

# Experience in the use of GIS tools in plant conservation

M. Olonova

Tomsk State University



- **GIS technologies can be used in 3 different sites:**
  - **A Mapping**
  - **B Niche modeling and research**
  - **C Species distribution modeling**

# Mapping

**ArcGIS** -- ArcGIS (ESRI) URL: <http://www.esri.com>

**DIVA-GIS** -- Hijmans R.J., Guarino L., Jarvis A. et. al.  
DIVA-GIS, version 5.2. Manual. 2005

# The data have to be prepared specially. From (from excell to attributive table of ArcGIS)

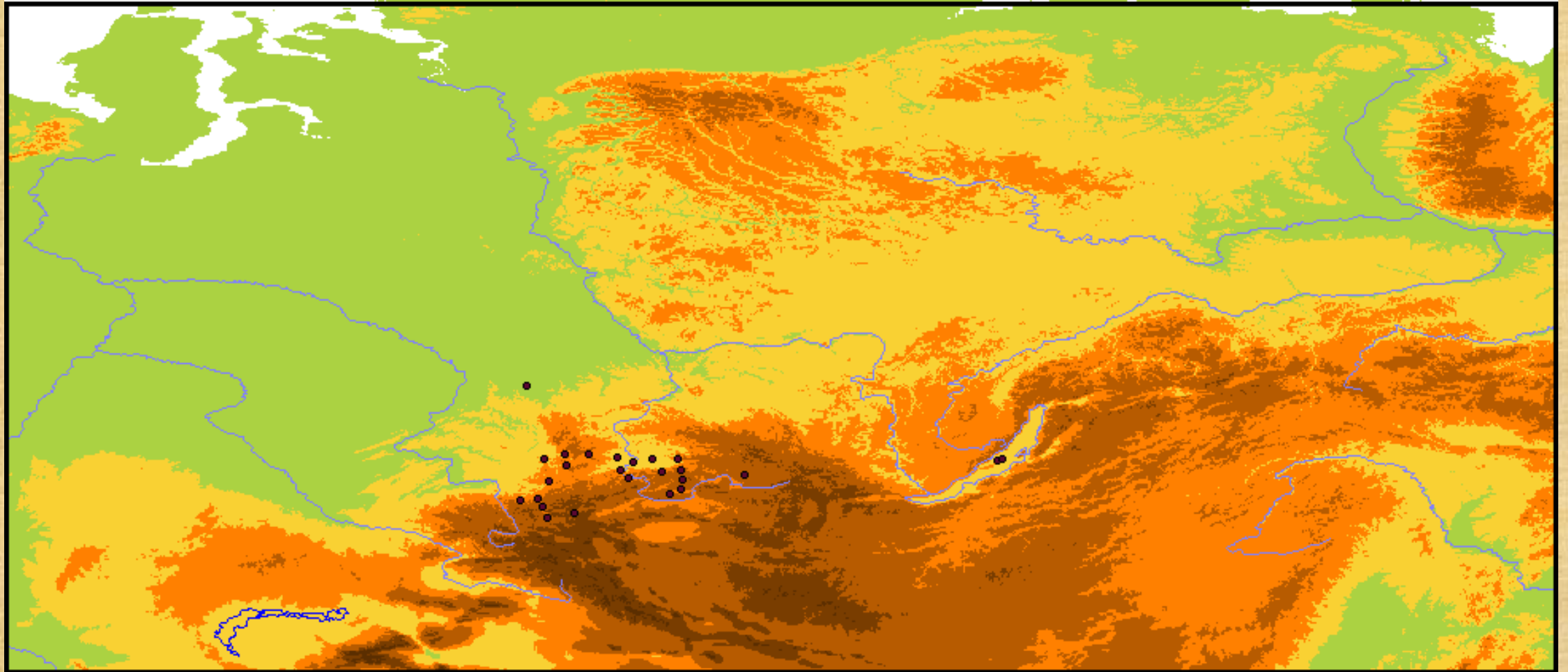
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D	E	F	G	H	I	J	K	L		
species	longit	latid	alt	level	rachilla	callus	betw_veins	ligule	lor	
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nemor	85,882	55,264	201,0000		1 2	2	1	1	2	2
nemor	85,126	51,670	845,0000		1 2	2	1	1	1	1
nemor	84,747	51,260	965,0000		1 2	2	1	1	1	1
nemor	85,252	51,071	1248,0000		1 2	2	1	1	2	2
nemor	85,662	51,386	858,0000		1 2	2	1	1	3	3
nemor	85,536	52,017	327,0000		1 2	2	1	1	5	5
nemor	87,112	51,796	537,0000		1 2	2	1	1	5	5
nemor	87,994	51,796	1365,0000		1 2	2	1	1	5	5
nemor	88,782	52,238	1185,0000		1 2	2	1	1	1	1
nemor	87,017	50,504	1926,0000		1 2	2	1	1	1	1
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nemor	91,556	50,882	1670,0000		1 2	2	1	1	2	2
nemor	94,457	57,596	254,0000		1 2	2	1	1	2	2
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Set of  
molecu-  
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markers

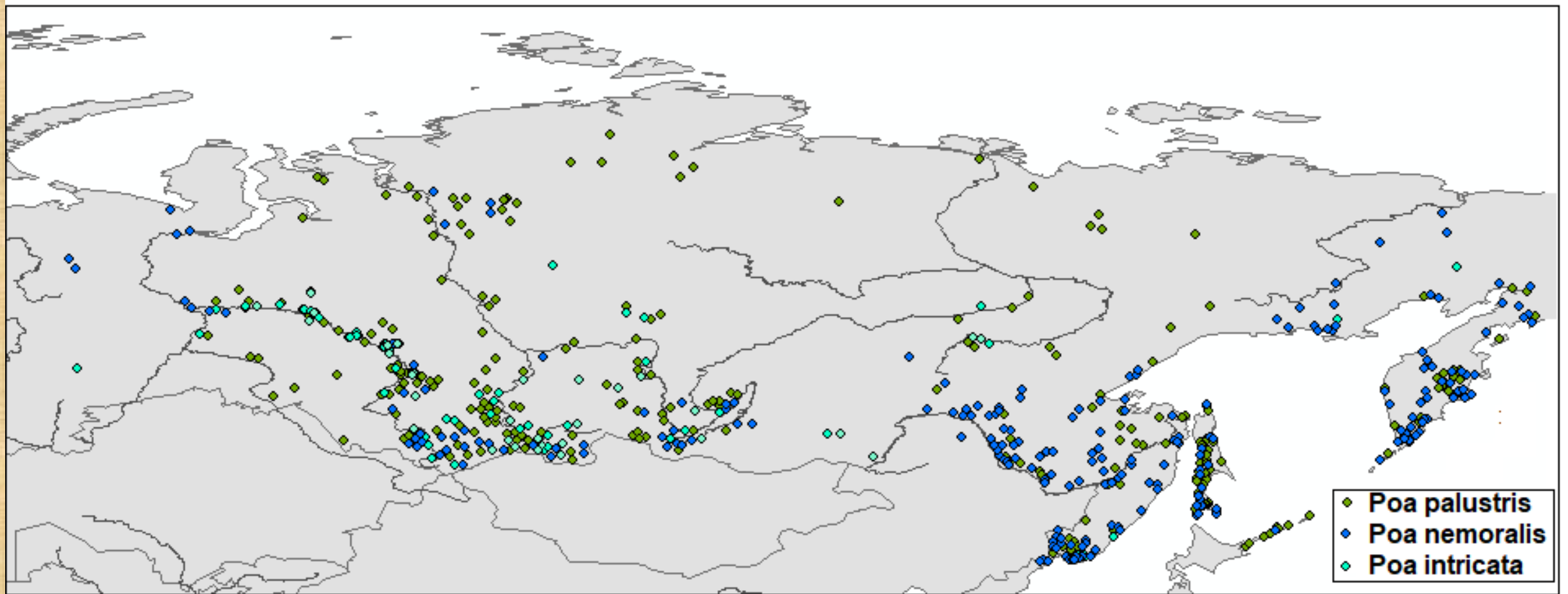




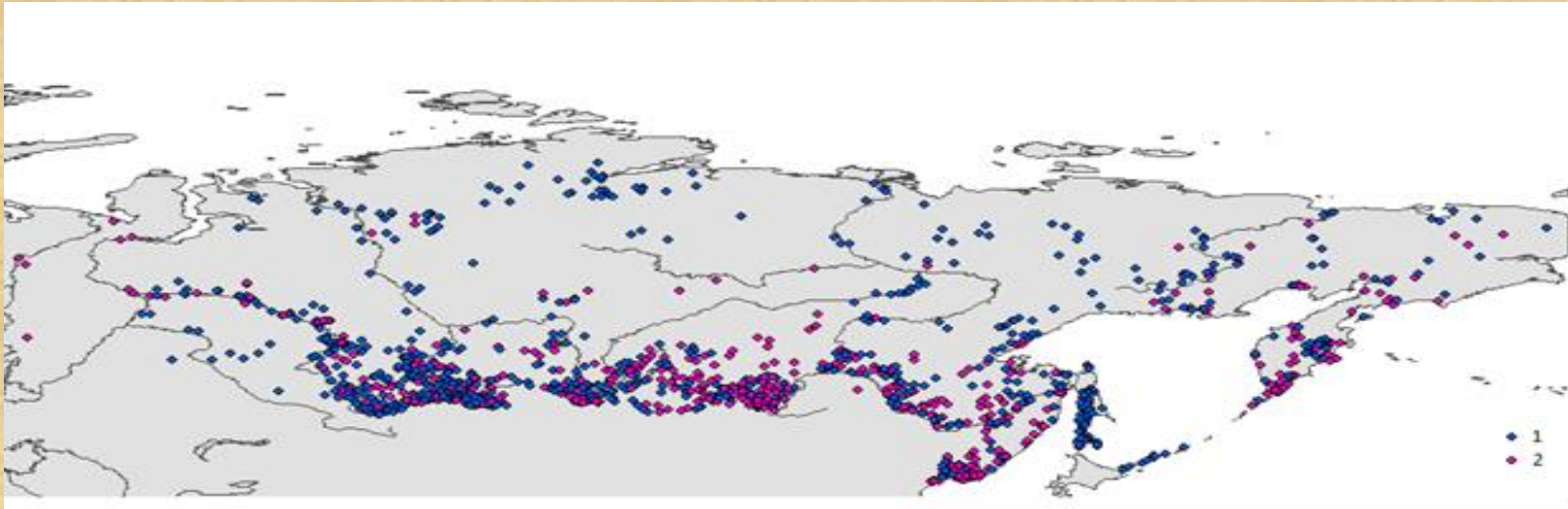
# The distribution of *Brunnera sibirica*



