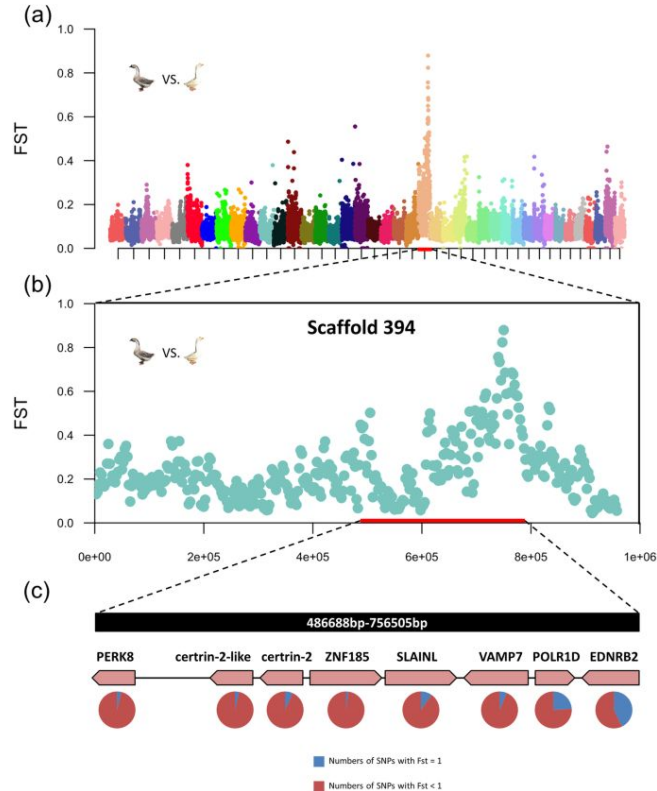


# **Detecting Selection Using Genomic Data: Methods and Characteristics**

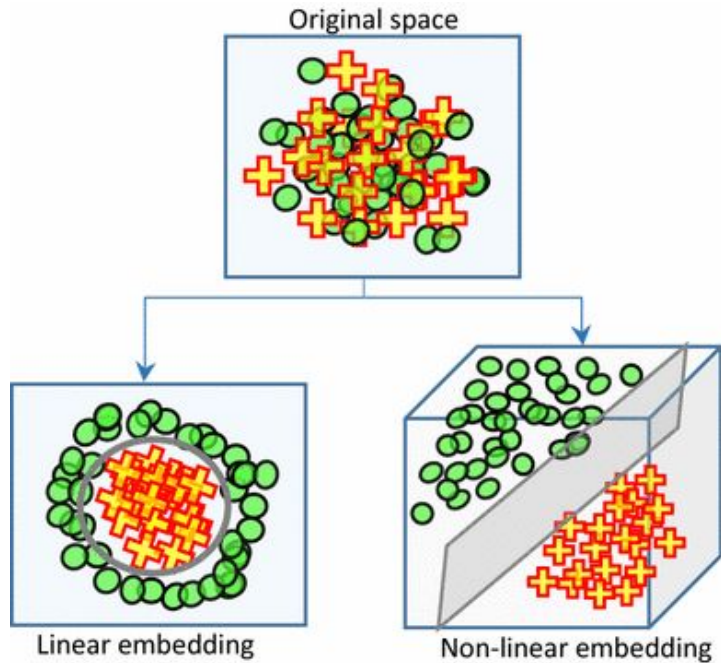
November 8, 2023

# Fst statistics



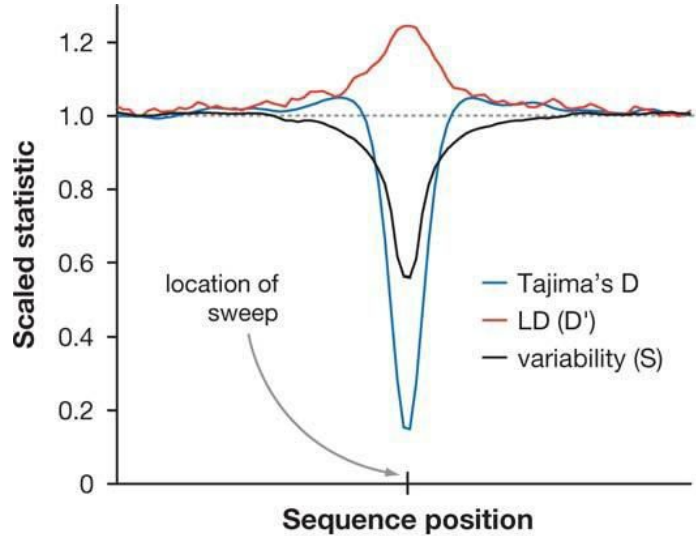
- **Ideal Situation:** Well-suited for studying populations with clear geographical or ecological boundaries.
- **Strengths:** Provides a straightforward measure of genetic differentiation between populations. Robust and widely applicable.
- **Weaknesses:** Sensitive to marker choice, may miss subtle population structure nuances.

# Spatial FST (SFS)



- **Ideal Situation:** Investigating the geographical patterns of genetic variation in a species with known migration corridors or barriers, such as a river or mountain range.
- **Strengths:** Incorporates geographical information, providing insights into spatial patterns of genetic differentiation.
- **Weaknesses:** Sensitivity to the choice of the kernel and potential bias introduced by uneven sampling across space.

