

# **Prediction and identification of functional cisNATs in plants**

Veerendra Gadekar

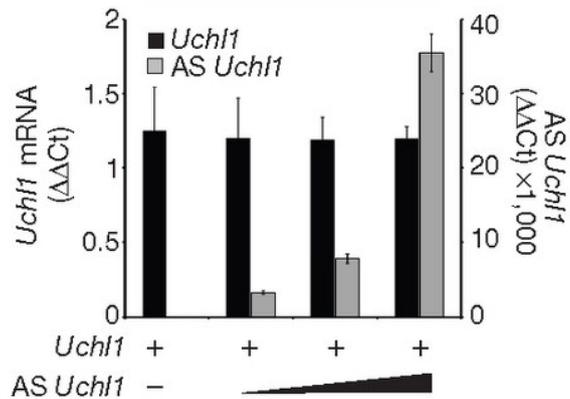
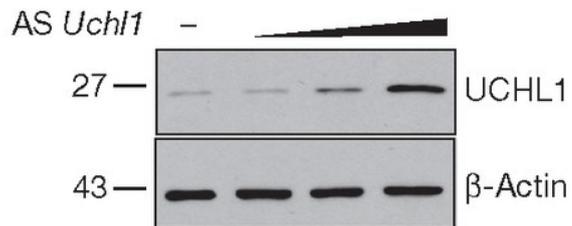
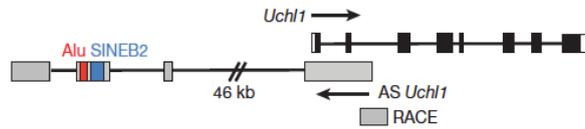
Department of Theoretical Chemistry

University of Vienna

Bled, Feb 17, 2017

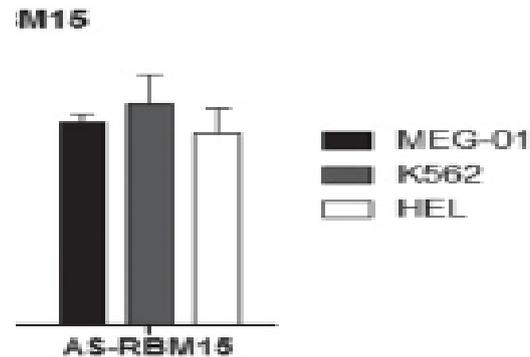
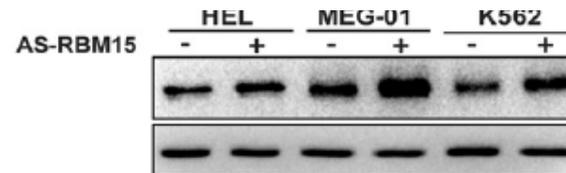
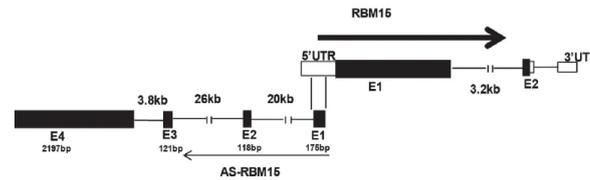
# Functional antisense long noncoding RNAs

## Mouse *Uchl1* / *cis*-NAT pair



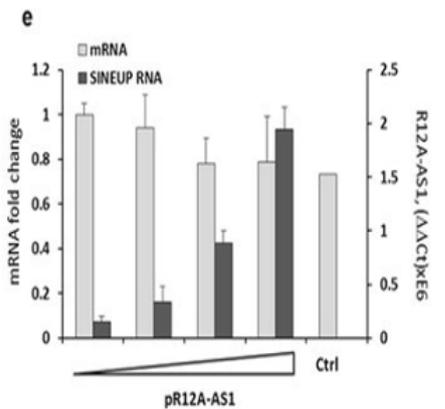
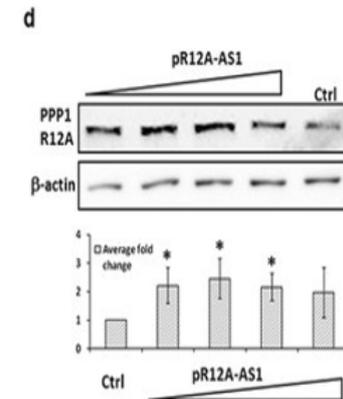
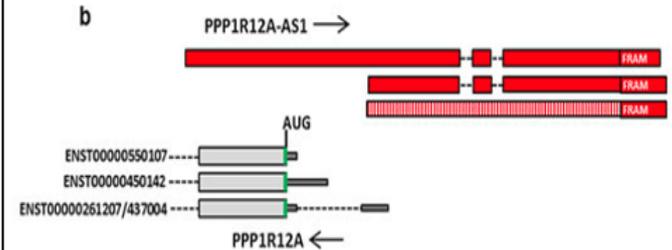
Carrieri et al. 2012

## Human *RBM15* / *cis*-NAT pair



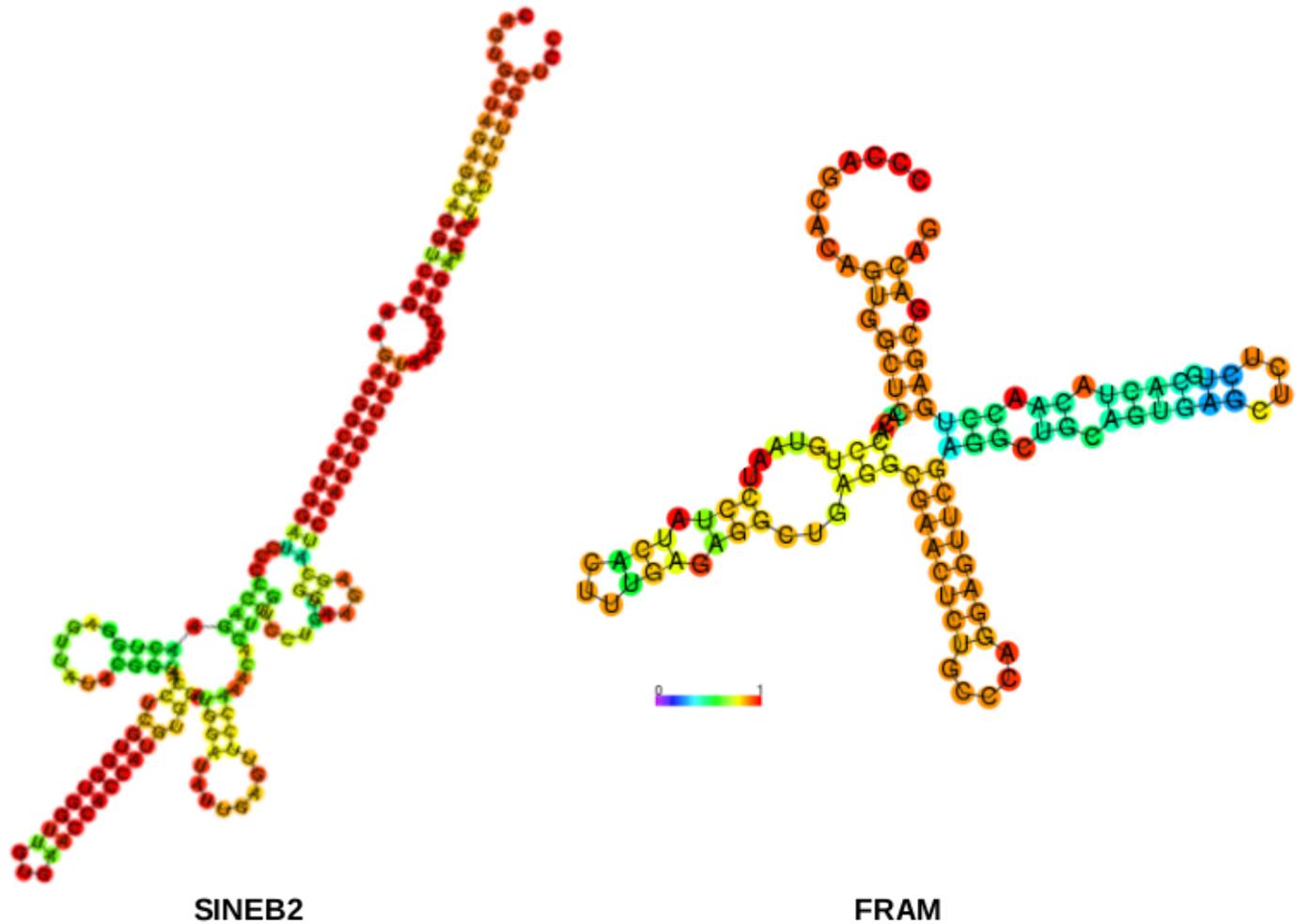
Tran et al. 2016

## Human *PPP1R12A* / *cis*-NAT pair



Schein et al. 2016

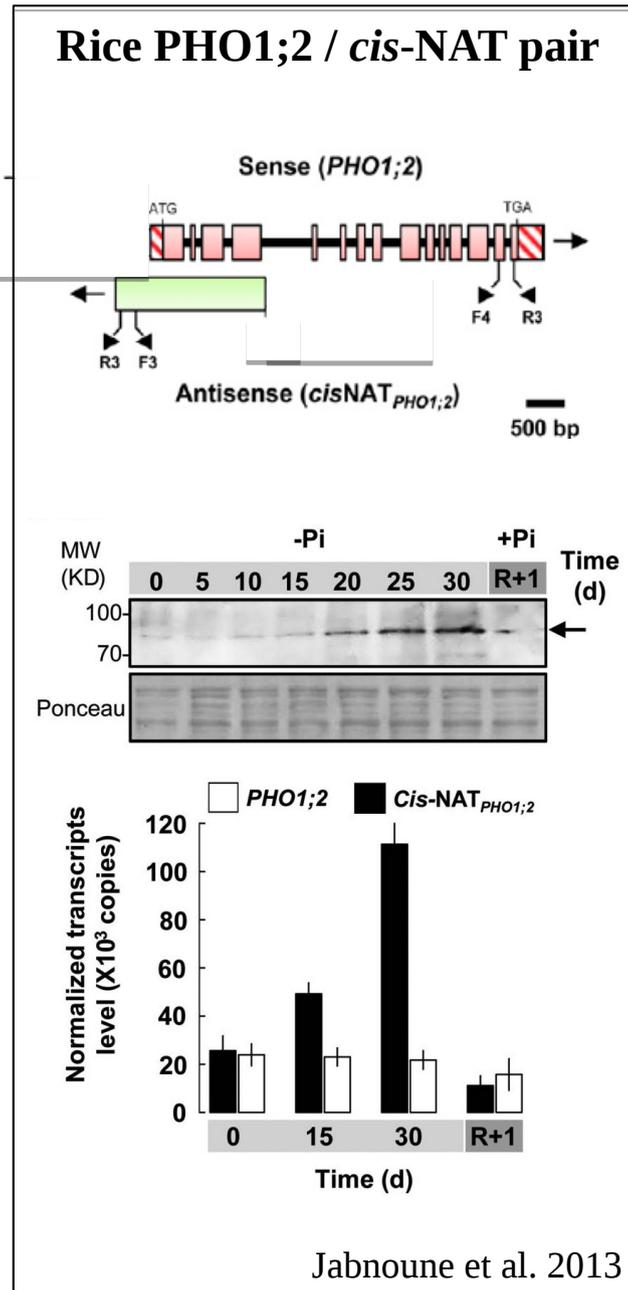
# SINEB2 and FRAM are predicted to fold into a different structures