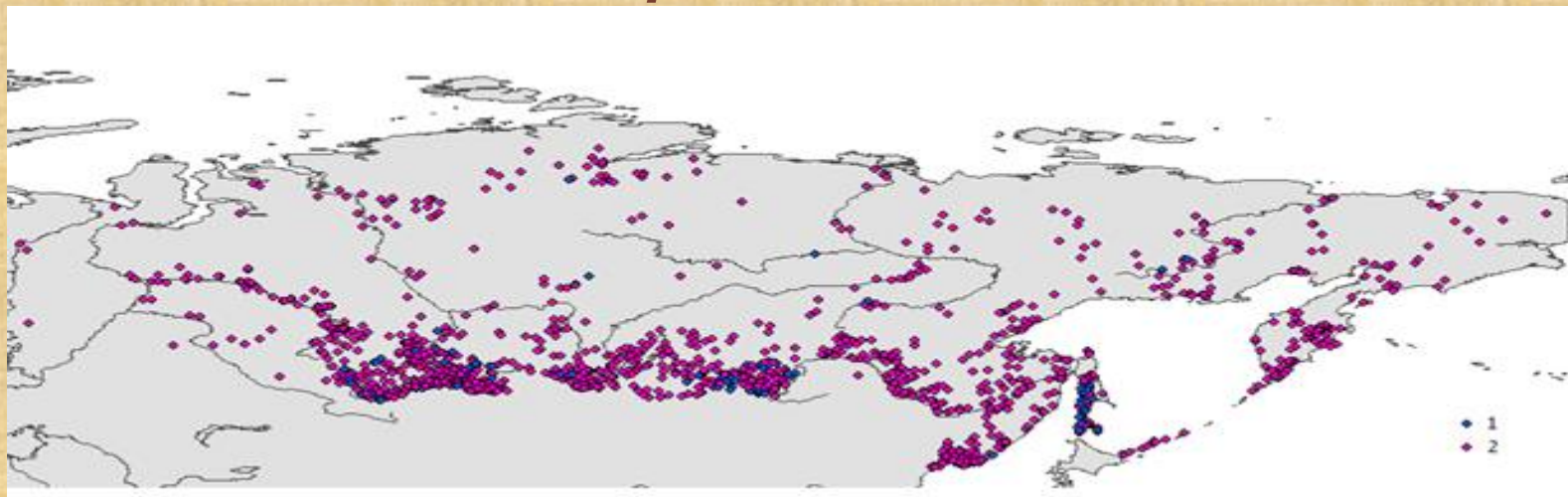
## The distribution of 3 species in Asian Russia



