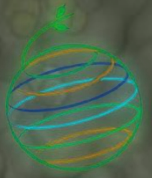


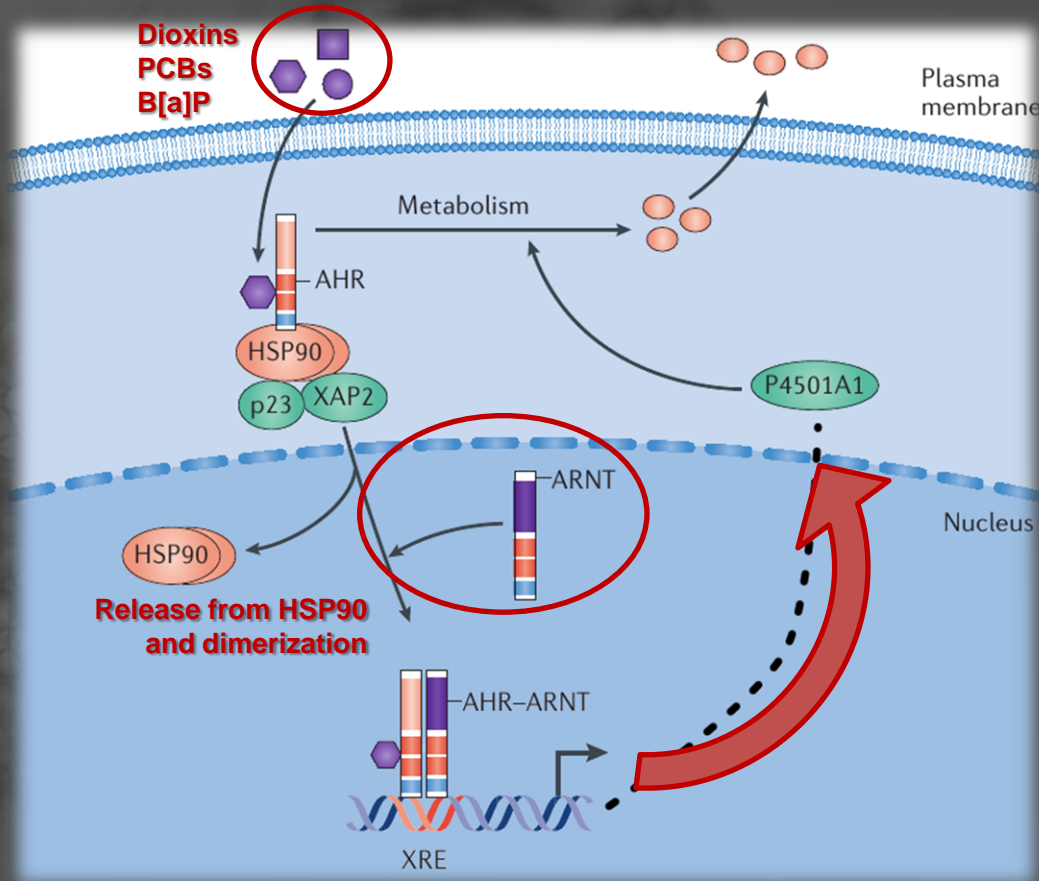
# MODELLING THE INTERTWINED NETWORK OF PPIs ALONG THE AHR:ARNT DIMER

Dario CORRADA and Laura BONATI

*Department of Earth and Environmental Sciences – University of Milano-Bicocca*



# Biological Function of Aryl hydrocarbon Receptor (AhR)



## CLASSICAL MECHANISM OF ACTION

AhR is a transcription factor maintained in its inactive cytosolic form as part of a larger protein complex

AhR is activated by binding to a wide range of xenobiotics

AhR translocates into the nucleus and dimerizes with the AhR Nuclear Translocator (ARNT)

The AhR:ARNT dimer binds to DNA and promotes the expression of genes involved in metabolic detoxification pathways

Bernsten, D. et al. (2013) *Nat Rev Cancer* 13, 827-41

# The bHLH-PAS Proteins Family

**bHLH-PAS**

*stands for*

basic Helix Loop Helix – Per Arnt Sim

**bHLH motif**

- dimerization
- DNA binding

**PAS-B domain**

- ligand binding
- environmental sensing



**PAS-A domain**

- dimerization
- recognition of PAS protein partners

**C-terminal region**

- regulatory
- transactivation

# The bHLH-PAS Protein Family

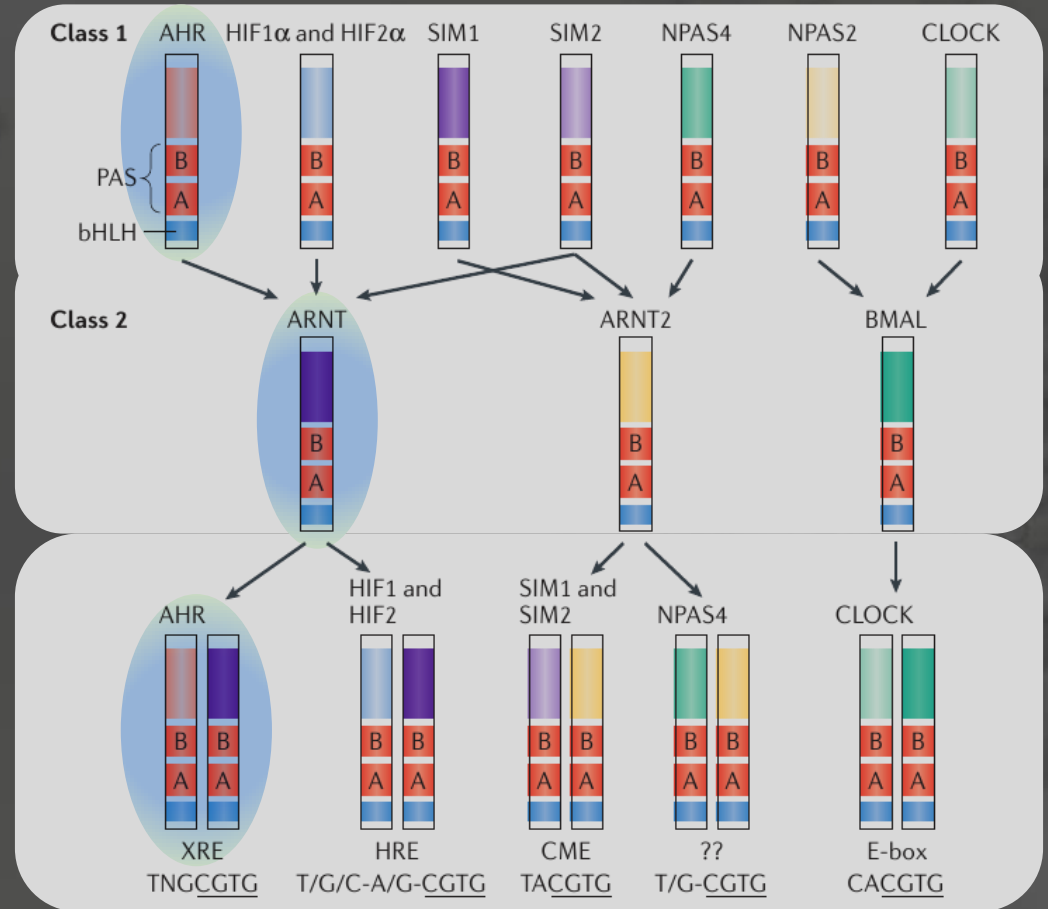
## CLASS I FAMILY MEMBERS

Functional roles: sensing of environmental or physiological signals

## CLASS II FAMILY MEMBERS

Regulatory roles: dimerization with both class II and class I members

The transcriptionally active complex is always a heterodimer composed of bHLH-PAS proteins



