Marine Biological Laboratories
Workshop in Molecular Evolution

Adaptive protein evolution: Detecting changes in selection

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Adaptive protein evolution

1

Phylogenetic approaches to the study of protein structure and function

- Ancestral protein reconstruction
- Computational analyses of selection (dN/dS)

-> Combining computational with experimental approaches allows us to test hypotheses of selection in protein evolution

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Codon models of evolution - Ratio of nonsynonymous/synonymous substitution rates

$\omega = dN/dS$

A measure of evolutionary constraint which can provide insight into the form and strength of selection on proteins.

- purifying selection (AA changes are purged) → $\omega < 1$
- neutral evolution → $\omega = 1$
- positive selection (AA changes are favoured) → $\omega > 1$

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ADAPTIVE EVOLUTION: Combining computational and experimental approaches to test hypotheses of selection in protein evolution

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GLELHPDYKTWSPEQVCSFLRRGGF
GPELHPDHKTWGPEQVCSFLRRGGF
GLELHPDYKTWGPEQVCSFLRRGGF
GLELHPDYKTWDPEQVCSFLRRGGF
GLELHPDYKTWGPEQVCFFLRGGGF
GLELHLDYKTWDPEQVCFFLRRGGF
GLELHPDYKTWGPEQVCFFLRRGGF
GLELHPDYKTWGPEQVCFFLRRGGF
GLELHPDYKTWDPEQVCFFLRRGGF
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GLELHPDYKTWDPEQVCFLRRGGF
GLELDPDYKTWDPEQVCSFLGRGGF
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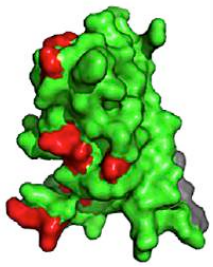

- Testing hypotheses of selection in a phylogenetic framework
- Identification of positively selected sites/regions
- Experimental studies of shifts in protein function

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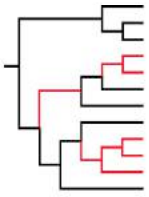
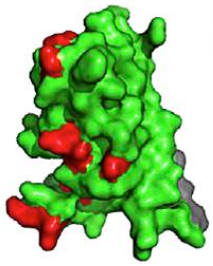
ADAPTIVE EVOLUTION:
Combining computational and experimental approaches to test hypotheses of selection in protein evolution





- Testing hypotheses of selection in a phylogenetic framework
- Identification of positively selected sites/regions
- Experimental studies of shifts in protein function

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Testing hypotheses of selection in protein evolution: Combining computational and experimental approaches

1. Formulate hypothesis of selection acting on evolution of particular group of sequences
2. Collect target group of sequences
3. Test hypothesis of selection using codon models in a phylogenetic framework
4. Identify amino acid sites/regions that have been targets of selection
5. Formulate hypothesis of selection acting on particular aspect of protein function
6. Select proteins/mutants for experimental studies
7. Test hypothesis of selection using experiments investigating shifts in protein function

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Testing hypotheses of selection in protein evolution: Combining computational and experimental approaches

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Testing hypotheses of adaptive evolution in protein function: Combining computational and experimental approaches

Computational analyses

- Statistical test for positive, or divergent selection in a phylogenetic context
- Identifies amino acid residues that may have been the targets of positive selection
- Does NOT prove adaptive evolution -> Need function

Experimental studies

- Empirical test for shifts in protein function as a consequence of substitutions at sites targeted by selection
- Does NOT prove anything about selection & adaptive evolution, need evolutionary context
- Ideally combined with ancestral reconstruction and mutagenesis studies

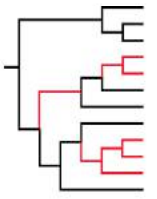
Testing hypotheses of adaptive evolution in protein function: Combining computational and experimental approaches

Computational analyses
- Statistical test for positive, or divergent selection in a phylogenetic context
- Identifies amino acid residues that may have been the targets of positive selection
- Does NOT prove adaptive evolution -> Need function

Experimental studies
- Empirical test for shifts in protein function as a consequence of substitutions at sites targeted by selection
- Ideally combined with ancestral reconstruction and mutagenesis studies

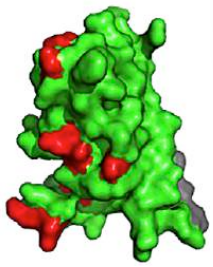
-> Taken together, computational and experimental approaches can be used to test for ADAPTIVE EVOLUTION in protein function as a consequence of natural selection!

Formulating specific and testable hypotheses of adaptive evolution



Pervasive vs. episodic selection

Sites targeted by selection



Effect on protein function

-> Answering the question, not only when/where but WHY did selection occur?

-> The role of a priori information in formulating hypotheses about function

Examples of positive selection on proteins: Experimental models

Host-viral arms races

- Primate intracellular immune response TRIM5a, protein kinase R (Sawyer et al. 2005, Elde et al. 2009)
- Potato virus Y (Moury & Simon 2011)
- Neutrophil-mediated host response to infection (Loughran et al. 2012)

Sperm-egg recognition proteins

- Abalone lysin, egg coat (Aagaard et al. 2013)