## The distribution of rachilla pubescence within the Bluegrasses section in Asian Russia

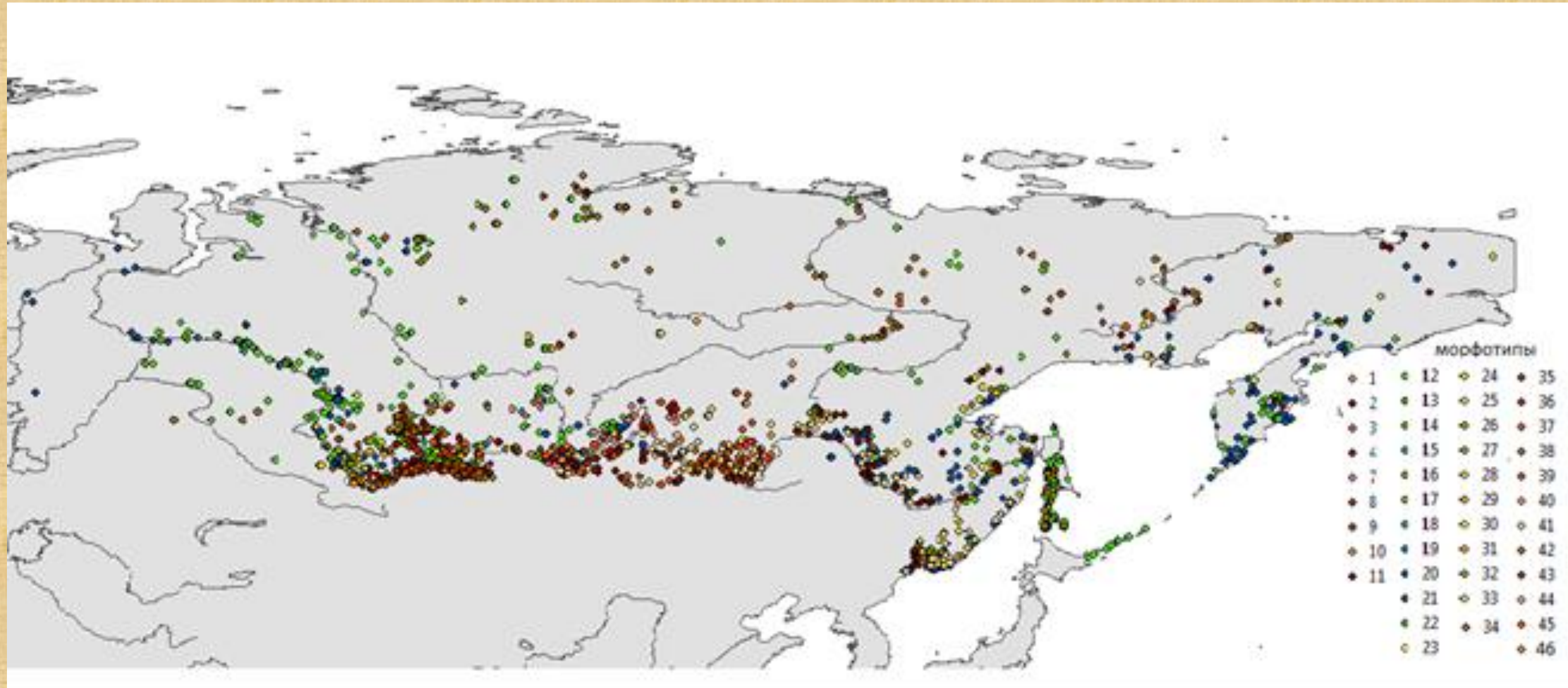


## The distribution of callus pubescence within the Bluegrasses section *Stenopoa* in Asian Russia



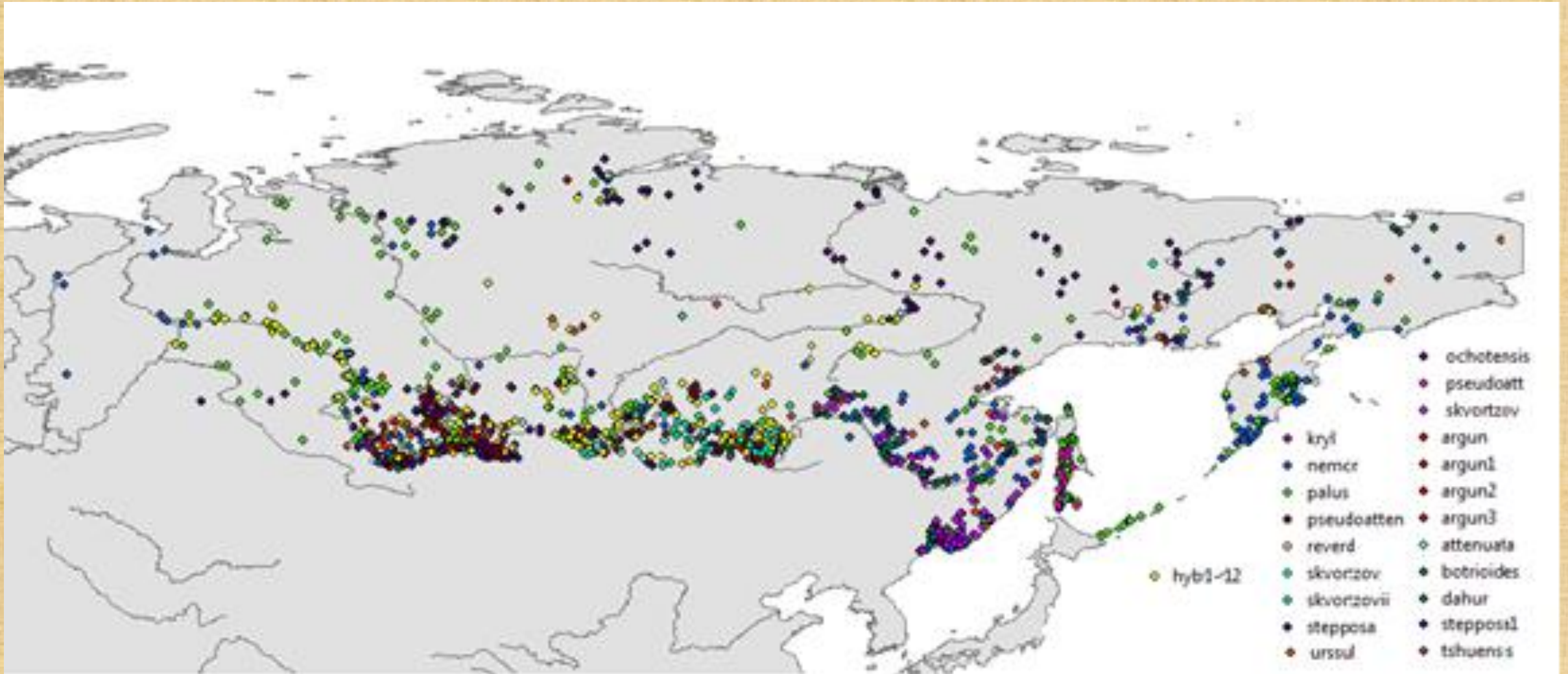


# The distribution of different morphotypes of the same species in Asian Russia basing 5 basic characters

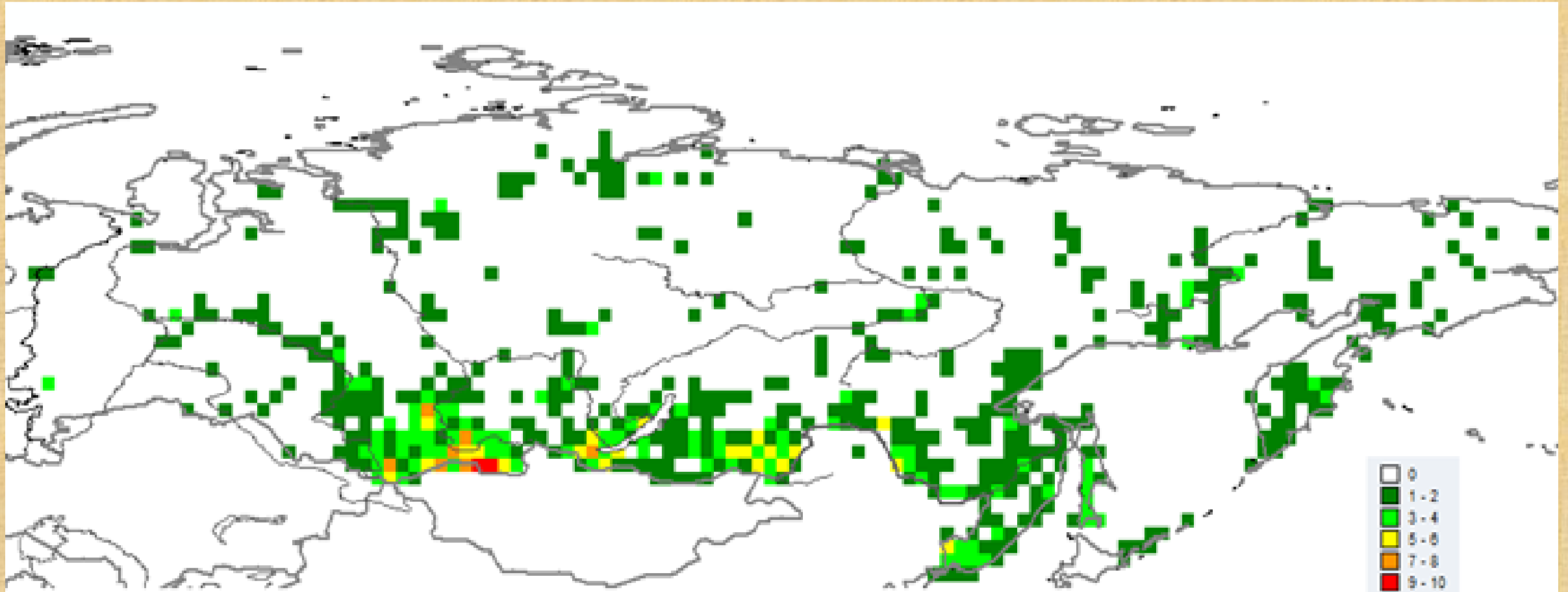




# The distribution of putative hybrid morphs of *Stenopoa* Bluegrasses in Asian Russia



# The richness of Asian Russia with morphotypes of Blugrasses section *Stenopoa*



# **Ecologo-climatic niche research and modeling**

## **DIVA GIS**

**Hijmans R.J., Guarino L., Jarvis A. et. al. DIVA-GIS, version 5.2. Manual. 2011. URL: [http://www.diva-gis.org/docs/DIVAGIS5\\_manual.pdf](http://www.diva-gis.org/docs/DIVAGIS5_manual.pdf)**

## **MaxEnt**

**Philips S.J., Anderson R.P., Schapire R.E. Maximum entropy modeling of species geographic distributions // Ecological Modelling. 2006. Vol. 190. P. 231–259.**

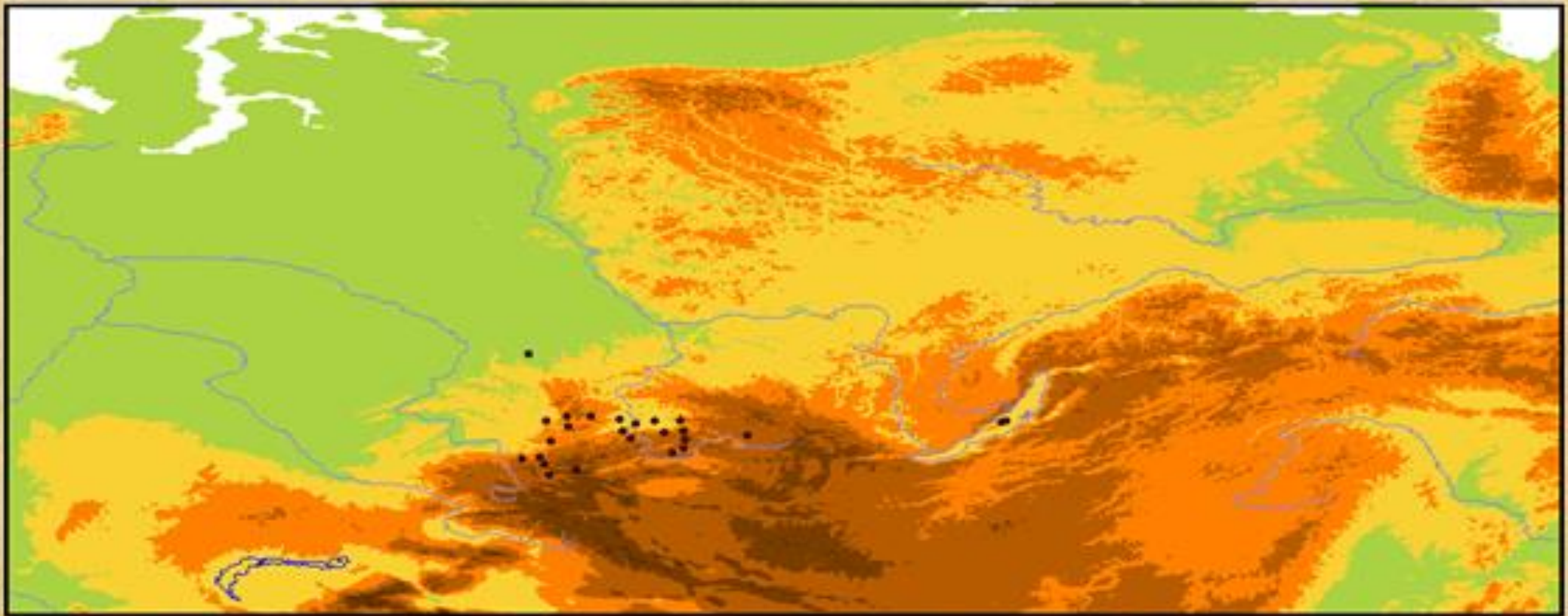
**Uses occurrence and climatic data**



- There are several methods of bioclimatic modeling at present, but among ones, which are satisfied with data about the presence of species only, the MaxEnt algorithm is the most popular currently.
- This application is based on the identification of the climatic niche of the species under study, which is established by combining the data of the geographical distribution of species and the climatic characteristics of these points, which are freely available on the internet (Worldclim database).
- If desired, and with the availability of data, you can add other indicators - for example, such as slope, salinity, chemical composition of soils and so on.