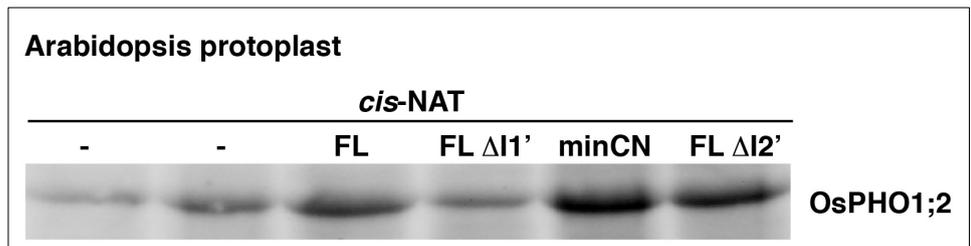
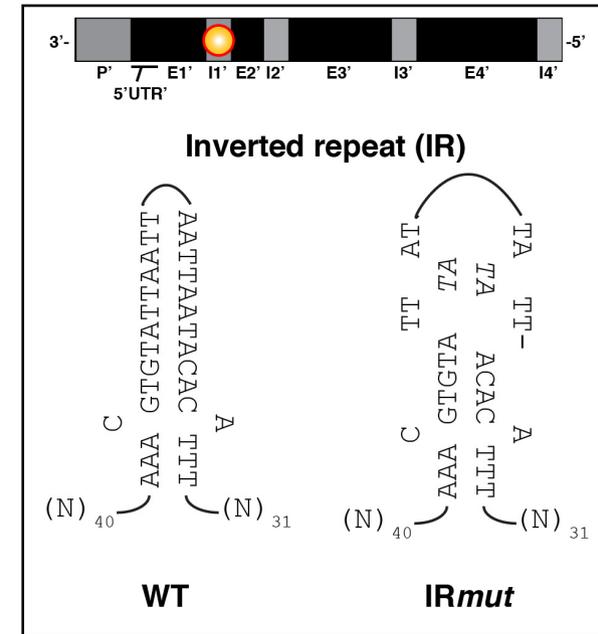
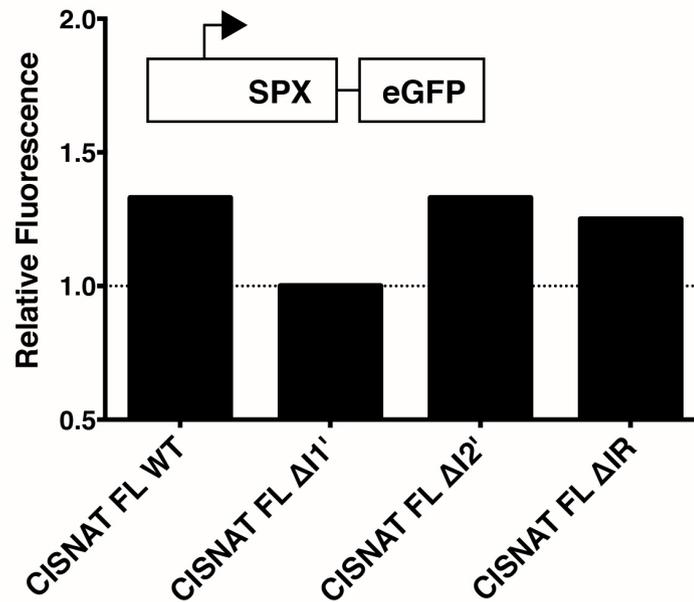
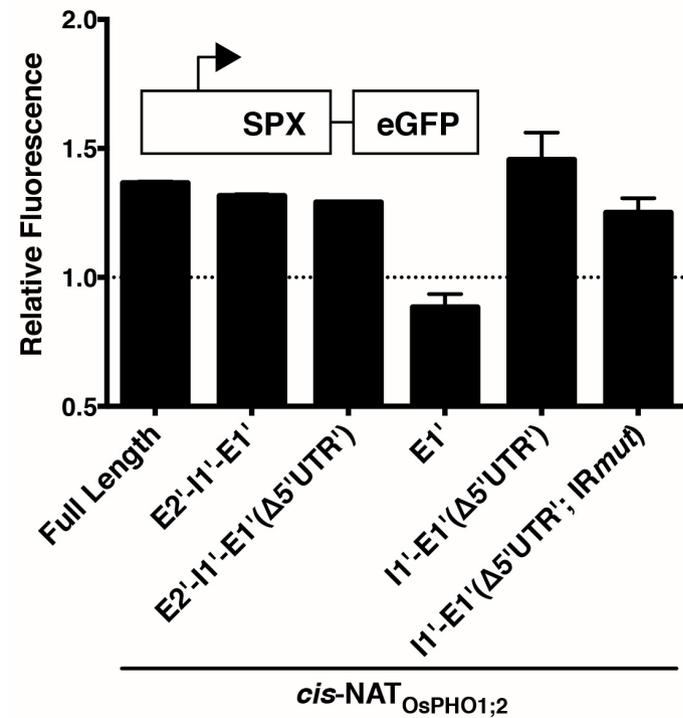
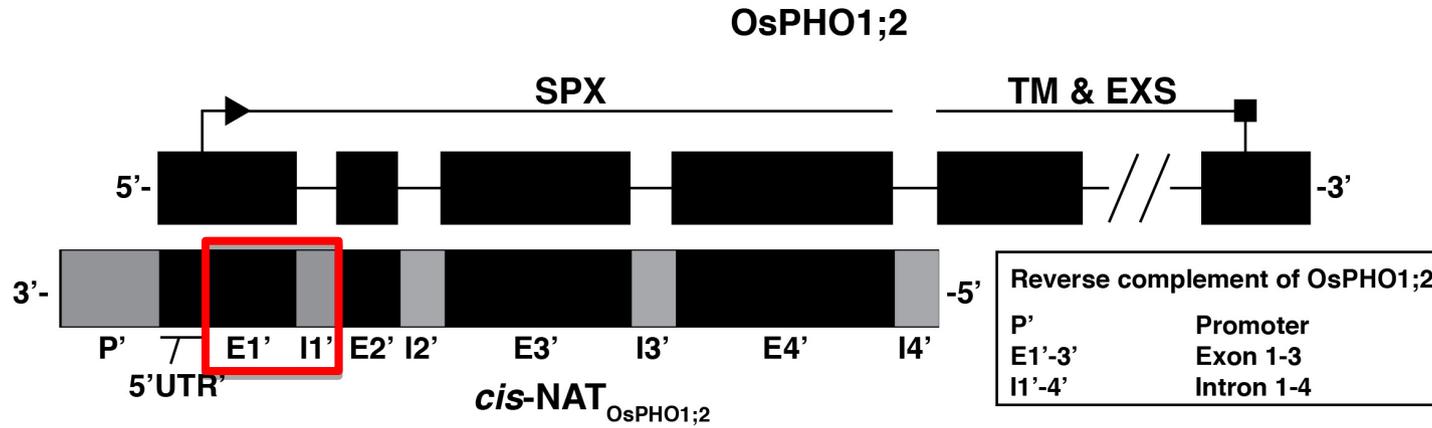
**Supplementary Figure S5. Human FRAM and mouse SINEB2 elements obtain different secondary structures**

Secondary structure of SINEs, predicted by RNAfold program. Prediction confidence for each base is indicated by the color code.