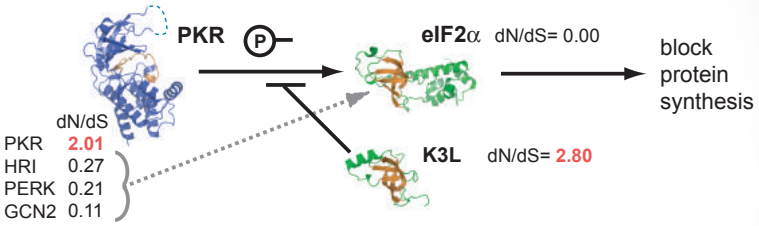
Sensory proteins

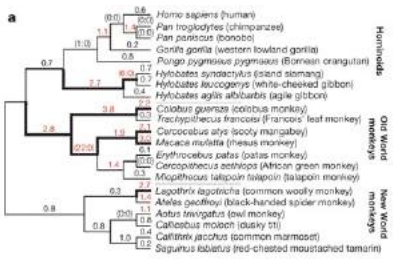
- Visual pigments in whales, fishes, birds, bats (Dungan & Chang 2017, Hauser et al. 2017)

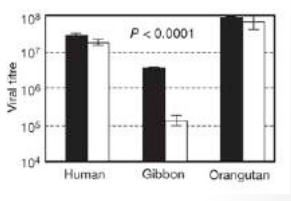
Transcription factors in development

- Stem cell pluripotency (Baker et al. 2016)

Primate protein kinase R locked in arms race with viral protein mimic K3L

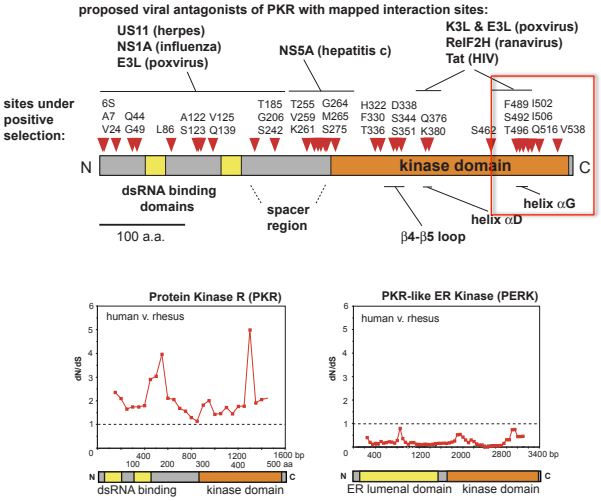






Elde et al. Nature 2009

Positive selection has shaped PKR in primate evolution



Elde et al. Nature 2009

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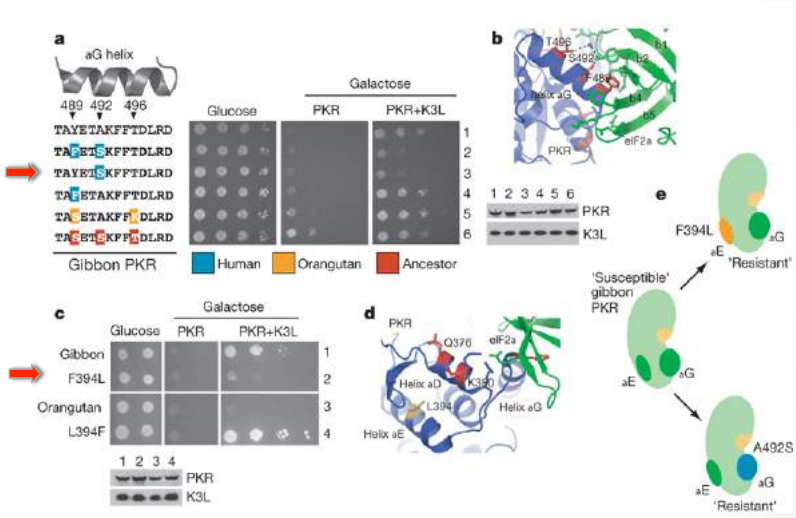
Positively selected sites on distinct surfaces of the PKR kinase domain are crucial to K3L resistance



Elde et al. Nature 2009

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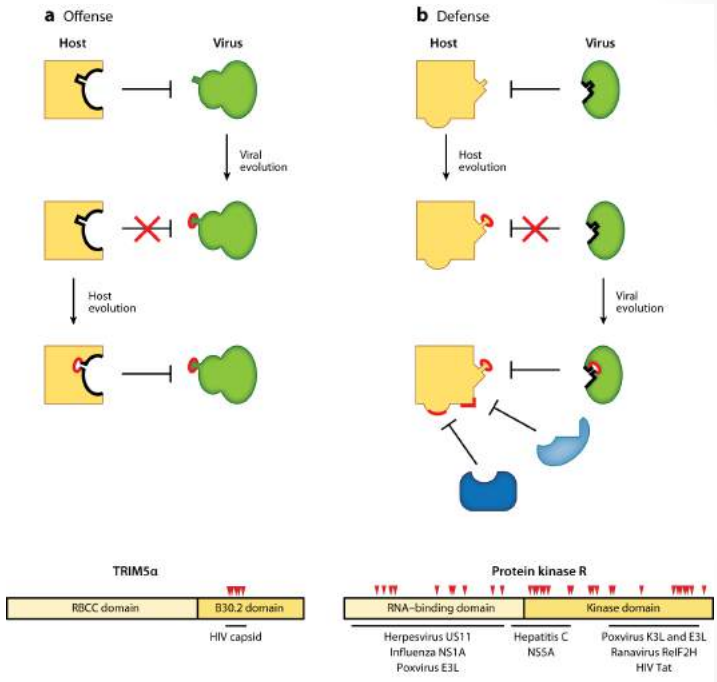
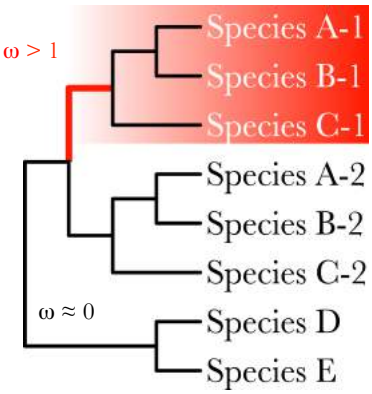
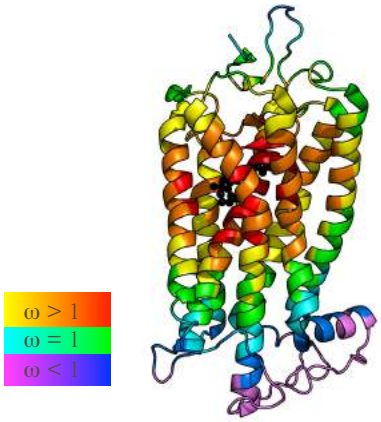


