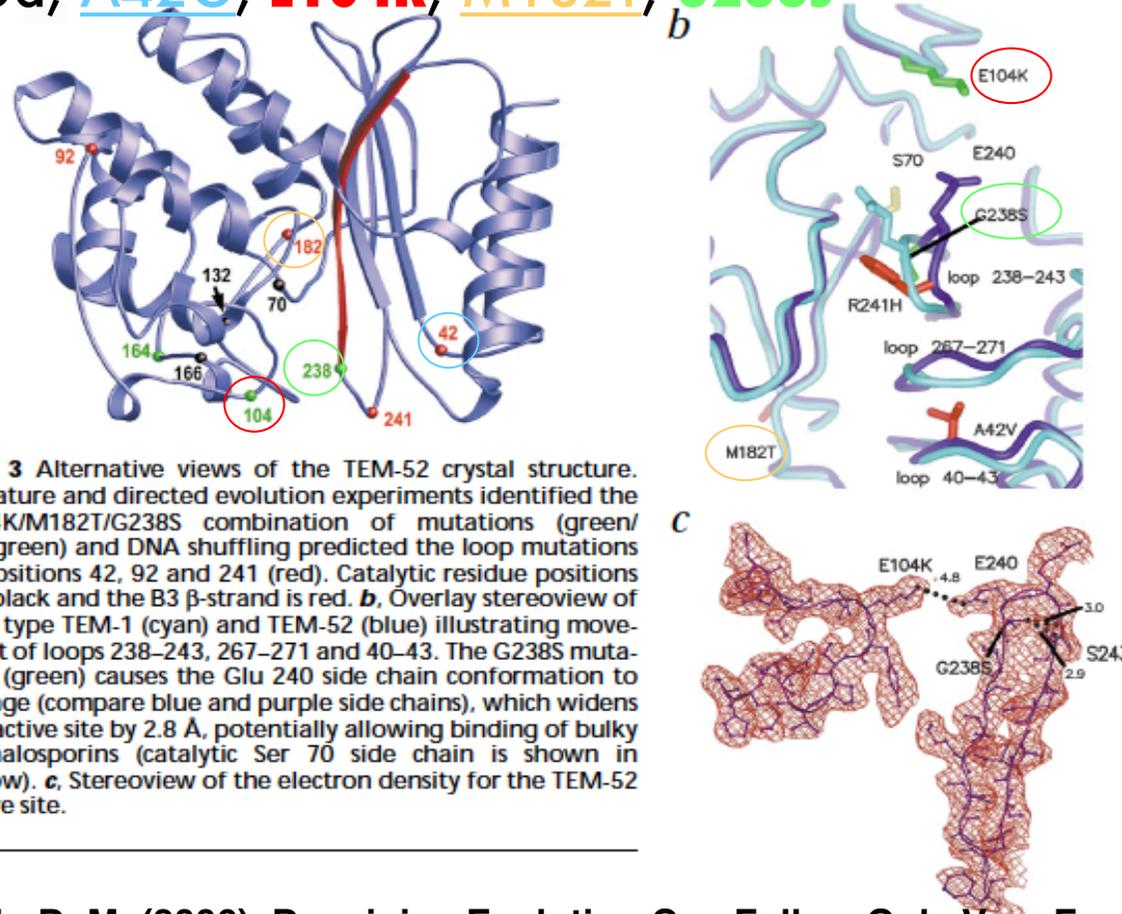
distribution of core alignment % identity for homstrad



# Un exemple

- Etude de la résistance à la pénicilline : 5 mutations dans une  $\beta$ -lactamase augmente la résistance par  $\sim 100\ 000$ :

g4205a, A42G, **E104K**, M182T, **G238S**



- Weinreich, D. M. (2006). Darwinian Evolution Can Follow Only Very Few Mutational Paths to Fitter Proteins. *Science (New York, NY)*, 312(5770).
- Orenca, M. C., Yoon, J. S., Ness, J. E., Stemmer, W. P., & Stevens, R. C. (2001). Predicting the emergence of antibiotic resistance by directed evolution and structural analysis *Nature structural biology*, 8(3).



# Mettre de la dynamique dans les structures protéiques pour comprendre leur évolution.

Les modes normaux semblent conservés dans les familles structurales<sup>1</sup>  
Les structures se déformeraient dans le même sens que les modes normaux basses fréquences<sup>2,3,4</sup>. et aussi <sup>5</sup>.

1. Maguid S, Fernandez-Alberti S, Echave J (2008) Evolutionary conservation of protein vibrational dynamics. *Gene* 422:7–13.

**2. Leo-Macias A, Lopez-Romero P, Lupyan D, Zerbino D, Ortiz AR (2005) An analysis of core deformations in protein superfamilies. *Biophys J* 88:1291–1299.**

3. Friedland GD, Lakomek N-A, Griesinger C, Meiler J, Kortemme T (2009) A Correspondence between solution-state dynamics of an individual protein and the sequence and conformational diversity of its family. *PLoS Comput Biol*.

4. Velazquez-Muriel JA, Rueda M, Cuesta I, Pascual-Montano A, Orozco M, Carazo J-M (2009) Comparison of molecular dynamics and superfamily spaces of protein domain deformation. *BMC Struct Biol* 9:6.

**5. Echave, J. & Fernández, F. M. A perturbative view of protein structural variation. *Proteins* 78, 173–180 (2010).**

+ **Aussi** Liberles, D. A. *et al.* The interface of protein structure, protein biophysics, and molecular evolution. *Protein Sci* 21, 769–785 (2012).



Leo-Macias A, Lopez-Romero P, Lupyan D, Zerbino D, Ortiz AR (2005)  
An analysis of core deformations in protein superfamilies. *Biophys J*  
88:1291–1299.

Alignements multiples calculés avec MAMMOTH de 35 familles SCOP de 11 à 36 protéines  
- Calculs des modes normaux (ANM) et PCA pour capturer les déformations principales

- Calcul du RMSi pour les comparer:

*The overlap between both spaces is calculated from the root mean-square inner product (root mean-square inner product) (Amadei et al., 1999) of the PCA eigenvectors with the vibrational ones:*

$$RMSIP = \left( \frac{1}{D} \sum_{i=1}^D \sum_{j=1}^K (\boldsymbol{\eta}_i \cdot \boldsymbol{v}_j)^2 \right)^{1/2} .$$

Here,  $\boldsymbol{\eta}_i$  and  $\boldsymbol{v}_j$  are, respectively, the set of eigenvectors of the evolutionary and ANM spaces, with dimensionality equal to three times the number of residues defined.  $D$  is the dimensionality of the evolutionary space (five dimensions were used on average), and  $k$  is the dimensionality of the ANM space (the slowest 50 modes were employed).

+ calcul d'une distribution aléatoire et d'un z-score



Leo-Macias A, Lopez-Romero P, Lupyan D, Zerbino D, Ortiz AR (2005)  
An analysis of core deformations in protein superfamilies. *Biophys J*  
88:1291–1299.

- ⇒ « **70% of the total variance** in the core fluctuations can be explained with an average of **4.5 + ou -1.2 components**. »
- ⇒ « For most superfamilies there is a moderate degree of **correlation** between the **root mean-squared** fluctuations observed in the core, as computed from the alignments, and the fluctuations predicted by **ANM**, with correlations in the range of 0.3–0.8. »
- ⇒ « More interesting is the finding that the adaptive movements responsible for these fluctuations are highly cooperative, taking place in a space of **low dimensionality**, of only 4–5 dimensions, and similar in all superfamilies. Because side chain degrees of freedom in the protein core are basically dictated by the backbone conformation (Levitt et al., 1997), this finding suggests that in fact, and as far as the core region is concerned, the **conformational space to sample in model refinement is fairly small**. »
- ⇒ « We conclude that, to a significant extent, **the structural response of a protein topology to sequence changes takes place by means of collective deformations along combinations of a small number of low-frequency modes**. The findings have implications in structure prediction by homology modeling. »



Echave, J. & Fernández, F. M. A perturbative view of protein structural variation. *Proteins* 78, 173–180 (2010).

The ENM potential is of the form

$$V_{\text{wt}} = \frac{1}{2} (\mathbf{r} - \bar{\mathbf{r}}_{\text{wt}})^T \mathbf{K} (\mathbf{r} - \bar{\mathbf{r}}_{\text{wt}}), \quad (1)$$

where, for a protein of  $N$  sites,  $\mathbf{r}$  is a column vector with  $3N$  elements: the  $x, y, z$  coordinates of the  $N C_{\alpha}$ ,  $\bar{\mathbf{r}}_{\text{wt}}$  is the equilibrium structure, and  $\mathbf{K}$  is the “stiffness” matrix, which represents the network’s topology and spring force constants.

We model a point mutation (amino acid replacement) by adding a linear perturbative term to the reference potential Eq. (1):

$$V_{\text{mut}} = V_{\text{wt}} - \mathbf{f}^T (\mathbf{r} - \bar{\mathbf{r}}_{\text{wt}}), \quad (2)$$

where  $\mathbf{f}$  is a column vector with  $3N$  elements that models the mutation. Since  $\mathbf{f} = -\left(\frac{\partial V_{\text{mut}}}{\partial \mathbf{r}}\right)_{\mathbf{r}=\bar{\mathbf{r}}_{\text{wt}}}$ , it can be interpreted as a force that drives the mutant’s structure away from that of the wild type. Eq. (2) can be derived by expanding the ENM potential in Taylor series with respect to parameter variations and keeping only first and second order terms, as is shown in the Supporting Information Appendix.

The equilibrium structure of the mutant  $\bar{\mathbf{r}}_{\text{mut}}$  is the value of  $\mathbf{r}$  that minimizes  $V_{\text{mut}}$ . Using Eqs. (1) and (2) we find the structural variation due to the mutation:

$$\delta \bar{\mathbf{r}} \equiv \bar{\mathbf{r}}_{\text{mut}} - \bar{\mathbf{r}}_{\text{wt}} = \mathbf{K}^{-1} \mathbf{f}. \quad (3)$$

⇒ **Divergence structurale le long des modes basses fréquences, qu’il y ait sélection ou non**



# Evolution des structures protéiques

## Vers un modèle d'évolution structurale des protéines ?

Etude de l'effet :

- des mutations
- des insertions/délétions
- (de la co-évolution)



# Effet des mutations : quel est l'impact d'une mutation sur une structure ?

Banque de données:

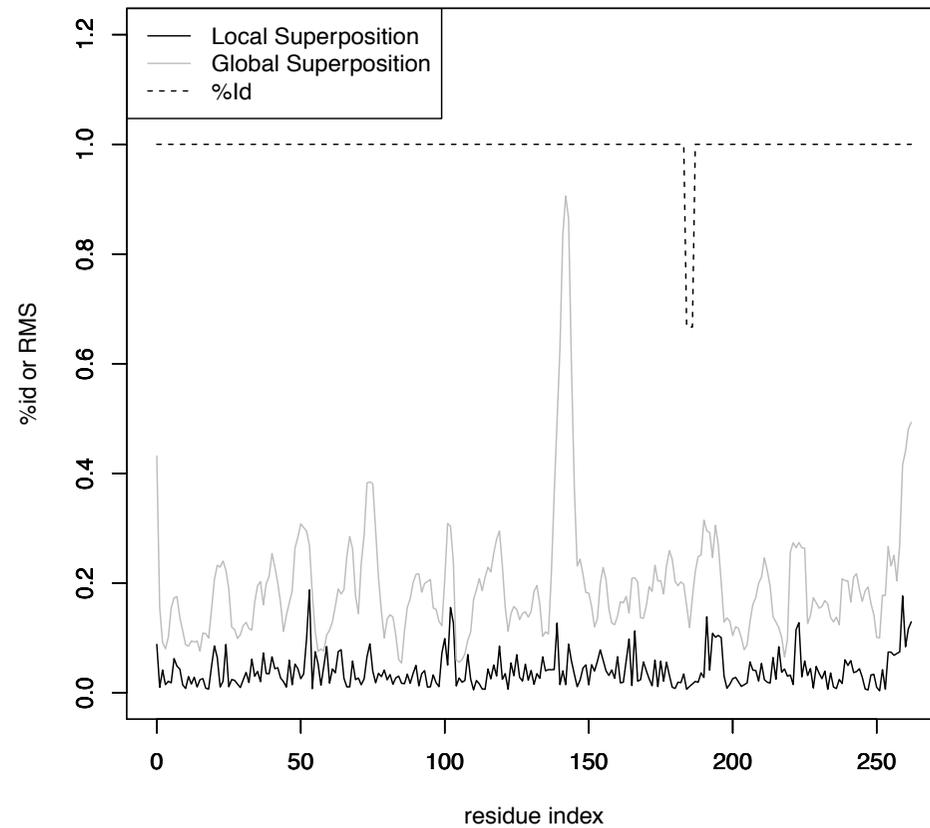
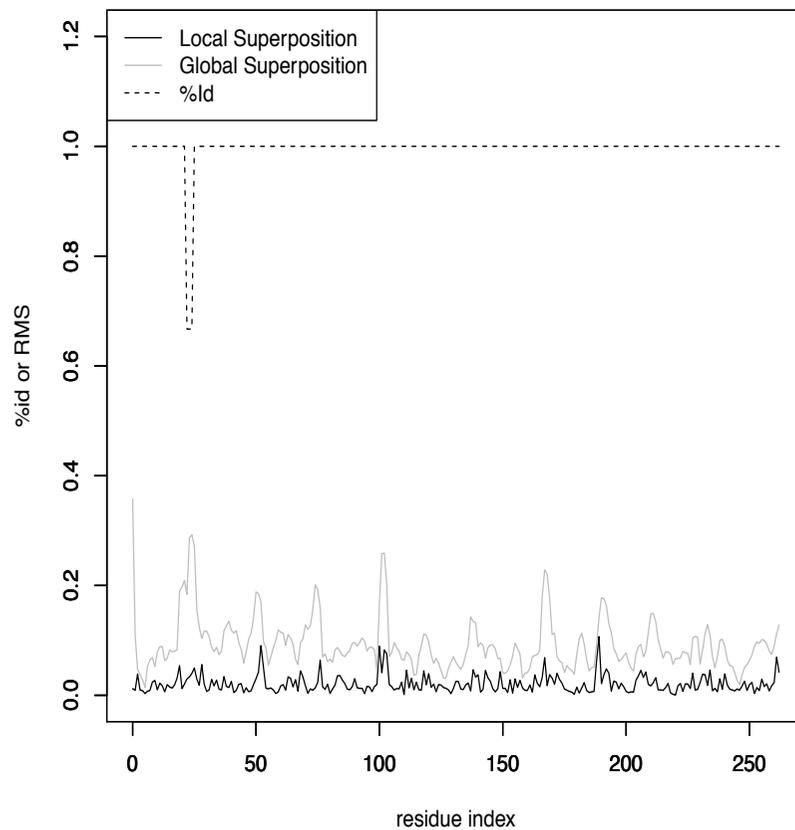
Rank	Members	Reference	Length	Protein	Class	Cluster
1	147	1lw9	164	T4 lysozyme	Alpha	31255
2	124	2nwd	130	Human lysozyme	Alpha	37522
3	78	2dek	265	Transferase	Alpha beta	18272
4	69	2ili	255-260	Anhydrase II	Alpha beta	18267
5	31	1ey0	149	Staphylococcal nuclease	Beta	34381
6	29	4bfl	753	Catalase HPII	Multi-domain	796
7	25	2e3w	124	Ribonuclease A	Alpha beta	38031
8	24	2vb1	129	Hen lysozyme	Alpha	37731
9	22	4fi8	126-127	Transthyretin	Beta	37628
10	22	2j8c	302-314	Reaction centre	Alpha beta	13574
11	20	5dei	524-536	Benzoylformate decarboxylase	Alpha beta	2739
Total	591					



En collaboration avec J. Chomilier, S. Shanthirabalan

# Effet des mutations : quel est l'impact d'une mutation sur une structure ?

RMS calculés sur 3  $C\alpha$ , à toutes les positions.