Bernsten, D. et al. (2013) *Nat Rev Cancer* 13, 827-41

# Outline – Homology Modelling Strategies

## STAGE 1

*individual dimers of PAS domains*

- Templates Available
- Missing Loops for PAS-A Domains
- Protein-Protein Interactions (PPIs)
- Discriminating Alternative Models
- Experimental Validations

## STAGE 2

*full-length bHLH-PAS complex*

- Templates Available (Brand New)
- Full Length Dimerization Interfaces
- Homology Models Comparison
- Energy Decomposition Analysis
- Known Mutations for AhR and ARNT



*incremental availability  
of structural information  
(ie brand new templates)*



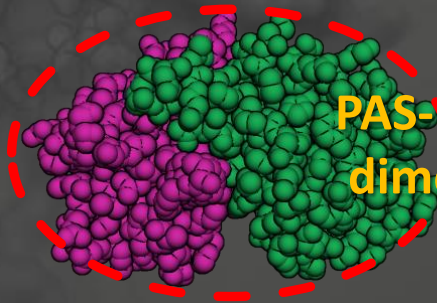


# [STAGE 1] Templates Available

Scheuermann, T. et al. (2009) *Proc Natl Acad Sci USA* 106, 450-5

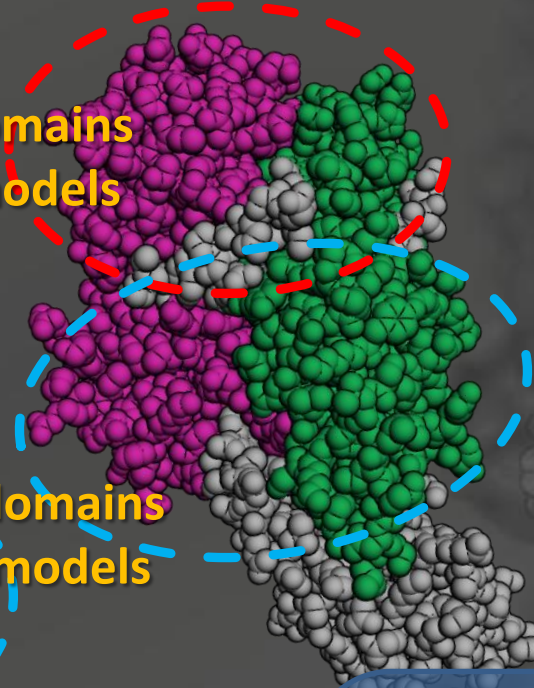
Huang, N. et al. (2012) *Science* 337, 189-94

**HIF2 $\alpha$ :ARNT**  
PAS-B  
Heterodimer  
[3F1P – Res. 1.17Å]



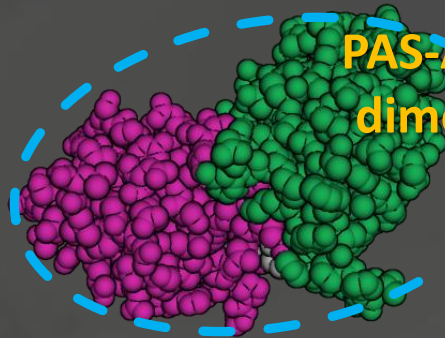
**PAS-B domains  
dimer models**

**CLOCK:BMAL1**  
full-length bHLH PAS  
complex  
[4F3L – Res. 2.27Å]



Wu, D. et al. (2013) *Mol Cell Biol* 33, 4346-56

**AhR:AhR**  
PAS-A  
Homodimer  
[4M4X – Res. 2.55Å]



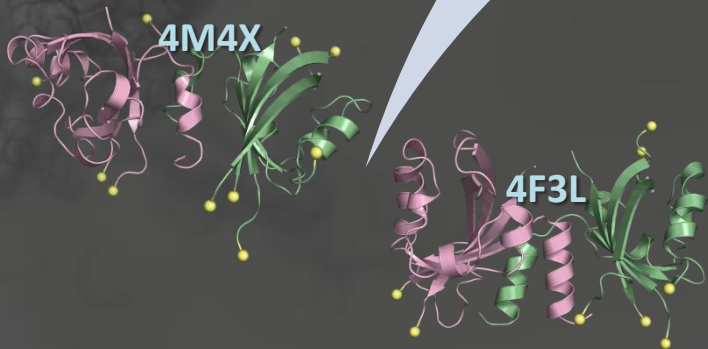
**PAS-A domains  
dimer models**

powered by MODELLER v9.13

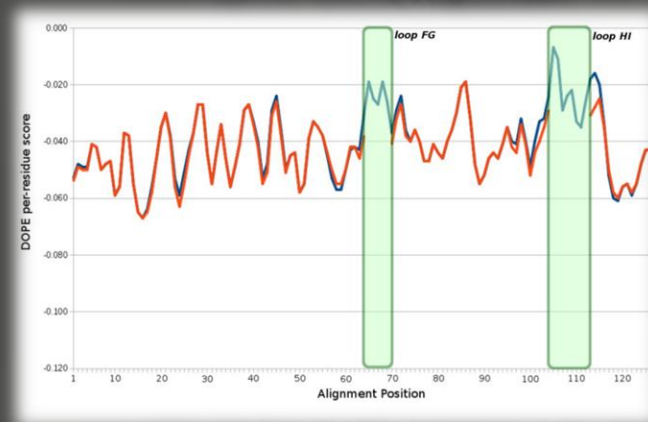
*100 putative homology models  
for every dimerization mode  
proposed by each template*

# Missing Loops for PAS-A Domains

Missing regions in the templates map on loops of about **20 residues** in the target



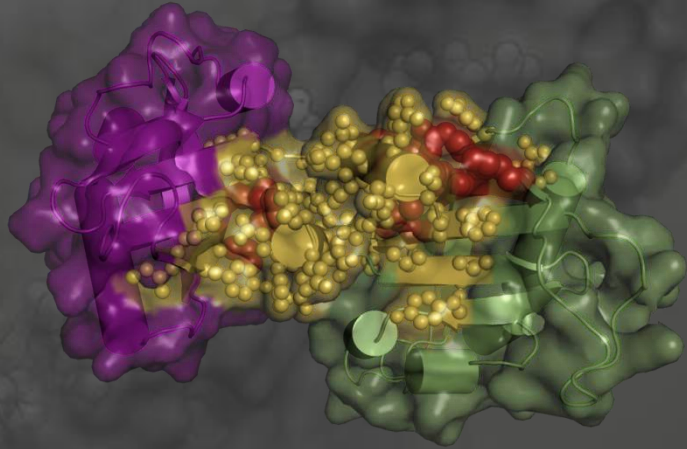
The very high degree of superposition between PAS-A and PAS-B domains allows to graft the **shorter** loops from PAS-B to PAS-A models