Beyond random sites and branch-sites models: Clade models

The form and strength of selection may vary across both the phylogeny and the protein.

Codon models can incorporate variation across sites and lineages, and can be used to detect positive and divergent selection.





Bielawski & Yang (2004)

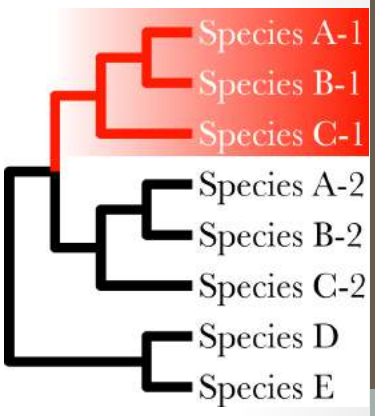
Codon models of divergent selection: Clade model C (CmC)

CmC assumes sites evolve in three ways:

1. purifying selection ($0 < \omega_0 < 1$) constrains evolution at some sites, operating consistently across the tree.

2. some sites evolve free of constraint (neutrally: $\omega_1 = 1$) across the entire tree.

3. the remaining sites evolve divergently ($\omega_2 \neq \omega_3$) between particular sections of the tree.



Bielawski & Yang (2004)

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Codon model tests of divergent selection

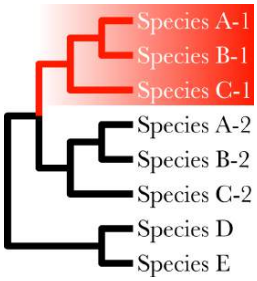
CmC assumes sites evolve in three ways:

1. always purifying selection ($0 < \omega_0 < 1$)

2. always neutral ($\omega_1 = 1$)

3. divergent ($\omega_2 \neq \omega_3$)

3 (alt). no divergence ($\omega_2 > 0$)



An improved null model for testing for divergent selection, M2a_rel model (Weadick & Chang 2012).

M2a_rel retains the third site class, but simply estimates a single ω ratio that applies to all branches of the phylogeny.

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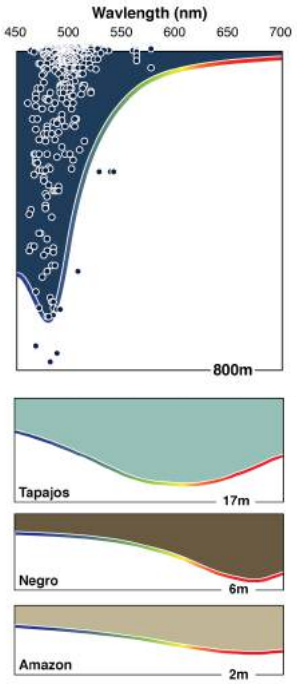
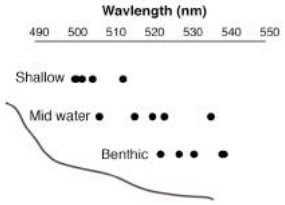


Vision in aquatic environments

- Marine environments become increasingly **blue** with depth
- Deep-sea fishes have **blue-shifted** Rhodopsin
- Rivers are **red-shifted** and dimmer than marine



Freshwater fishes have **red-shifted** rhodopsin pigments

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Molecular evolutionary models + experiments support functional divergence of rhodopsin in Neotropical cichlids

Frances Hauser

Hernan Lopez-Fernandez, ROM

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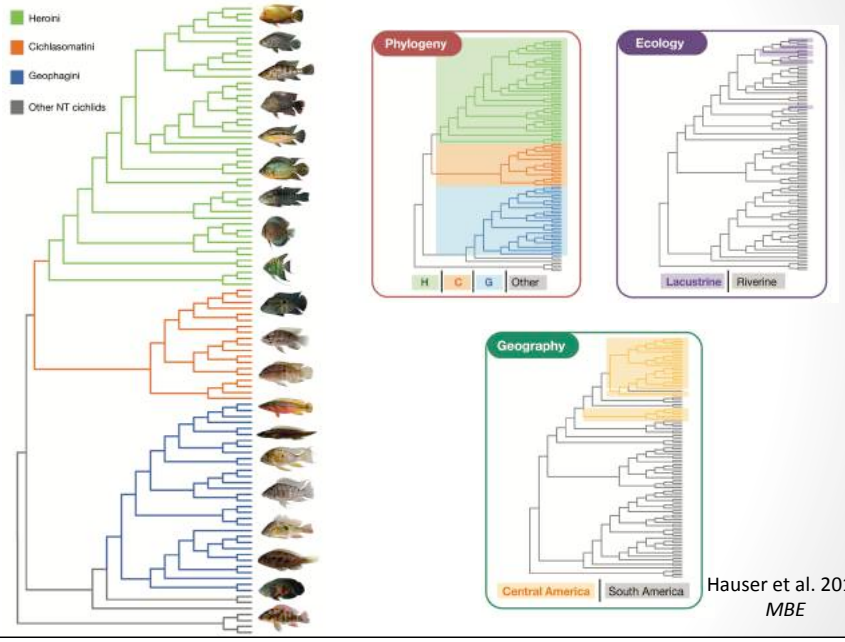
Clade models used to test different hypotheses of Neotropical cichlid rhodopsin evolutionary divergence