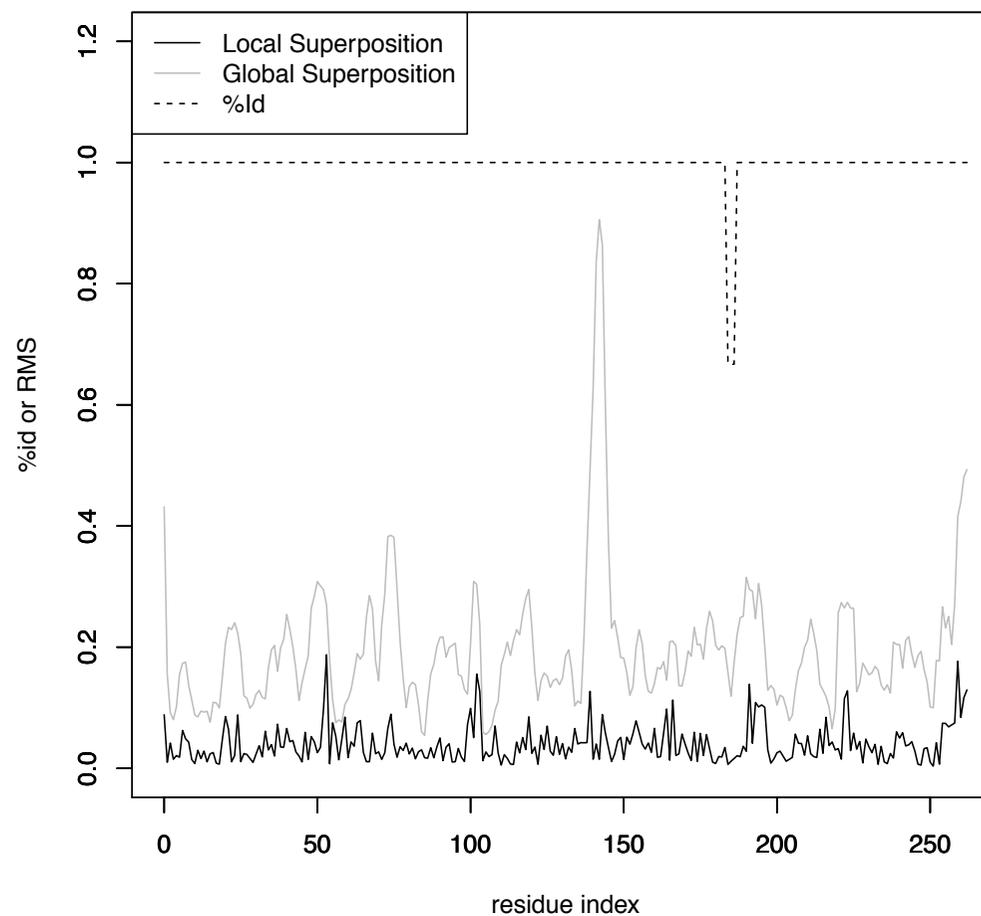
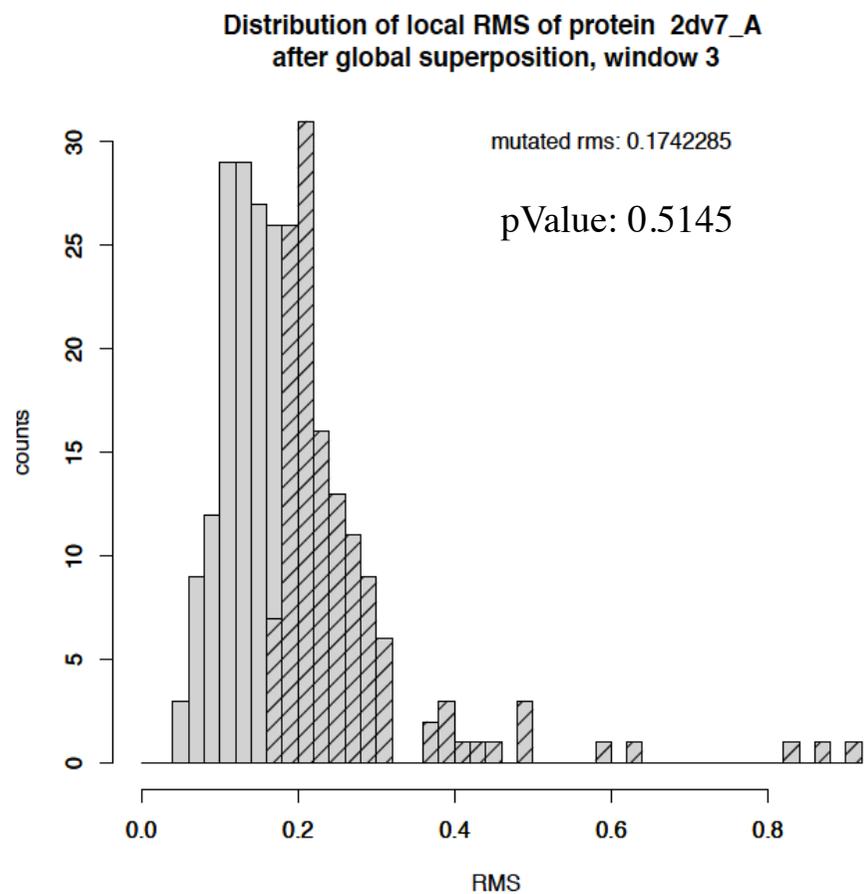


Distribution of the local rms with a 3 residues window for two cases taken from cluster with 2dek as a reference: 2e8r (left) and 2dv7 (right). Superimpositions are either local (dark line) or global (grey line). The dashed upper dotted line well indicates the location of the mutation.



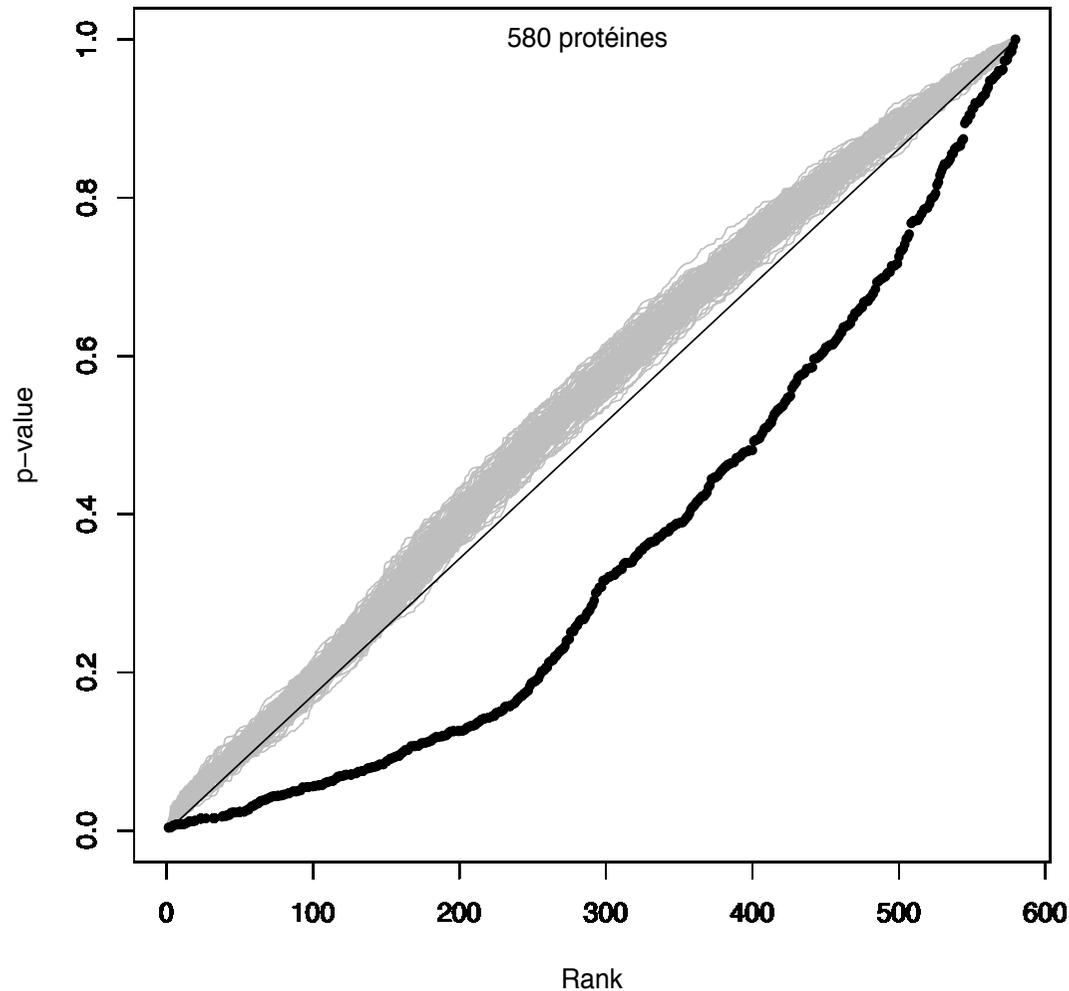
# Effet des mutations : quel est l'impact d'une mutation sur une structure ?

On calcule une p-value empirique pour chaque mutation



# Effet des mutations : quel est l'impact d'une mutation sur une structure ?

On classe les p-value et on les affiche selon leur rang.



# Effet des mutations : quel est l'impact d'une mutation sur une structure ?

On classe les p-value et on les affiche selon leur rang.

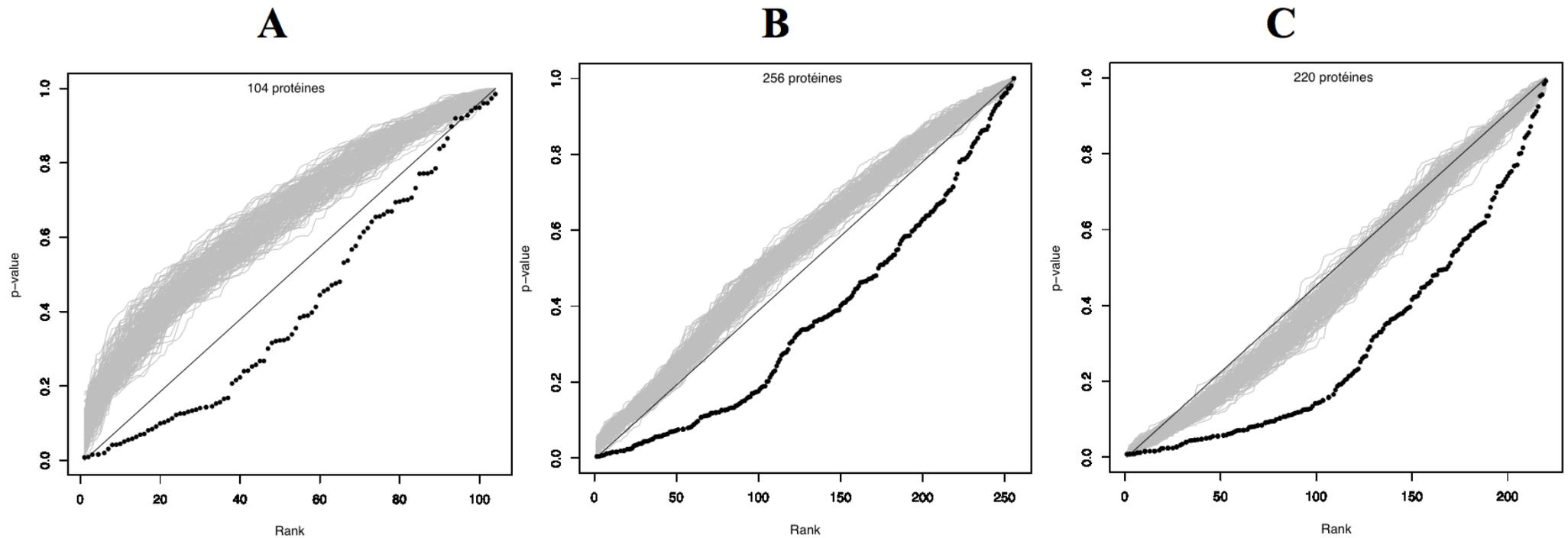


Figure 6. Curves of the p-value sorted as a function of their rank for mutations occurring only in: A) strands; B) helices; C) loops.



# Effet des mutations : quel est l'impact d'une mutation sur une structure ?

On classe les p-value et on les affiche selon leur rang.