# A Rice cis-Natural Antisense RNA



# Dissection of *cis-NAT*<sub>OsPHO1;2</sub> translation enhancement of OsPHO1;2

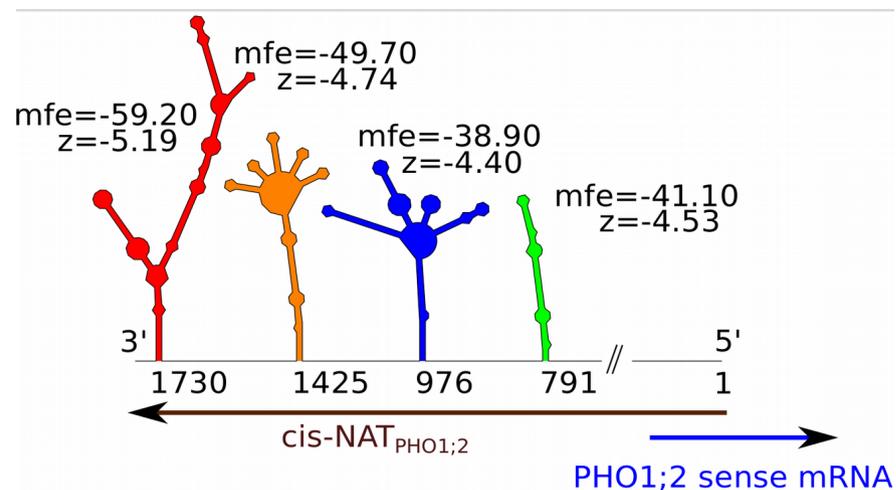


## Aim

Mechanism underlying the translation enhancement of PHO1 by *cis*-NAT in rice

## Objectives

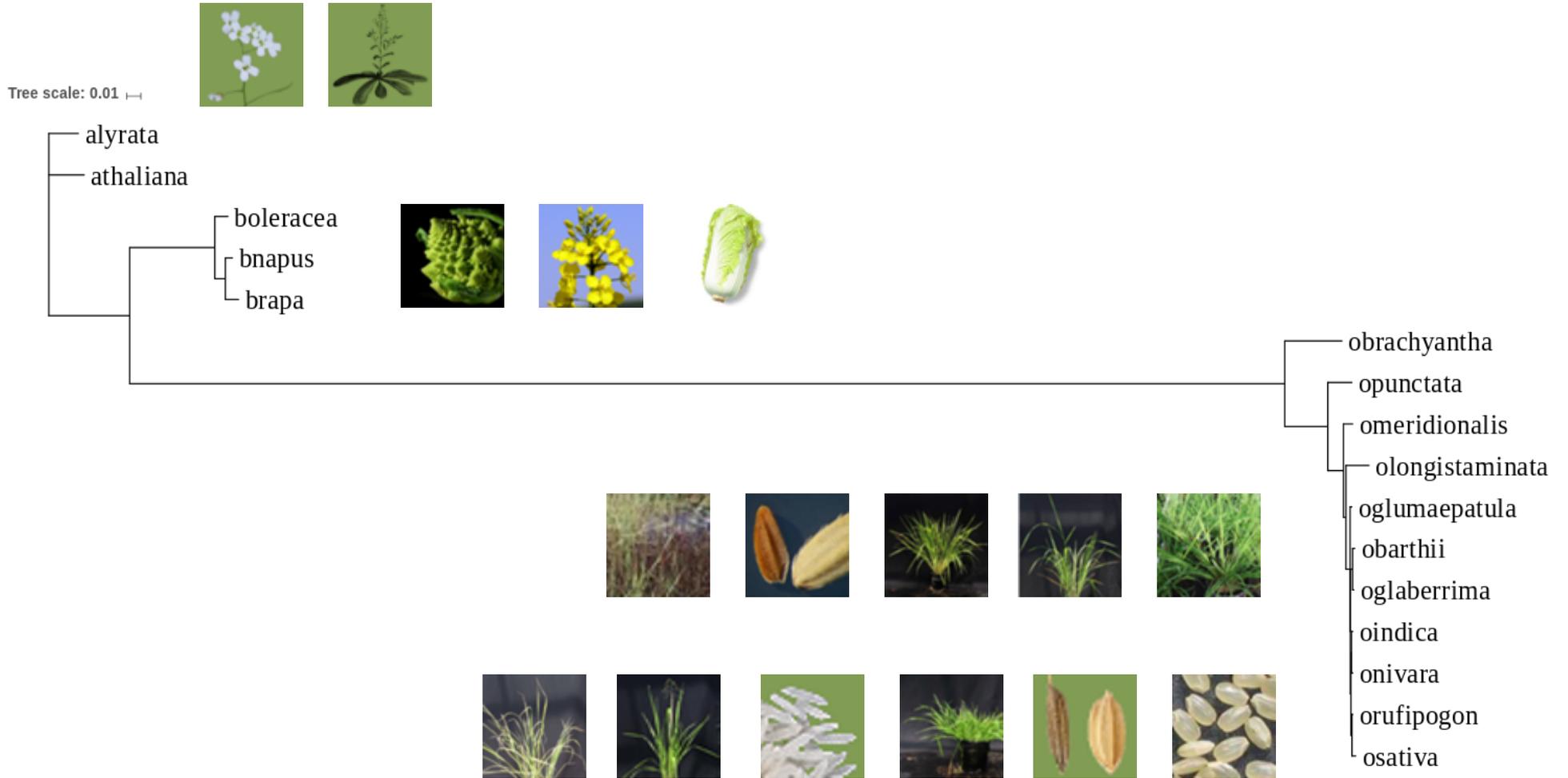
- Identification of similar putative *cis*-NATs in plant genomes
- Application of comparative genomics to identify evolutionary conserved structure elements
- Select candidate structures for experimental testing



## Data set

Species	Genome Version	Genome size in Mbp	No. of chromosomes
<i>Oryza sativa</i>	IRGSP-1.0	~374	12
<i>Oryza rufipogon</i>	OR_W1943	~338	12
<i>Oryza punctata</i>	AVCL000000000	~394	12
<i>Oryza nivara</i>	AWHD000000000	~338	12
<i>Oryza meridionalis</i>	Oryza_meridionalis_v1.3	~336	12
<i>Oryza longistaminata</i>	O_longistaminata_v1.0	~326	60198 scaffold
<i>Oryza indica</i>	ASM465v1	~412	12
<i>Oryza glumaepatula</i>	ALNU020000000	~372	12
<i>Oryza glaberrima</i>	AGI1.1	~316	12
<i>Oryza brachyantha</i>	Oryza_brachyantha.v1.4b	~260	12
<i>Oryza barthii</i>	O.barthii_v1	~308	12
<i>Brassica rapa</i>	IVFCAASv1	~284	10
<i>Brassica oleracea</i>	v2.1	~489	9
<i>Brassica napus</i>	AST_PRJEB5043_v1	~738	20899 supercontigs
<i>Arabidopsis thaliana</i>	TAIR10	~135	5
<i>Arabidopsis lyrata</i>	v.1.0	~206	8

# Phylogenetic tree



## No. of annotated transcripts

Species	Protein coding	ncRNA	Other	Total
<i>Oryza sativai</i>	42132	55619	0	97751
<i>Oryza rufipogon</i>	47441	2020	758	50219
<i>Oryza punctata</i>	41060	28	5167	46255
<i>Oryza nivara</i>	48360	24	1648	50032
<i>Oryza meridionalis</i>	43455	2283	0	45738
<i>Oryza longistaminata</i>	31686	0	0	31686
<i>Oryza indica</i>	40745	2232	45461	88438
<i>Oryza glumaepatula</i>	46893	19	3264	50176
<i>Oryza glaberrima</i>	33164	1997	38717	73878
<i>Oryza brachyantha</i>	32037	18	2100	34155
<i>Oryza barthii</i>	41595	1681	665	43941
<i>Brassica rapa</i>	41025	1	1827	42853
<i>Brassica oleracea</i>	59220	5	0	59225
<i>Brassica napus</i>	101040	0	0	101040
<i>Arabidopsis thaliana</i>	48321	3917	1775	54013
<i>Arabidopsis lyrata</i>	32667	0	0	32667

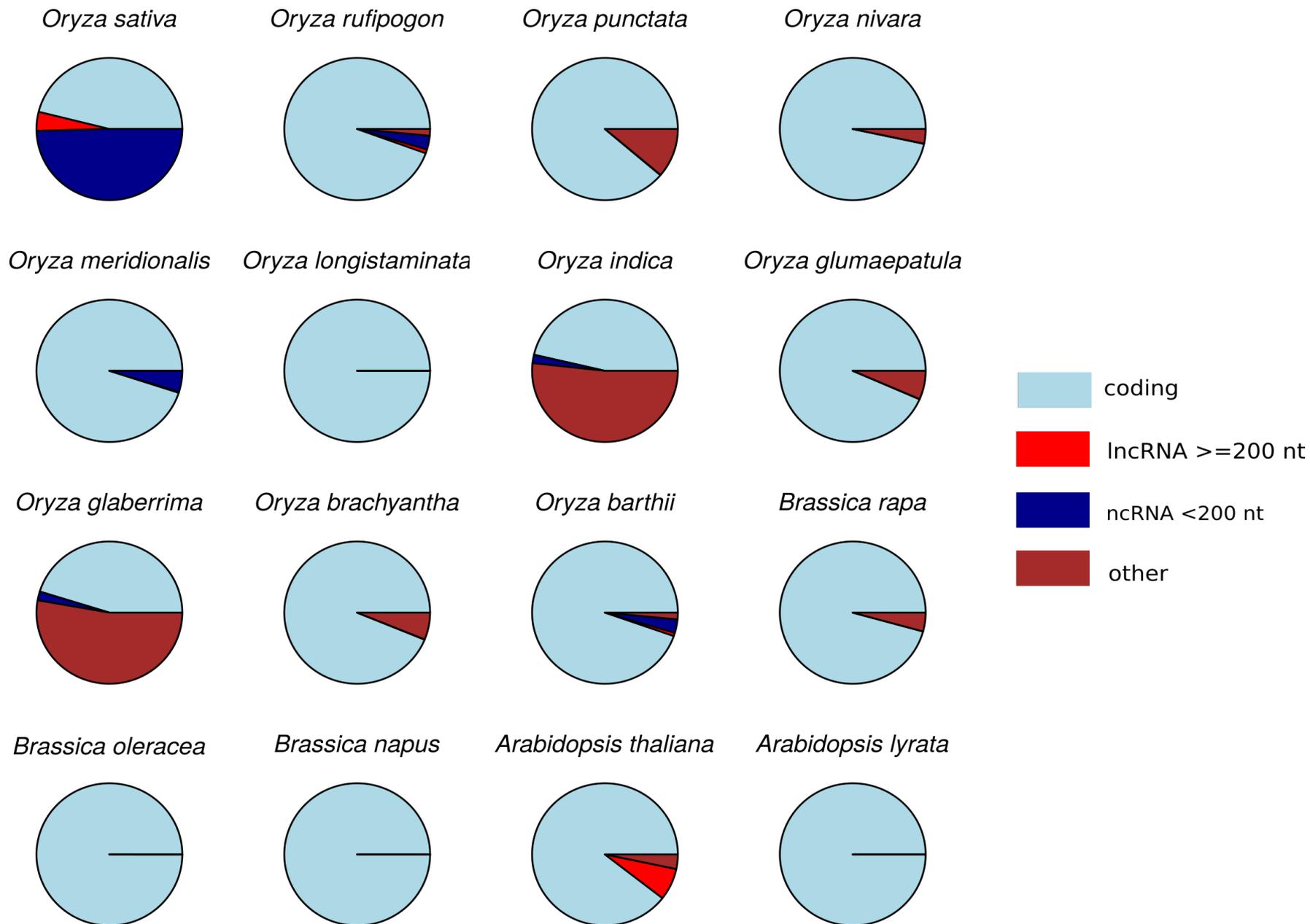
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<i>Oryza punctata</i>	41060	28	5167	46255
<i>Oryza nivara</i>	48360	24	1648	50032
<i>Oryza meridionalis</i>	43455	2283	0	45738
<i>Oryza longistaminata</i>	31686	0	0	31686
<i>Oryza indica</i>	40745	2232	45461	88438
<i>Oryza glumaepatula</i>	46893	19	3264	50176
<i>Oryza glaberrima</i>	33164	1997	38717	73878
<i>Oryza brachyantha</i>	32037	18	2100	34155
<i>Oryza barthii</i>	41595	1681	665	43941
<i>Brassica rapa</i>	41025	1	1827	42853
<i>Brassica oleracea</i>	59220	5	0	59225
<i>Brassica napus</i>	101040	0	0	101040
<i>Arabidopsis thaliana</i>	48321	3917	1775	54013
<i>Arabidopsis lyrata</i>	32667	0	0	32667