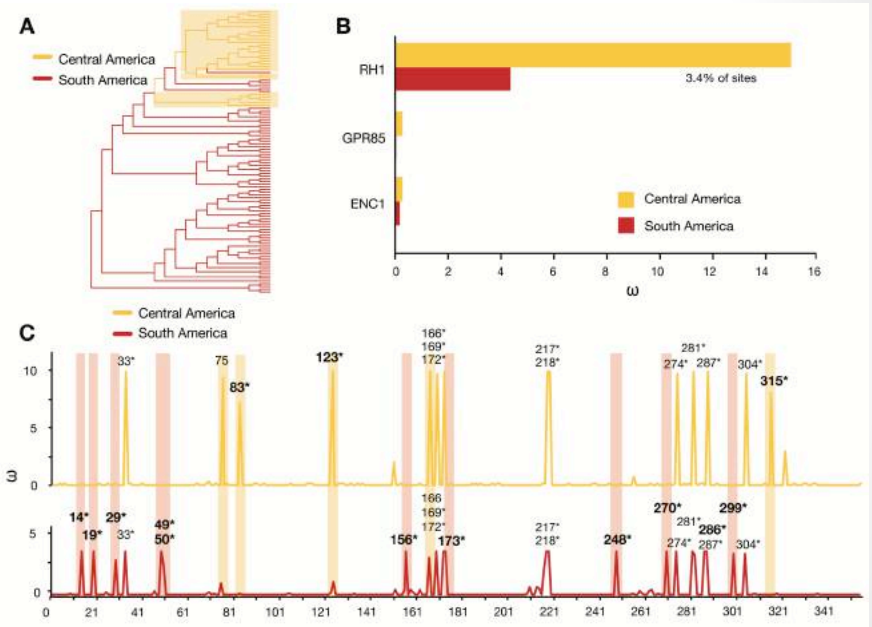
Hauser et al. 2017 *MBE*

Adaptive protein evolution

Model (foreground clade)	np	lnL	k	AIC	ΔAIC		Parameters			Null	LRT	df	*P*
M2a_rel	210	-5909.85	3.12	12239.70	17.46	p:	0.868	0.091	0.041	M1a	250.160	2	**0.0000**
						w:	0.009	1	5.470				
C+H+G	213	-5904.67	3.06	12235.34	13.10	site	0	1	2	M2a_rel	10.360	3	0.0157
						proportion	0.868	0.097	0.034				
						background	0.009	1	3.979				
						Cichlasomatini	0.009	1	6.357				
						Heroini	0.009	1	8.710				
						Geophagini	0.009	1	4.100				
Central America (clade)	211	-5900.12	2.41	12222.24	7.34	site	0	1	2	M2a_rel	19.464	1	**0.0000**
						proportion	0.868	0.097	0.034				
						background	0.009	1	4.476				
						foreground	0.009	1	11.660				
Cichlasomatini	211	-5909.84	3.12	12241.68	19.44	site	0	1	2	M2a_rel	0.020	1	0.8875
						proportion	0.868	0.091	0.040				
						background	0.009	1	5.430				
						foreground	0.009	1	5.710				
Heroini	211	-5906.21	3.09	12234.42	12.18	site	0	1	2	M2a_rel	7.280	1	**0.0070**
						proportion	0.868	0.095	0.037				
						background	0.009	1	4.630				
						foreground	0.009	1	8.020				
Geophagini	211	-5907.70	3.10	12237.40	15.16	site	0	1	2	M2a_rel	4.300	1	**0.0381**
						proportion	0.868	0.094	0.038				
						background	0.009	1	6.520				
						branch	0.009	1	4.200				
Central America	**211**	**-5896.45**	**3.07**	**12214.90**	**0.00**	**site**	**0**	**1**	**2**	**M2a_rel**	**26.800**	**1**	**0.0000**
						proportion	**0.868**	**0.097**	**3.440**				
						background	**0.009**	**1**	**4.500**				
						Central America	**0.009**	**1**	**14.800**				
Lake-dwelling	211	-5909.02	3.11	12240.03	25.13	site	0	1	2	M2a_rel	1.670	1	**0.1963**
						proportion	0.868	0.092	0.040				
						background	0.009	1	5.410				
						foreground	0.009	1	10.250				