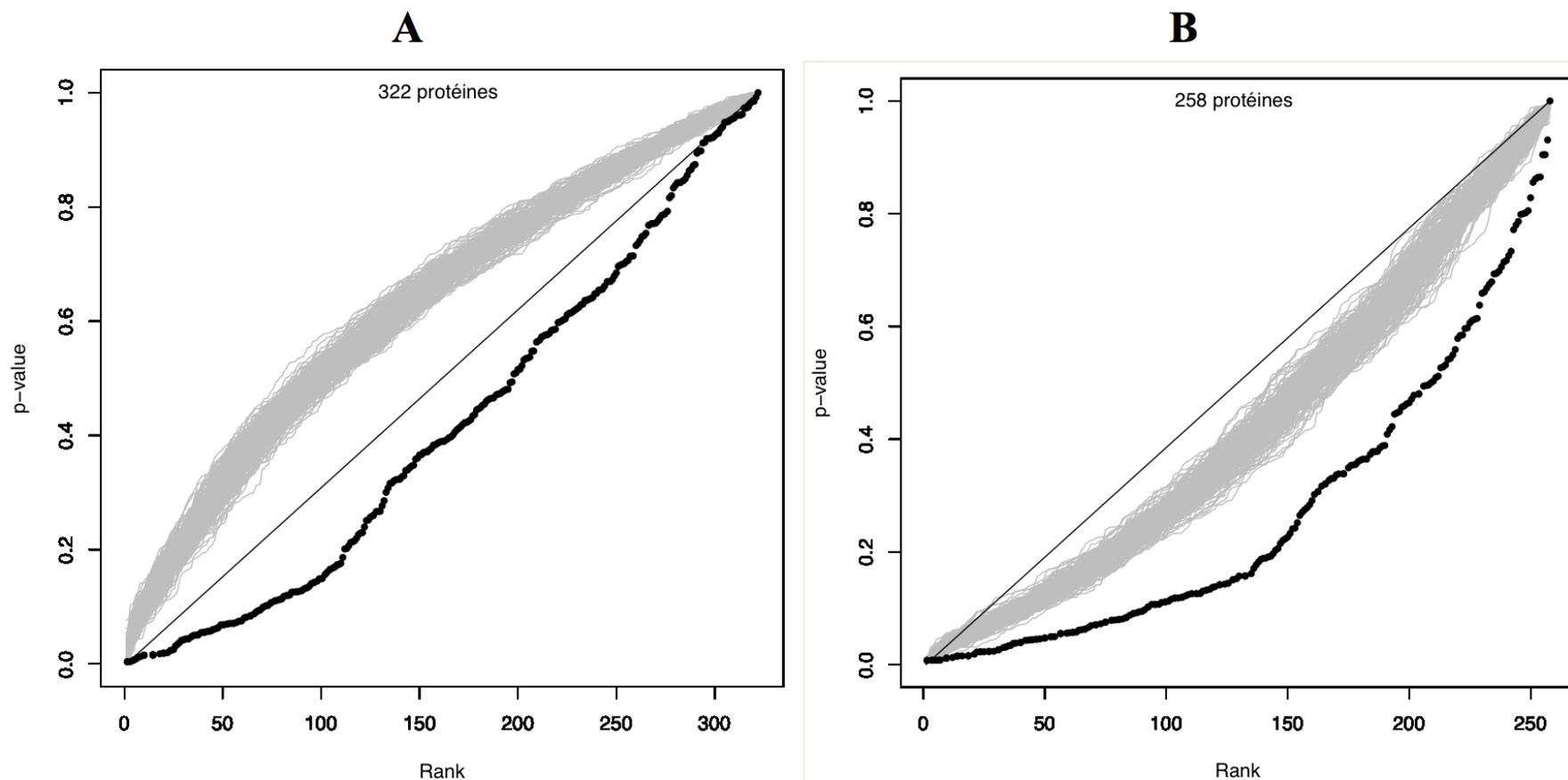
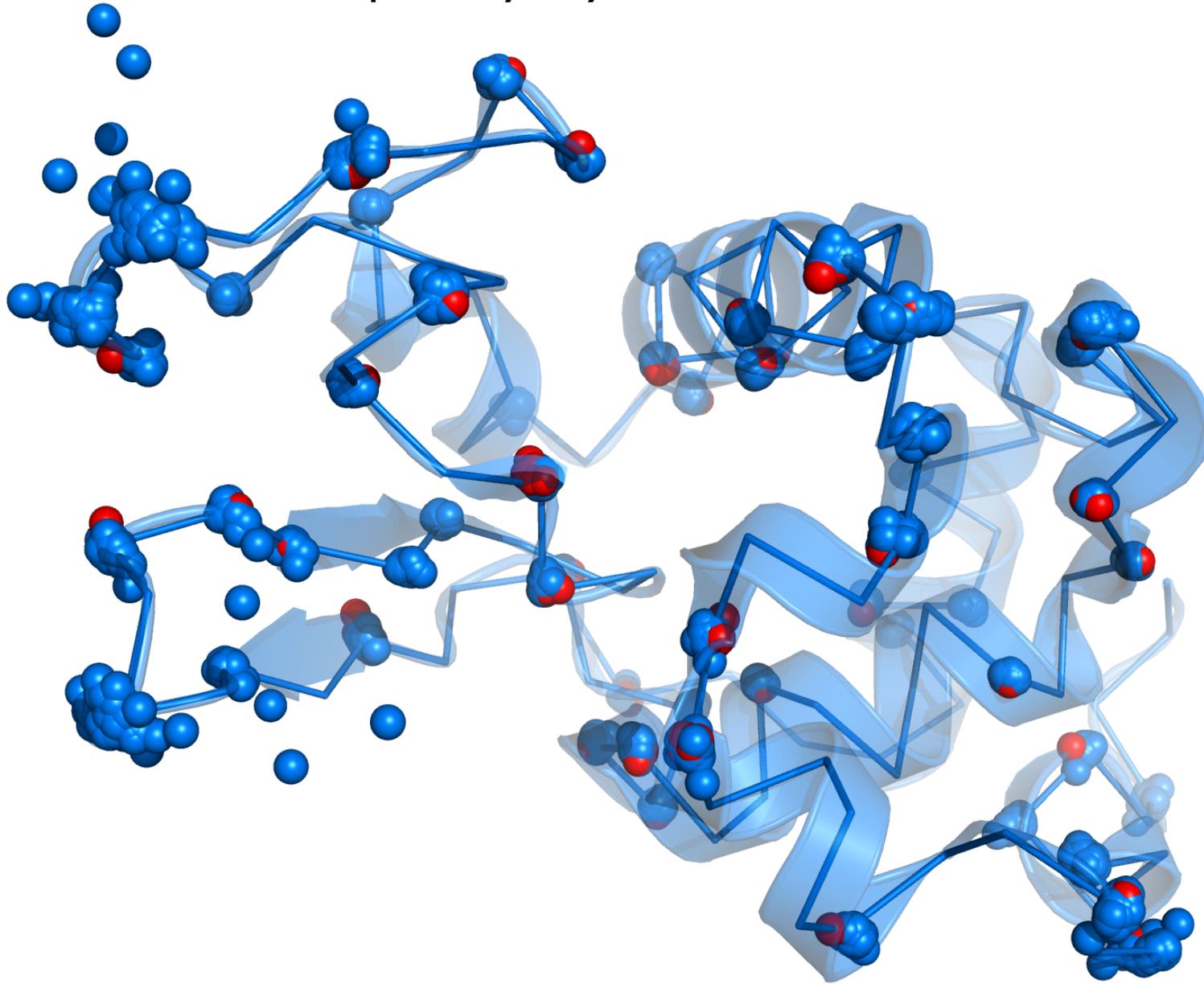


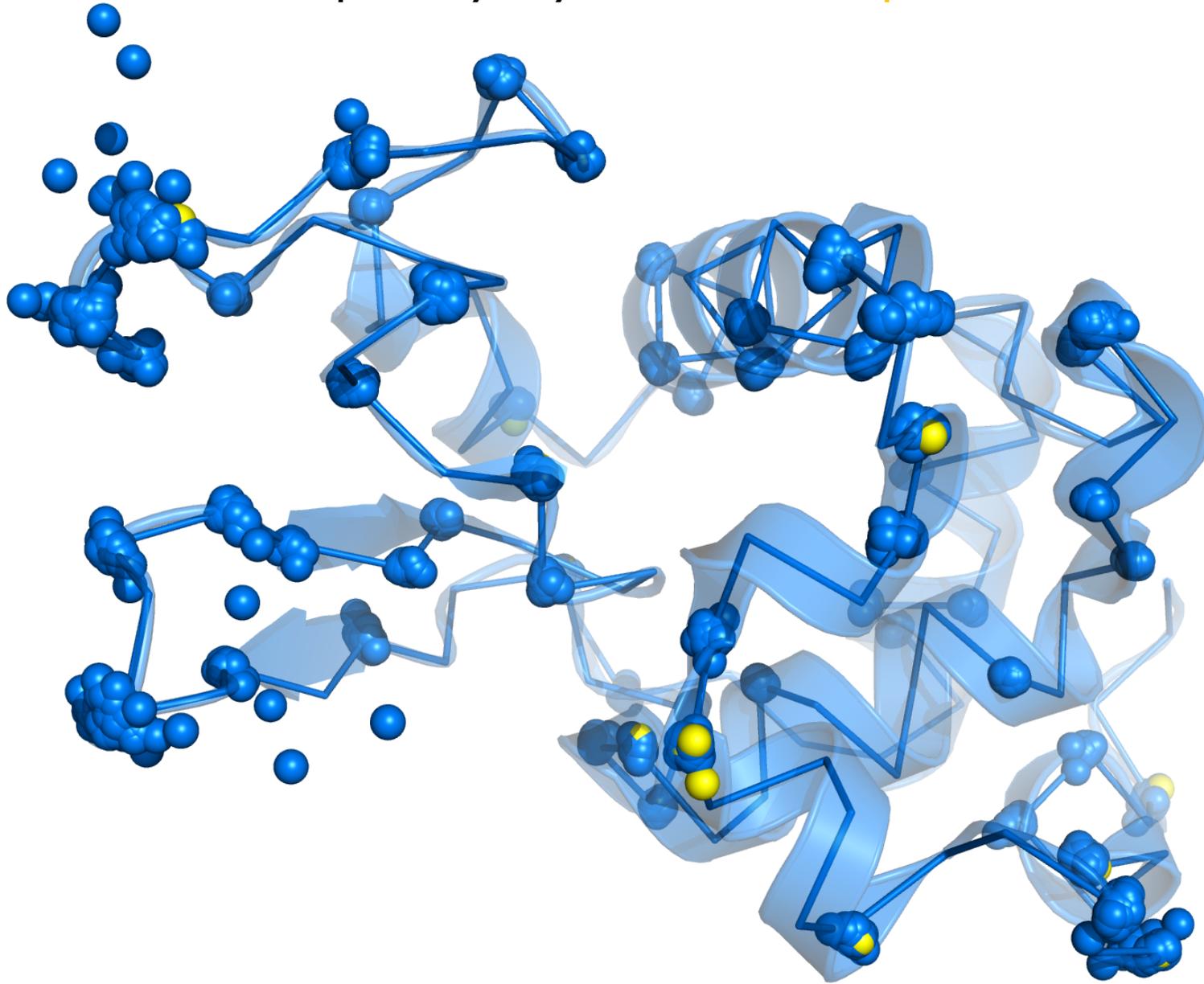
Figure 7. Distribution of the p-value as a function of their rank, among all members of the mutated dataset, according to their accessibility: a) buried; b) exposed.



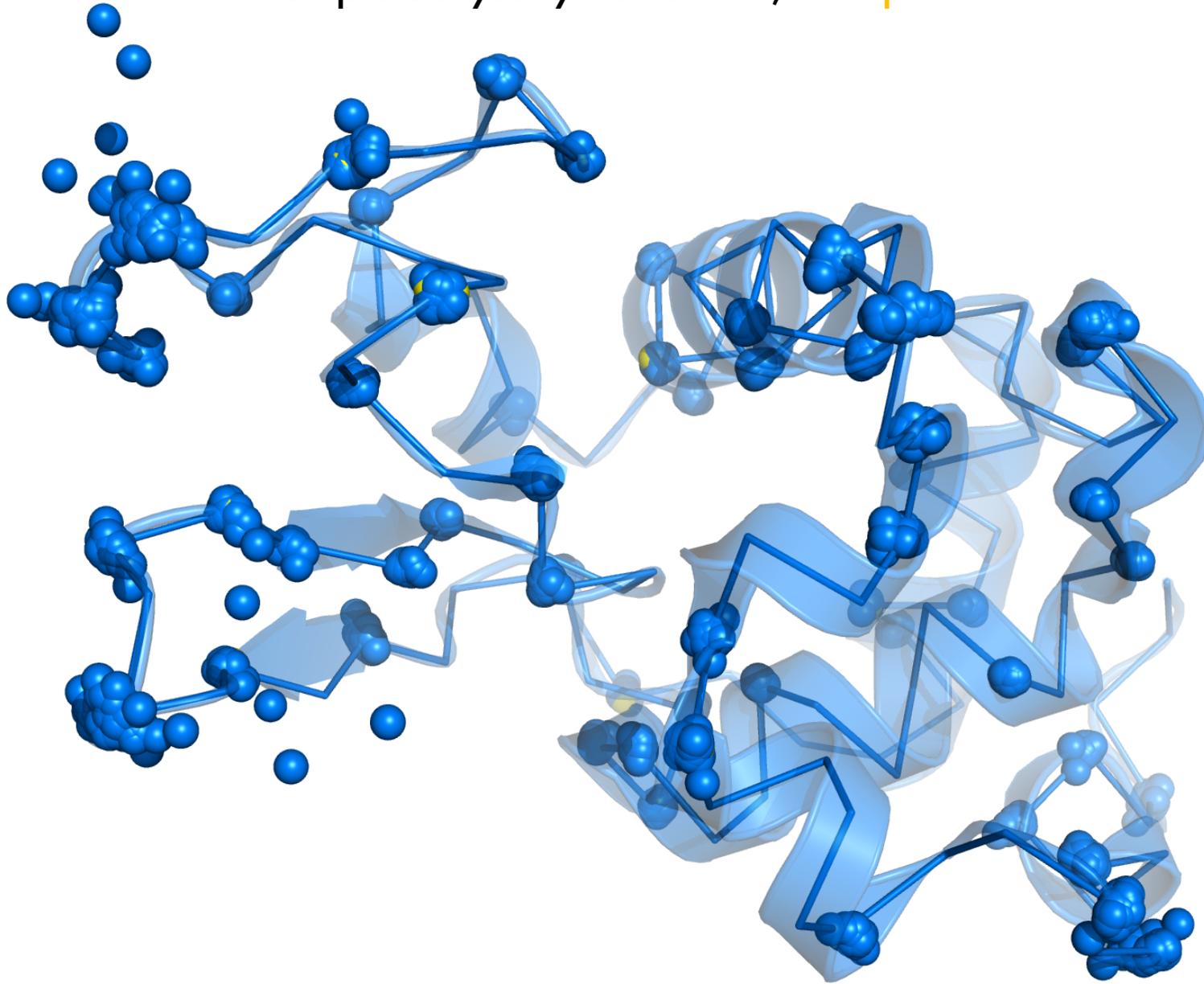
Exemple du lysozyme humain, **124 mutations**



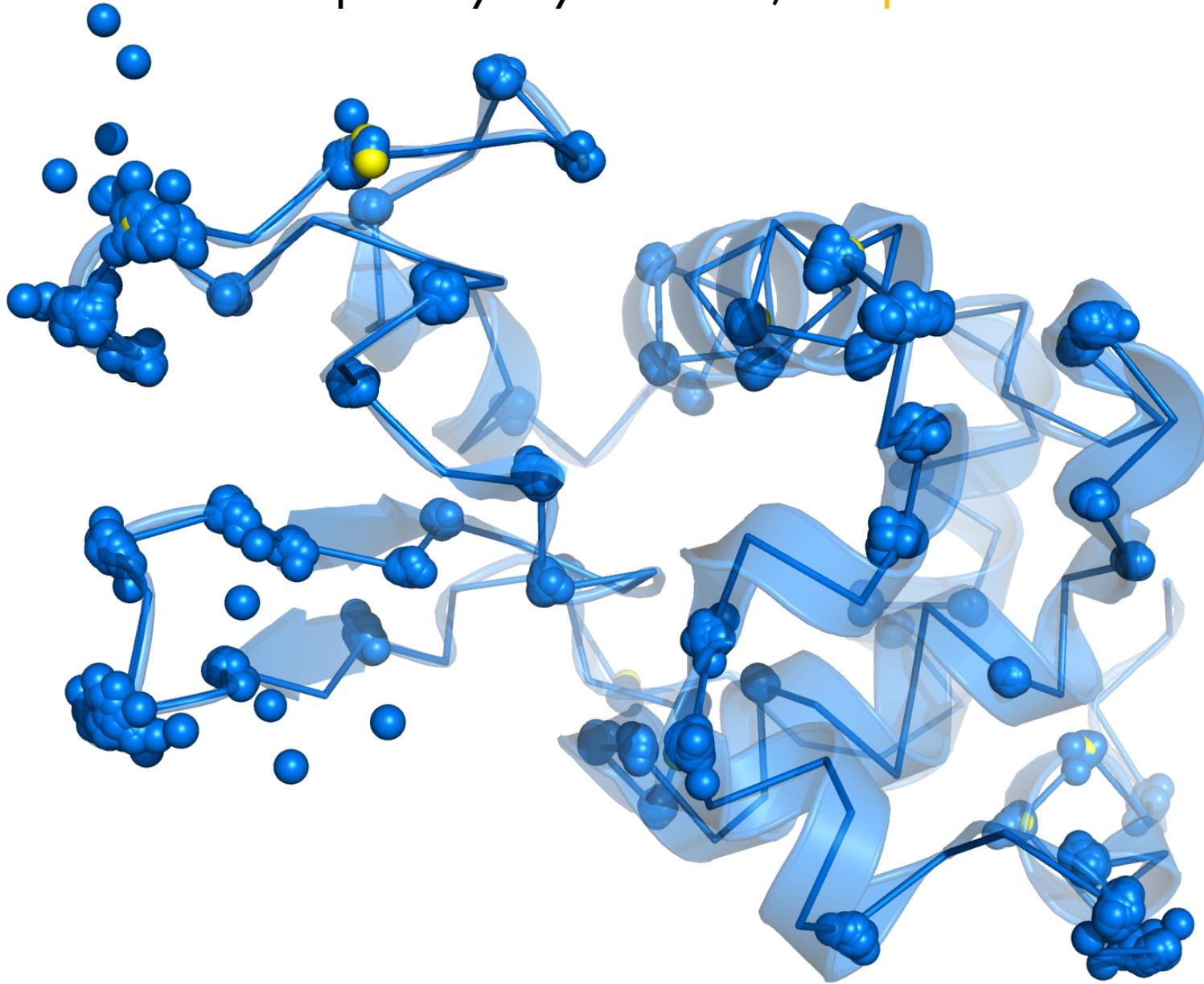
Exemple du lysozyme humain, 124 positions tirées au hasard