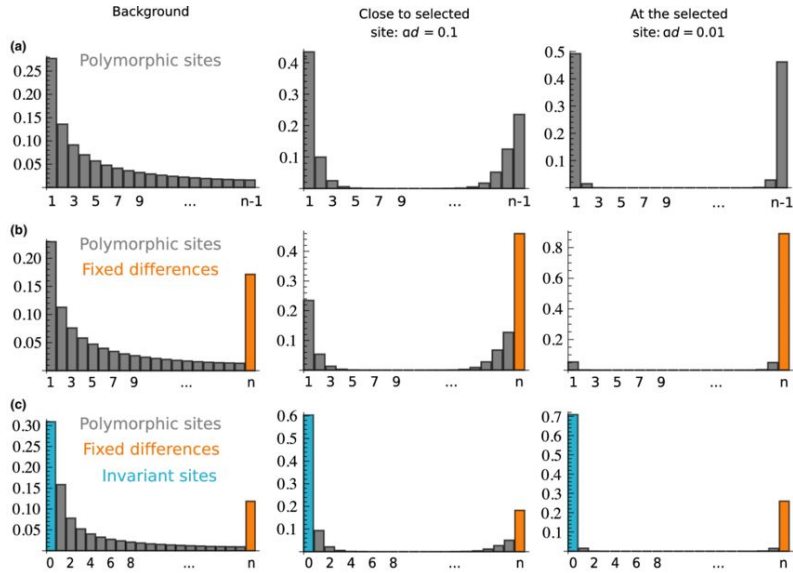
# Tajima's D



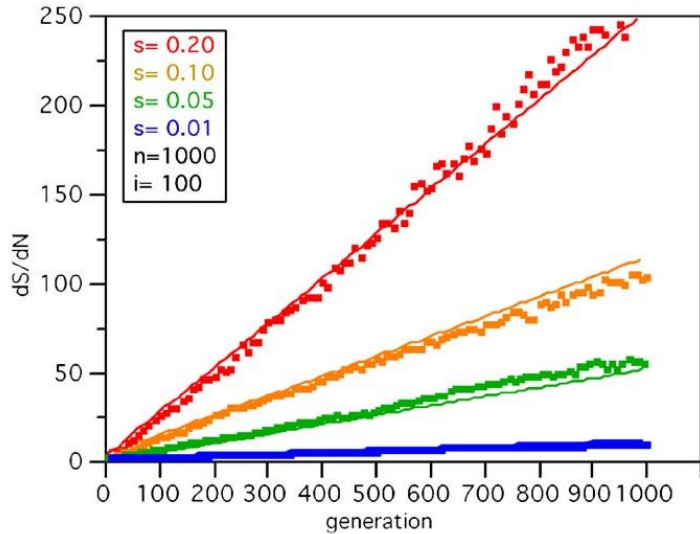
- **Ideal Situation:** Assessing signatures of natural selection in a population with a recent demographic change, like a population recovering from a bottleneck.
- **Strengths:** Sensitive to selection and demographic events, provides information about the frequency spectrum of mutations.
- **Weaknesses:** Susceptible to population structure and demographic history effects.

# Site Frequency Spectrum (SFS)

- **Ideal Situation:** Analyzing a population with a known demographic history, such as recent expansion or contraction, to understand the impact on allele frequencies.
- **Strengths:** Directly examines allele frequency distributions, useful for detecting demographic changes.
- **Weaknesses:** May not distinguish between different evolutionary processes affecting allele frequencies.

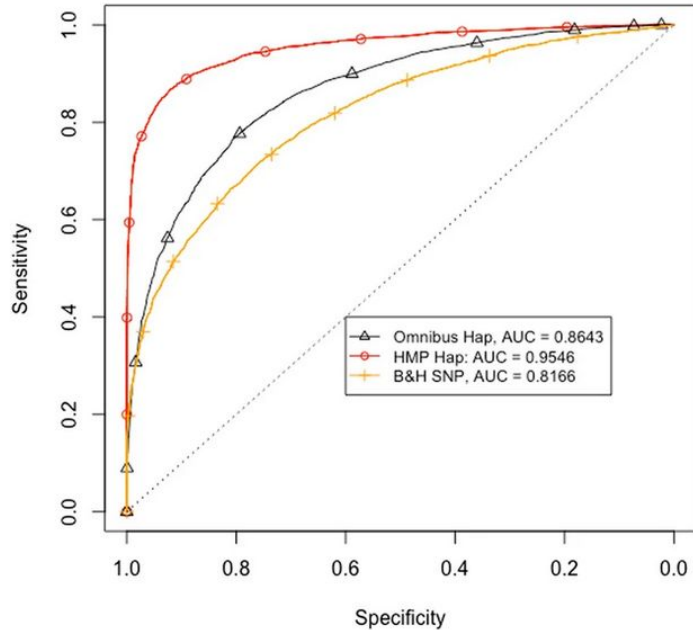


# dN/dS Ratio



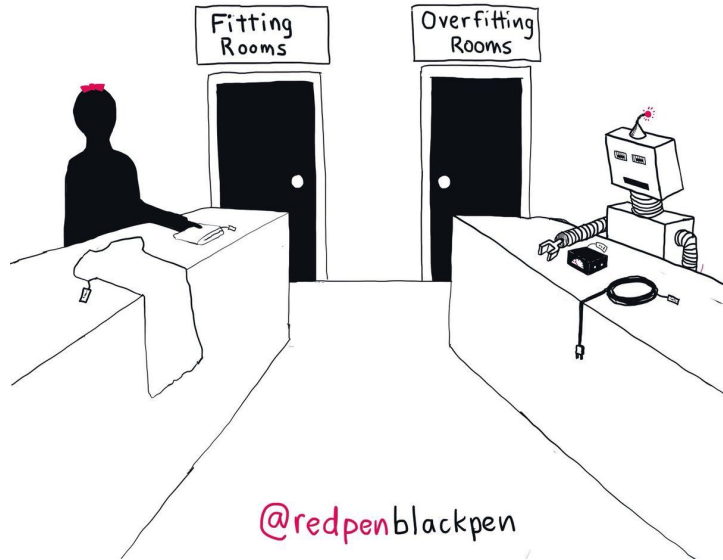
- **Ideal Situation:** Investigating positive selection on protein-coding genes in a population facing strong selective pressures, such as a pathogen-host arms race.
- **Strengths:** Focuses on protein-coding genes, highlighting signatures of positive selection.
- **Weaknesses:** Relies on accurate gene annotation and assumptions about synonymous mutations.

# Haplotype-based Tests



- **Ideal Situation:** Exploring patterns of selection in regions with complex haplotype structures, like genomic regions associated with disease resistance.
- **Strengths:** Captures information on linkage disequilibrium and haplotype structure.
- **Weaknesses:** Sensitive to recombination rates and complex demographic scenarios.

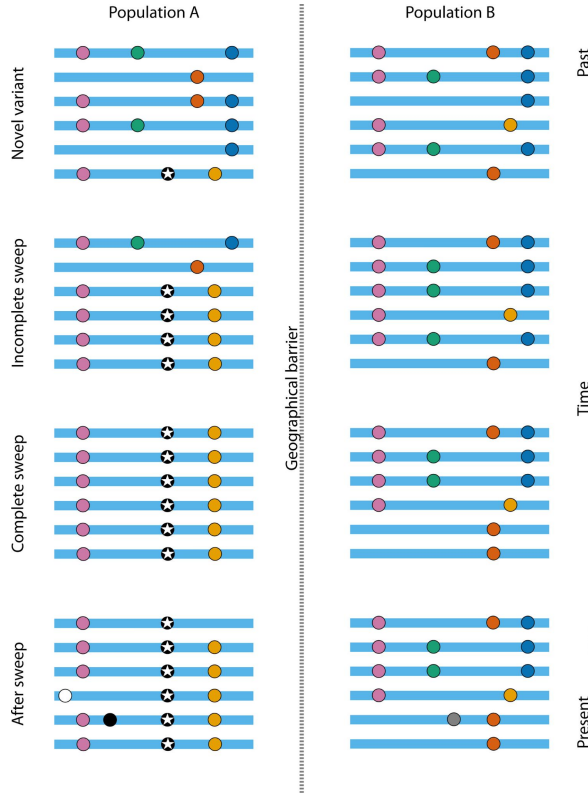
# Machine learning based approaches



- **Ideal Situation:** Employing machine learning techniques like neural networks to recognize subtle patterns indicative of positive selection in genomic sequences, especially in non-coding regions.
- **Strengths:** Can capture intricate patterns and dependencies in data. Suitable for high-dimensional and non-linear relationships.
- **Weaknesses:** Requires substantial computational resources and large training datasets. Interpretability may be challenging.