# Data of occurrence

## The distribution of *Brunnera sibirica*





# **The Worldclim database (Hijmans et al, 2004). Biologically significant variables**

**BIO1 = Annual mean temperature**

**BIO2 = Mean diurnal range (max temp – min temp) (monthly average)**

**BIO3 = Isothermality (BIO1/BIO7) \* 100**

**BIO4 = Temperature Seasonality (Coefficient of Variation)**

**BIO5 = Max Temperature of Warmest Period**

**BIO6 = Min Temperature of Coldest Period**

**BIO7 = Temperature Annual Range (BIO5-BIO6)**

**BIO8 = Mean Temperature of Wettest Quarter**

**BIO9 = Mean Temperature of Driest Quarter**

**BIO10 = Mean Temperature of Warmest Quarter**

**BIO11 = Mean Temperature of Coldest Quarter**

**BIO12 = Annual Precipitation**

**BIO13 = Precipitation of Wettest Period**

**BIO14 = Precipitation of Driest Period**

**BIO15 = Precipitation Seasonality (Coefficient of Variation)**

**BIO16 = Precipitation of Wettest Quarter**

**BIO17 = Precipitation of Driest Quarter**

**BIO18 = Precipitation of Warmest Quarter**

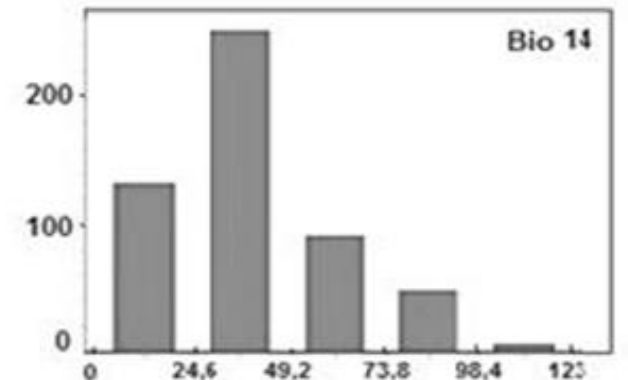
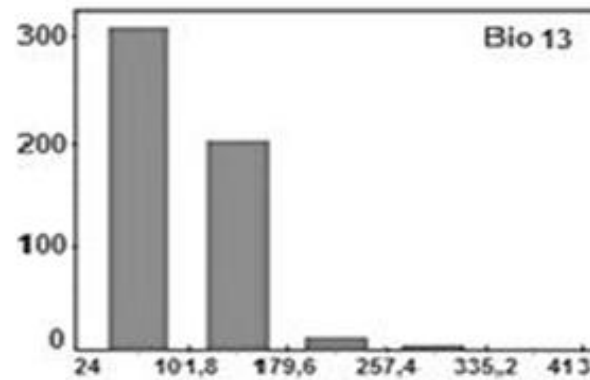
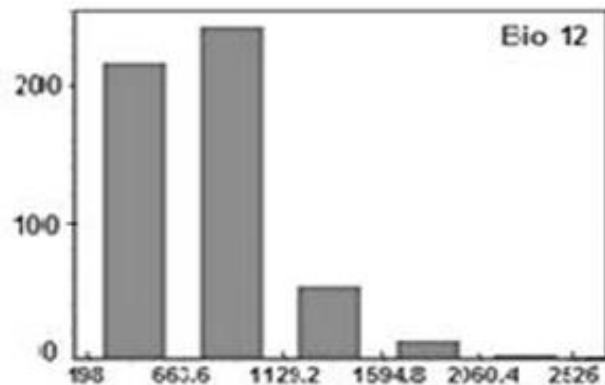
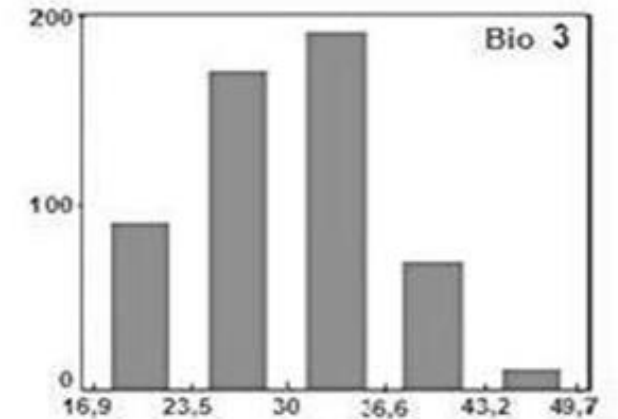
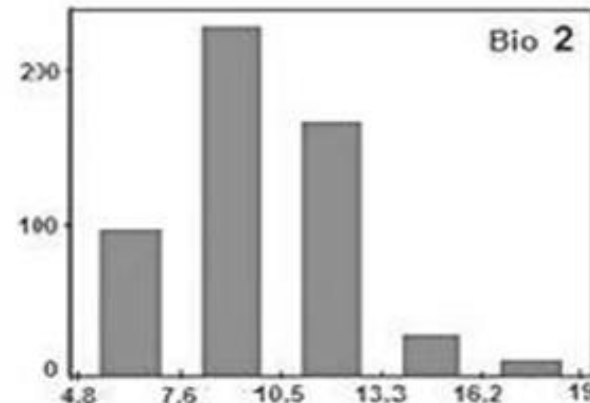
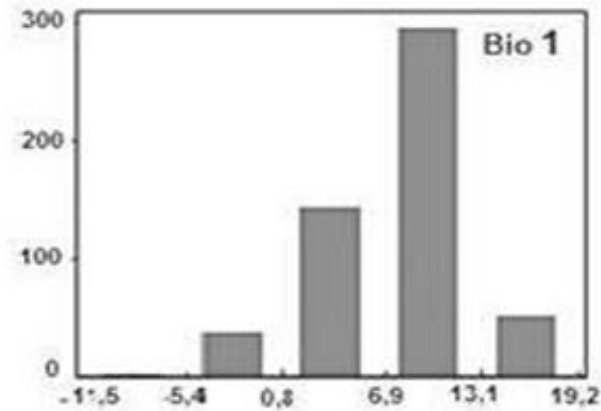
**BIO19 = Precipitation of Coldest Quarter**



**The DIVA-GIS program allows you to determine the bioclimatic parameters of each point where a species was recorded, then, build various histograms, and conduct multivariate analyses of data.**

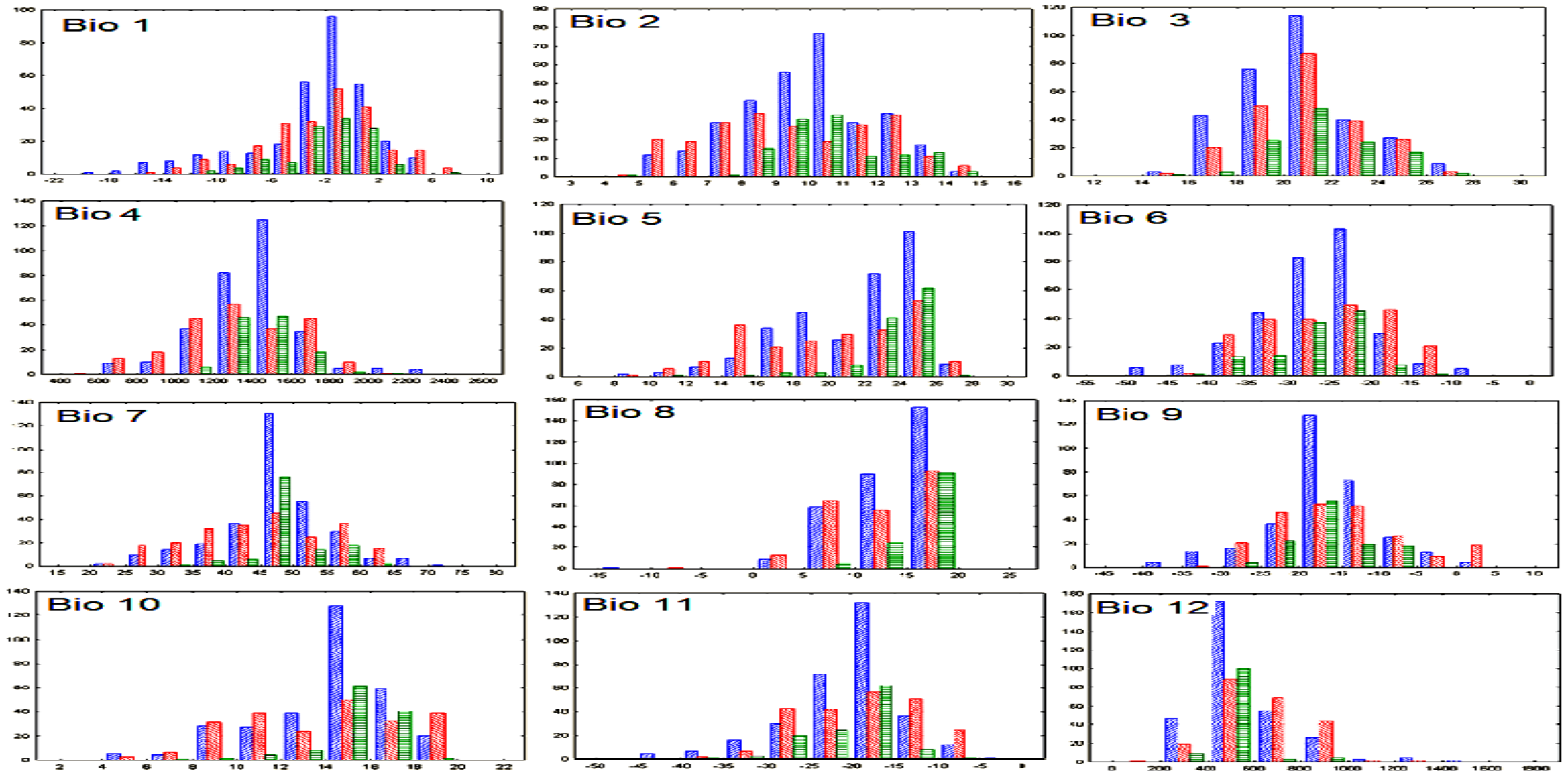
# DIVA-GIS allows to obtain the bioclimatic profile of one species