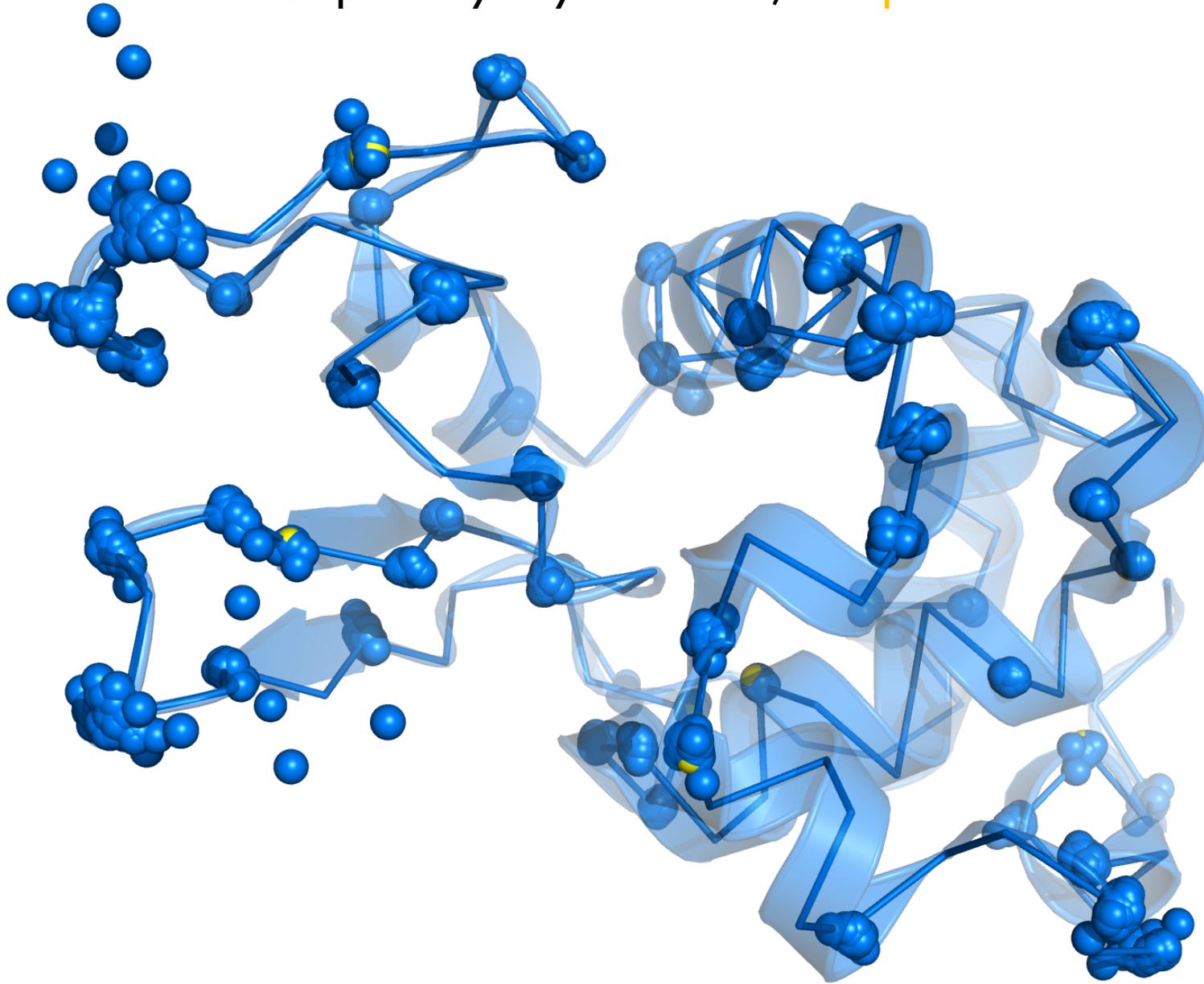
Exemple du lysozyme humain, 124 positions tirées au hasard



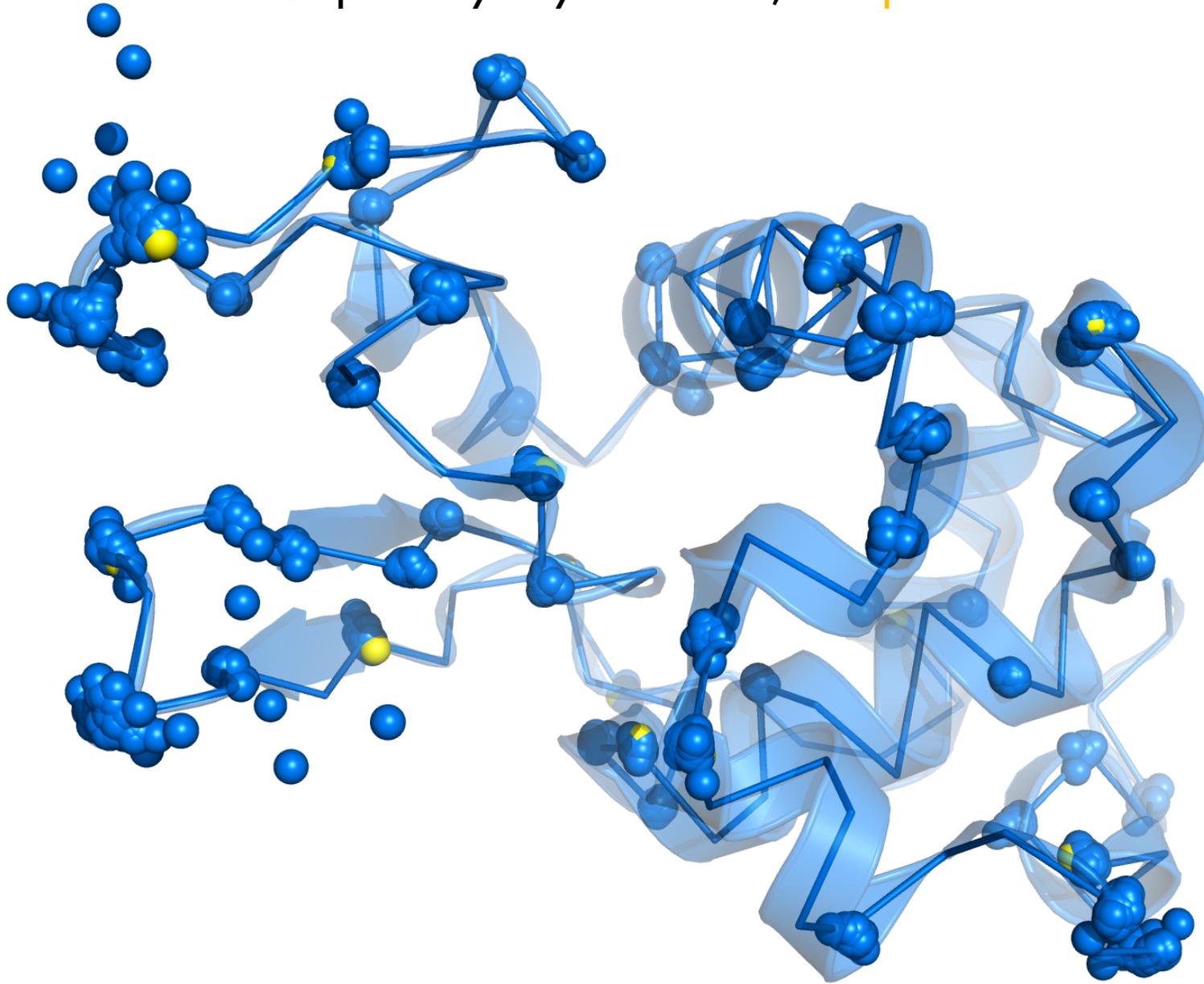
Exemple du lysozyme humain, 124 positions tirées au hasard



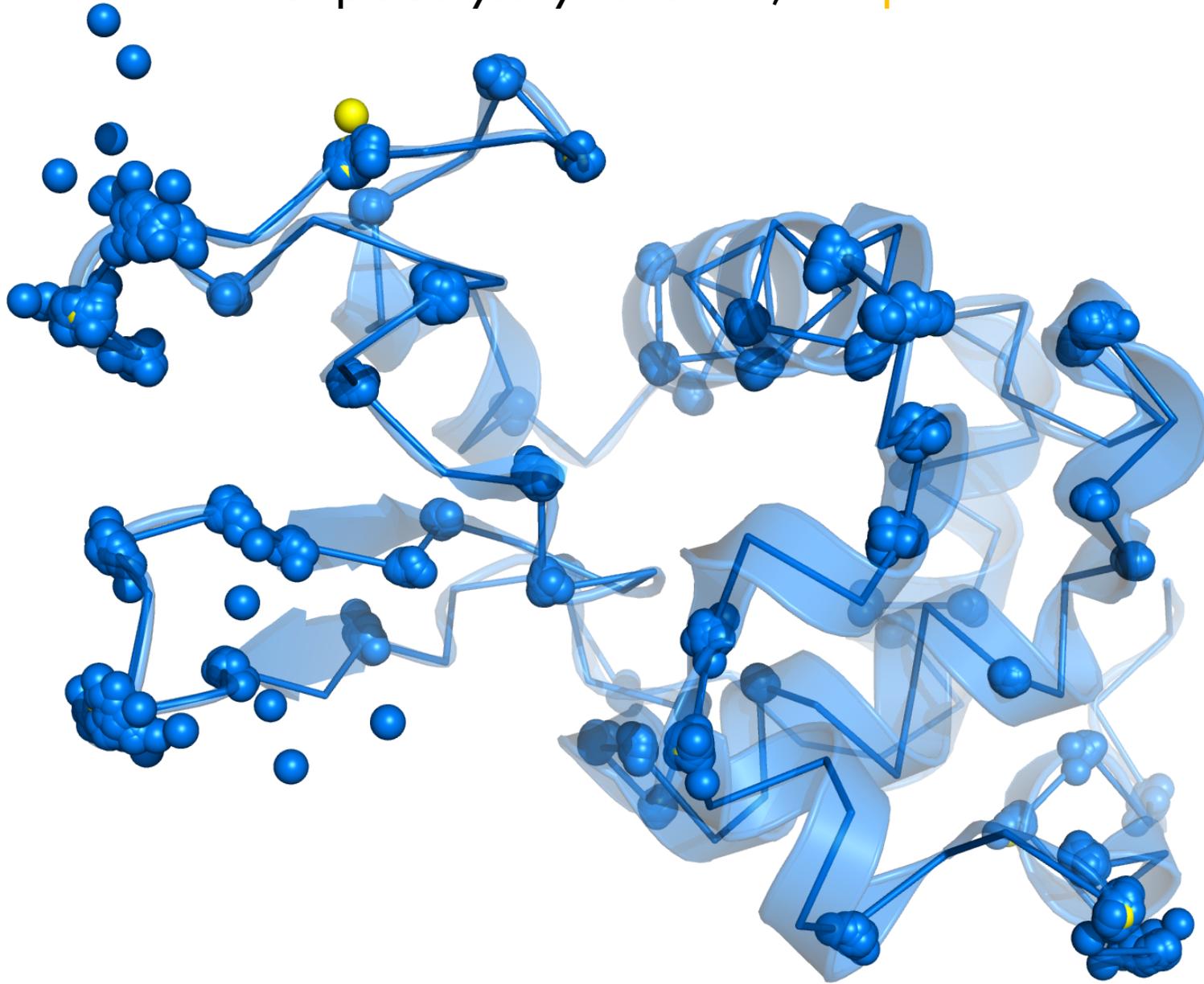
Exemple du lysozyme humain, 124 positions tirées au hasard



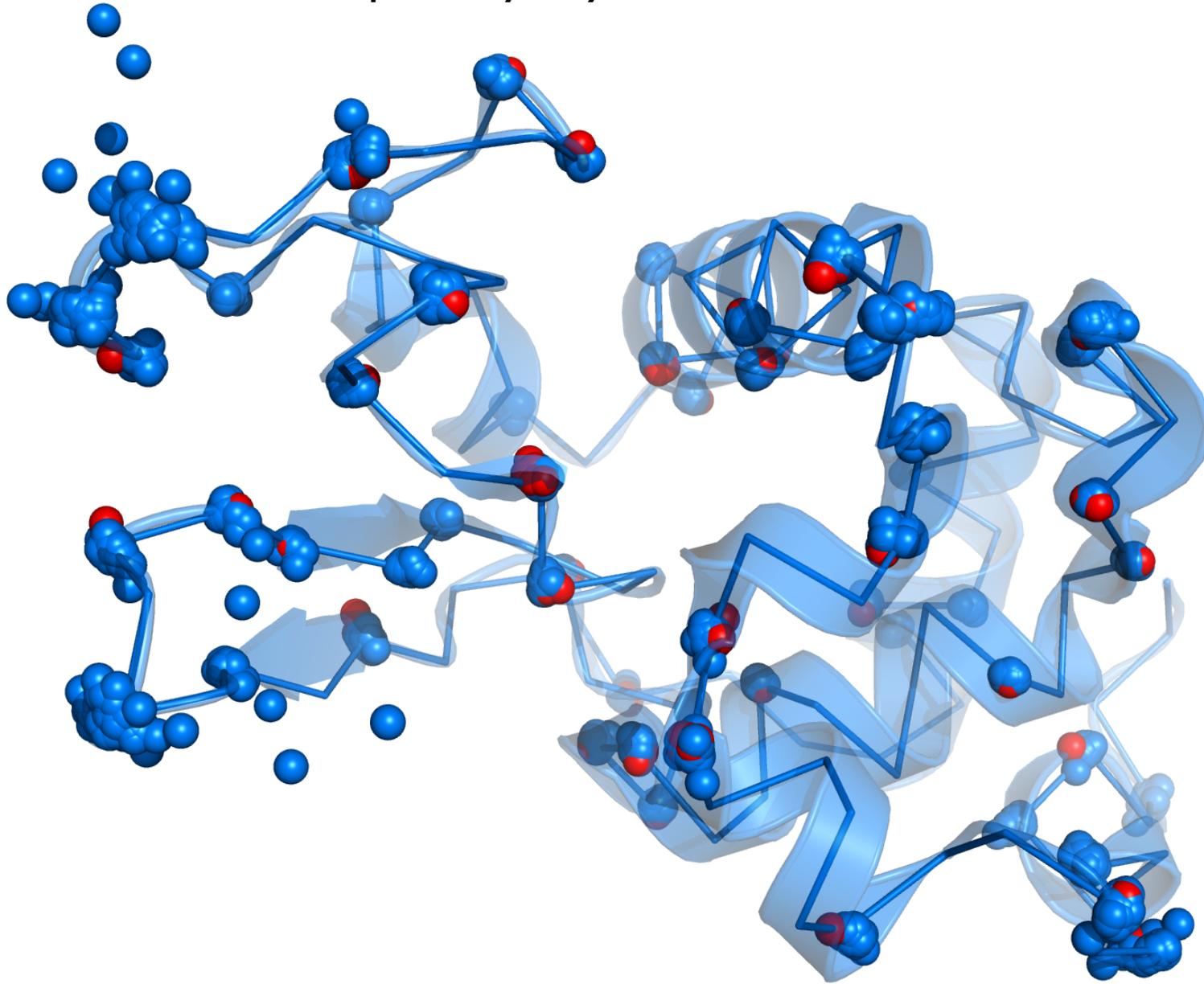
Exemple du lysozyme humain, 124 positions tirées au hasard