The “surgery” outcome seems good: no relevant perturbations emerge by comparison of DOPE energy profiles<sup>1</sup> of PAS-A templates and models

[1] Shen, M. et al. (2006) *Protein Sci* 15, 2507-24

# Protein-Protein Interactions (PPIs)



Dimerization interfaces are outlined by variations in Solvent Accessible Surface Area ( $\Delta$ SASA)<sup>1</sup>

[1] Kleinjung, J. et al. (2005) *Nucleic Acid Res* 33, W342-6

Residues predicted to have critical roles in dimerization are gathered by diverse hot spot prediction algorithms: Robetta<sup>2</sup>; HotPoint<sup>3</sup>; KFC2<sup>4</sup>

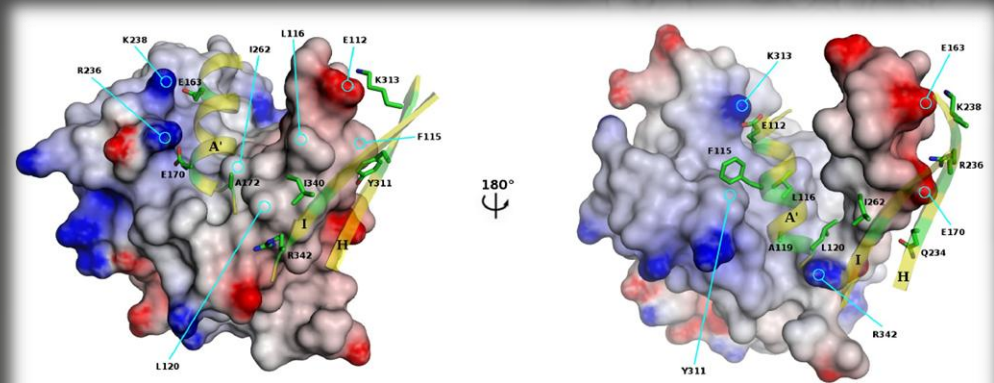
[2] Kortemme, T. et al. (2002) *Proc Natl Acad Sci USA* 99, 14116-21

[3] Tuncbag, N. et al. (2010) *Nucleic Acid Res* 38, W402-6

[4] Zhu, X. et al. (2011) *Proteins* 79, 2671-83

Dimerization interfaces exhibit both geometric and electrostatic complementarity, according to the Electrostatic Potential Surfaces (EPS)<sup>5</sup>

[5] Rocchia, W. et al. (2001) *J Phys Chem B* 105, 6507-14





# Discriminating Alternative Models

## SET A

100 PAS-A(PAS-B) dimers  
based on  
CLOCK:BMAL1 complex

VS

## SET B

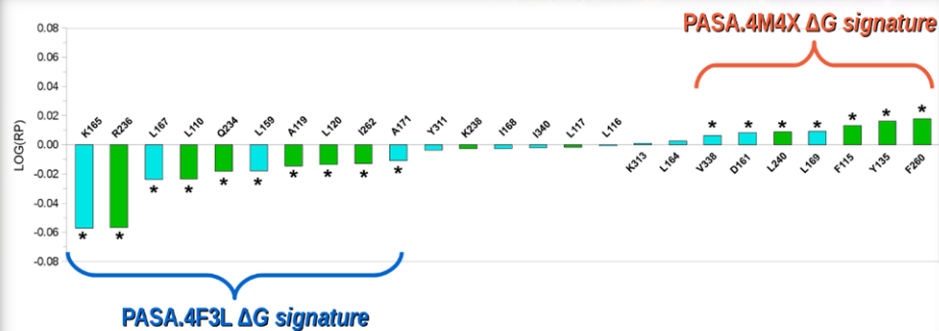
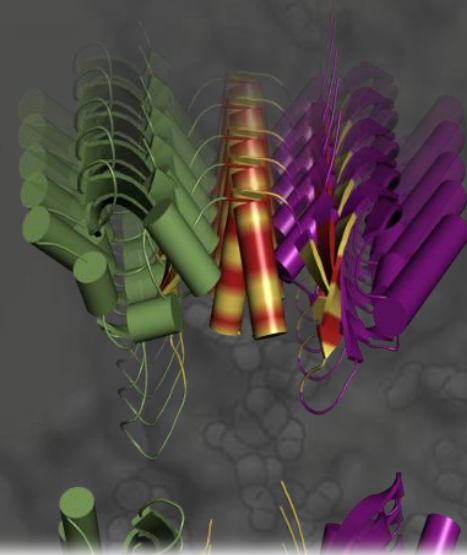
100 PAS-A(PAS-B) dimers  
based on  
AhR:AhR(HIF2 $\alpha$ :ARNT) dimer

$\Delta G_{binding}$  is calculated by means of MM-GBSA method.  
Energetic determinants are extracted through Energy  
(eigen)Decomposition analysis<sup>1</sup>

[1] Corrada, D. et al. (2013) *J Chem Inf Model* 53, 2937-50

Distinctive patterns of interacting  
residues are determined by comparing  
the 100 replicates of each model by the  
two sample Rank Products algorithm<sup>2</sup>

[2] Koziol, J. (2010) *FEBS Lett* 584, 4481-84

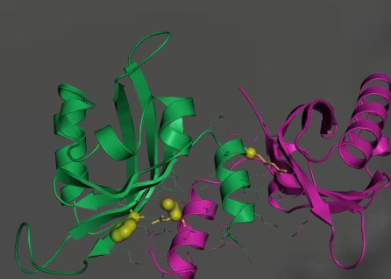
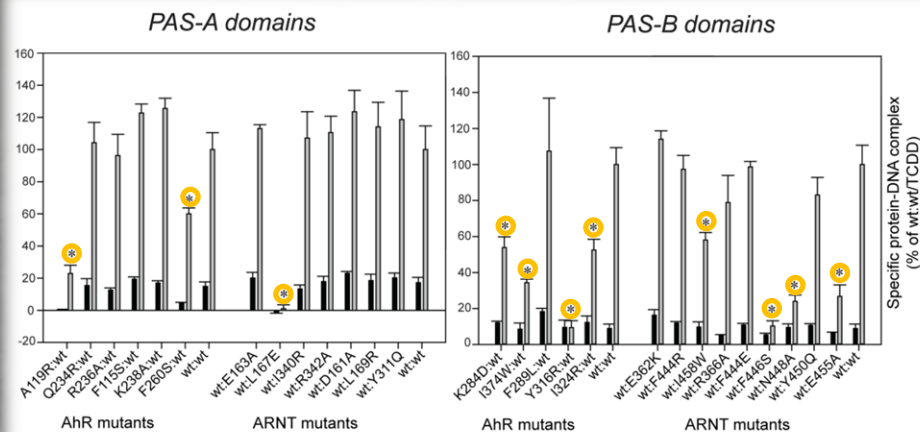


# Experimental Validations

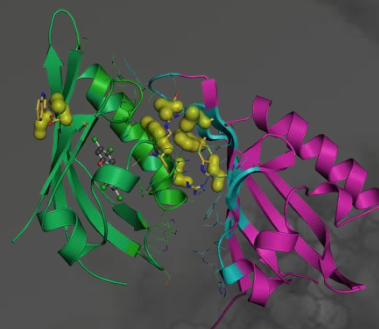
$\Delta G$  signatures define pattern of distinct hot spots characterizing each model



mutagenesis experiments for the assessment of the proposed dimerization modes



PAS-A dimer model  
based on  
CLOCK:BMAL1 complex



PAS-B dimer model  
based on  
CLOCK:BMAL1 complex

Corrada D, Soshilov AA, Denison MS, Bonati L.