temperature

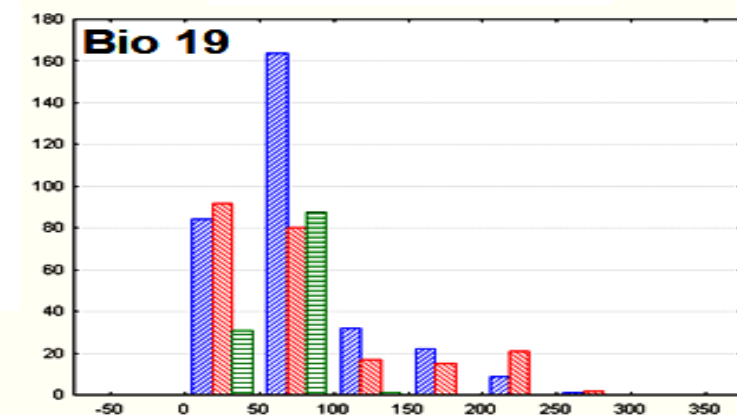
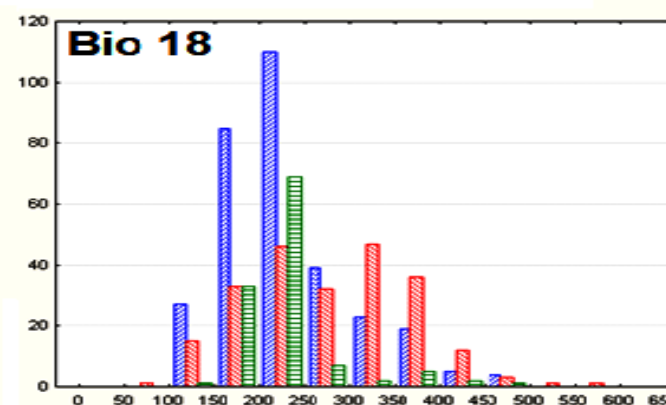
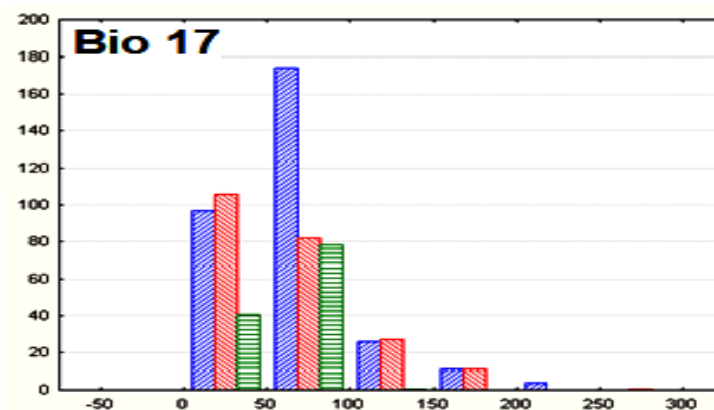
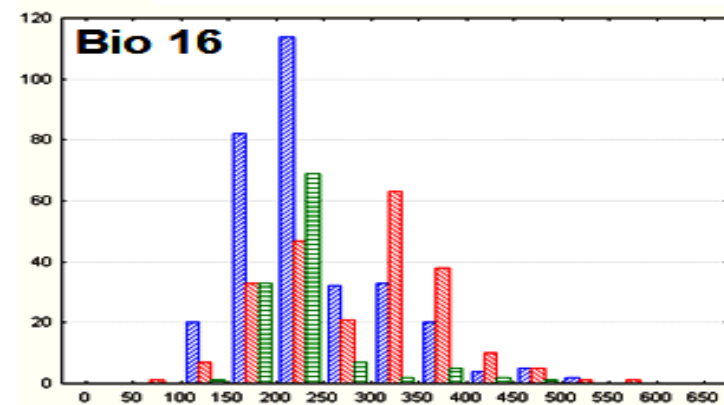
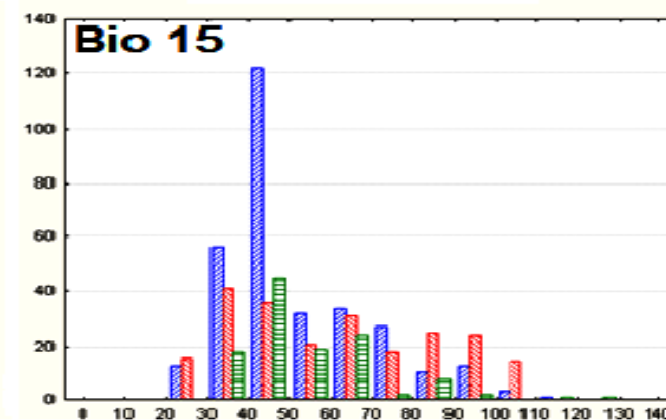
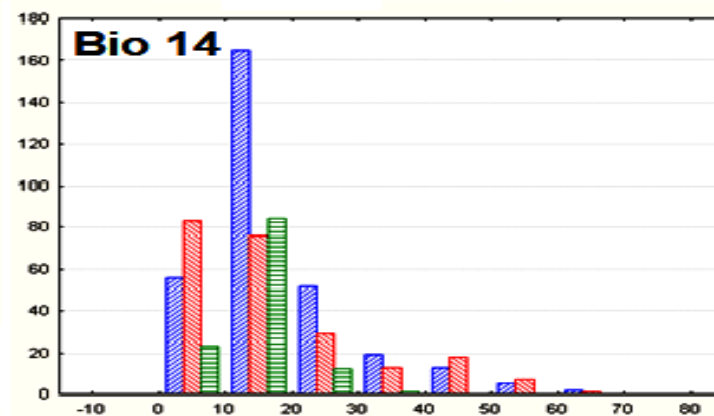
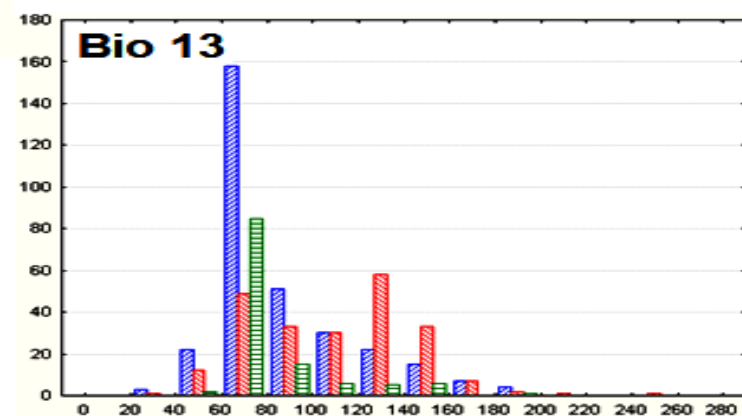