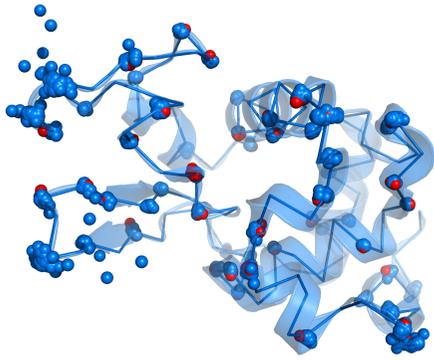
Exemple du lysozyme humain, 124 positions tirées au hasard



Exemple du lysozyme humain, **124 mutations**



# Effet des mutations : quel est l'impact d'une mutation sur une structure ?



Conclusion:

=> Il y a un effet visible, quelque soit la localisation de la mutation

=> L'effet se propage mais il reste local (2/3 résidus en séquences, résidus en contact)

=> Il n'y a par contre pas de lien (évident) entre les variations de stabilité (DDG) et la déformation (RMS)

=> Il existe une faible corrélation positive entre les RMS et les erreurs de prédiction de DDG (FoldX<sup>1</sup>).

Et maintenant :

Comment se font se déformations ?

<sup>1</sup> Schymkowitz, Joost et al. "The FoldX Web Server: An Online Force Field." *Nucleic Acids Research* 33.Web Server issue (2005): W382–W388. *PMC*. Web. 1 May 2017.



## Effet des mutations :

Quel est l'impact d'une insertion ou d'une délétion ?  
La structure se déforme-t-elle dans le sens des modes  
normaux basses fréquences ?

Données :

- > Paires de protéines ayant plus 90% d'identité
  - > 134 délétions artificielles
  - > 17 insertions artificielles
  - > 505 indels autres (naturels ?)

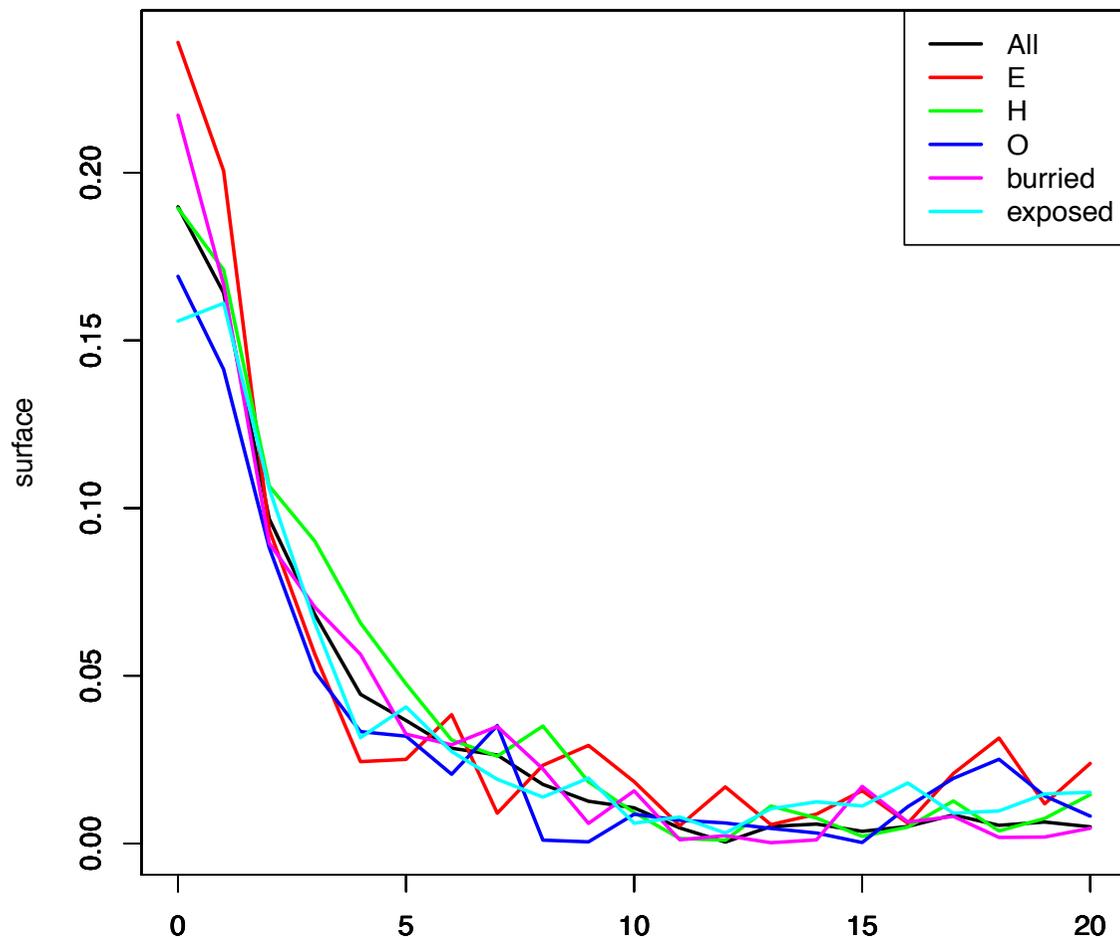
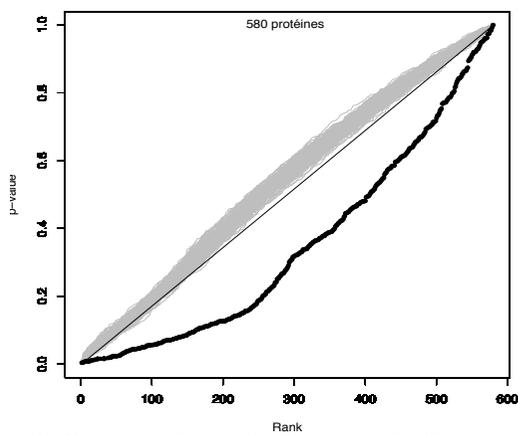


## Effet des mutations : quel est l'impact d'une insertion ou d'une délétion ?

- Construction de la banque de données ✓
- Calculs des modes normaux ✓
- Comparaison des modes normaux basses fréquences avec les déformations structurales ...
- Analyse en fonction de la localisation structurale des indels
- Identification des insertions et délétions dans les événements naturels
- Comparaison entre les insertions et délétions naturels et artificiels
- Recherche de co-évolution entre ces événements et les mutations.



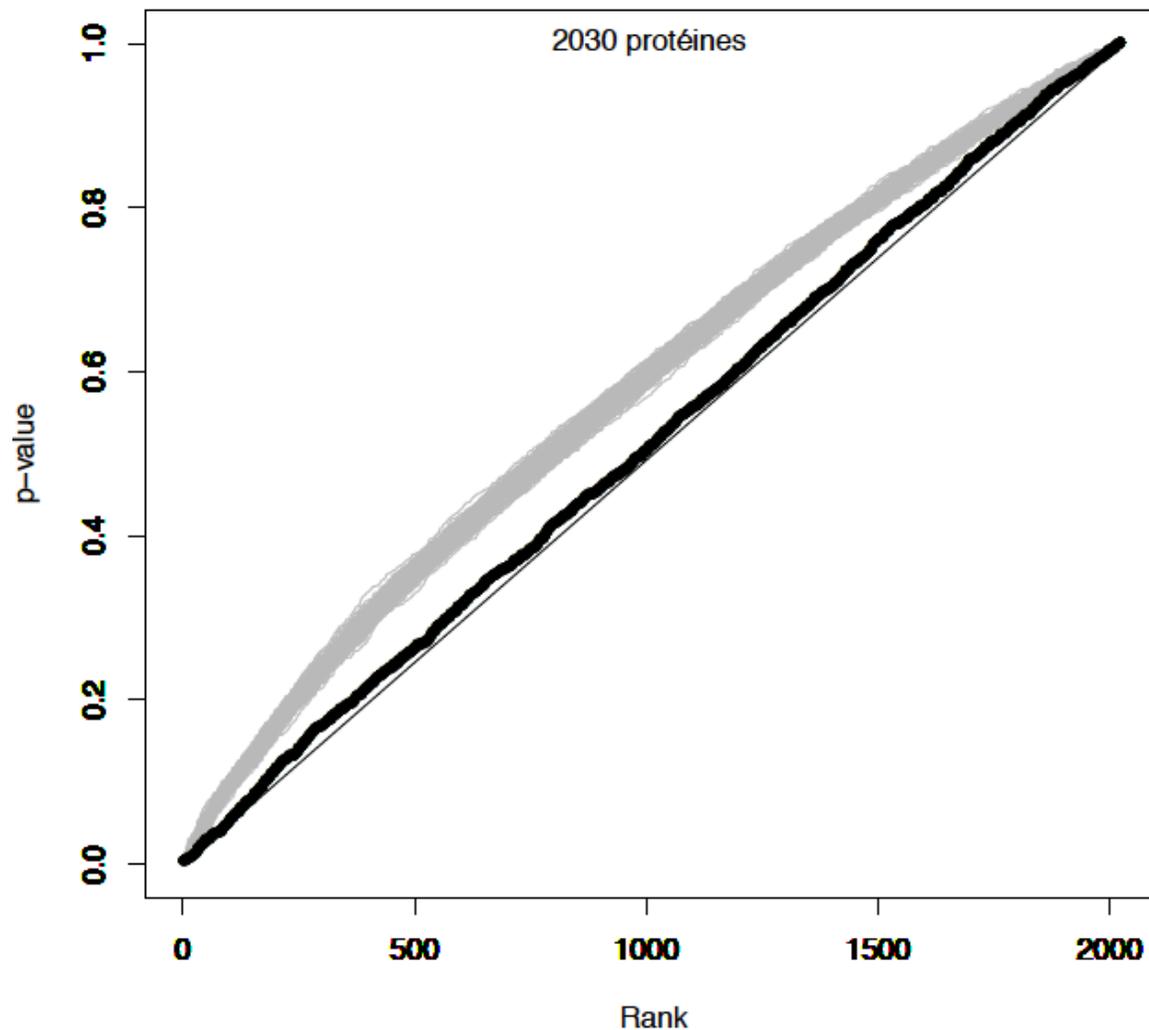
# Effet des mutations : quel est l'impact d'une mutation sur une structure ?



Surfaces between the average random and the mutated p-values for various windows along which the rms is calculated: centred on the mutated residue, and shifted on both sides by 1 to 20 residues. The surfaces have been calculated for several subsets of residues: mutated residue in helices, strands or loop (green, red and blue lines) and buried or exposed residues (magenta and cyan lines).



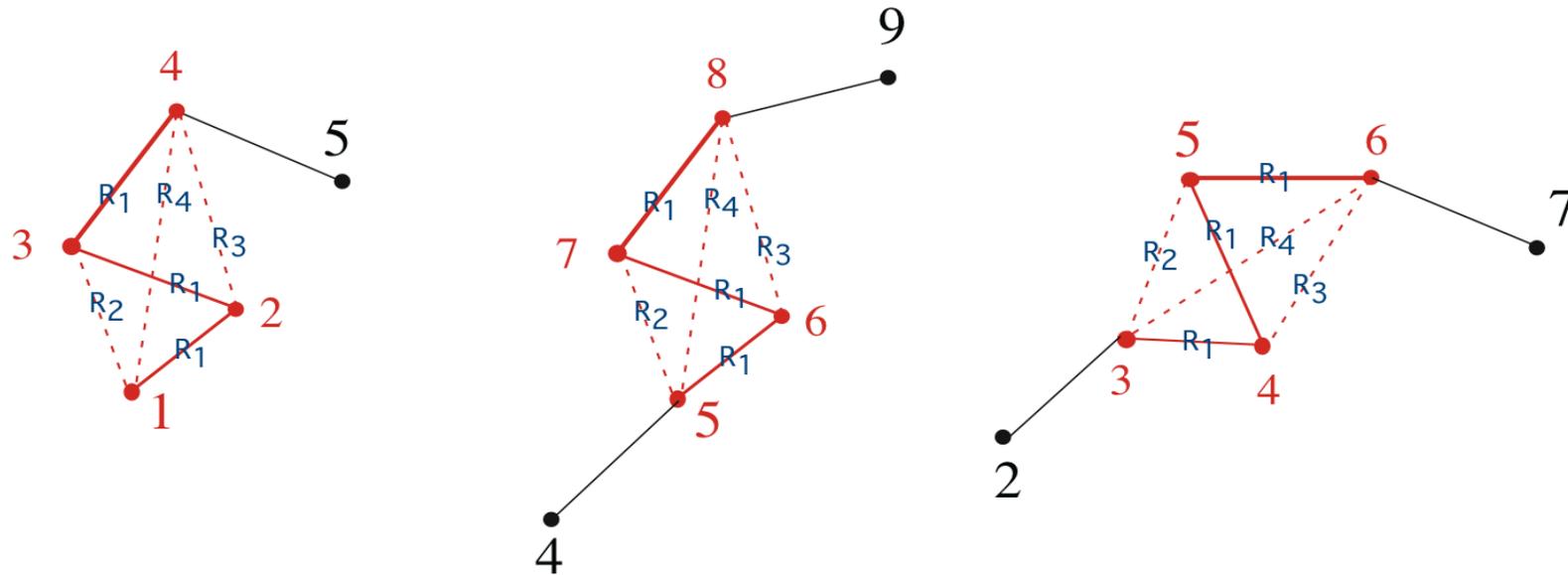
## Effet des mutations : quel est l'impact d'une mutation sur une structure ?



Rank vs p-values for residues that are geometrically close but not sequentially adjacent to the mutated position, for the whole mutated dataset.



Distances internes entre  $\mathcal{C}\alpha$



Construction des motifs de taille  $k$  à partir des motifs chevauchants de taille intérieure.