*Deciphering Dimerization Modes of PAS Domains: Computational and Experimental Analyses of the AhR:ARNT Complex Reveal New Insights Into the Mechanisms of AhR Transformation.*

(2016) PLoS Computational Biology 12(6): e1004981

doi:10.1371/ journal.pcbi.1004981

# [STAGE 2] Templates Available (Brand New)

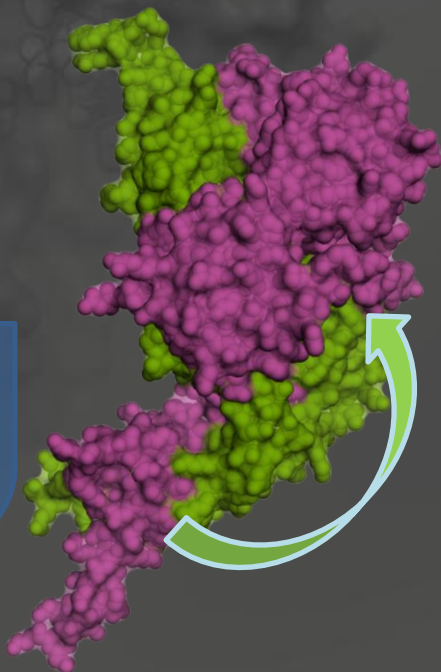
Huang, N. et al. (2012) *Science* 337, 189-94

## CLOCK:BMAL1

full-length  
complex

[4F3L – Res. 2.27Å]

Class I bHLH-PAS  
(**CLOCK**) wraps around  
Class II bHLH-PAS  
(**BMAL1**)



Wu, D. et al. (2015) *Nature* 524, 303-8

## HIF2α:ARNT

full-length  
complex

[4ZP4 – Res. 2.36Å]

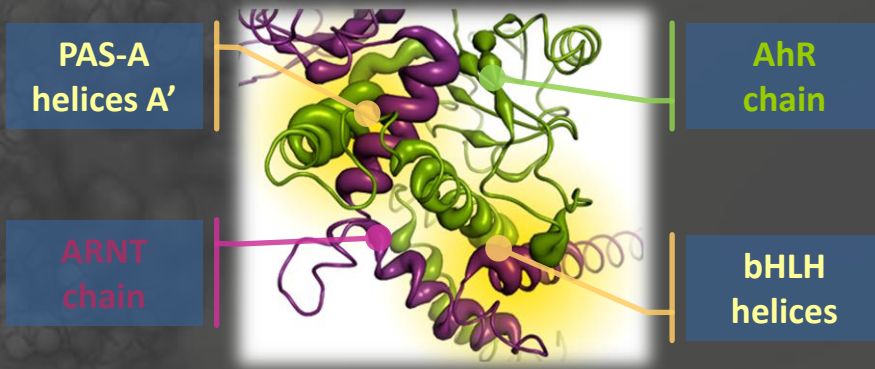
Class II bHLH-PAS  
(**ARNT**) wraps around  
Class I bHLH-PAS  
(**HIF2α**)



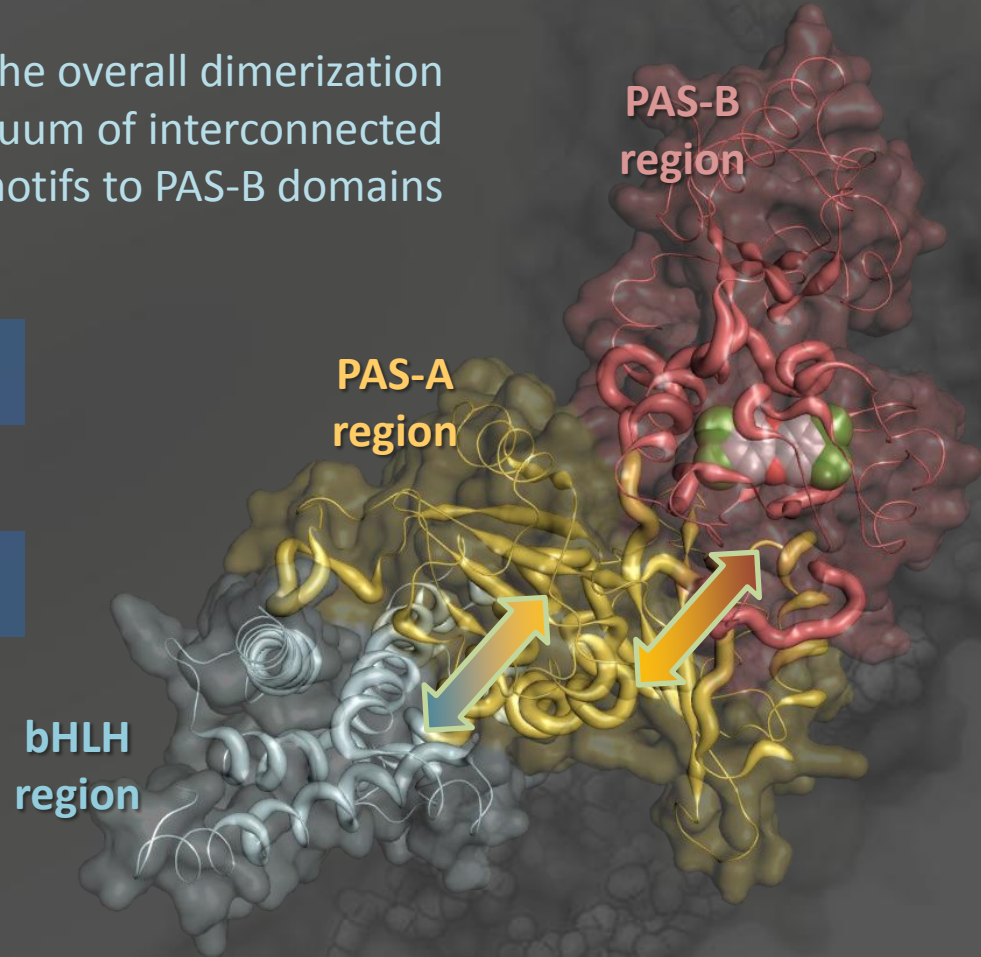
Homomeric PPIs (PAS-A/PAS-A; PAS-B/PAS-B)  
show very similar interfaces in the two templates  
and in our dimer models