# Selective Sweep Analysis



- **Ideal Situation:** Detecting selective sweeps in a population exposed to a sudden environmental change, such as a change in climate or the introduction of a new predator.
- **Strengths:** Detects regions where selected alleles rapidly rise in frequency.
- **Weaknesses:** May miss soft sweeps and is sensitive to demographic history and recombination rates.



**Detecting signatures of selection in Atlantic herring using whole genome sequencing**



Photo Per Eide



- A near ideal population structure
- huge population size (census population size about  $10^{12}$ )
- random mating
- high fecundity
- natural selection very effective
- genetic drift at selectively neutral loci is minute

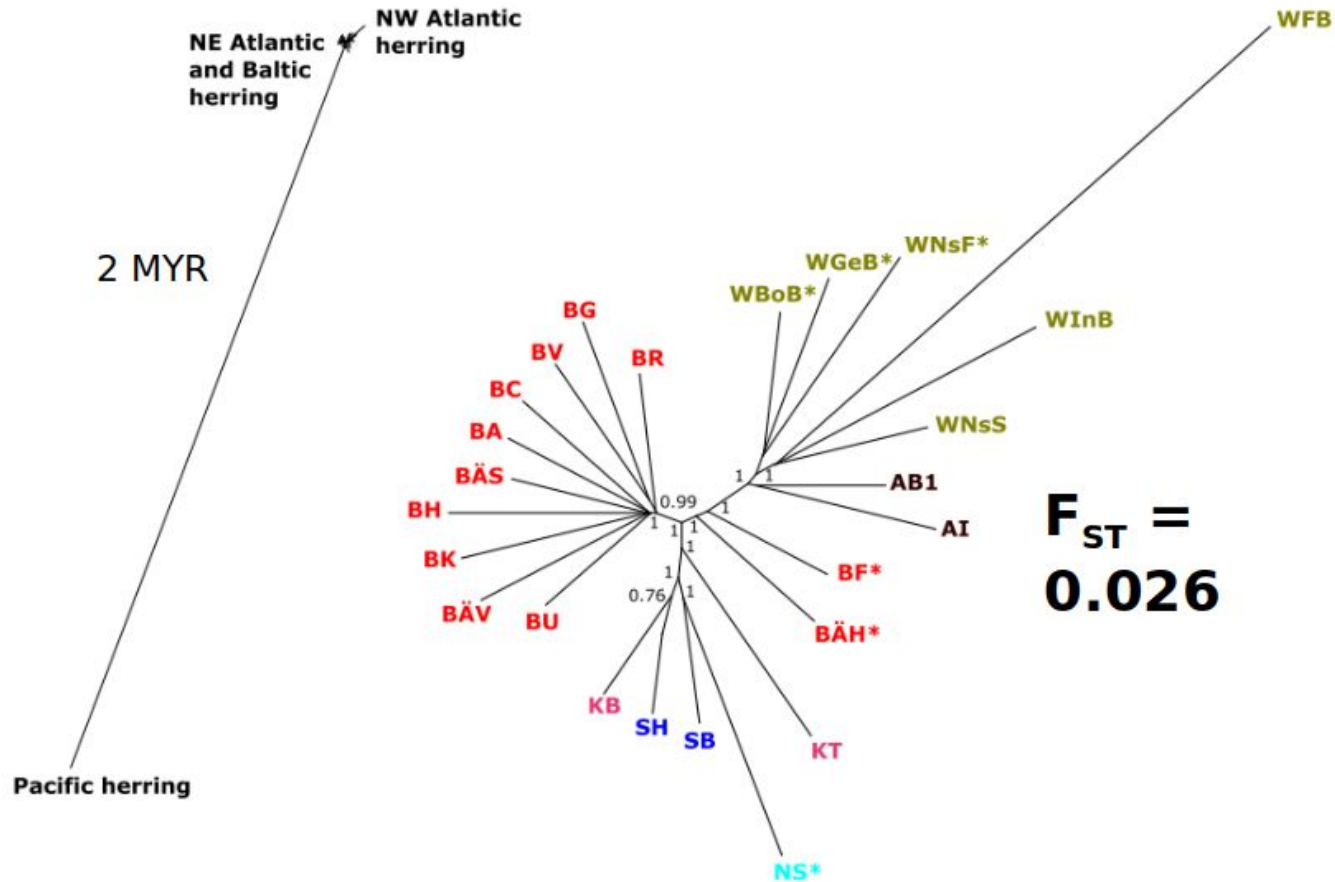
<http://sointularipple.ca>

# The herring has a very low mutation rate

Species	Taxonomic group	$\mu$	Genome size (Mb)	$Ne\tau$
<i>Caenorhabditis briggsae</i>	Invertebrates	$1.3 \times 10^{-9}$	108	$2.7 \times 10^5$
<i>Drosophila melanogaster</i>	Invertebrates	$3.2 \times 10^{-9}$	144	$1.4 \times 10^6$
<i>Heliconius melpomene</i>	Invertebrates	$2.9 \times 10^{-9}$	274	$2.1 \times 10^6$
<i>Daphnia pulex</i>	Invertebrates	$5.7 \times 10^{-9}$	250	$8.2 \times 10^5$
Atlantic herring	Teleosts	$2.0 \times 10^{-9}$	850	$4.0 \times 10^5$
Collared flycatcher	Birds	$4.6 \times 10^{-9}$	1118	$2.0 \times 10^5$
Mouse	Mammals	$5.4 \times 10^{-9}$	2808	$1.8 \times 10^5$
Chimpanzee	Mammals	$1.2 \times 10^{-8}$	3231	$2.9 \times 10^4$
Human	Mammals	$1.2 \times 10^{-8}$	3236	$2.4 \times 10^4$