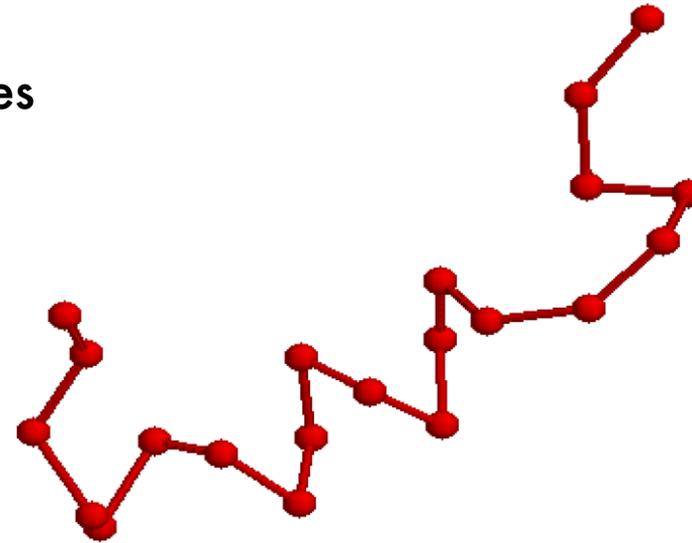
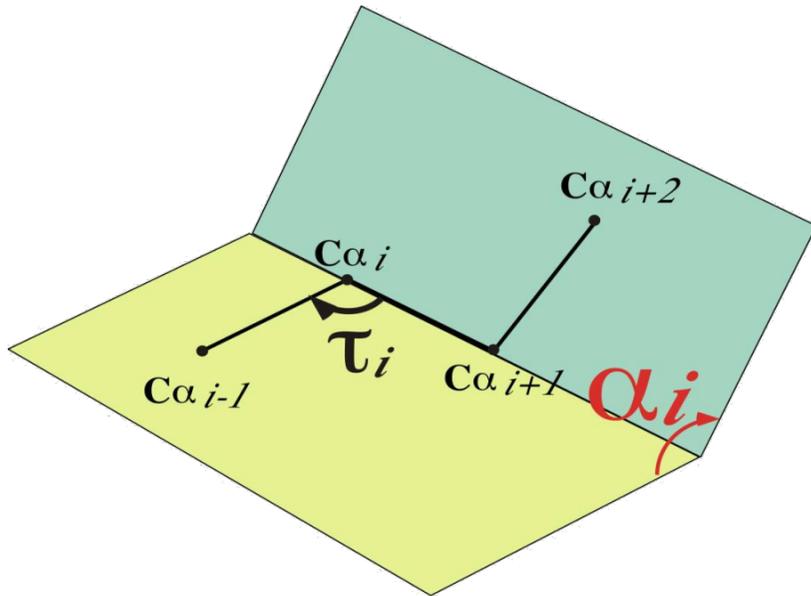
N. Pisanti, H. Soldano, M. Carpentier, Incremental Inference of Relational Motifs with a Degenerate Alphabet ,  
Lecture Note in Computer Science (proceedings CPM, Combinatorial Pattern Matching, Volume 3537, May  
2005, Pages 229 - 240).



N. Pisanti, H. Soldano, M. Carpentier, J. Pothier, Implicit and Explicit Representation of Approximated Motifs  
KCL series book, edited by C. Iliopoulos, K. Park and K. Steinhfel (à paraître en 2005)

# Les angles $\alpha$

Les structures comme des séries de symboles



...206-55-52-63-...-79-46-150-250-...

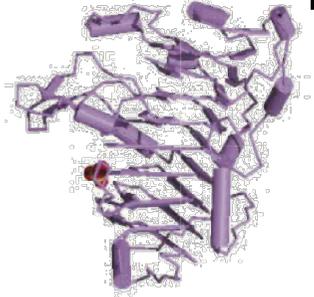


... $\alpha_{21}$ - $\alpha_{05}$ - $\alpha_{05}$ - $\alpha_{06}$ -...- $\alpha_{07}$ - $\alpha_{04}$ - $\alpha_{15}$ - $\alpha_{25}$ -...



# Recherche de similarités structurales dans une banque : YAKUSA

## Structure requête



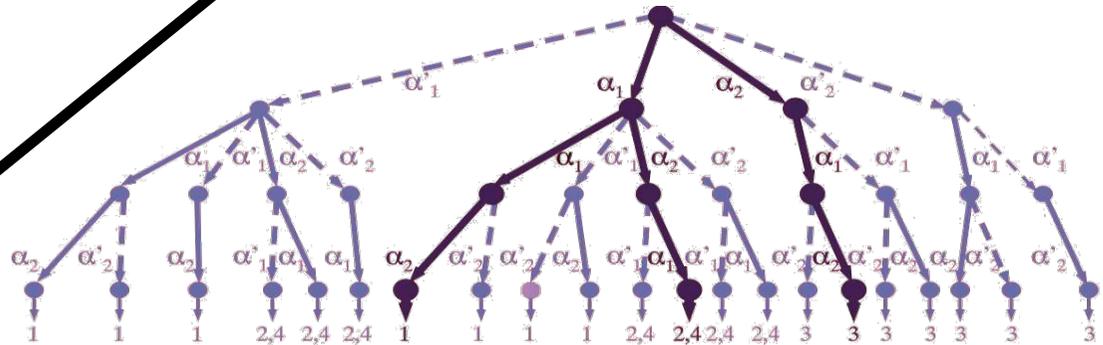
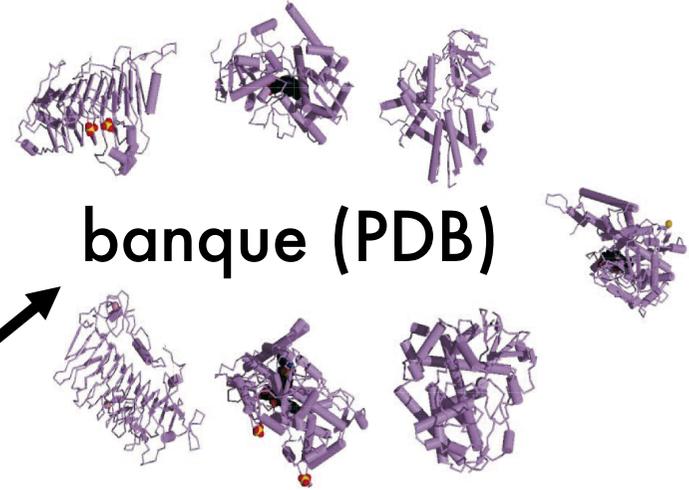
... 55-72-...-150-250-...



...  $\alpha_{05}$ - $\alpha_{07}$ -...- $\alpha_{15}$ - $\alpha_{25}$ -...

Recherche sur banque  
1 min 30 pour 15000 structures

banque (PDB)



# Recherche de similarités structurales dans un banque : YAKUSA (BLAST structural)

**yakusa results**  
query: 9mt  
[YAKUSA TEXT RESULTS FILE](#)  
[Help](#)

Mouse-over to show sequence name

Legend for SHSPs (SHSP = Structural Homology Segment):

- <math>\leq 10E-40</math>
- <math>\leq 10E-40 > 10E-35</math>
- <math>\leq 10E-35 > 10E-30</math>
- <math>\leq 10E-30 > 10E-25</math>
- <math>\leq 10E-25 > 10E-20</math>
- <math>\leq 10E-20 > 10E-15</math>
- <math>\leq 10E-15 > 10E-10</math>
- <math>\leq 10E-10 > 10E-5</math>
- > 10E-5

SHSPs: 3 SHSPs found

Id	pos_query	chain	pos_bank	chain	score	shift	length	RMSD	MTD_proba
[ 1 ]	4 - 32	( )	7 - 35	( )	674	-3	29	1.0	3.534923E-32
[ 2 ]	72 - 80	( )	80 - 88	( )	197	-8	9	0.2	1.491801E-13
[ 3 ]	82 - 95	( )	91 - 104	( )	240	-9	14	0.8	9.382358E-22

Group of SHSPs spatially compatible: 1

SHSPs amino acid sequences

**SHSP 1**

```

query  YTCGSNCYSSSDVSTAQAAGYKLHEDGET
database TNCGGNVYSNDDINTAIQGALDDVANGDR
    
```

**SHSP 2**

```

query  SPGADRVVF
database SPGPDRVIY
    
```

**SHSP 3**

```

query  ENNQLAGVITHTGA
database NTGEPCATVHTGA
    
```

3D visualization: Your query 9mt (dark red), Target structure Irtu (dark blue). SHSPs are bright: two segments corresponding to a SHSP have same color.

Disponible sur RPBS

[www.rpsb.jussieu.fr/Yakusa/](http://www.rpsb.jussieu.fr/Yakusa/)

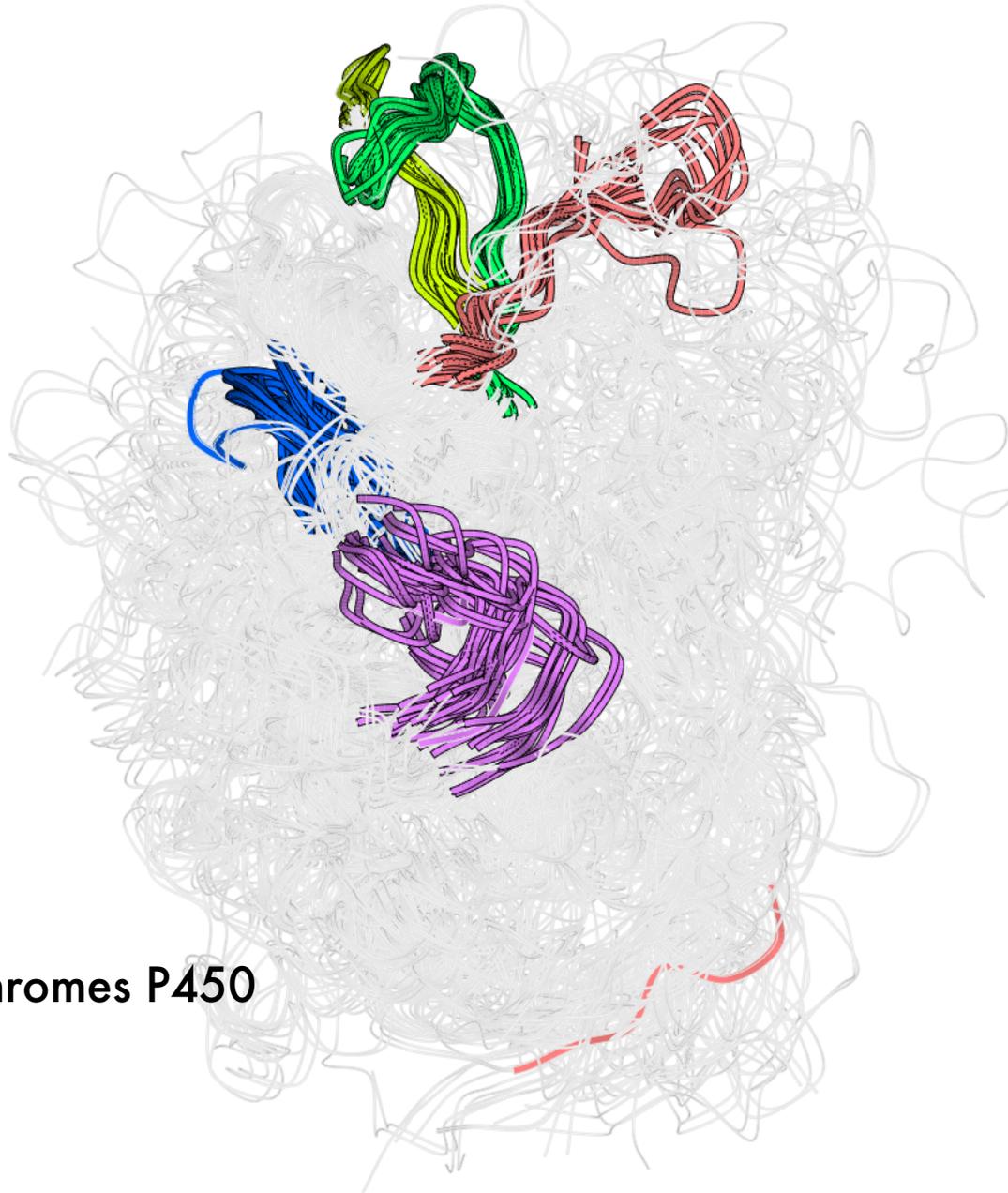
Actuellement: encadrement d'un projet pour l'améliorer



C. Alland, F. Moreews, D. Boens, M. Carpentier, S. Chiusa, M. Lonquety, N. Renault, Y. Wong, H. Cantalloube, J. Chomilier, J. Hochez, J. Pothier, B.O. Villoutreix, J.-F. Zagury, P. Tuffery, ;

RPBS: a web resource for structural bioinformatics, Nucleic Acid Research, 2005, 33: W44-W49

# Un exemple



35 cytochromes P450

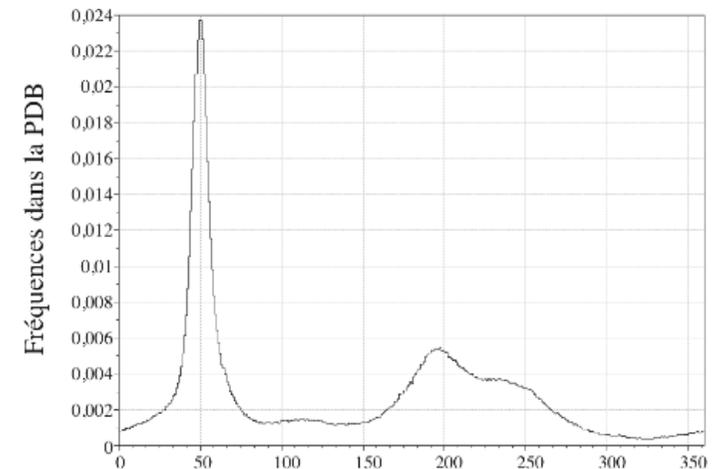


# Exemple

1 -> 1CPT OXIDOREDUCTASE(OXYGENASE)  
 2 -> 1DT6 OXIDOREDUCTASE  
 3 -> 1E9X OXIDOREDUCTASE  
 4 -> 1IZ0 OXIDOREDUCTASE  
 5 -> 1N40 OXIDOREDUCTASE  
 6 -> 1N97 ELECTRON TRANSPORT  
 7 -> 10XA OXIDOREDUCTASE (OXYGENASE)  
 8 -> 1PHD OXIDOREDUCTASE(OXYGENASE)  
 9 -> 2HPD OXIDOREDUCTASE(OXYGENASE)

DGECDFMTDCALY 148  
 KVSKGLGIAFSNA 105  
 YEFEMAQPPEYR 415  
 ADEVVLFEAKEI 129  
 GAPADLRNDFADP 128  
 GKPLSPSLAEHAL 146  
 SGVVDIVDRFAHP 135  
 QGQCNFTEDYAEP 145  
 GFNYRFNSFYRDQ 157