# Full Length dimerization interface

According to  $\Delta$ SASA analyses, the overall dimerization interface encompasses a continuum of interconnected PPIs from bHLH motifs to PAS-B domains

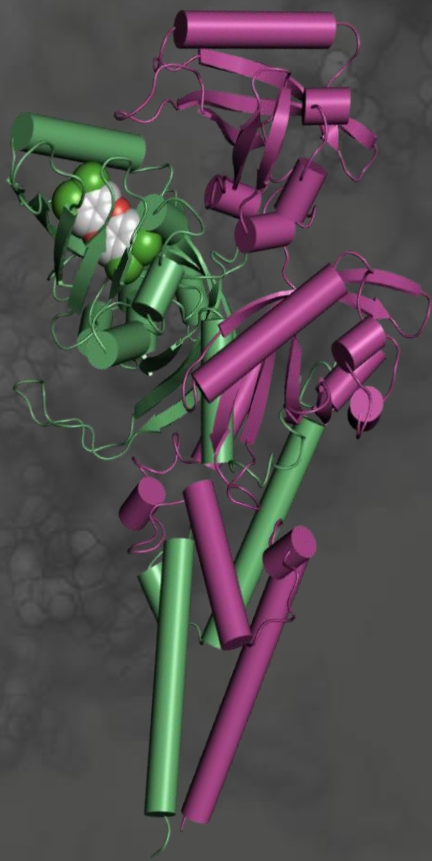


Extended overlaps between homomeric (PAS-A/PAS-A and bHLH/bHLH) and heteromeric (bHLH/PAS-A) interactions

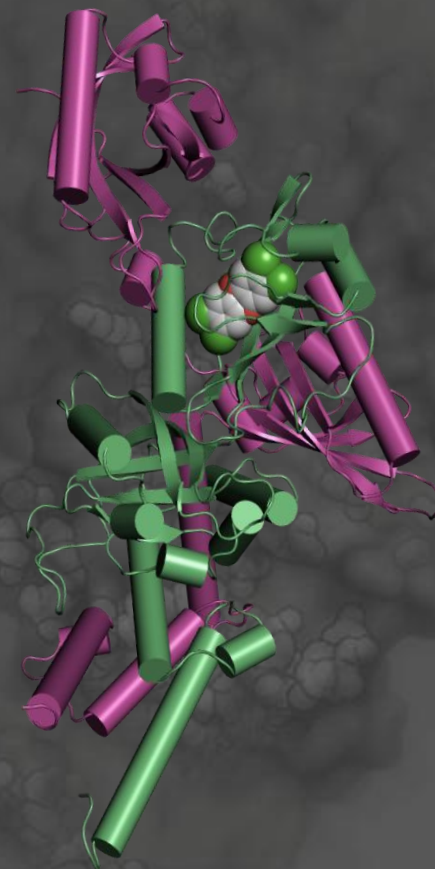




# Homology Models Comparison

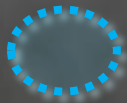


CLOCK:BMAL1 (4F3L)	<i>model based on...</i>	HIF2a:ARNT (4ZP4)
279	<i>residues</i>	248
7,046	$\Delta$ SASA ( $\text{\AA}^2$ )	6,536
3.1	<i>i</i> RMSD ( $\text{\AA}$ )	1.2
39.2	<i>identity</i> (%)	54.4
54.3	<i>similarity</i> (%)	64.6
<b>-323.55 <math>\pm</math> 17.67</b>	$\Delta G_{\text{binding}}$ (kcal/mol)	<b>-325.70 <math>\pm</math> 16.30</b>



$\Delta G_{\text{binding}}$  values are nearly identical, despite the overall scaffold of the templates chosen show remarkable differences

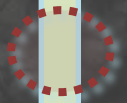
# Energy Decomposition Analysis



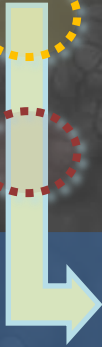
The distribution of most of the contributions to  $\Delta G_{binding}$  greatly overlaps in the two models



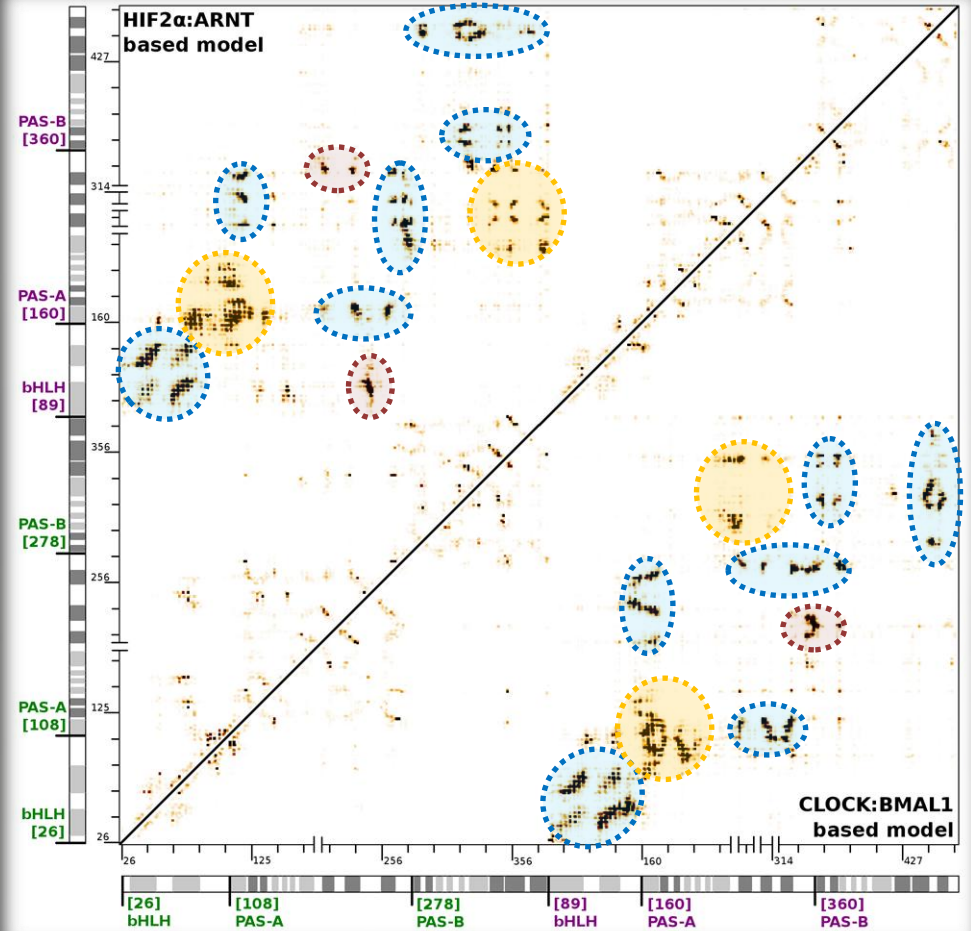
The topology of few energetic couplings slightly varies