precipitation

... To compare two bioclimatic outlines of 3 different relative species

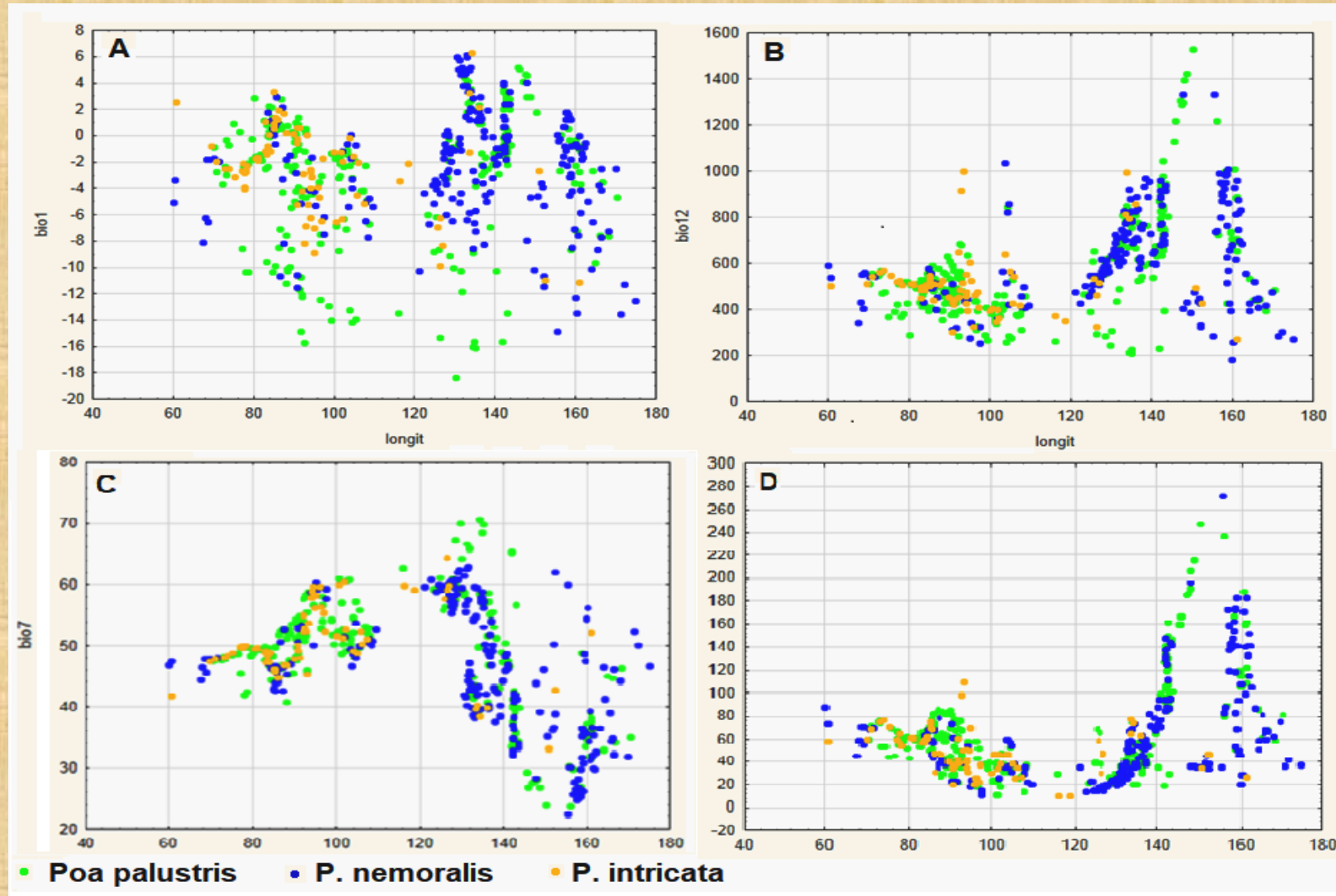






■ *Poa palustris*  
 ■ *Poa nemoralis*  
 ■ *Poa intricata*

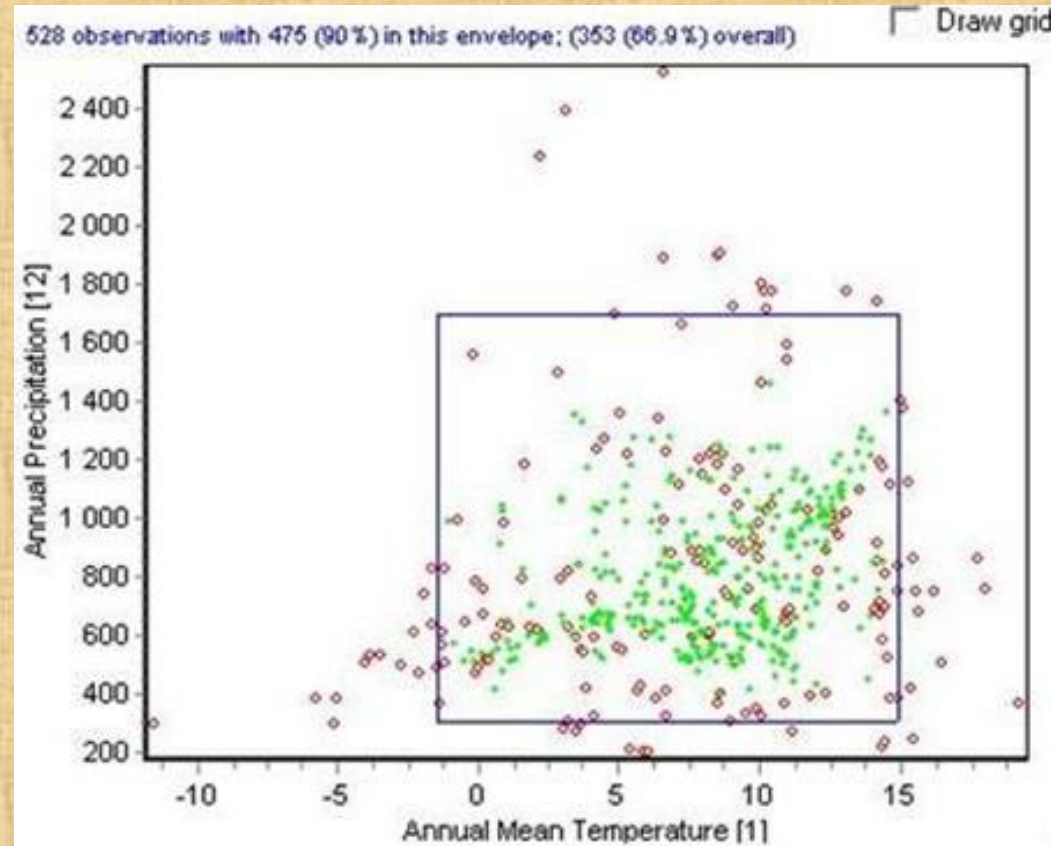
# To reveal the dependence of distribution of 3 different relative species on longitude



- A Annual mean temperature
- B Annual precipitation
- C Temperature annual range
- D Precipitation of wet-test period

... To obtain bioclimatic “envelope” for 2 climatic variable

Bio12



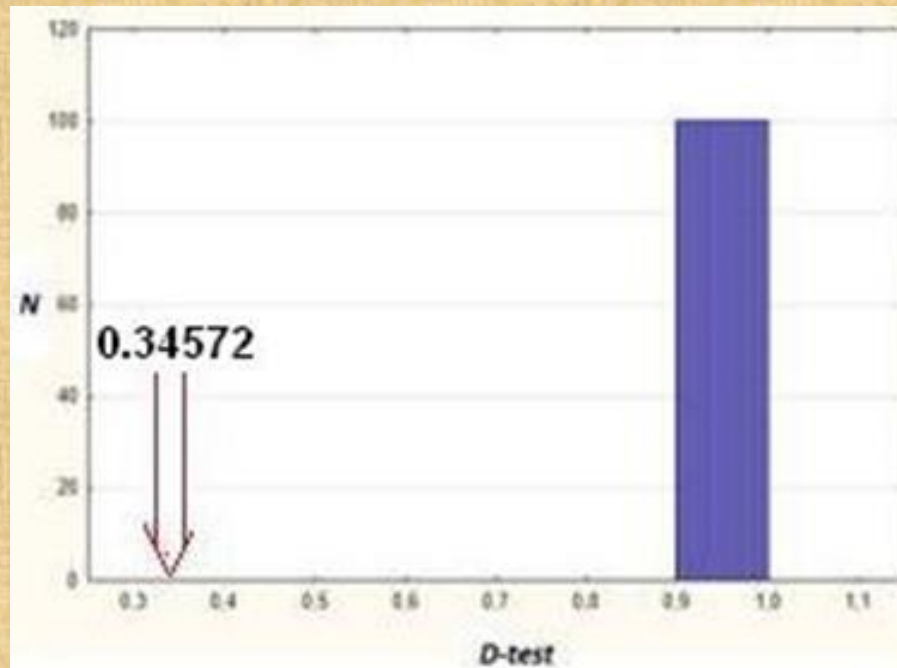
Bio1



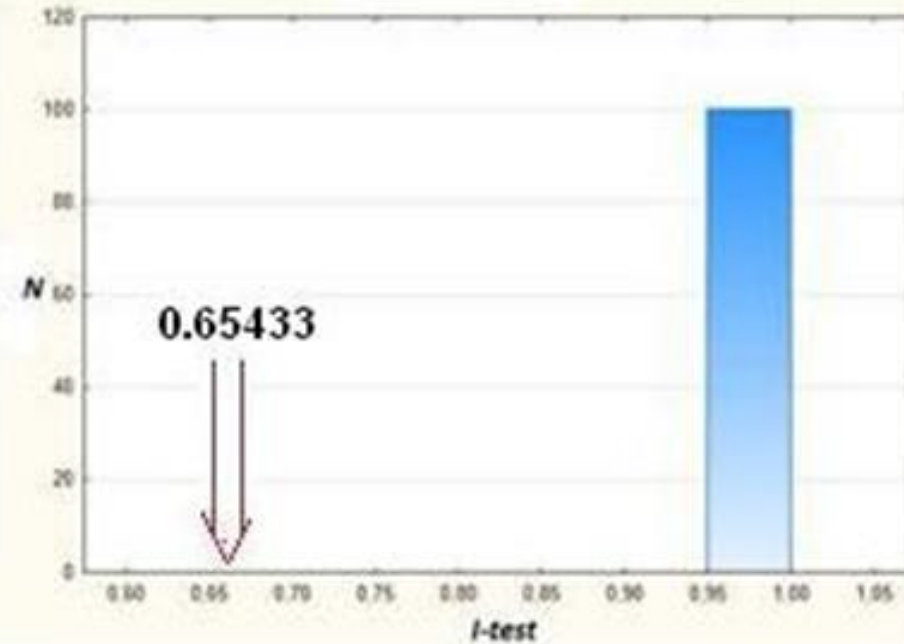
**MaxEnt, using the special additional soft,  
allows to measure and to compare  
obtained niches**

**Warren et al., 2008,  
ENVIRONMENTAL NICHE EQUIVALENCY VERSUS  
CONSERVATISM: QUANTITATIVE APPROACHES TO NICHE  
EVOLUTION. Evolution 62-11: 2868–2883**

# I-test – identity of ecologo-climatic niches of two relative species in Asian Russia (for overlapping ranges) via ENMtools (Warren et al., 2008, 2010)