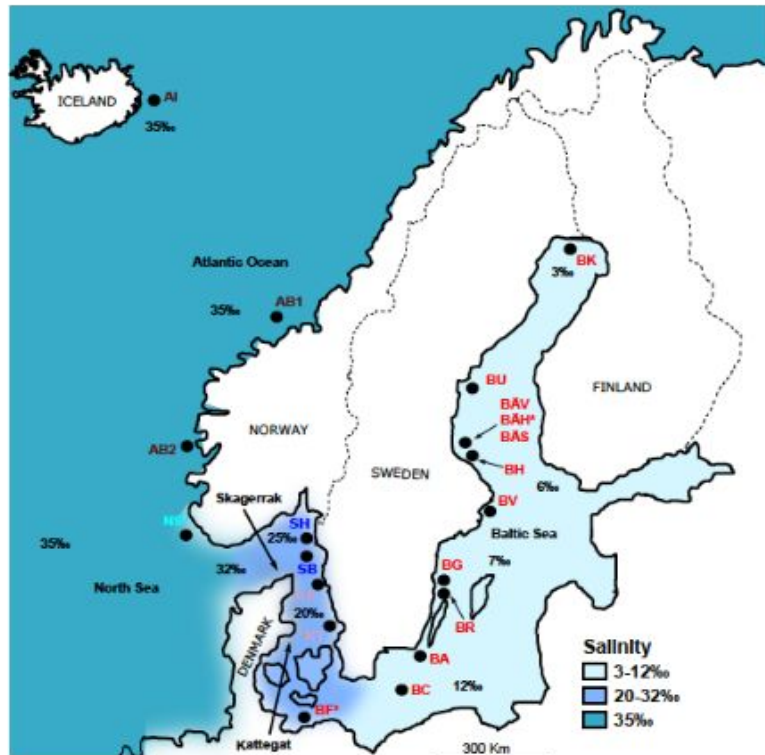
....but in each generation **each** nucleotide site mutates thousands of times!

# Phylogenetic analysis



$$F_{ST} = 0.026$$

# A genetic screen for loci underlying adaptation to the Baltic Sea vs. Atlantic Ocean



Pool Atlantic: All samples from Skagerrak, Kattegat, North Sea and Atlantic Ocean

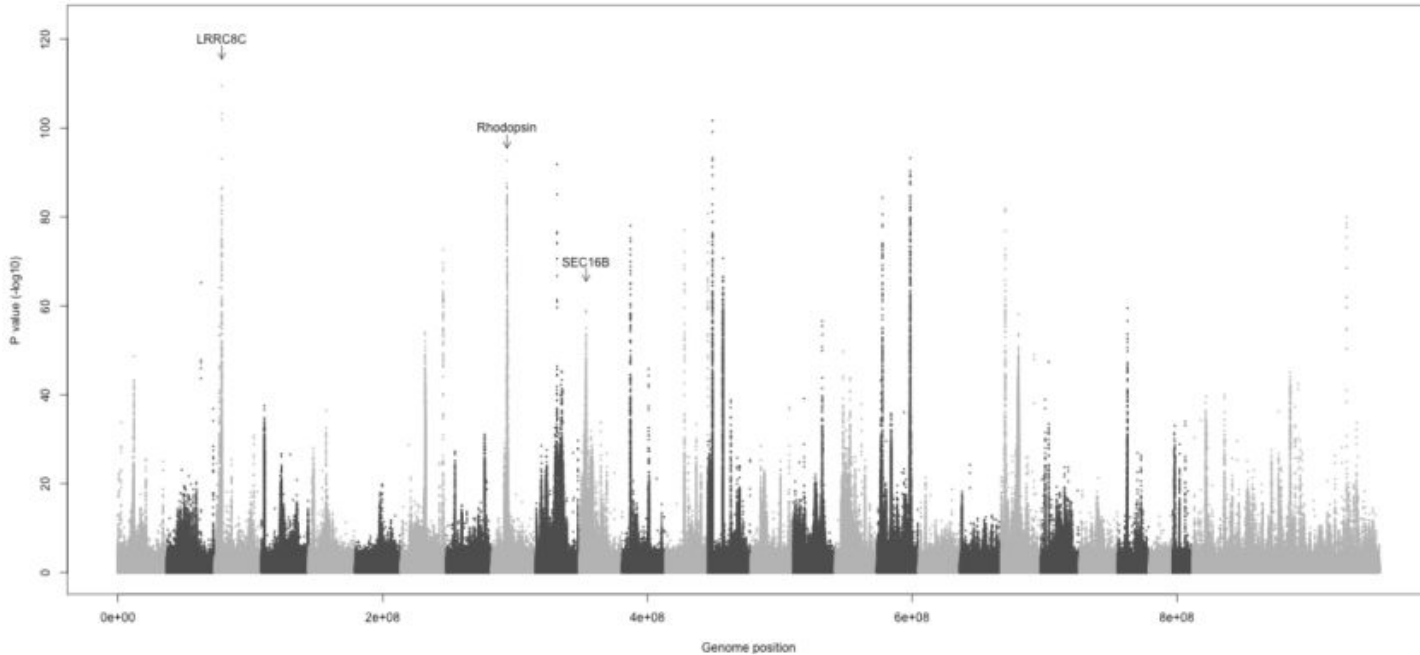
Pool Baltic: All samples from the Baltic Sea