Minor stabilizing "islets" can be found, typical of each model



Heteromeric PPIs account for minor contributions to the overall  $\Delta G_{binding}$



# Known Mutations for AhR and ARNT

chain	domain	mutant(s)	CLOCK:BMAL1 based model		HIF2 $\alpha$ :ARNT based model	
			$\Delta G$	$\Delta SASA$	$\Delta G$	$\Delta SASA$
AhR	PAS-A	L116E	Red	Blue	Red	Blue
AhR	PAS-A	A119D; A119R	Red	Blue	Red	Blue
AhR	PAS-A	L120E	Red	Blue	Red	Blue
AhR	PAS-A	V124E; V124D	Red	Blue	Red	Blue
AhR	PAS-A	A131V	Red	Blue	Red	Blue
AhR	PAS-A	I160T	Red	Blue	Red	Blue
AhR	PAS-A	C216W	Red	Blue	Red	Blue
AhR	PAS-A	L218P	Red	Blue	Red	Blue
AhR	PAS-A	G227C	Red	Blue	Red	Blue
AhR	PAS-A	F228L	Red	Blue	Red	Blue
AhR	PAS-A	F260D; F260S	Red	Blue	Red	Blue
AhR	PAS-A	I262D	Red	Blue	Red	Blue
AhR	PAS-B	K284D	Red	Blue	Red	Blue
AhR	PAS-B	Y316R	Red	Blue	Red	Blue
AhR	PAS-B	I324R	Red	Blue	Red	Blue
AhR	PAS-B	I374W	Red	Blue	Red	Blue
ARNT	PAS-A	E163K	Red	Blue	Red	Blue
ARNT	PAS-A	L167E	Red	Blue	Red	Blue
ARNT	PAS-A	I168D	Red	Blue	Red	Blue
ARNT	PAS-A	A171D	Red	Blue	Red	Blue
ARNT	PAS-A	V179A	Red	Blue	Red	Blue
ARNT	PAS-A	S190P	Red	Blue	Red	Blue
ARNT	PAS-A	D217G	Red	Blue	Red	Blue
ARNT	PAS-A	L221H	Red	Blue	Red	Blue
ARNT	PAS-A	M267K	Red	Blue	Red	Blue
ARNT	PAS-A	V306D	Red	Blue	Red	Blue
ARNT	PAS-A	C308R	Red	Blue	Red	Blue
ARNT	PAS-A	A339D	Red	Blue	Red	Blue
ARNT	PAS-A	G341D	Red	Blue	Red	Blue
ARNT	PAS-B	F446S	Red	Blue	Red	Blue
ARNT	PAS-B	N448A	Red	Blue	Red	Blue
ARNT	PAS-B	E455A	Red	Blue	Red	Blue
ARNT	PAS-B	I458W	Red	Blue	Red	Blue

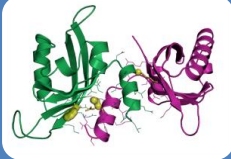
The critical importance of several residues along the dimerization interface agree with effective disrupting mutations

Other known mutations maps outside the dimerization interface, along solvent exposed regions



External partners other than AhR and ARNT involved in the complex stabilization?

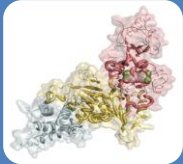
# Lessons from AhR:ARNT Complex...



## [STAGE 1]

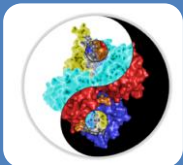
- Our *in silico* workflow strongly suggests reliable dimerization modes among alternative interfaces

From local definition of PPIs...



## [STAGE 2]

- The two full length models share the most critical PPIs, where homomeric interactions overcome the heteromeric ones



The final outcome offers a basic framework of interactions for next studies on the molecular mechanism of transformation and transactivation of the AhR transcription factor

...to global characterization of dimerization interface



## GRAFTED vs. NATIVE LOOPS

How the native loops could improve the dimerization interface?

## DYNAMICAL PERSPECTIVE

May differential behaviours arise from MD simulation?





# THANK YOU FOR THE ATTENTION

Dario CORRADA, PhD  
*dario.corrada@unimib.it*



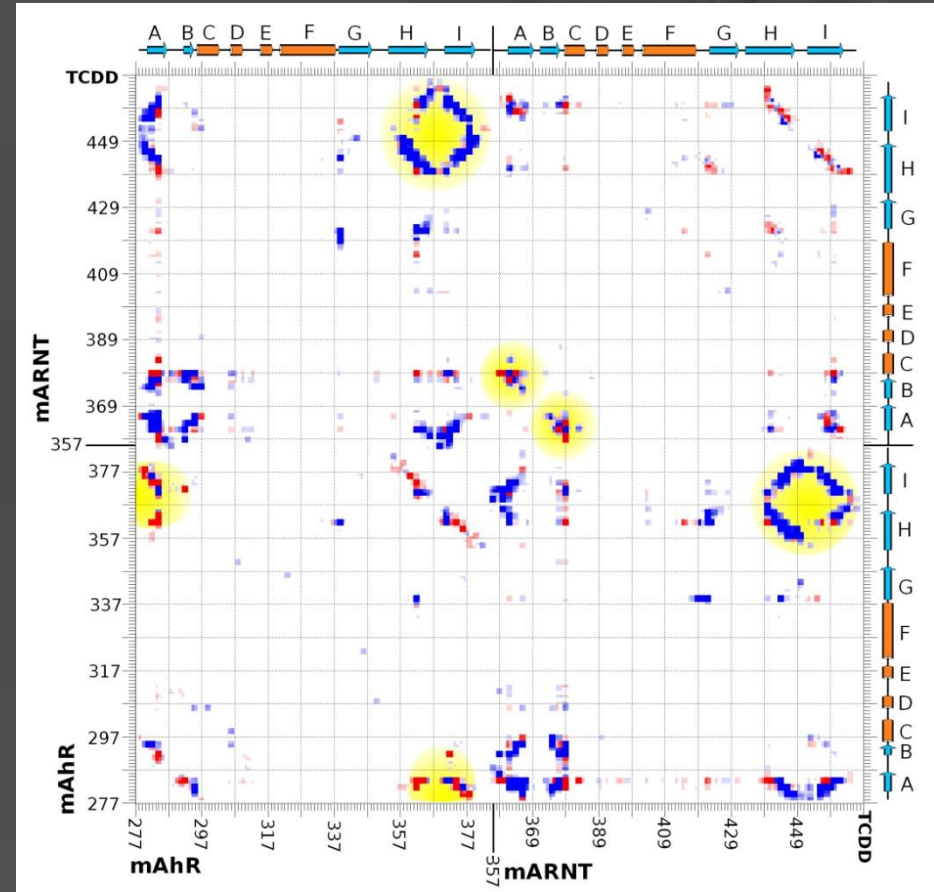
*National Institute of Environmental  
Health Sciences [R01 ES007685]*