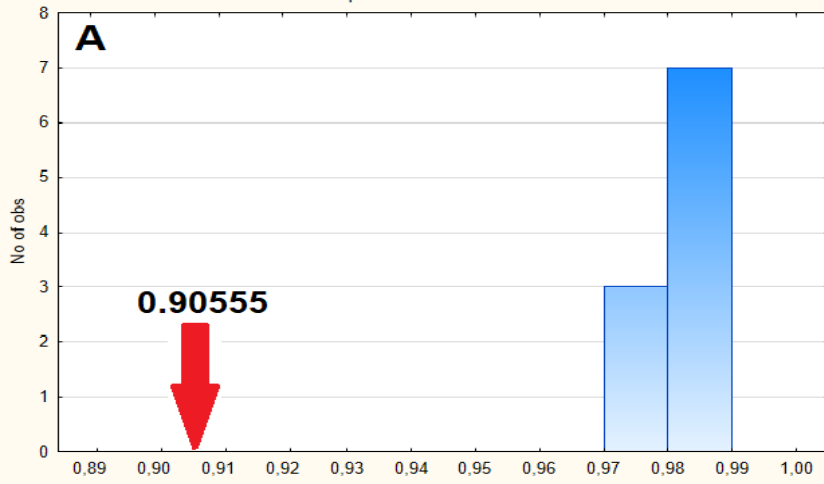
the standardized  
Hellinger distance



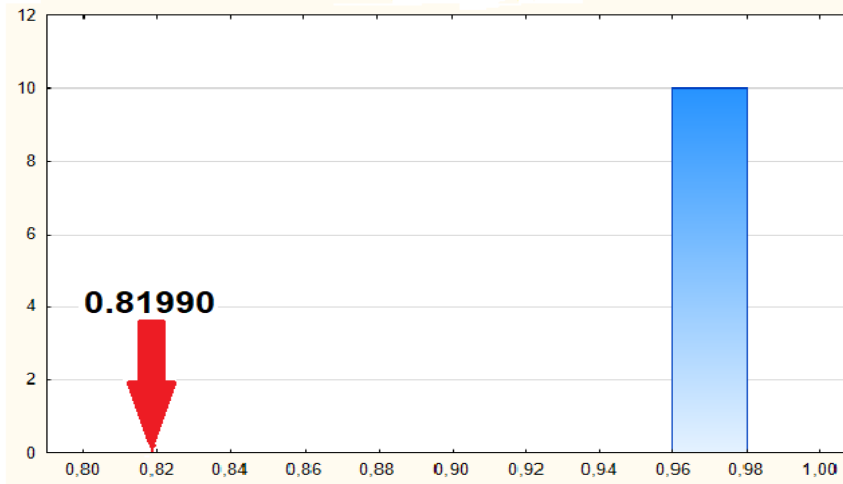
the Schöner index

# Identity of ecologo-climatic niches of 3 relative species in Asian Russia

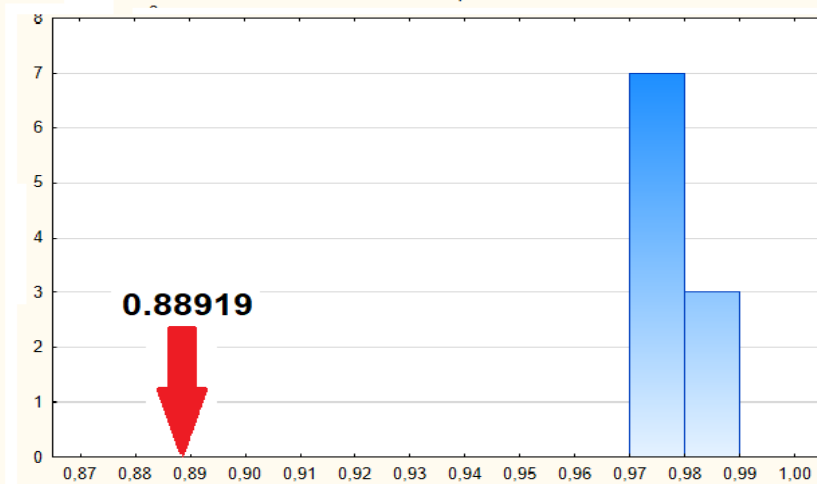
I-test



*Poa palustris* - *Poa nemoralis*

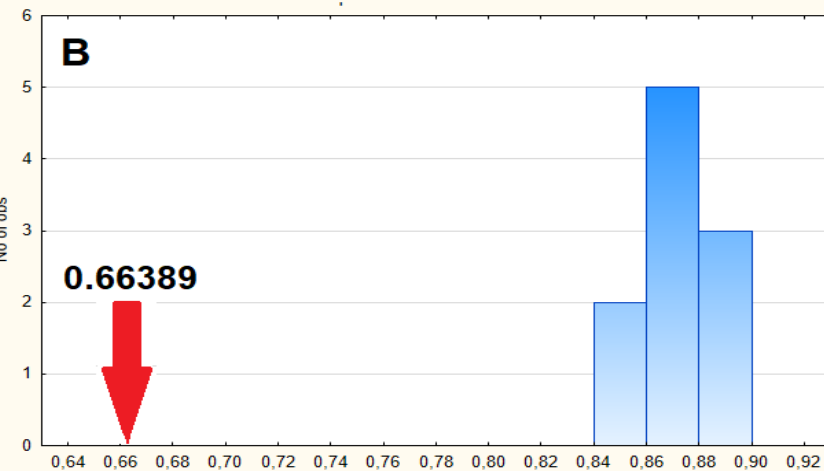


*Poa palustris* - *Poa intricata*

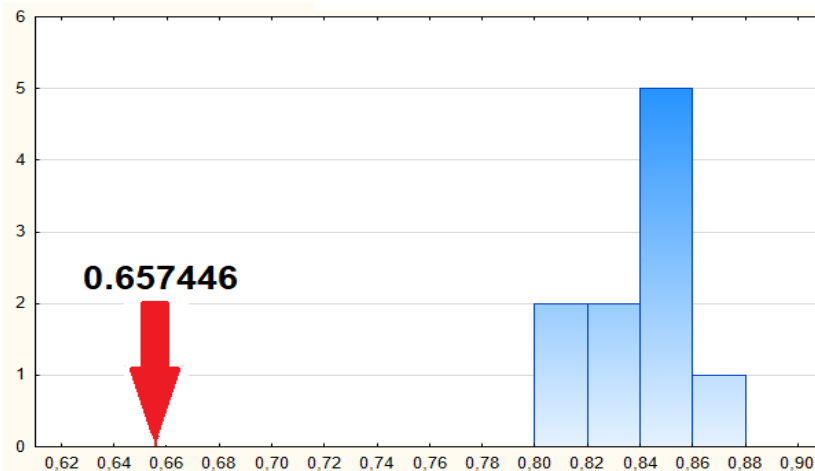


*Poa nemoralis* - *Poa intricata*

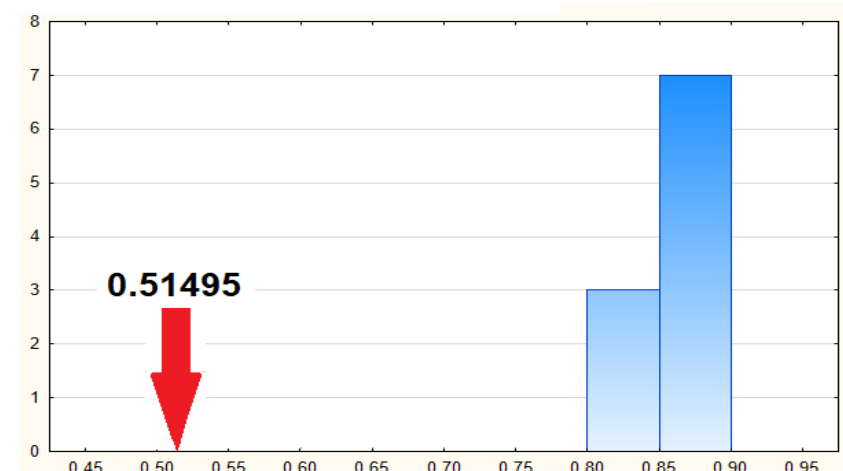
D-test



*Poa palustris* - *Poa nemoralis*



*Poa palustris* - *Poa intricata*



*Poa nemoralis* - *Poa intricata*