Compare allele frequencies between the two pools SNP by SNP

**How polygenic is ecological adaptation in a species with a huge breeding population?**

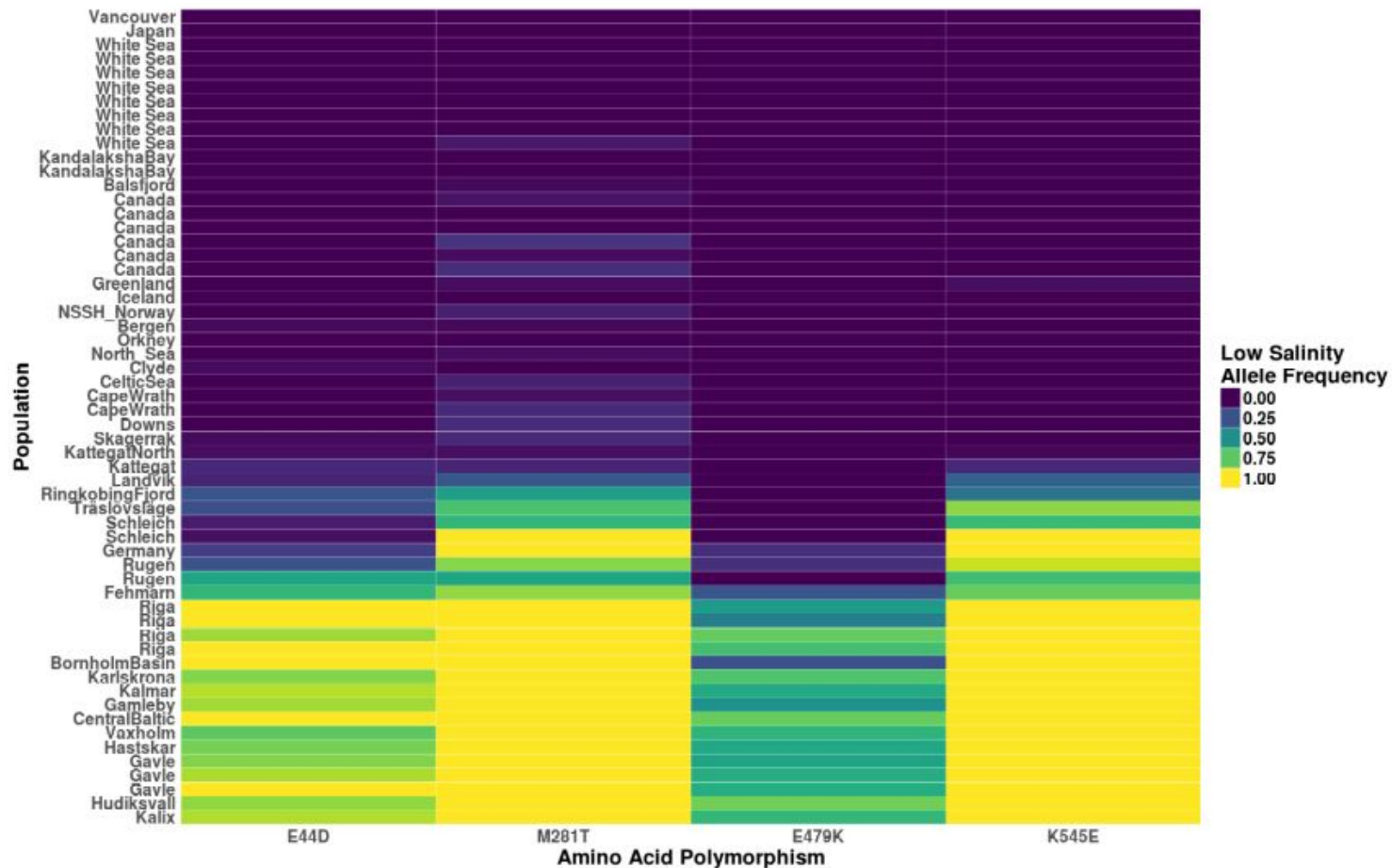


# Genome-wide association analysis Atlantic versus Baltic

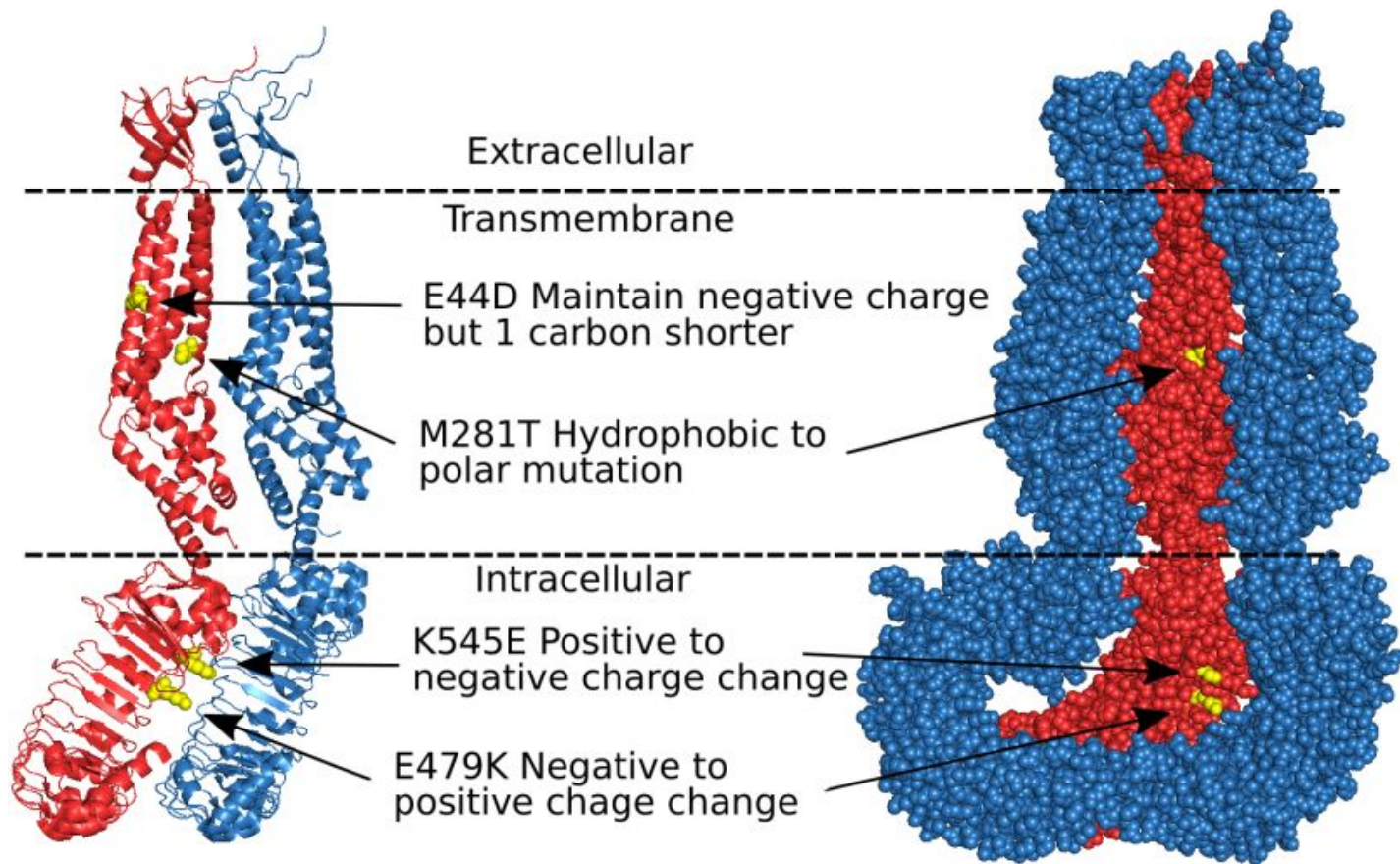


**About 500 regions in the genome with  
highly differentiated SNPs  $P < 10^{-20}$**