Adaptive protein evolution

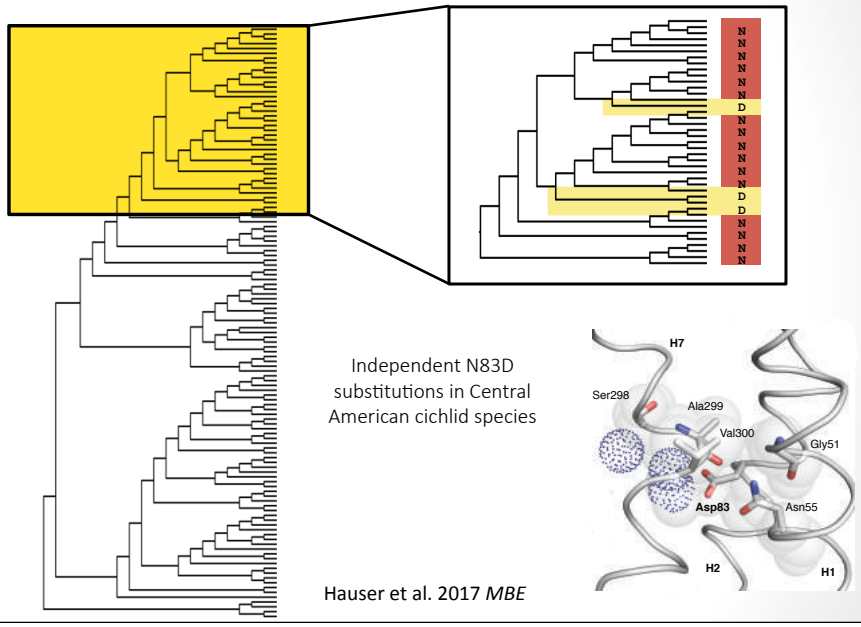
Accelerated rhodopsin divergence during invasion of Central America



Hauser et al. 2017 *MBE*

Adaptive protein evolution

Rhodopsin site 83 identified as under positive selection and undergoes independent transitions in Central American cichlids



Hauser et al. 2017 *MBE*

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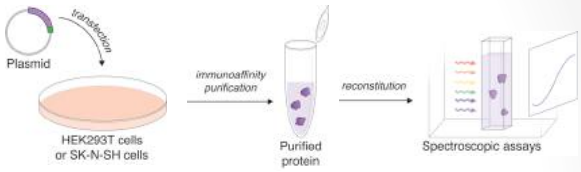
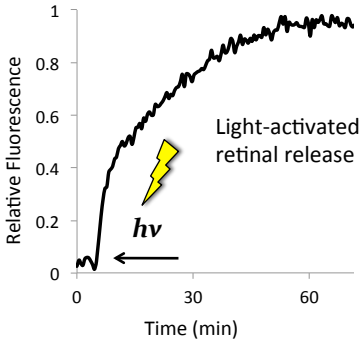
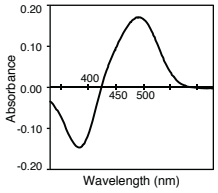
Spectroscopic assays of rhodopsin function

In vitro expression & purification

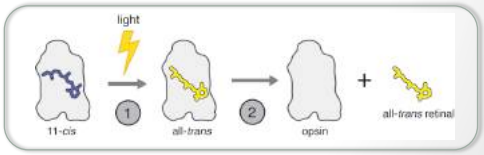




Light-activated retinal release

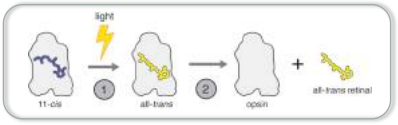


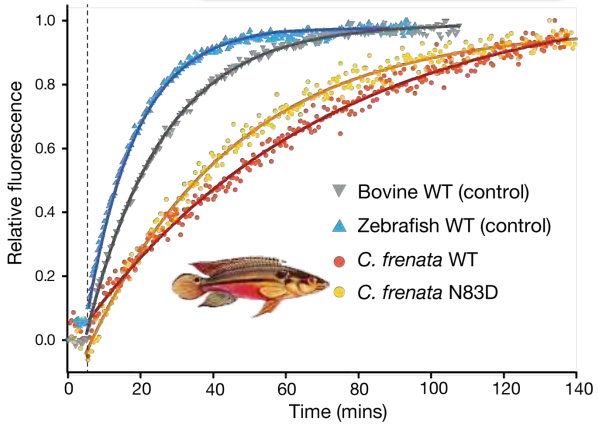
Dark-light difference spectrum

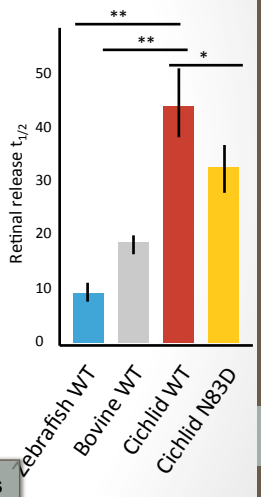


Adaptive protein evolution

The N83D mutation produces a significant shift in rhodopsin function







N83D in Central American fishes mediates faster kinetics

Hauser et al. 2017 *MBE*

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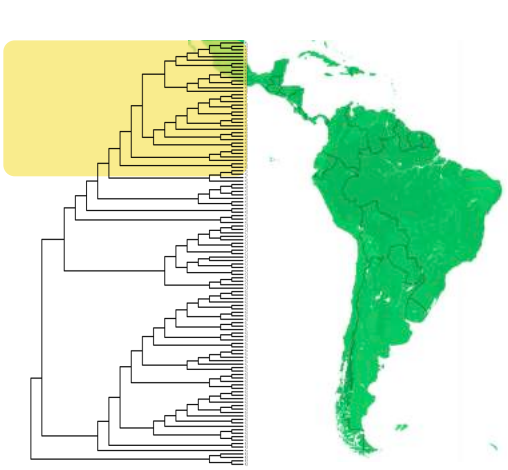
Accelerated rhodopsin divergence during invasion of Central America



Combination of computational and functional studies suggest **adaptation** to increased light levels in clear streams of Central America