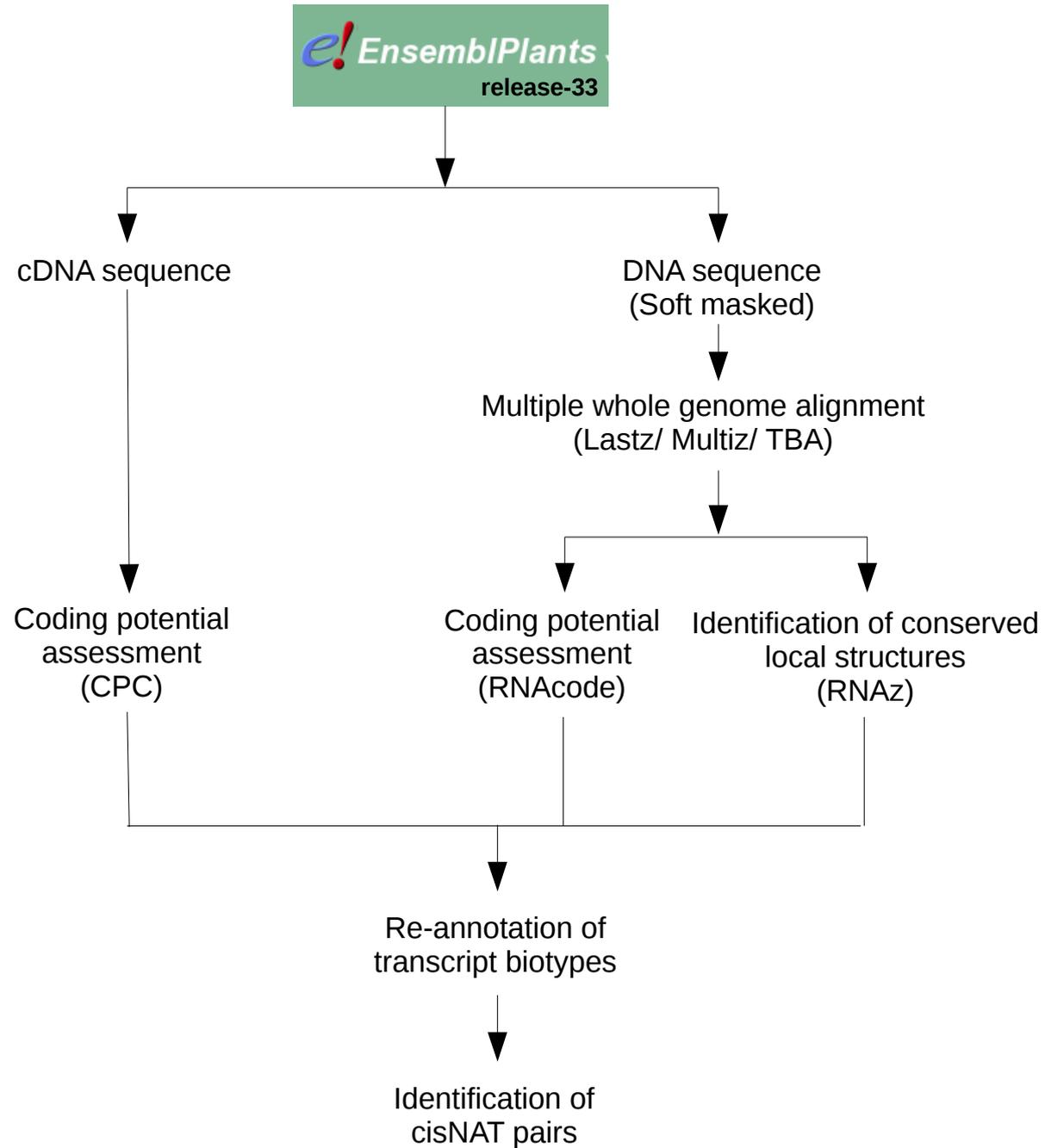
## No. of annotated transcripts

Species	Protein coding	lncRNA nt $\geq$ 200	ncRNA nt $<$ 200	Other
Oryza sativa	42132	3923	45310	0
Oryza rufipogon	47441	440	1580	758
Oryza punctata	41060	4	24	5167
Oryza nivara	48360	1	23	1648
Oryza meridionalis	43455	82	2201	0
Oryza longistaminata	31686	0	0	0
Oryza indica	40745	15	1669	45461
Oryza glumaepatula	46893	2	17	3264
Oryza glaberrima	33164	18	1459	38717
Oryza brachyantha	32037	1	17	2100
Oryza barthii	41595	326	1355	665
Brassica rapa	41024	0	1	1827
Brassica oleracea	59219	5	0	0
Brassica napus	101040	0	0	0
Arabidopsis thaliana	48321	3916	1	1775
Arabidopsis lyrata	32663	0	0	0

# Percentage of different transcript biotypes



# Work flow



# Coding potential Calculator (CPC)

## Quality of the ORF

- Implements *framefinder* software to identify the longest reading frame in the three forward frames
- Accesses the integrity of the ORF by checking if the ORF begins with a start codon and ends with an in-frame stop codon

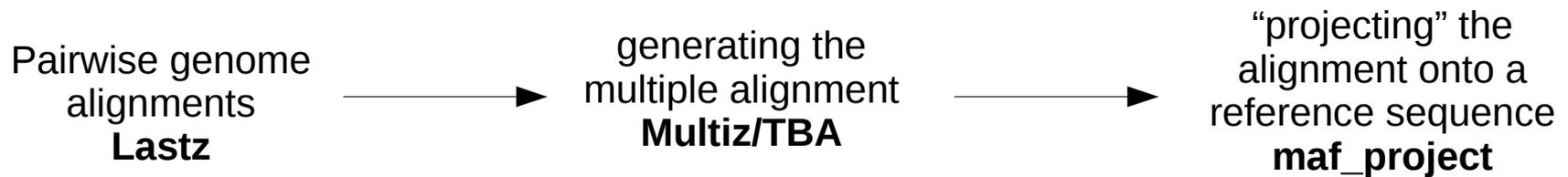
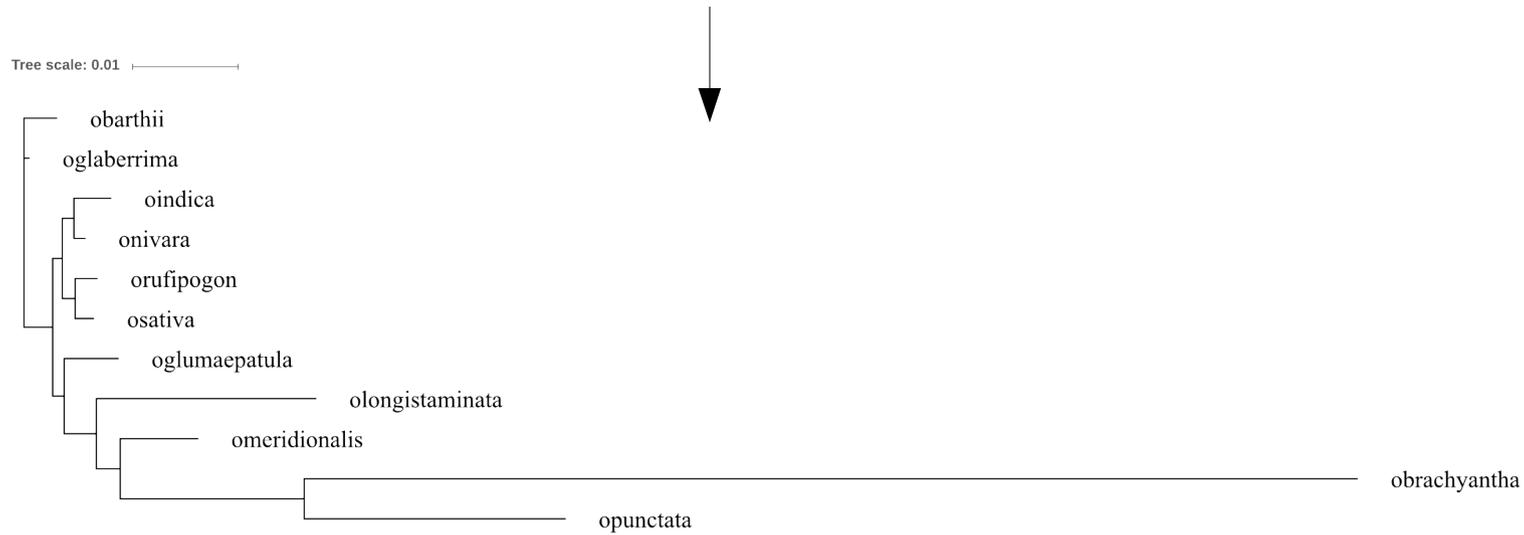
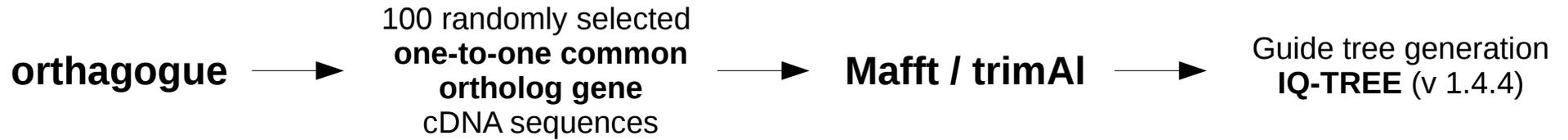
## BLASTX against uniref