# Energy of the PPI interfaces

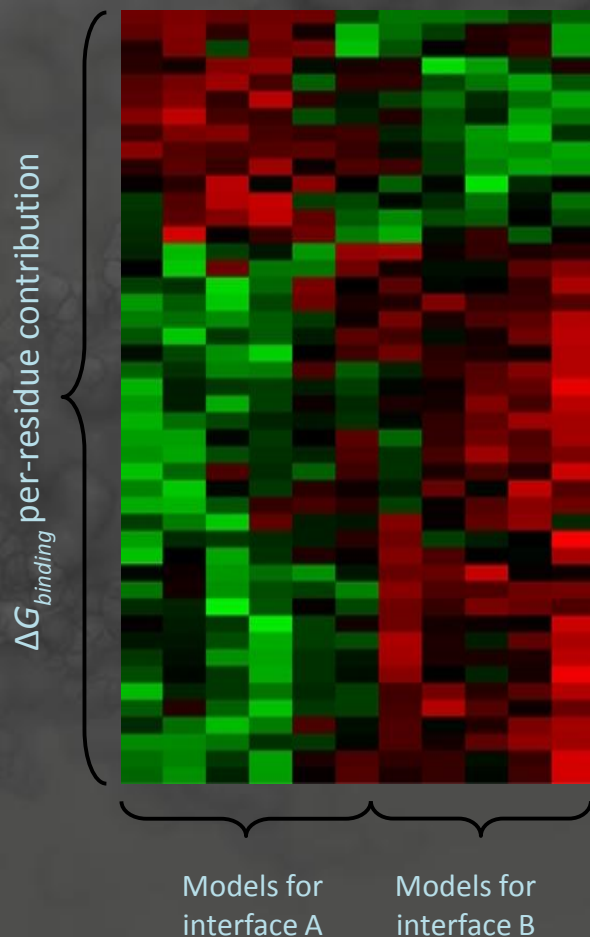
The free energy of binding is calculated by means of the MM-GBSA method, implementing a Single Frame Protocol (SFP) strategy. The choice of receptor and ligand is arbitrary, since both of the protomers (almost) equally contribute to the dimerization process.

The Energy (eigen)Decomposition analysis allows to define an interaction energy matrix in which the most relevant residue pairwises that contribute to disrupting/stabilizing effects are emphasized.

$$A_{ij} \cong \sum_{k=1}^K \lambda_k w_i^k w_j^k$$



# Two Sample Rank Products



Rank Products is a positional method to combine ranked lists. In this specific case, the residues that belongs to each model produced are ranked, according to their contributions to the overall free energy of binding of the dimer.

$$R_g = \prod_{i=1}^K \frac{r_{i,j}}{N_i}$$

In order to compare the rank products provided from two alternative kind of PPI the two sample variant has been adopted.

$$\log(RP_g) = \log(R_g^A) - \log(R_g^B)$$

# Predicting Hot Spots

---

A hot spot is a residue predicted to have a critical role for the dimerization. The more detailed definition of hot spot varies, according to the different assumptions established by the PPI hot spot prediction methods.

## Robetta

Kortemme, T. et al. (2002)  
*Proc Natl Acad Sci USA* 99, 14116-21

the predictions are obtained by performing an *in silico* alanine scanning and calculating the  $\Delta\Delta G$  upon mutation with an internal energy function based on rotamers evaluation.

## HotPoint

Tuncbag, N. et al. (2010)  
*Nucleic Acid Res* 38, W402-6

the predictions provided are based both on evaluation of  $\Delta SASA$  and on a scoring function termed potential contact, based on the number of interacting residues in a shell of 7 Å

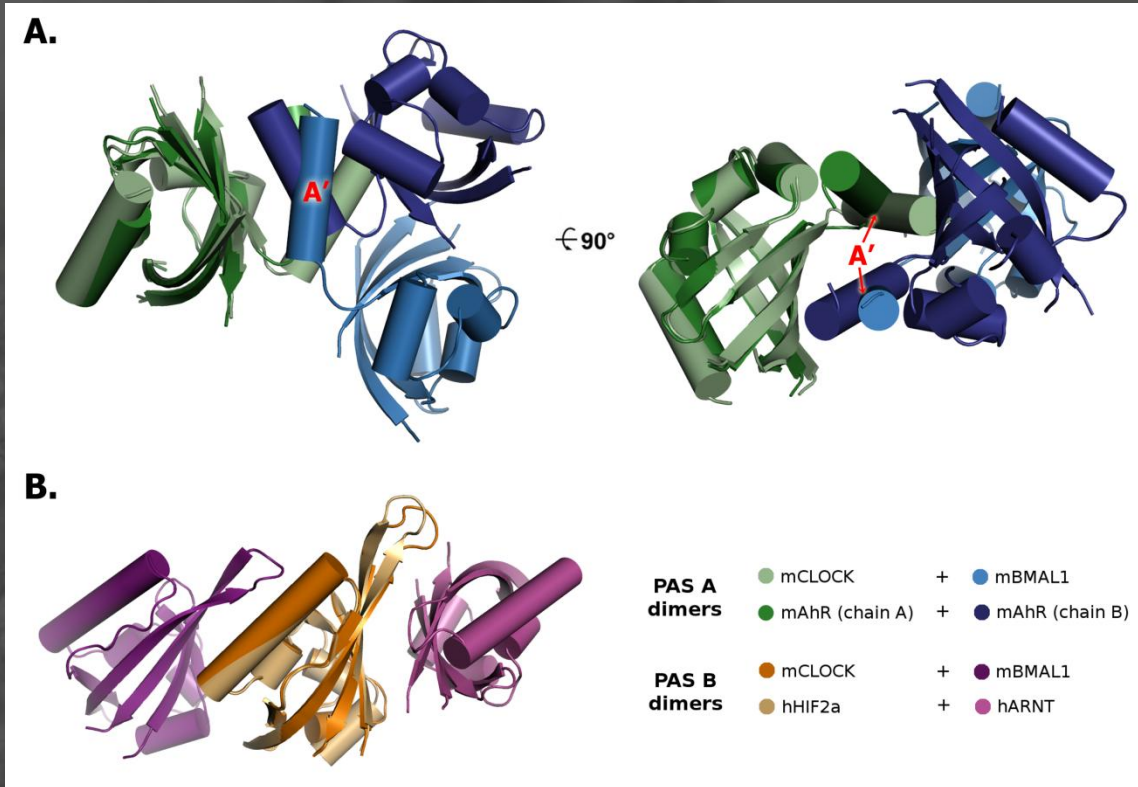
## KFC2

Zhu, X. et al. (2011)  
*Proteins* 79, 2671-83

the predictions are based on a machine learning method trained on 47 different features derived from solvent accessibility and biochemical properties of the residues (e.g.: hydrophobic profiles, non-bonded interactions and  $\pi$ -stacking interactions)



# Homology modelling: single- vs. multi-template



The different dimerization modes observed for the templates span from opposite orientations of the partner (PAS-B dimer) to not negligible spatial arrangement of secondary structural elements.