Positive selection in RH1

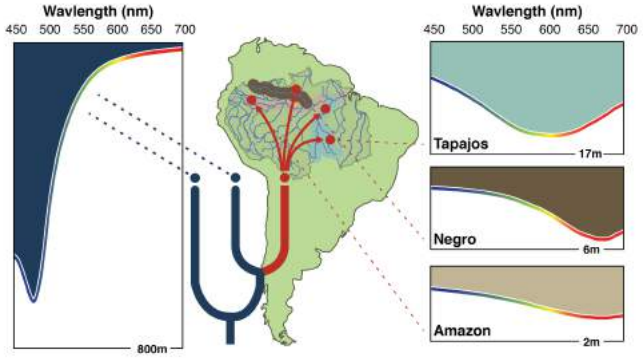
	3.4% of sites
Background (South America)	ω = 4.5
Foreground (Central America)	ω = **14.0**

Hauser et al. 2017 *MBE*

Adaptive protein evolution

Rhodopsin evolution in marine-derived Amazonian anchovies

Hypothesis: Adaptive evolution in rhodopsin gene of freshwater anchovies



Alex Van Nynatten

Nathan Lovejoy
U of Toronto

- Closely related marine and freshwater clades
- **Ancestrally marine**

Van Nynatten et al. 2015 Biol Lett

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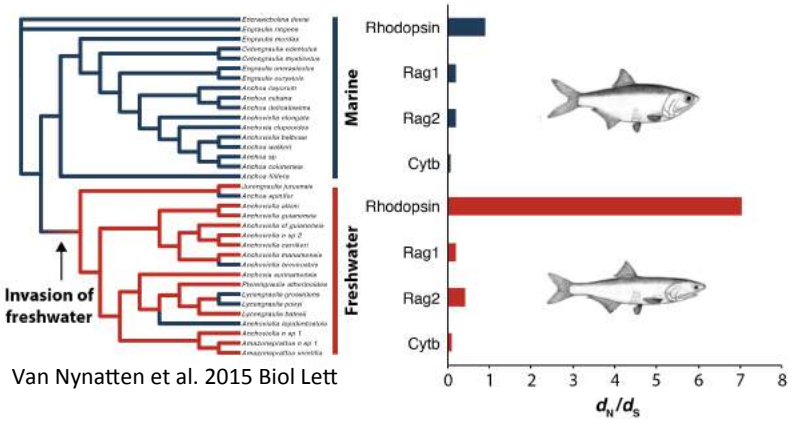
Rhodopsin evolution in marine-derived Amazonian anchovies

Hypothesis: Adaptive evolution in rhodopsin gene of freshwater anchovies



Van Nynatten et al. 2015 Biol Lett

- Increased dN/dS (CmC) in rhodopsin of the freshwater clade
- No difference in non-visual control genes

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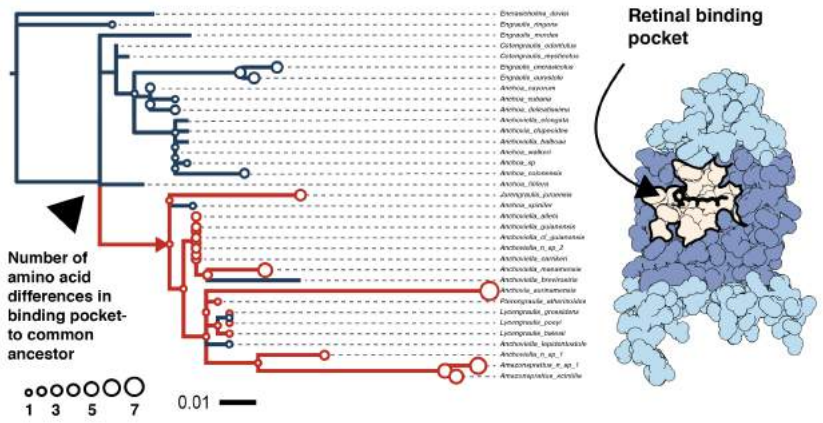
Amino acid substitutions in anchovy rhodopsin



- Longer branch lengths in freshwater clade when scaled by number of amino acid substitutions in rhodopsin
- More remodelled chromophore binding pocket in freshwater clade

Larger circles at nodes represent more amino acid differences in retinal binding pocket residues with common ancestor (arrowhead)

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Vision at high altitudes: Andean catfish rhodopsin evolution