# Frequency of Low-Salinity allele in LRRC8C



LRRRC8C - AA sites > .65  $\Delta$ AF baltic/atlantic

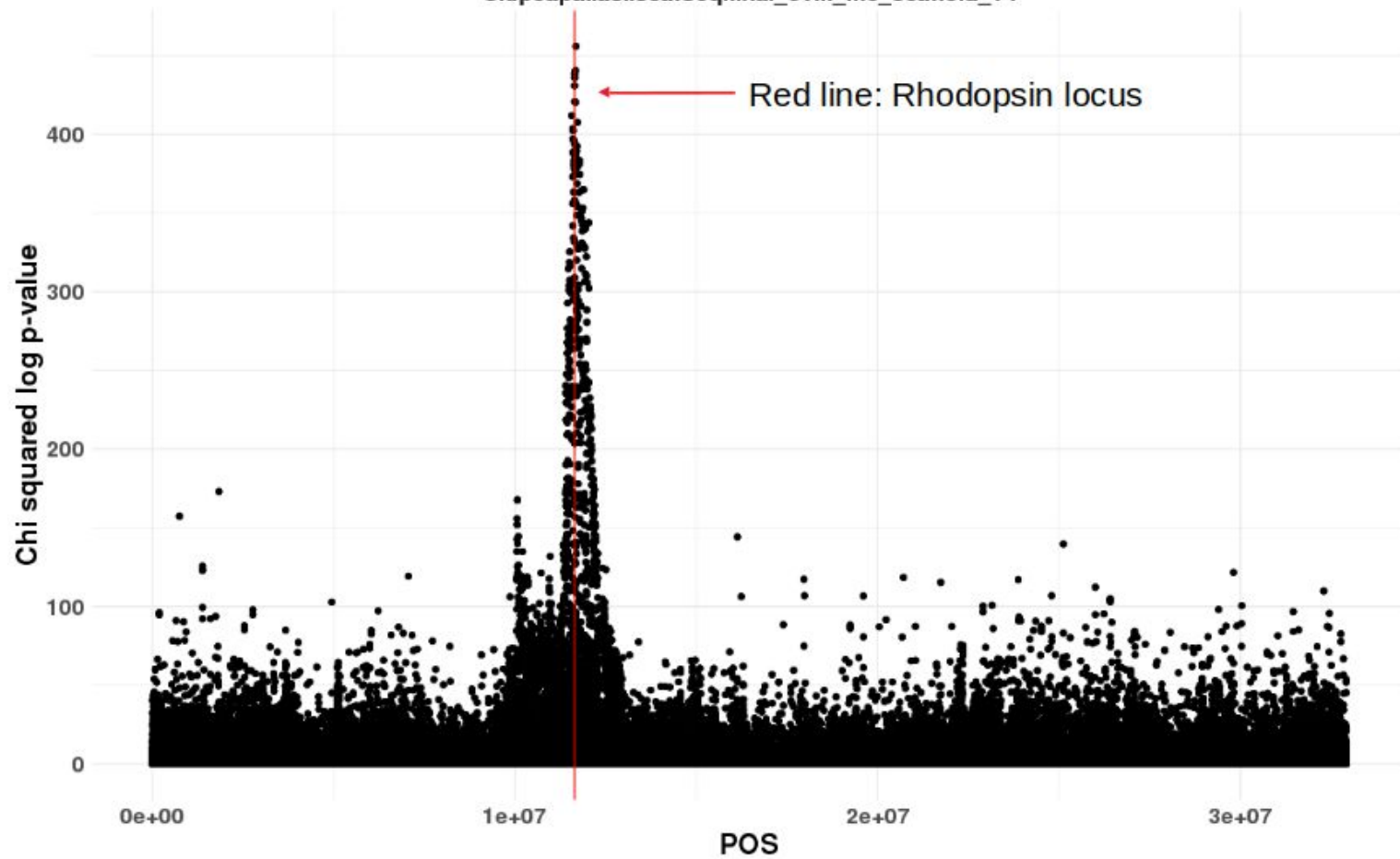


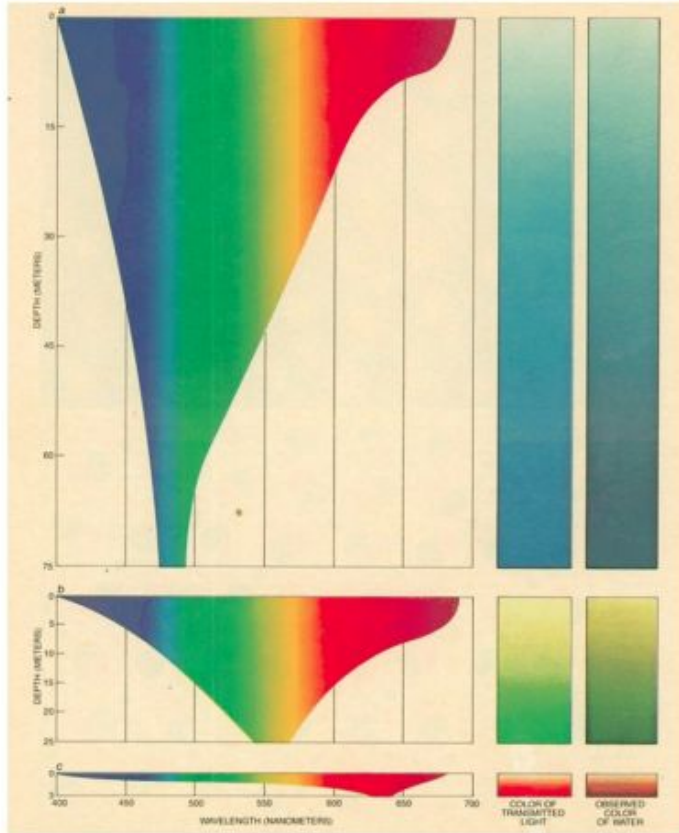
# Exercise

- 1) Inside your working directory: \$ git clone <https://github.com/JasonAnthonyHill/pgip>
- 2) \$ module load R/4.2.1 R\_packages/4.2.1 RStudio
- 3) \$ rstudio
- 4) Within rstudio load the file:  
herring\_selection\_scan.Rmd