1 -> |12|25|29| 9| 3|22|21|22|17|23|24|21|25|  
 2 -> |12|32| 1| 8|29|24|11|23|19|24|14| 5|26|  
 3 -> | 4| 3|35| 7| 1|21|12| 5|23|25|27|32| 7|  
 4 -> | 4|18| 1| 4| 2|23|22|22|23|23|22|22|22|  
 5 -> |16|23|35| 4| 1|22|20|21|19|21|22|22|23|  
 6 -> |23| 9| 7| 9| 3|23|23|22|23|23|22|22|22|  
 7 -> |19|13|34| 7| 1|23|21|22|17|23|22|22|24|  
 8 -> | 3|24|33| 6| 1|23|20|23|16|24|21|21|24|  
 9 -> |16| 7|31| 4| 0| 3|34|24|23|23| 2|22| 7|



Angles  $\alpha$  (degré)

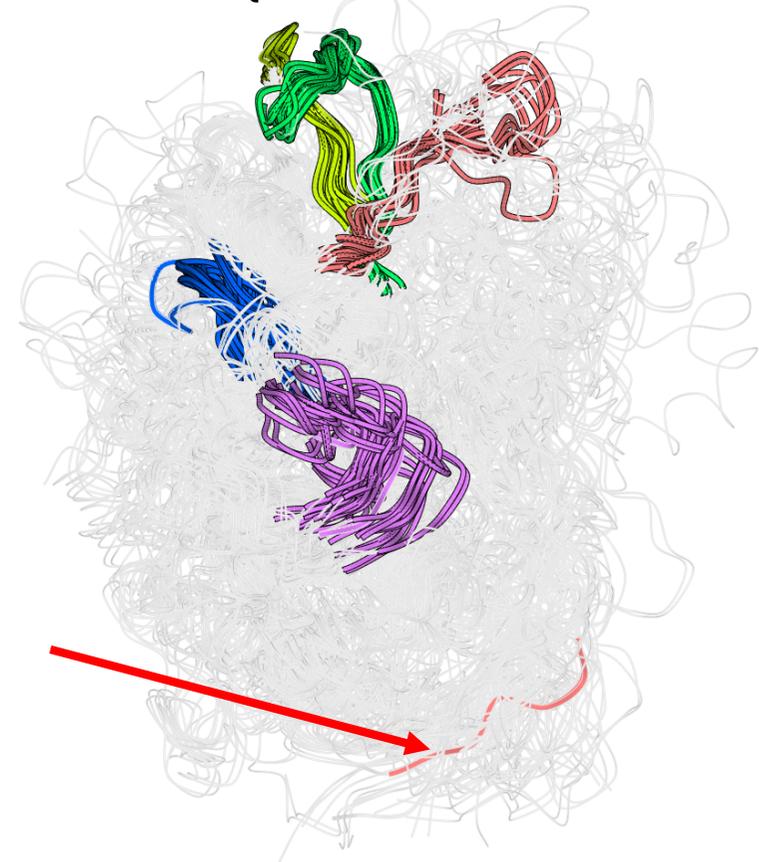


# Exemple

1 -> 1CPT OXIDOREDUCTASE(OXYGENASE)  
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DGECDFMTDCALY 148  
 KVSKGLGIAFSNA 105  
 YEFEMAQPPEYR 415  
 ADEVVLFEEAKEI 129  
 GAPADLRNDFADP 128  
 GKPLSPSLAEHAL 146  
 SGVVDIVDRFAHP 135  
 QGQCNFTEDYAEP 145  
 GFNYRFNSFYRDQ 157

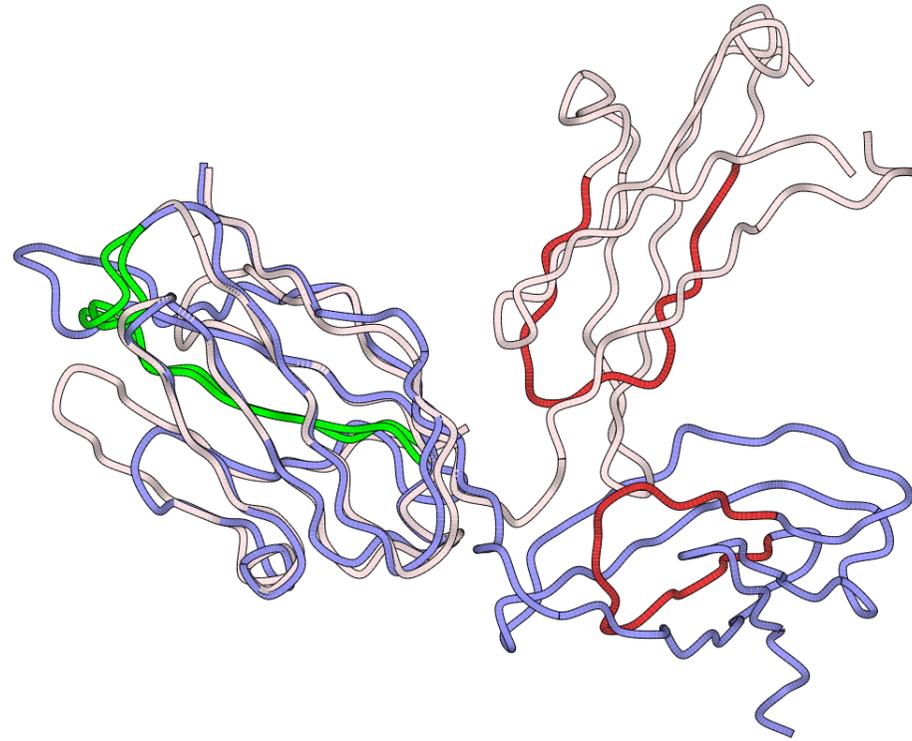
1 -> |12|25|29| 9| 3|22|21|22|17|23|24|21|25|  
 2 -> |12|32| 1| 8|29|24|11|23|19|24|14| 5|26|  
 3 -> | 4| 3|35| 7| 1|21|12| 5|23|25|27|32| 7|  
 4 -> | 4|18| 1| 4| 2|23|22|22|23|23|22|22|22|  
 5 -> |16|23|35| 4| 1|22|20|21|19|21|22|22|23|  
 6 -> |23| 9| 7| 9| 3|23|23|22|23|23|22|22|22|  
 7 -> |19|13|34| 7| 1|23|21|22|17|23|22|22|24|  
 8 -> | 3|24|33| 6| 1|23|20|23|16|24|21|21|24|  
 9 -> |16| 7|31| 4| 0| 3|34|24|23|23| 2|22| 7|



# Modifications

Solutions testées :

-> prise en compte du RMS

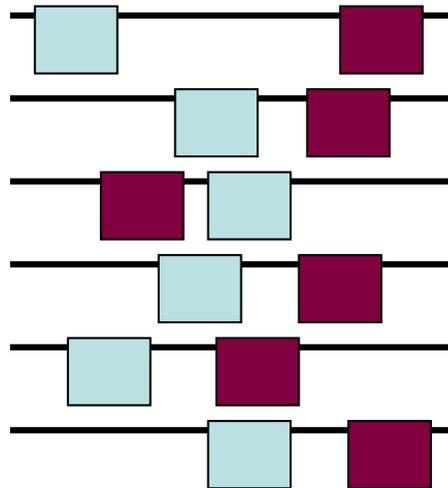
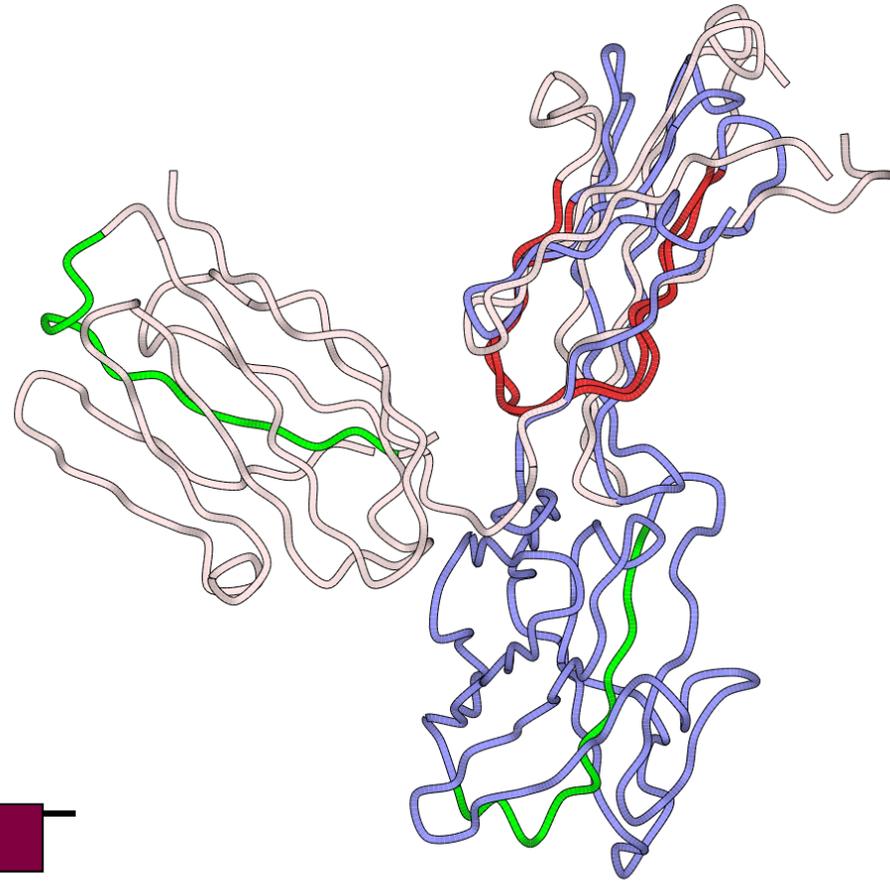


# Modifications

Solutions testées :

-> prise en compte du RMS

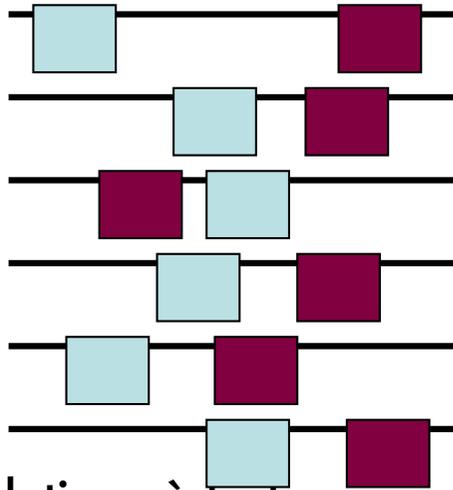
-> contrainte d'ordre



# Perspectives

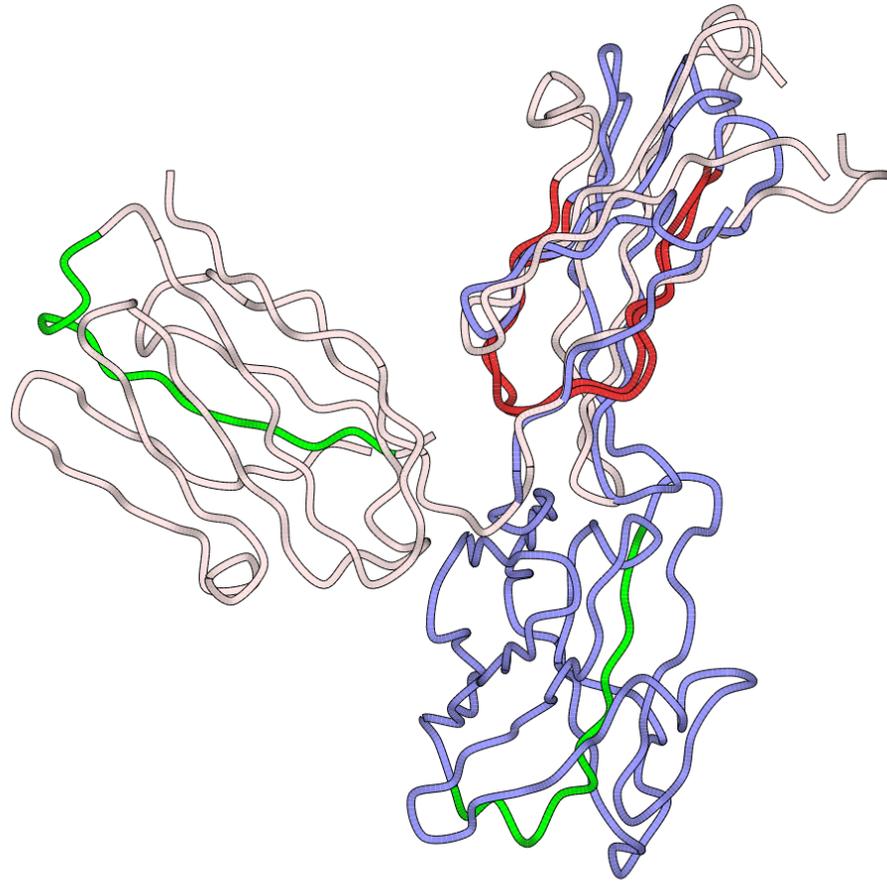
Solutions testées :

- > prise en compte du RMS
- > contrainte d'ordre



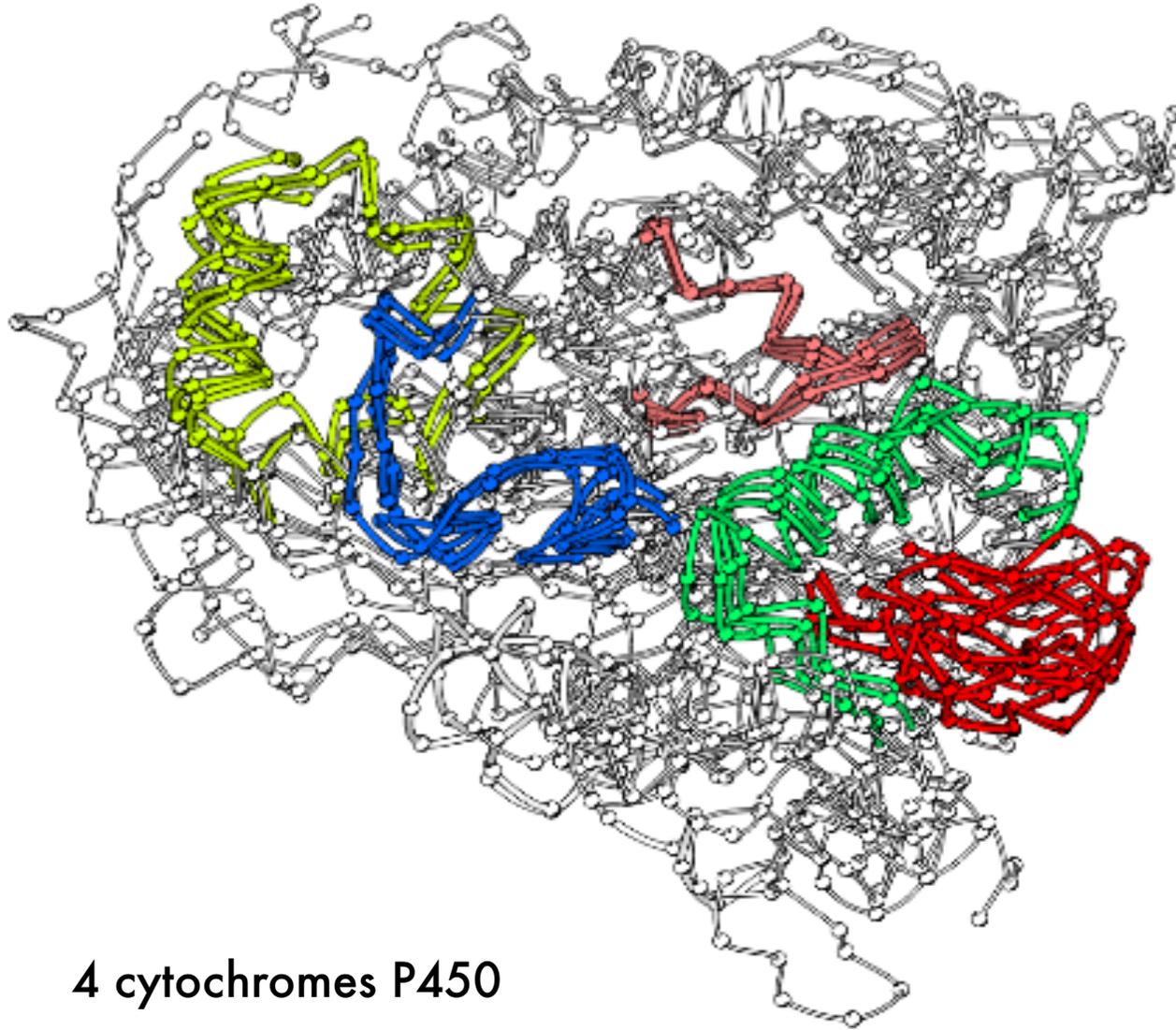
Solutions à tester :