- Extracts the number of hits
- Quality of HSPs (Lower E-values)
- Distribution of HSPs with in the frame

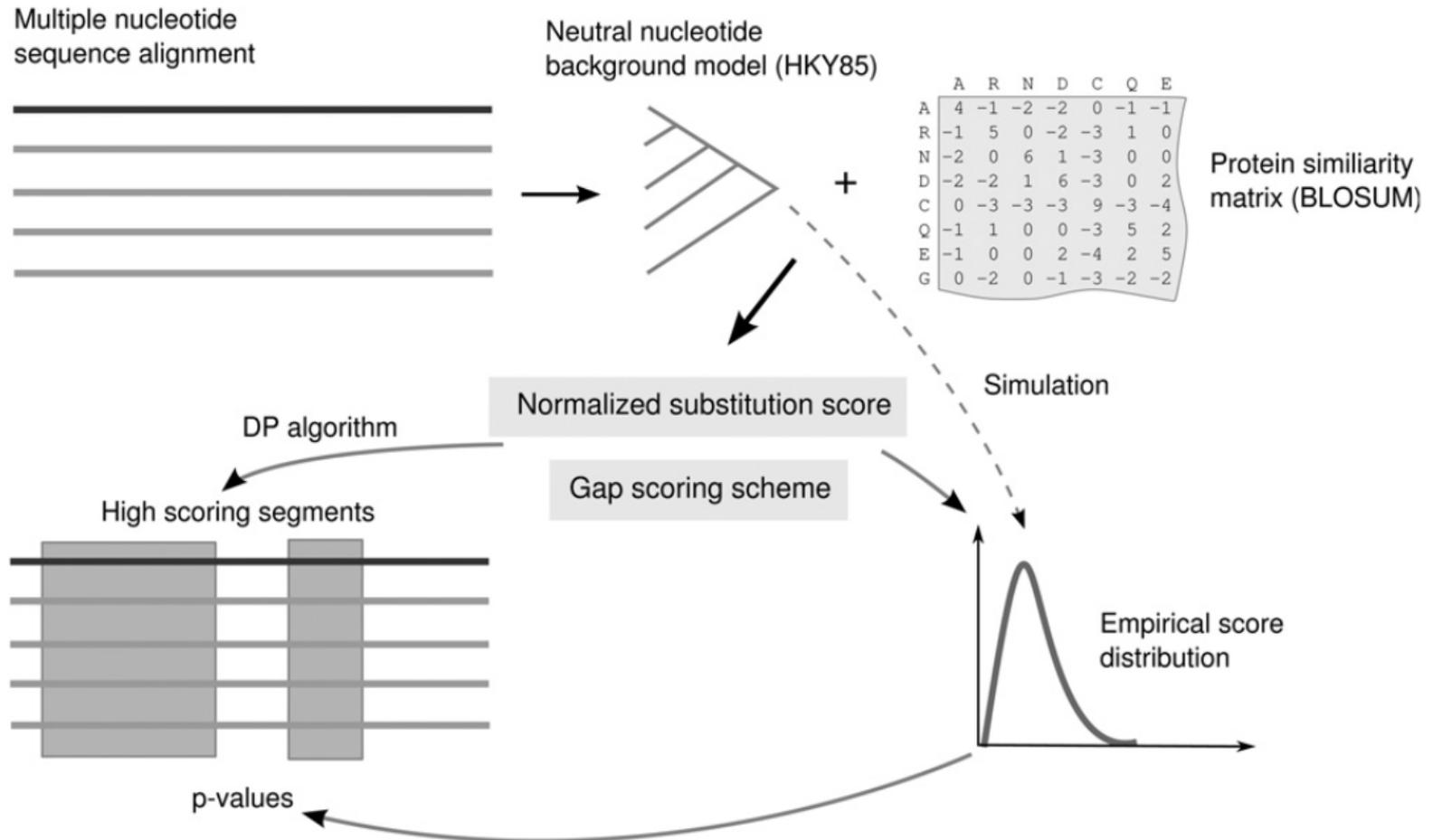
## Support vector machine (SVM) machine learning classifier