## Baltic vs. Atlantic SNPS

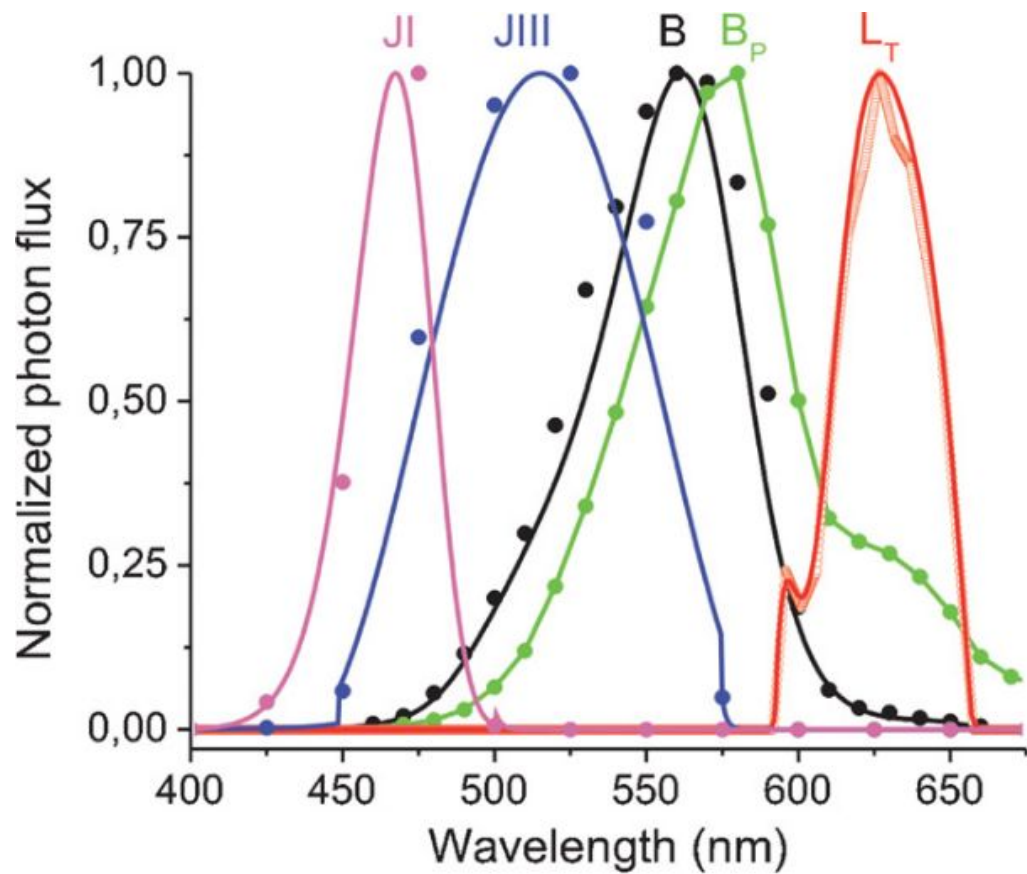
Clupeapallasi.scafSeq.final\_ovlk\_hic\_scaffold\_14