- > ignorer les hélices
- > ne garder que les meilleurs blocs puis affiner l'alignement après superposition des structures selon ces blocs



Alignement  
multiple de  
structures

## Recherche de motifs répétés : Triades



4 cytochromes P450



- **Méthode des « m-diagonales » :**

- quorum réglable
- alignement des paires de structures

- **Méthode du Gibbs sampling :**

- pas d'alignement des paires, comparaison d'un très grand nombre de structures
- quorum fixe

- **Méthode de recherche de motifs répétés (Triades) :**

- pas d'alignement des paires, quorum réglable
- exhaustivité
- générique



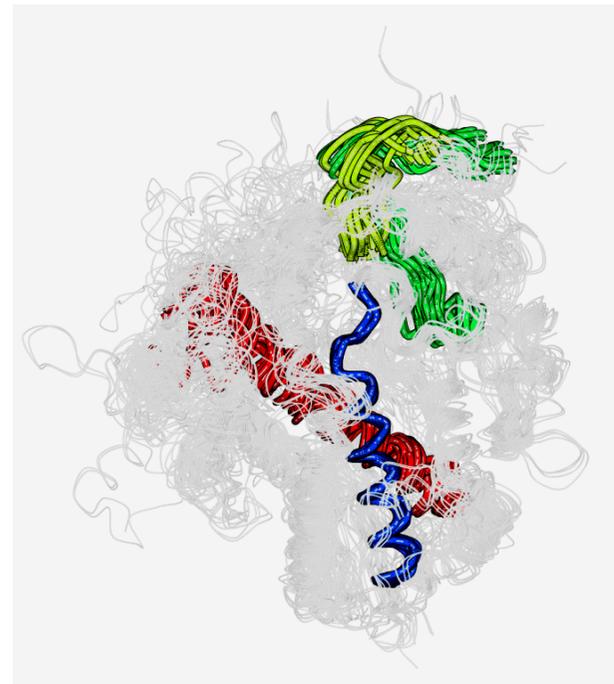
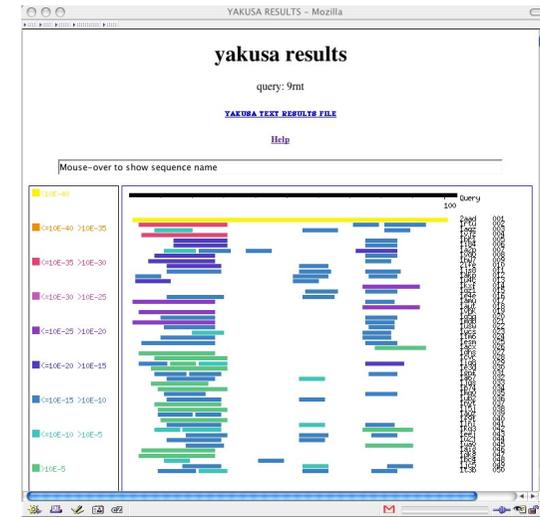
- Comparaison d'une structure avec toutes les structures d'une banque.

-> Yakusa<sup>1</sup>

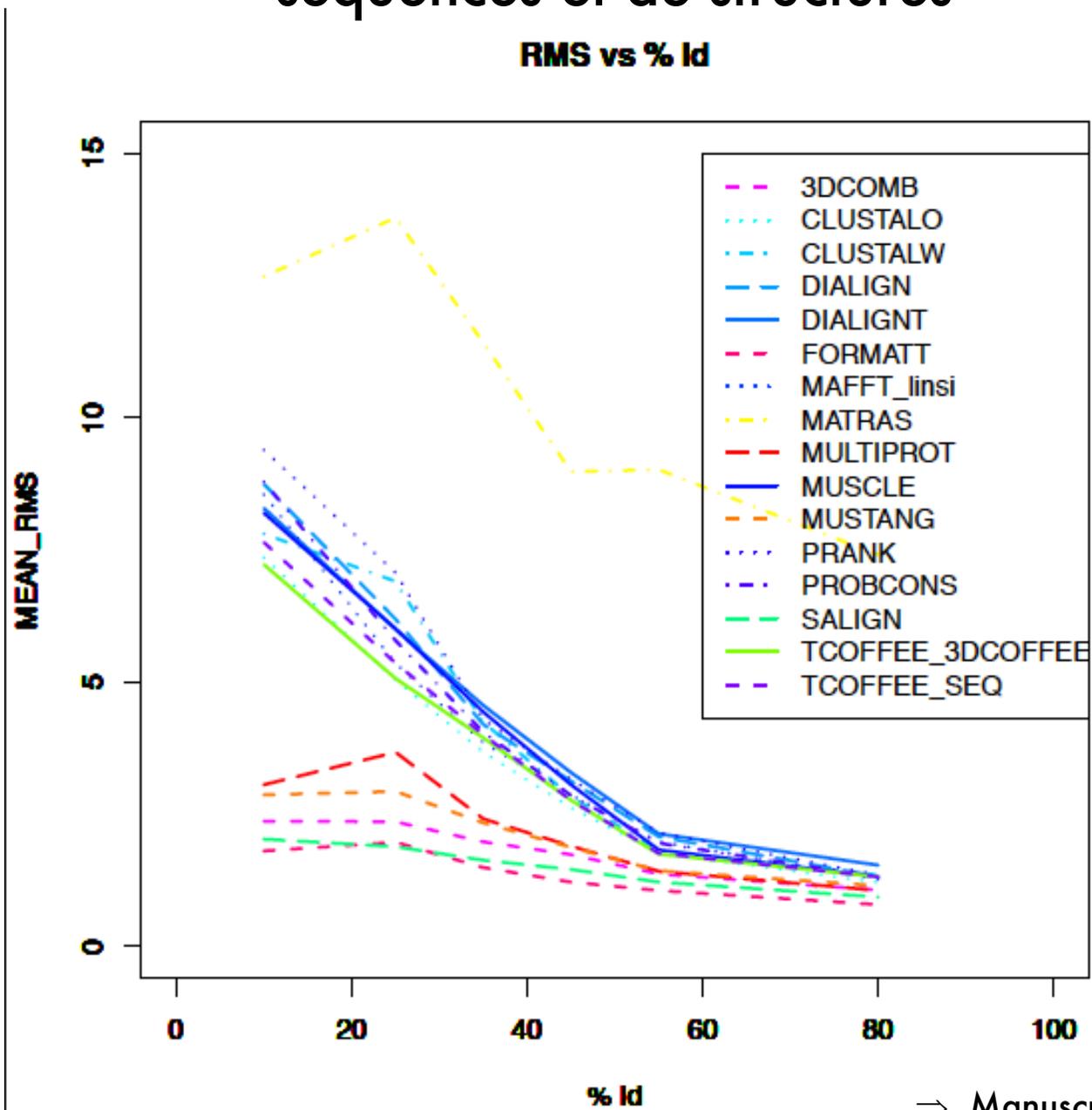
- Comparaison de plusieurs structures

3 méthodes:

- \* Méthode des « m-diagonales »
- \* Méthode du Gibbs sampling
- \* Méthode de recherche de motifs relationnels (Triades)



# Comparaison des méthodes d'alignement multiple de séquences et de structures

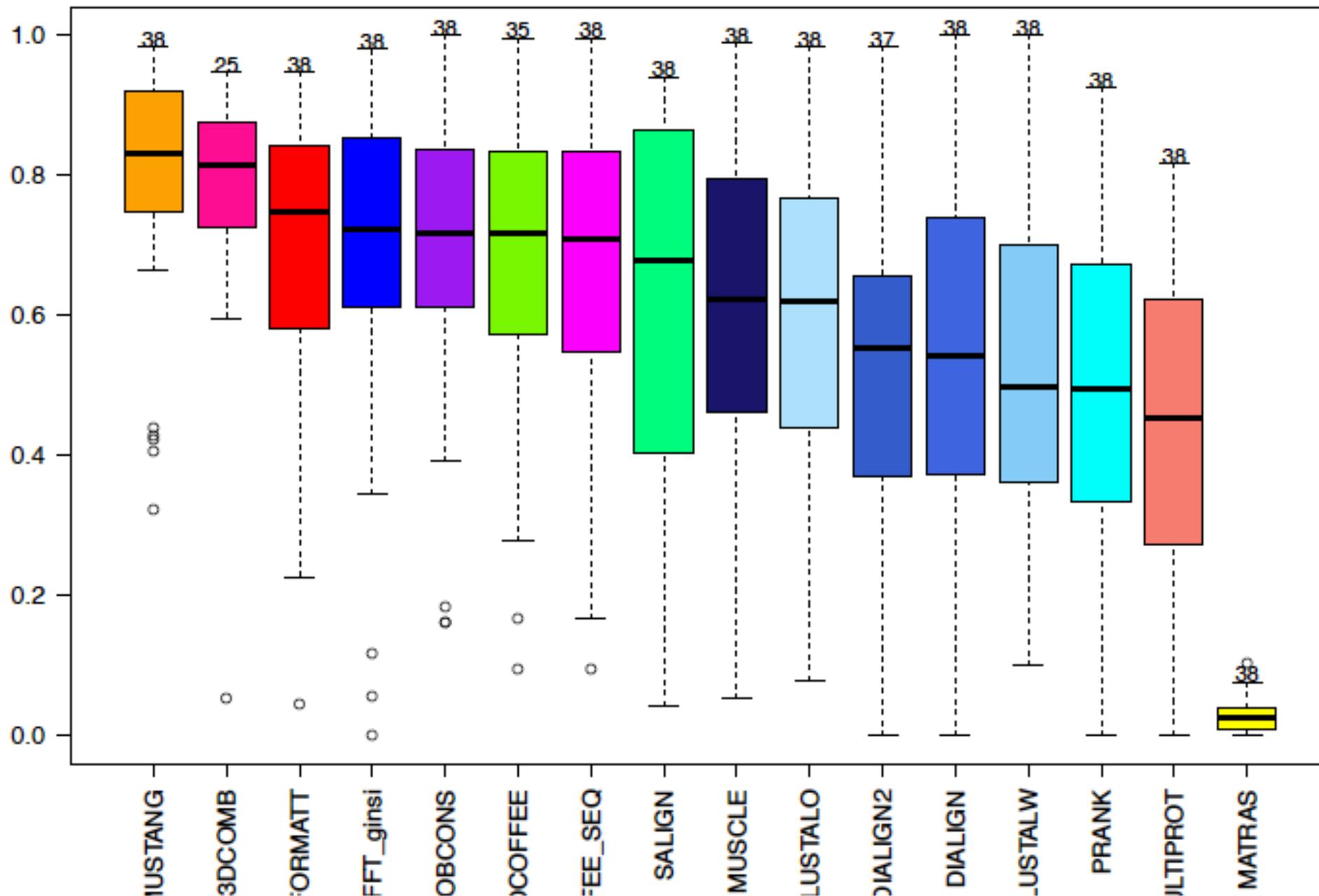


⇒ Manuscrit en cours d'écriture



Align  
stru

SP result summary for BB3



# Echave, J. & Fernández, F. M. A perturbative view of protein structural variation. *Proteins* 78, 173–180 (2010).

## Datasets

- **LFENM: SIMULATED** réf = 1a6m sperm whale oxy-myoglobin crystallized at pH 7, 151 residus. Starting from 1a6m, we simulated  $151 \times 100 = 15,100$  single-point mutants using random forces as described in the previous section. To take into account the heme into the ENM we placed five extra nodes at the positions of the heme's Fe and the four CH porphyrin atoms.
- **Random** As a reference model, a null model to compare the LFENM with, we used a dataset of 1510 simulated structures obtained by adding to the wild-type (reference) structure a vector of dimension  $3N$  with random elements picked from a uniform distribution with values in  $(-n, n)$  with  $n \in [0, 1]$ .
- **Globin-like** This dataset includes 1a6m and 21 members of the superfamily of globin-like homologous proteins, as classified in the SCOP database.<sup>9</sup>
- **Mutants** This dataset contains 119 sperm whale myoglobin mutant structures: 22 single mutants, 77 double mutants, 7 triple mutants, and 13 quadruple mutants. Members of this dataset may also differ from 1a6m in the ligand bound to Fe and/or pH, heme state. For most (108) cases the aspartic acid in position 122 is replaced by asparagine. Most of the rest of the mutations are at sites 29, 64, 68, and 67
- **Wild-type variants** This dataset includes 1a6m and 48 structures that have the same (wild-type) sequence. Different members of this set have different ligands, pH, and/or Fe oxidation state. There are also 3 members with Co(II) replacing Fe(II).



# Echave, J. & Fernández, F. M. A perturbative view of protein structural variation. *Proteins* 78, 173–180 (2010).

To better understand the observed connection between evolutionary deformations and dynamical deformations, a model was proposed in which perturbation of Elastic Network Models accounts for the effect of mutations on equilibrium conformation.<sup>140</sup>

This model predicts that the equilibrium conformation will diverge along the low-energy normal modes even under random unselected mutations, which casts doubt on the functional interpretation. If the perturbed ENM is correct, dynamical deformations (normal modes) should govern not only evolutionary divergence, but also the structural change due to perturbation. Further support to the idea of functional signal in ENM perturbation comes from the observation that the same pattern variation along normal modes is found for unselected engineered mutants and for structures of the same protein determined in different experimental conditions.<sup>141</sup>

To say that even under random mutations a protein would diverge along the lowest normal modes is not to say that such modes are nonfunctional or that selection plays no role in molding structural divergence. It is possible that natural selection increases or decreases the contribution of a certain normal mode to structural variation. However, a careful assessment demands the use of a null model that takes into account the dominant effect of the lowest normal modes even in the absence of selection. There is some work that suggests that this could be the case for proteins that experience large functional conformational transitions.<sup>145</sup> Disentangling the effects of natural selection from those of drift on the patterns of structural divergence is a subject on which further research is needed.



# Effet des mutations : quel est l'impact d'une mutation sur une structure ?

## RMS