- Transcripts with Score  $< 1.5$  is classified as noncoding

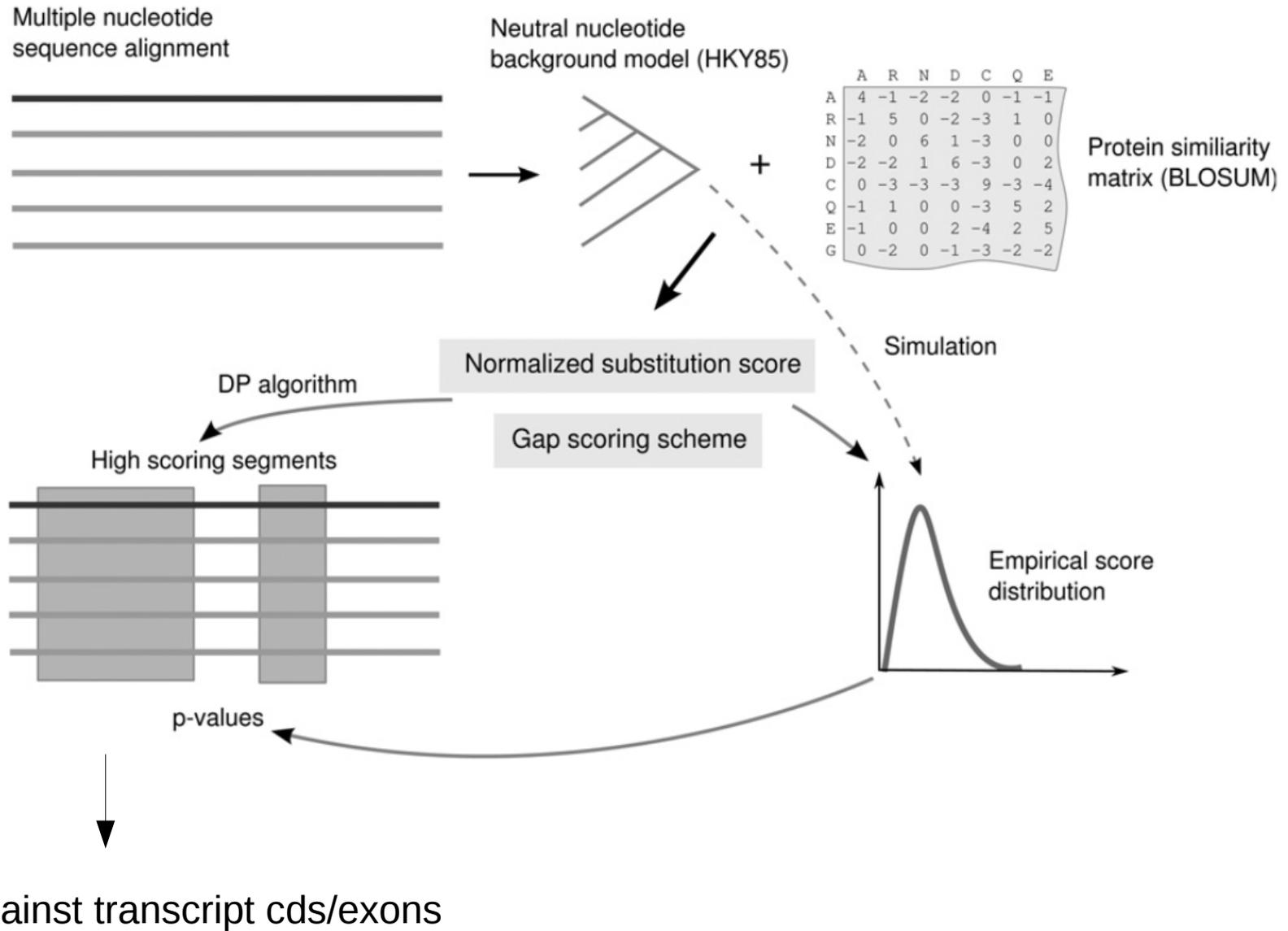
# Multiple whole genome alignment



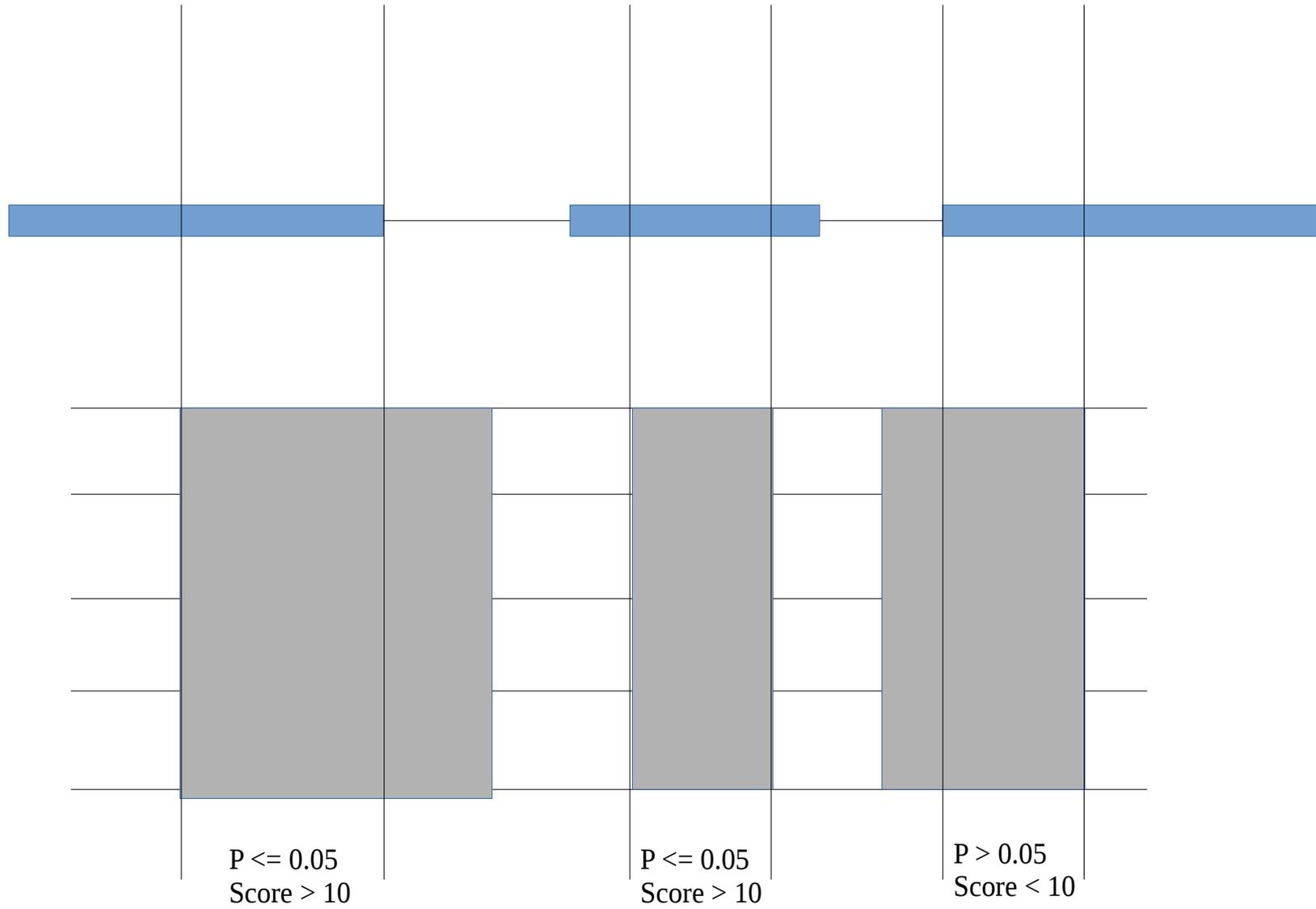
# RNAcode



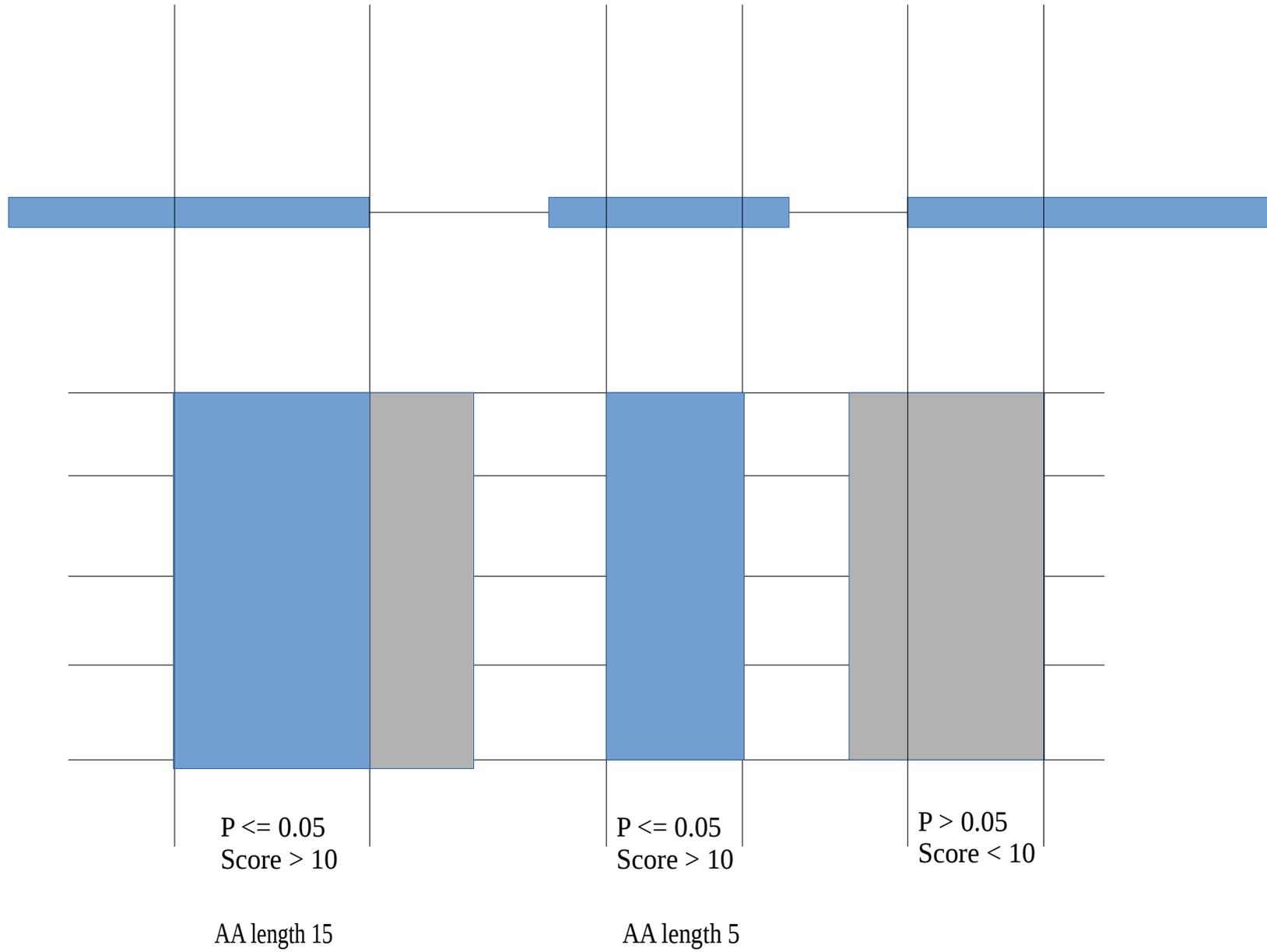