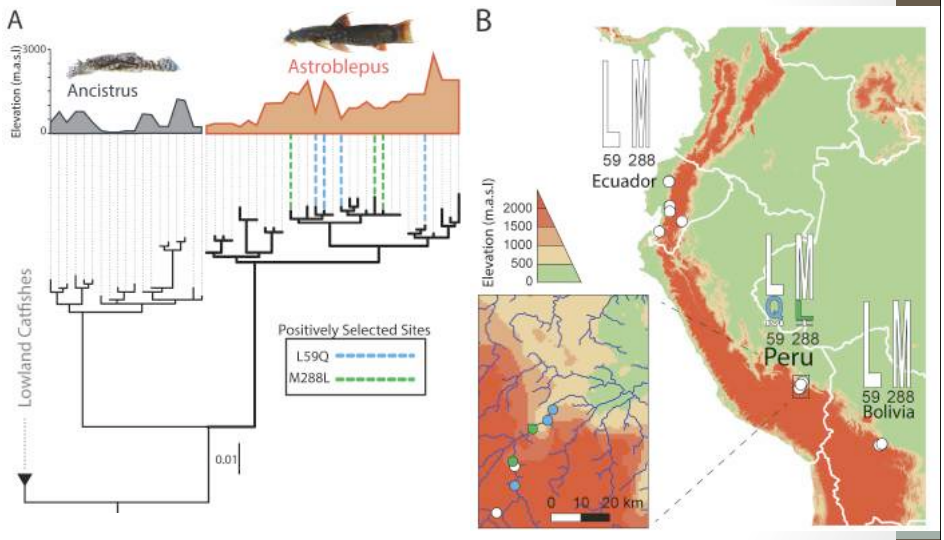
Gianni Castiglione

Nathan Lujan
ROM, UTSC

Castiglione et al. 2017 PNAS

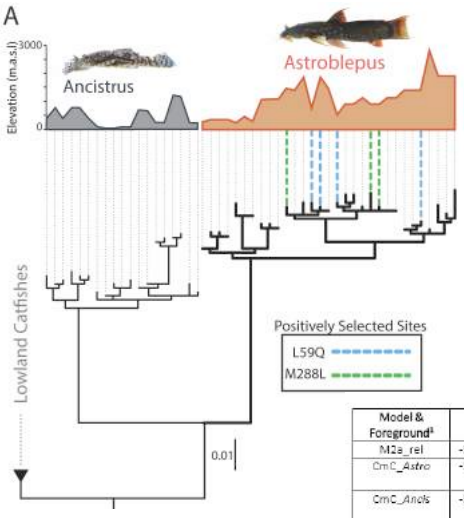
Adaptive protein evolution

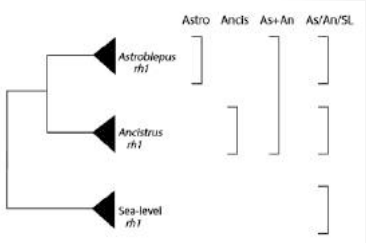
Positive divergent selection in rhodopsin of high altitude catfishes



Castiglione et al. 2017 *PNAS*

Positive divergent selection in rhodopsin of high altitude catfishes





Model & Foreground[4]	lnL	Parameters[5]			Null	p [df][6]
		ω_0/p	ω_1/q	ω_2/ω_s		
M2a_rel	-3744.12	0.01 (88%)	1 (5%)	0.28 (12%)	N/A	-
CmC_*Astro*	-3739.22	0.01 (86%)	1 (6%)	0.18 (7%) Astro:1.42	M2a_rel	0.002 [1]
CmC_*Ancis*	-3744.10	0.01 (82%)	1 (5%)	0.27 (12%) Ancis:0.31	M2a_rel	0.815 [1]
CmC_*As+An*	-3739.70	0.01 (84%)	1 (5%)	0.17 (10%) As/An:0.71	M2a_rel	0.003 [1]
CmC_*As/An/LL*	-3738.68	0.01 (86%)	1 (6%)	LL: 0.15 (8%) Ancis:0.41 Astro:1.34	M2a_rel CmC_*Astro*	0.004 [2] 0.278 [1]

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Adaptive protein evolution

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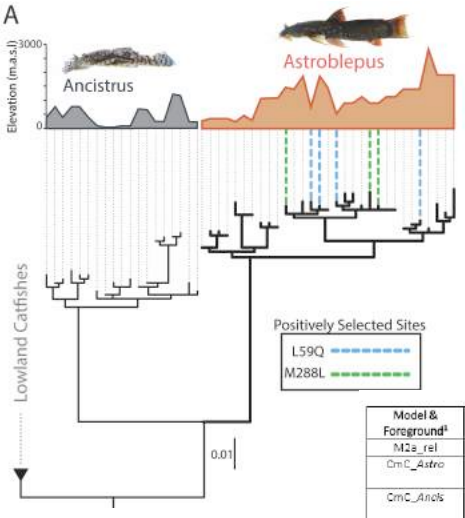
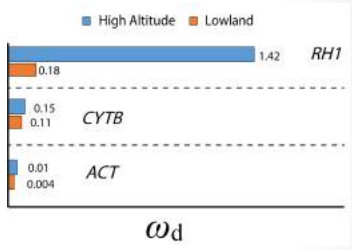
Positive divergent selection in rhodopsin of high altitude catfishes





Model & Foreground[4]	lnL	Parameters[5]			Null	p [df][6]
		ω_0/p	ω_1/q	ω_2/ω_s		
M2a_rel	-3744.12	0.01 (88%)	1 (5%)	0.28 (12%)	N/A	-
CmC_*Astro*	-3739.22	0.01 (86%)	1 (6%)	0.18 (7%) Astro:1.42	M2a_rel	0.002 [1]
CmC_*Ancis*	-3744.10	0.01 (82%)	1 (5%)	0.27 (12%) Ancis:0.31	M2a_rel	0.815 [1]
CmC_*As+An*	-3739.70	0.01 (84%)	1 (5%)	0.17 (10%) As/An:0.71	M2a_rel	0.003 [1]
CmC_*As/An/LL*	-3738.68	0.01 (86%)	1 (6%)	LL: 0.15 (8%) Ancis:0.41 Astro:1.34	M2a_rel CmC_*Astro*	0.004 [2] 0.278 [1]

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Adaptive protein evolution

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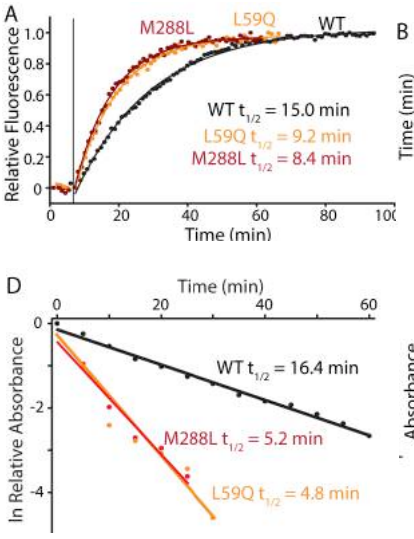
High-altitude variants increase kinetic rates