J. Pahlberg (2007)



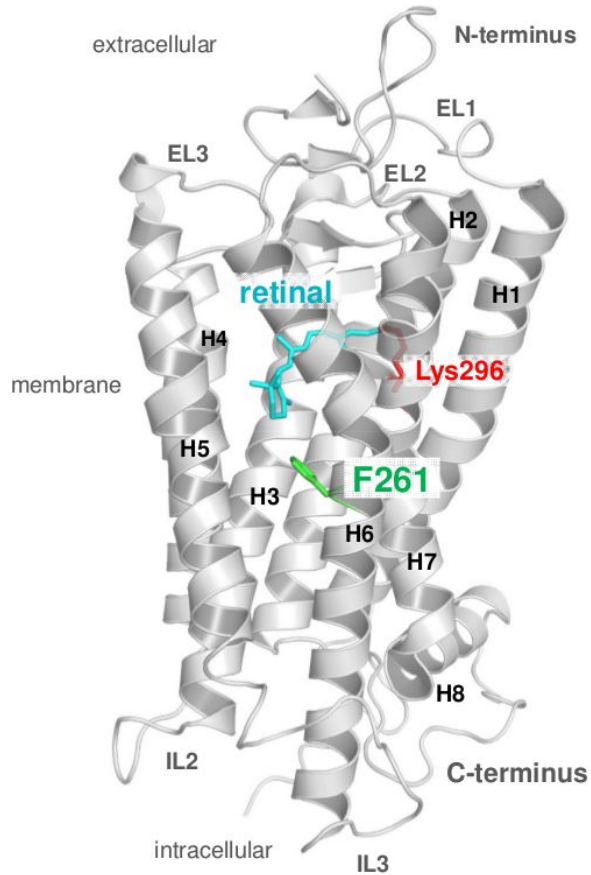


M. Jokela-Määttä *et al.* Visual Neuroscience (2007)

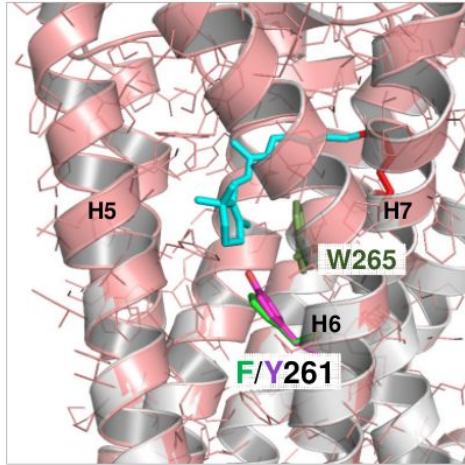
Family	Species	Location	N	A1/A2 (%)	Rod $\lambda_{max} \pm SD$ (nm)	$\lambda_{max}$ of A1–A2 (nm)
Ammodytidae	Greater Sandeel ( <i>Hyperoplus lanceolatus</i> , Le Sauvage)	B	1	A1 (100)	485.6	
Sygnathidae	Straight-nosed Pipefish ( <i>Nerophis ophidion</i> , L.)	B <sub>P</sub>	1	A1 (100)	500.4	
		B <sub>P</sub>	4	A1 (100)	500.6 $\pm$ 0.4	
Gobiidae	Black Goby ( <i>Gobius niger</i> , L.)	B <sub>P</sub>	2	A1 (100)	504.8 $\pm$ 0.5	
		B <sub>P</sub>	19	A1 (100)	508.3 $\pm$ 1.9	
	E	10	A1 (100)	506.2 $\pm$ 1.0		
	A	18	A1 (100)	503.0 $\pm$ 1.3		
	B <sub>P</sub>	11	A1 (100)	515.7 $\pm$ 1.3		
Clupeidae	Baltic Herring ( <i>Clupea harengus membras</i> , L.)	B <sub>K</sub>	8	A1 (100)	512.3 $\pm$ 0.8	
	Atlantic Herring ( <i>Clupea harengus</i> , L.)	E	5	A1 (100)	502.5 $\pm$ 0.2	
Zoarcidae	Viviparous Blenny ( <i>Zoarces viviparus</i> , L.)	B	9	A1 (100)	512.8 $\pm$ 1.0	
Pleuronectidae	Flounder ( <i>Platichthys flesus</i> , Duncker)	B	8	A1 (100)	512.2 $\pm$ 1.2	
		N	4	A1 (100)	510.3 $\pm$ 1.3	
Cottidae	Fourhorned Sculpin ( <i>Myoxocephalus quadricornis</i> , L.)	B <sub>A</sub>	6	A1 (100)	512.2 $\pm$ 1.0	
Gasterosteidae	Three-spined Stickleback ( <i>Gasterosteus aculeatus</i> , L.)	B <sub>P</sub>	2	A1/A2 (69/31)	508.8 $\pm$ 0.6	504/531
	Nine-spined Stickleback ( <i>Pungitius pungitius</i> , L.)	B <sub>P</sub>	4	A1/A2 (4/96)	526.8 $\pm$ 3.5	502/528
Esocidae	Pike ( <i>Esox lucius</i> , L.)	B <sub>P</sub>	1	A1/A2 (25/75)	520.8	503/530
		L <sub>T</sub>	1	A1/A2 (10/90)	529.8	506/534
Osmeridae	Smelt ( <i>Osmerus eperlanus</i> , L.)	B <sub>P</sub>	2	A1/A2 (95/5)	517.8 $\pm$ 0.6	517/553
Cyprinidae	Rudd ( <i>Scardinius erythrophthalmus</i> , L.)	B <sub>P</sub>	3	A1/A2 (0/100)	537.2 $\pm$ 1.4	507/537
		L <sub>T</sub>	2	A1/A2 (10/90)	533.3 $\pm$ 9.4	508/538
	Roach ( <i>Rutilus rutilus</i> , L.)	B <sub>P</sub>	6	A1/A2 (35/65)	523.8 $\pm$ 6.6	507/537
		L <sub>T</sub>	2	A1/A2 (11/89)	534.2 $\pm$ 0.6	509/539
	Bleak ( <i>Alburnus alburnus</i> , L.)	B <sub>P</sub>	4	A1/A2 (100/0)	514.6 $\pm$ 0.2	515/550
		L <sub>T</sub>	2	A1/A2 (89/11)	514.6 $\pm$ 1.1	513/546
	Crucian carp ( <i>Carassius carassius</i> , L.)	L <sub>B</sub>	2	A2 (100)	525.5 $\pm$ 0.6	
	Bream ( <i>Abramis brama</i> , L.)	B <sub>P</sub>	3	A2 (100)	537.2 $\pm$ 0.9	
		L <sub>V</sub>	1	A2 (100)	535.8	
	Blue bream ( <i>Abramis ballerus</i> L.)	B <sub>P</sub>	1	A2 (100)	517.8	
White bream ( <i>Blicca bjoerkna</i> , L.)	B <sub>P</sub>	1	A2 (100)	538.6		
Percidae	Pike-perch ( <i>Stizostedion lucioperca</i> , L.)	L <sub>T</sub> , L <sub>V</sub>	7	A2 (100)	524.1 $\pm$ 1.3	
		B <sub>P</sub>	3	A2 (100)	533.2 $\pm$ 1.1	
	Ruffe ( <i>Acerina cernua</i> , L.)	L <sub>V</sub> , L <sub>P</sub>	5	A2 (100)	531.8 $\pm$ 1.8	
		B <sub>P</sub>	4	A2 (100)	538.7 $\pm$ 0.9	
	Perch ( <i>Perca fluviatilis</i> , L.)	L <sub>T</sub> , L <sub>V</sub>	7	A2 (100)	538.6 $\pm$ 2.0	



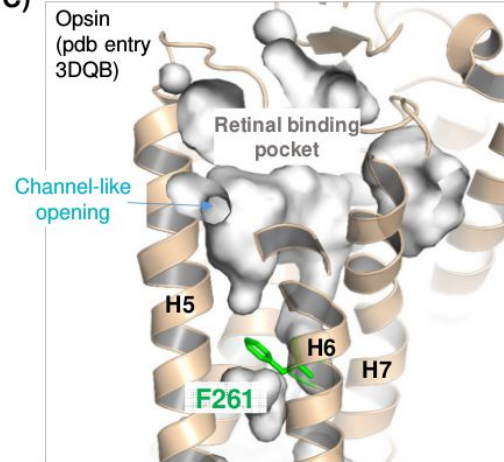
**A)** Autumn spawning herring rhodopsin model, Meta-II state



**B)** Spring spawning rhodopsin model, Meta-II state



**C)**



**Insights from herring Rhodopsin models:**

F261 is located in TMH6, close to the retinal binding site (A).

In consequence variant Y261 will be different to F261 in:

1. The electrostatics at this retinal binding region (additional OH group) (B)
2. The contact and interplay with Trp265 that is essentially involved in the retinal  $\beta$ -ionone ring/rhodopsin interplay and thereby activation of the receptor (B)
3. The variant could have impact on the channel-like opening for retinal release/entry as observed in the opsin structure (C)

- Park JH<sup>5</sup>, Scheerer P<sup>5</sup>, et al., Crystal structure of the ligand-free G-protein-coupled receptor opsin. *Nature* 2008, 454(7201):183-7.
- Piechnick R, Ritter E, Hildebrand PW, Ernst OP, Scheerer P, Hofmann KP, Heck M. Effect of channel mutations on the uptake and release of the retinal ligand in opsin. *PNAS* 2012;109(14):5247-52

Multiple observations of Tyr 261 involved in fish vision adaptation

# Spectral Tuning and Molecular Evolution of Rod Visual Pigments in the Species Flock of Cottoid Fish in Lake Baikal

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Received 28 March 1995; in revised form 19 June 1995; in final form 14 August 1995

## Rhodopsin From the Fish, *Astyanax*: Role of Tyrosine 261 in the Red Shift

Ruth Yokoyama,\* Barry E. Knox,† and Shozo Yokoyama\*

The Journal of Experimental Biology 212, 3415-3421  
Published by The Company of Biologists 2009  
doi:10.1242/jeb.031344

### Individual variation in rod absorbance spectra correlated with opsin gene polymorphism in sand goby (*Pomatoschistus minutus*)

Mirka Jokela-Määttä<sup>1,\*</sup>, Annika Vartio<sup>1</sup>, Lars Paulin<sup>2</sup> and Kristian Donner<sup>1</sup>

<sup>1</sup>Department of Biological and Environmental Sciences and <sup>2</sup>Institute of Biotechnology, University of Helsinki, Helsinki, Finland

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Accepted 28 July 2009

## Summary

- Many methods exist for detecting selection using genomic data
- Selecting the right method for the right species can yield powerful results
- Carry through to structure and function