# RNAcode



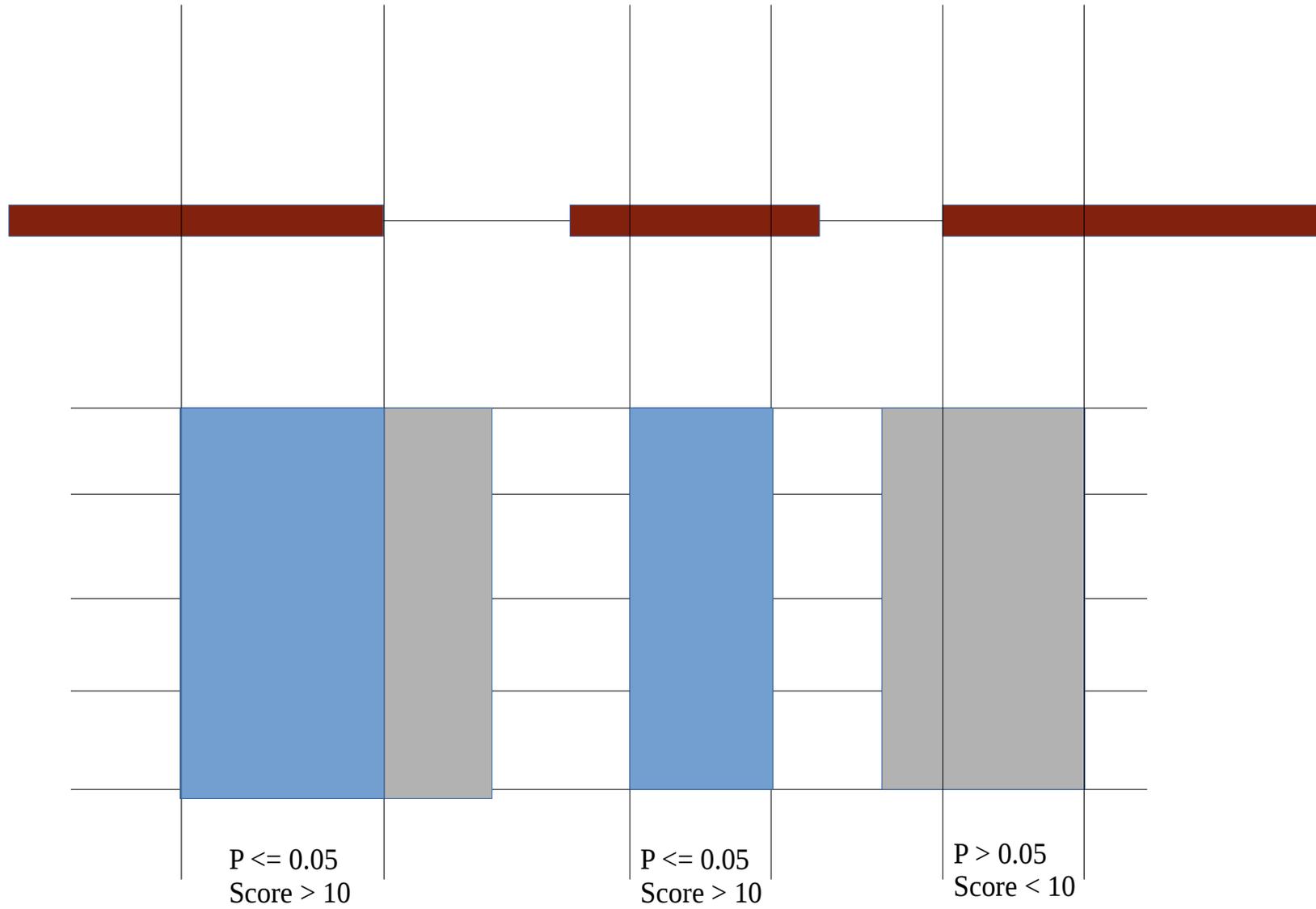
# RNAcode



# RNAcode

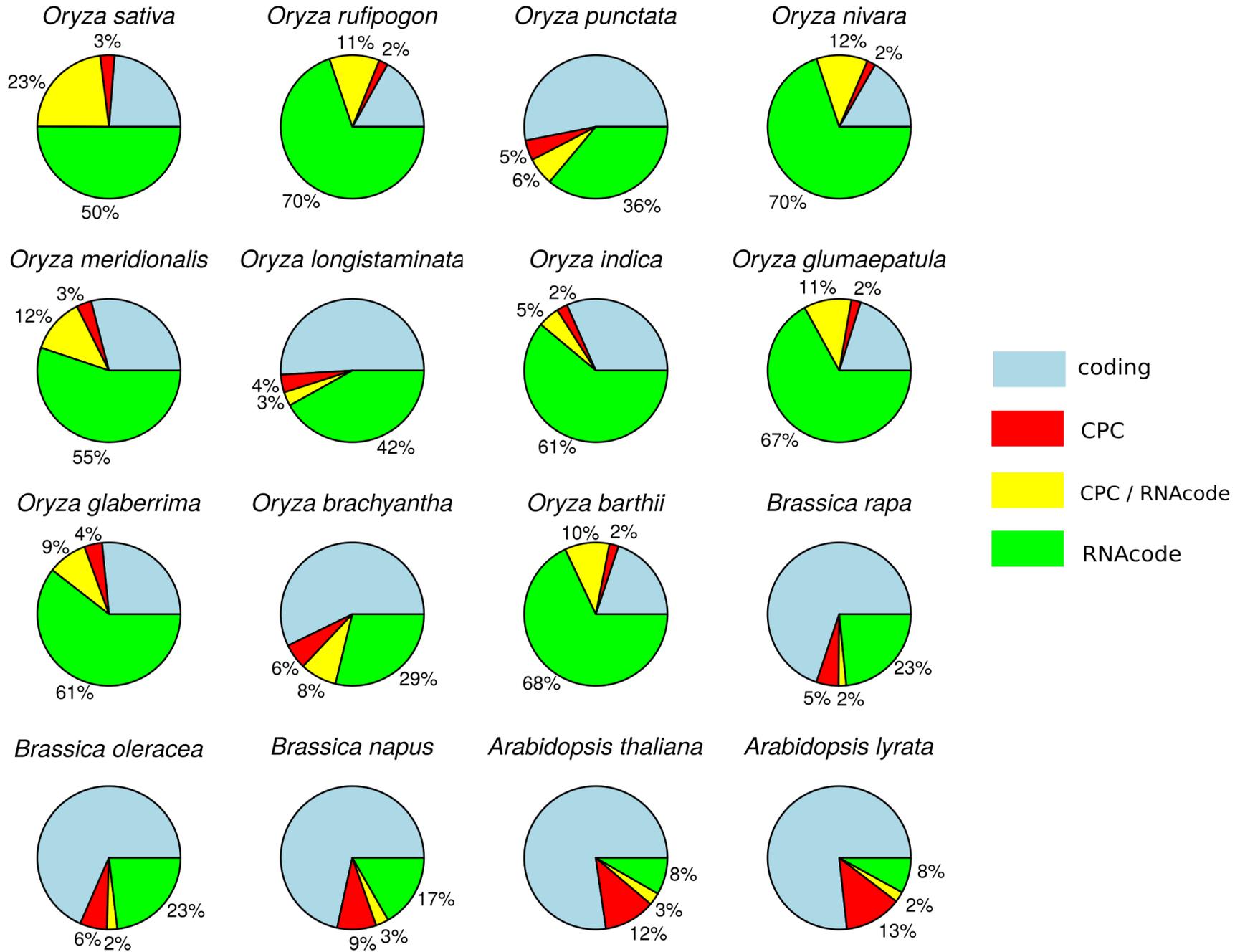


# RNAcode

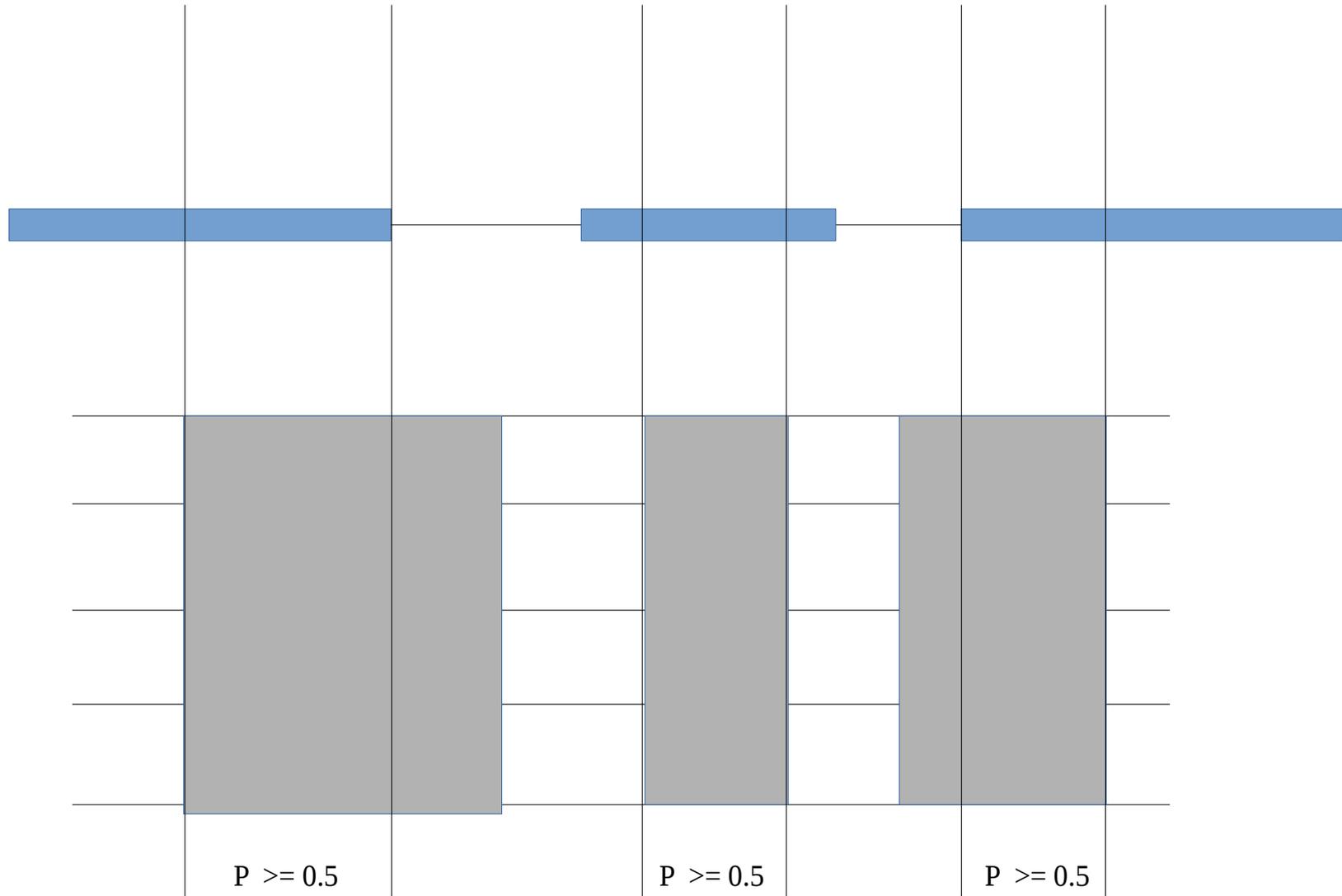


20 Amino Acids

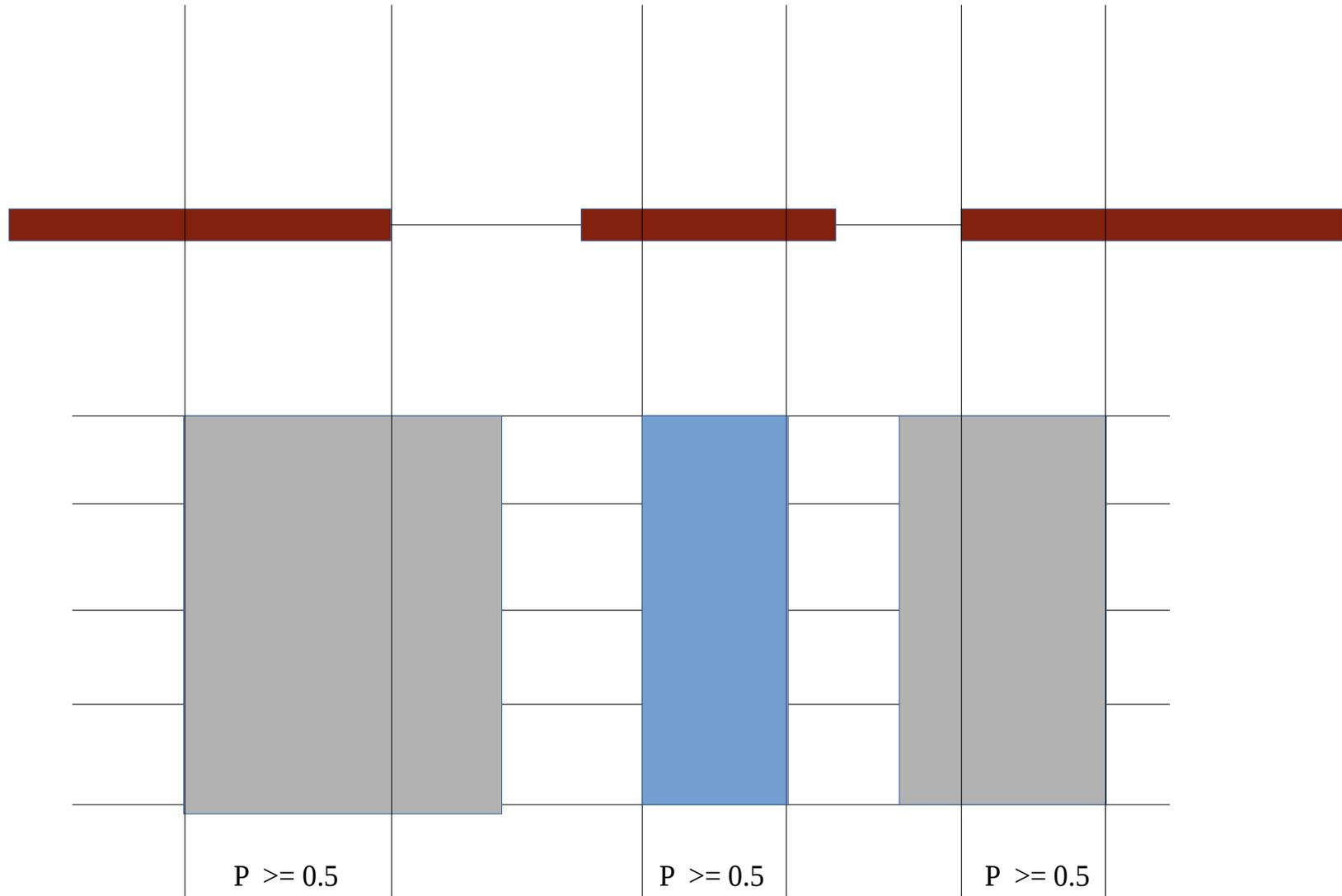
# Coding potentials identified by RNAcode vs CPC