For such reasons a multi-template approach to homology modelling seems not feasible in this specific case.

**NOTE (panel B of the figure):** the PAS-B dimerization mode observed for the crystal **4ZP4** (HIF2a:ARNT complex) resemble the dimerization mode of the crystal **4F3L** (CLOCK:BMAL1 complex), in contrast with that showed in the crystal **3F1P** (HIF2a:ARNT PAS-B heterodimer)

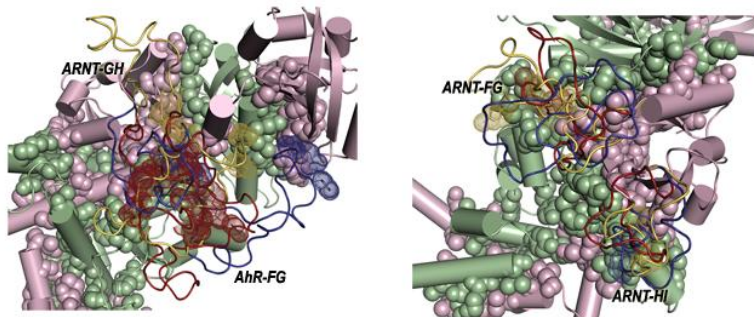
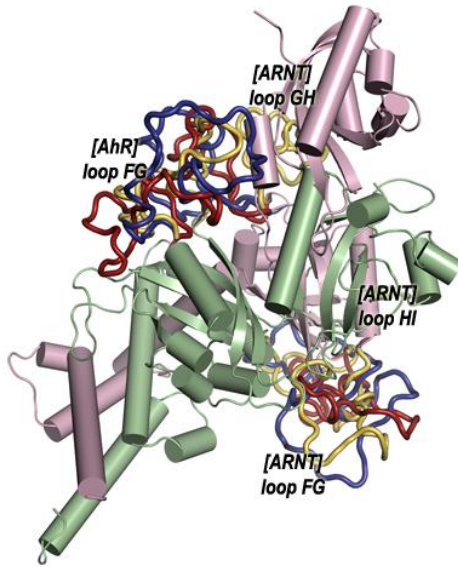
# Rosetta Native Loops Building

More than 1,000 loop models have been generated, the *next generation KIC with fragments* method was adopted, according with *Talaris 2014* protocol

Ò Conchùir, S. et al. (2015) *PLoS ONE* 10, e0130433

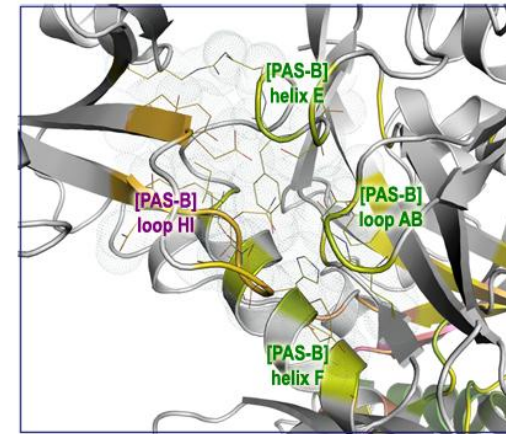
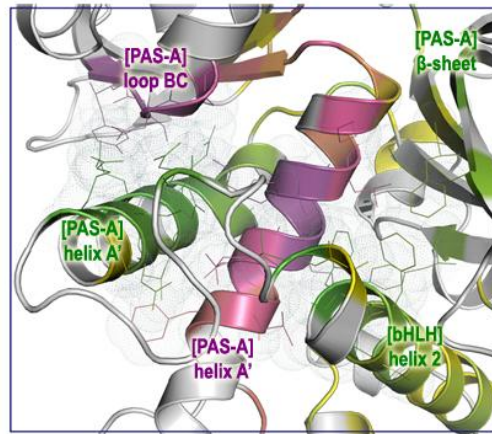
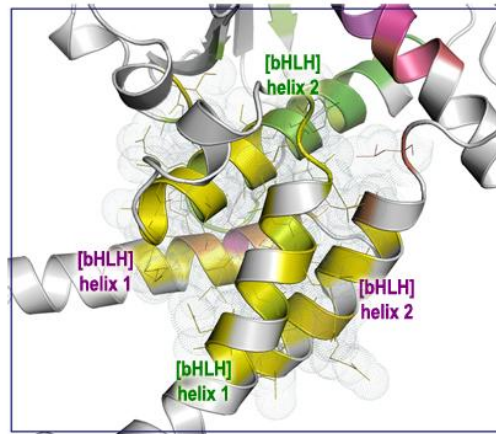
A limited number of representatives was chosen upon cluster analysis of the putative models

The native loops seems to extend the dimerization interfaces marginally, with minor patches

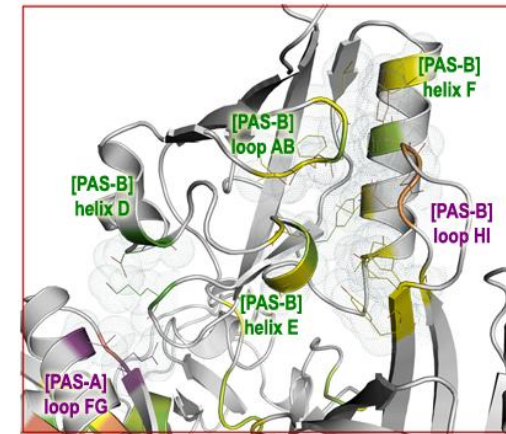
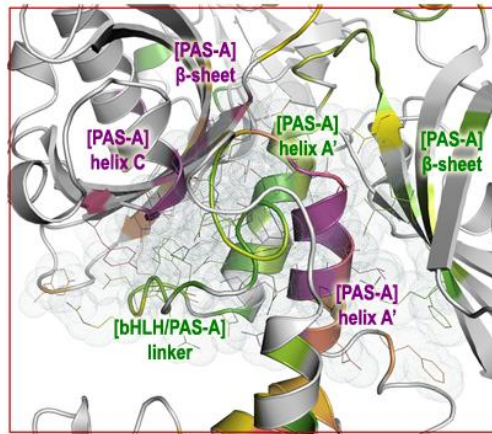
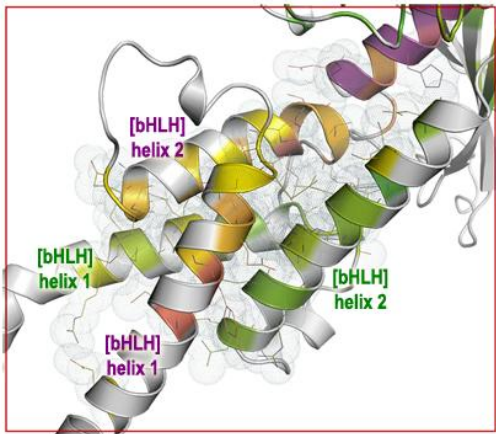




# Main PPIs and Related Energy Couplings



**HIF2a:ARNT based**



**CLOCK:BMAL1 based**