Light-activated stability

Cold Adaptation: Activity-Stability trade-off

Dark-state thermal decay

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Adaptive protein evolution

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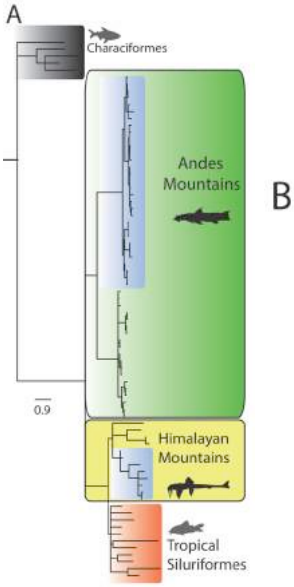
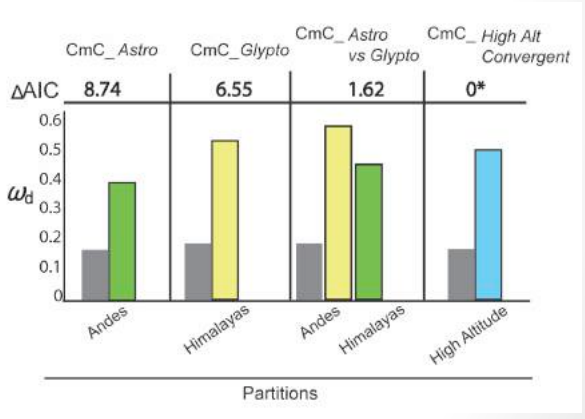
Evolutionary Convergence in Andean and Himalayan High Altitude Specialist Rhodopsins



Parallel shifts in evolutionary rates at high altitudes



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Adaptive protein evolution

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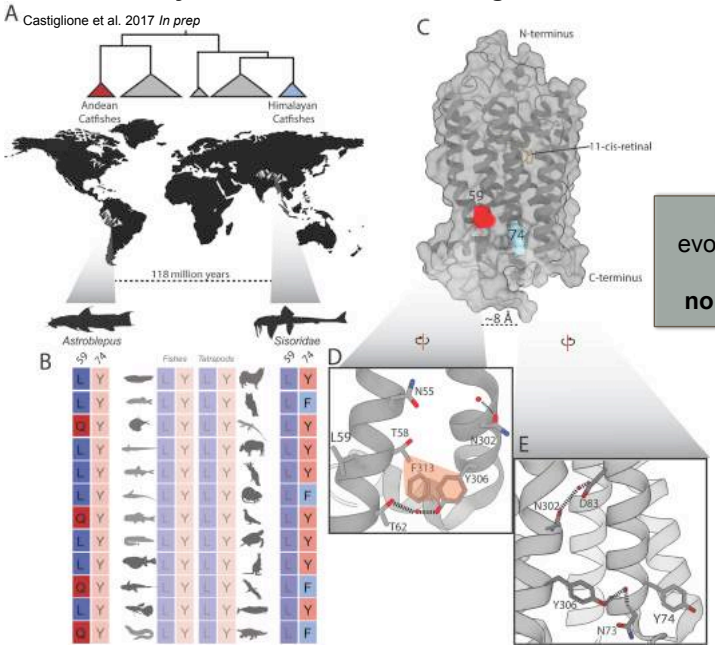
Himalayan and Andean sites target the same structural motifs



Parallel shifts in evolutionary constraint are targeting **nonspectral** function

Adaptive protein evolution

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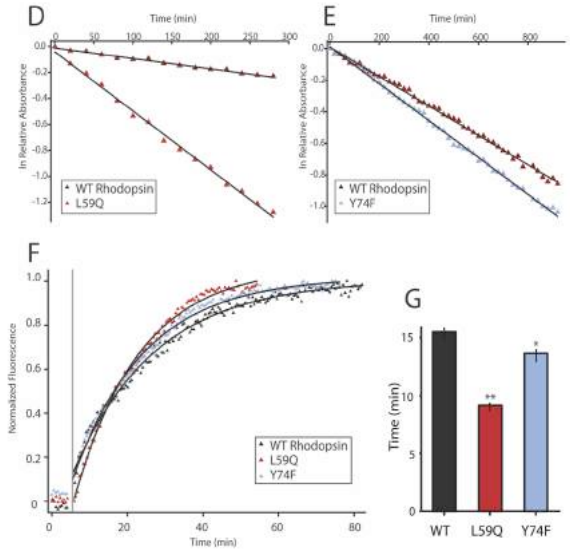
Andean and Himalayan variants modulate the nonspectral kinetic rates of ligand-bound rhodopsin



Dark-state thermal decay

Evolutionary convergence **predicts** non-parallel functional convergence

Light-activated stability

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Adaptive protein evolution

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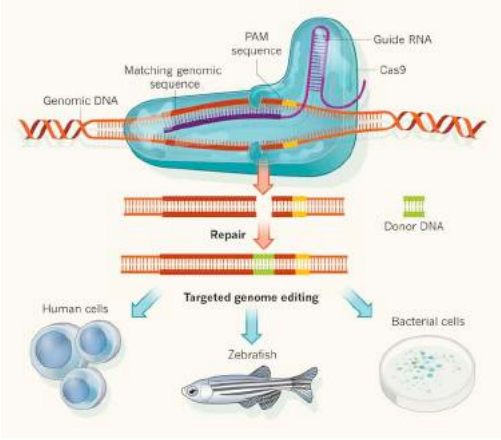
The future of studies in adaptive molecular evolution?

Combining computational and experimental approaches to study adaptive evolution within a hypothesis testing framework enables us to draw conclusions about adaptive molecular evolution that would not otherwise be possible with either method alone



CRISPR-Cas system