# RNAz



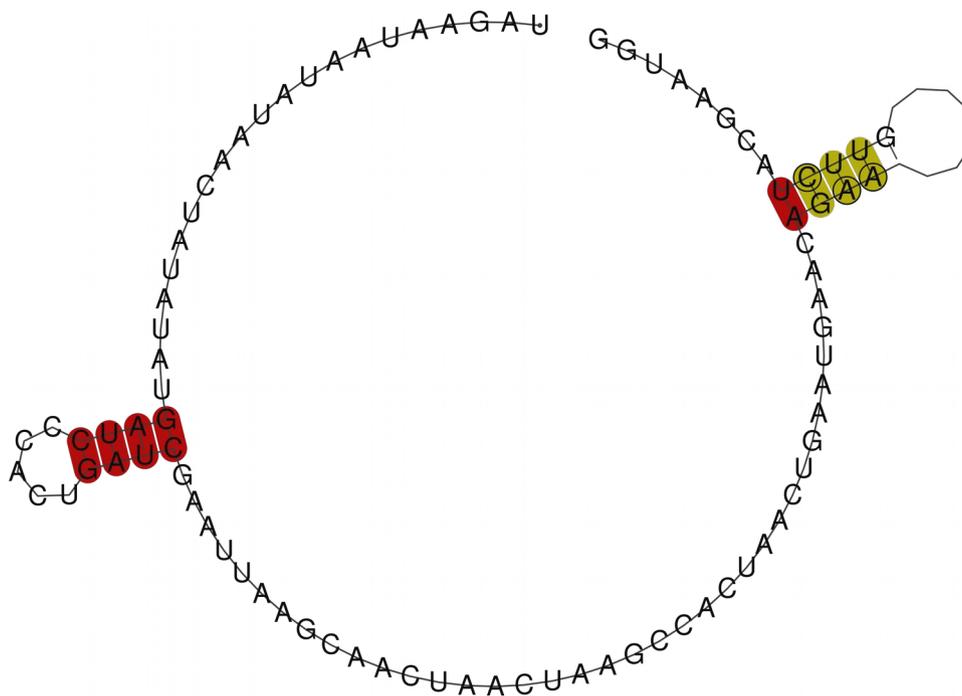
# RNAz



100 % overlap

# No. of identified lncRNA transcripts with conserved local structure

Species	Protein coding	RNAcode classified lncRNA	RNAz
<i>Oryza sativa</i>	42132	30779	14835
<i>Oryza rufipogon</i>	47441	33111	13690
<i>Oryza punctata</i>	41060	14828	3807
<i>Oryza nivara</i>	48360	33786	14531
<i>Oryza meridionalis</i>	43455	23971	9995
<i>Oryza longistaminata</i>	31686	13276	4257
<i>Oryza indica</i>	40745	24887	9102
<i>Oryza glumaepatula</i>	46893	31398	12618
<i>Oryza glaberrima</i>	33164	20073	6912
<i>Oryza brachyantha</i>	32037	9224	1258
<i>Oryza barthii</i>	41595	28263	10675
<i>Brassica rapa</i>	41024	9604	42
<i>Brassica oleracea</i>	59219	13690	46
<i>Brassica napus</i>	101040	16841	87
<i>Arabidopsis thaliana</i>	48321	4033	131
<i>Arabidopsis lyrata</i>	32663	2617	104



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 opunctata.chr2  
 oglumaepatula.chr2  
 oglaberrima.chr2  
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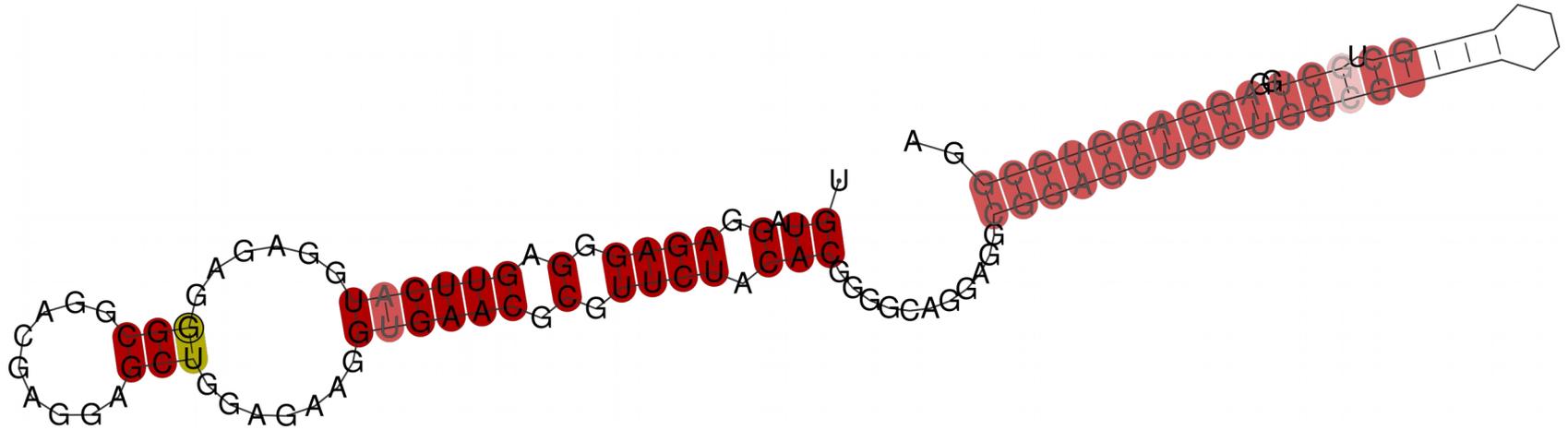
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osativa.chr2  
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 oglumaepatula.chr2  
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(((.(.(((.(.((((((.....(((.....)))))))).)))))  
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osativa.chr2  
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 oglumaepatula.chr2  
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## Total number of identified cisNAT pairs

Species	RNAcode based	Annotation based
<i>Oryza sativa</i>	970	445
<i>Oryza rufipogon</i>	293	1
<i>Oryza punctata</i>	329	0
<i>Oryza nivara</i>	384	0
<i>Oryza meridionalis</i>	622	18
<i>Oryza longistaminata</i>	0	0
<i>Oryza indica</i>	26	3
<i>Oryza glumaepatula</i>	420	0
<i>Oryza glaberrima</i>	7	7
<i>Oryza brachyantha</i>	346	1
<i>Oryza barthii</i>	162	1
<i>Brassica rapa</i>	4	0
<i>Brassica oleracea</i>	0	0
<i>Brassica napus</i>	0	0
<i>Arabidopsis thaliana</i>	839	552
<i>Arabidopsis lyrata</i>	6	0

# Future work

- ✓ Identification of true protein coding and non-coding transcripts
- ✓ Genome wide screen for local conserved structures
- ✓ Identification of overlapping features
- Re-annotation of transcript biotypes considering the results from CPC, RNAcode and RNAz
- Enrichment analysis of local conserved structures in cisNATs
- Application of GraphClust / RNAscClust on the candidate cisNATs with conserved local structures for grouping them together for genome wide screen for similar regions
- Selection of candidate cisNATs for experimental testing
- Annotation of missing protein-coding genes

# Acknowledgments



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**Andrea Tanzer**

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**Roman Ochsenreiter**  
**Richard Neuboeck**

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**ETH Zurich, Switzerland**

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**Katja Baerenfaller**  
**Julia Svozil**

**Funding**



**SWISS NATIONAL SCIENCE FOUNDATION**

# No. of annotated lncRNA transcripts classified as coding

<b>Species</b>	<b>Annotated ncRNA</b>	<b>CPC Score <math>\geq 1.5</math></b>	<b>RNAcode Score<math>&gt;10</math>; pvalue<math>&lt;0.05</math></b>
Oryza sativa	55619	65	337
Oryza rufipogon	2020	12	34
Oryza punctata	28	0	0
Oryza nivara	24	0	0
Oryza meridionalis	2283	7	16
Oryza longistaminata	0	0	0
Oryza indica	2232	5	23
Oryza glumaepatula	19	0	0
Oryza glaberrima	1997	6	18
Oryza brachyantha	18	1	0
Oryza barthii	1681	3	15
Brassica rapa	1	0	0
Brassica oleracea	5	3	1
Brassica napus	0	0	0
Arabidopsis thaliana	3917	61	660
Arabidopsis lyrata	0	0	0