**Background test provides another opportunity to confirm the niches divergence on genetic level**

**Can be used for non-overlapping ranges**

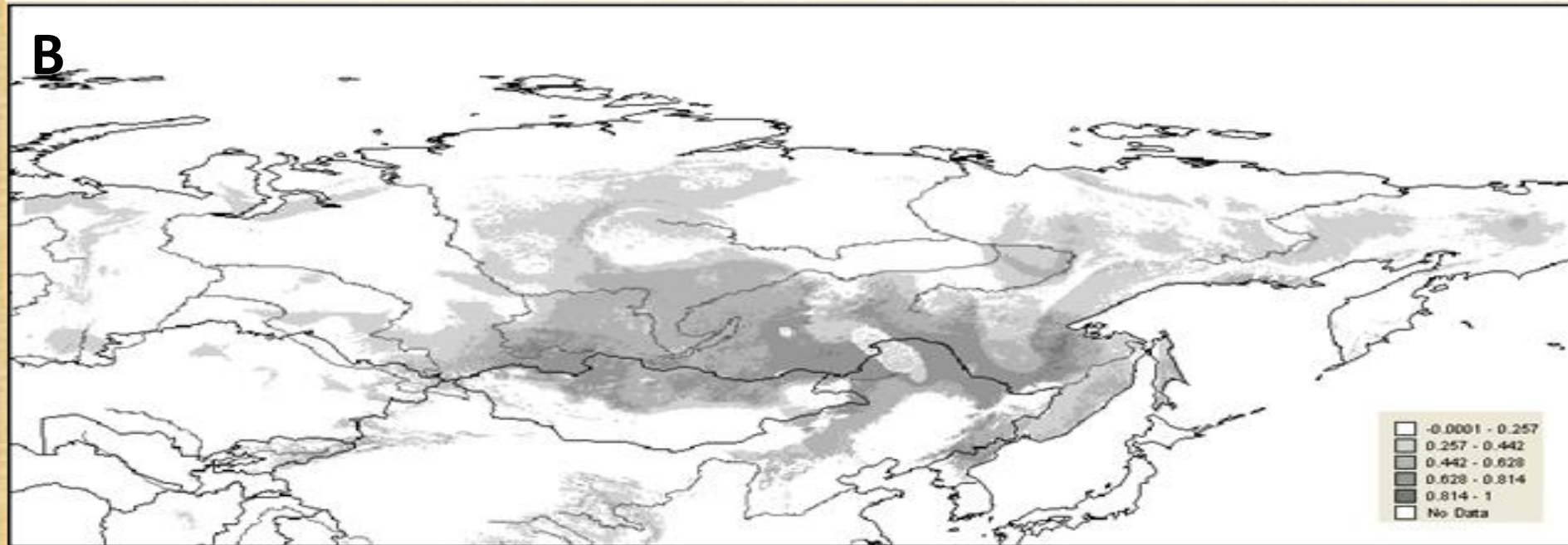
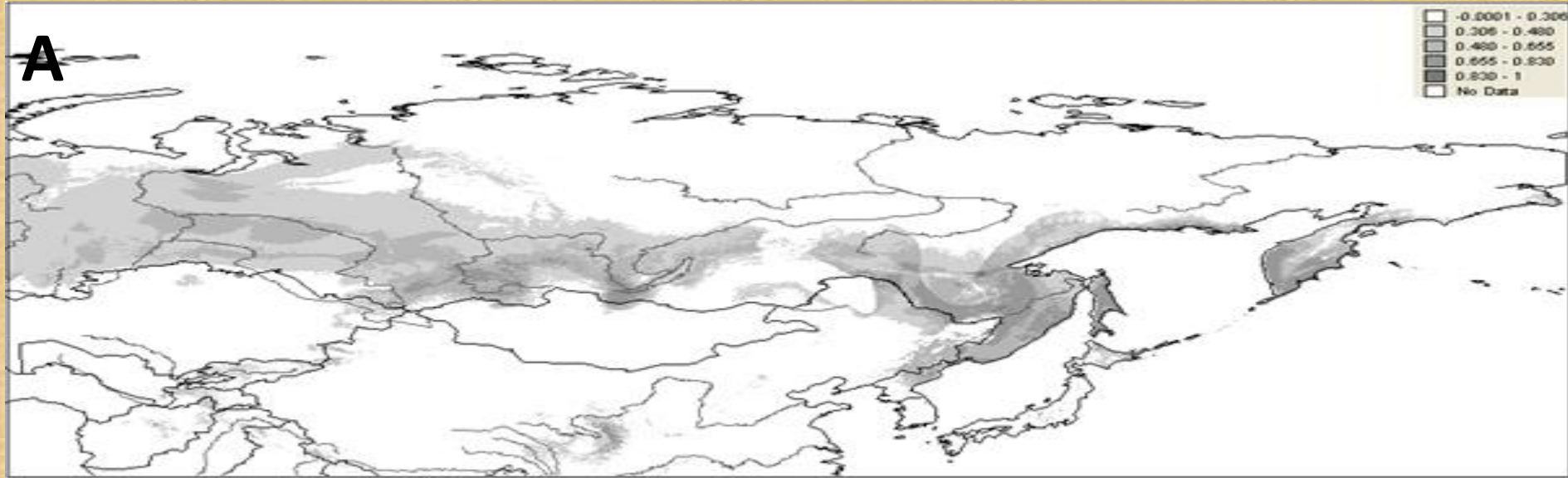
# Species distribution modelling (MaxEnt)

# **Preparing data to minimize the omissions using SDMtools (Brown et al, 2014)**

- 1. Delete the correlated bioclimatic data**
- 2. Rarefy occurrence data, taking into account**
  - a. latitudinal background**
  - b. climate and sampling heterogeneity**



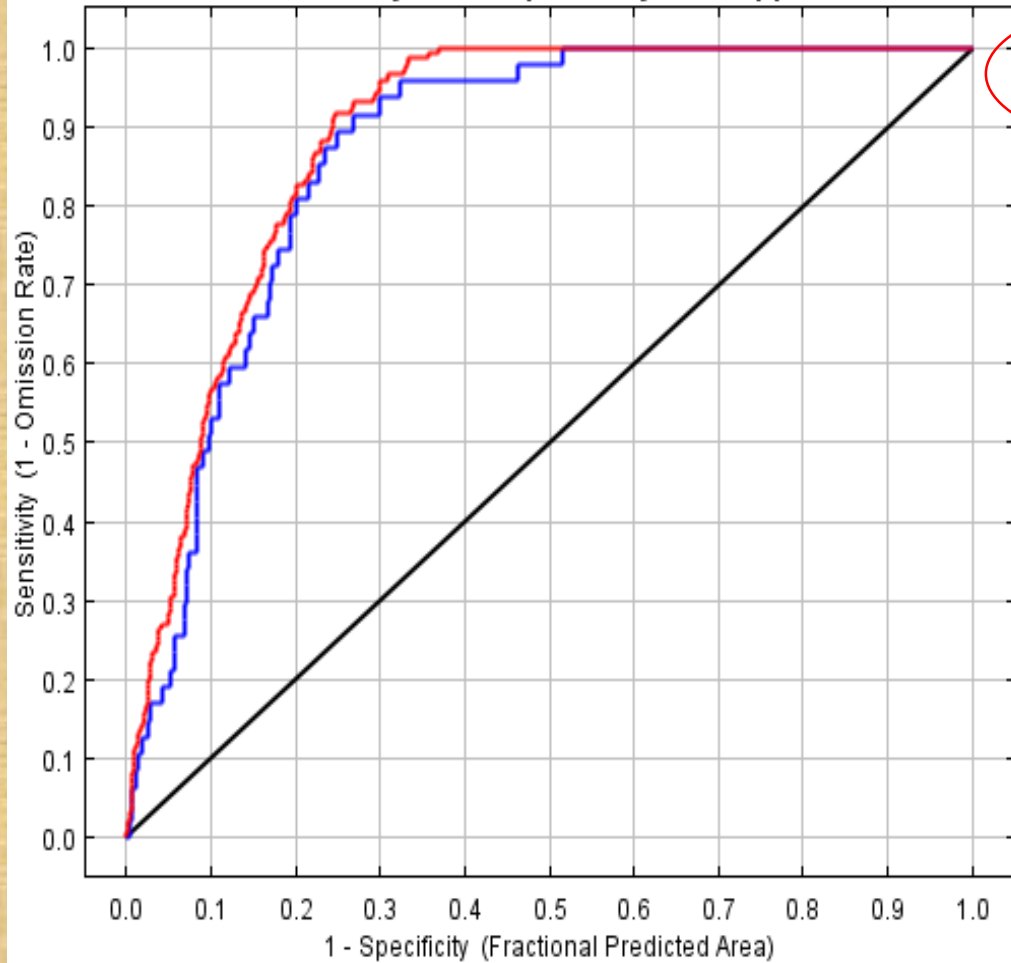
# The models of distribution 2 relative species in Asian Russia (10 percentile threshold)



A – mesomorphic species

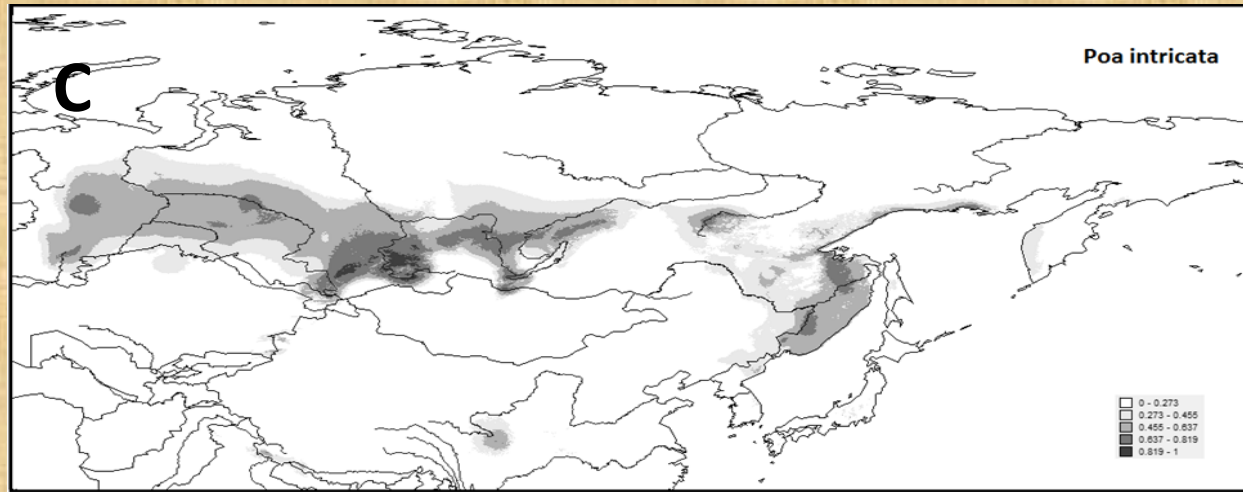
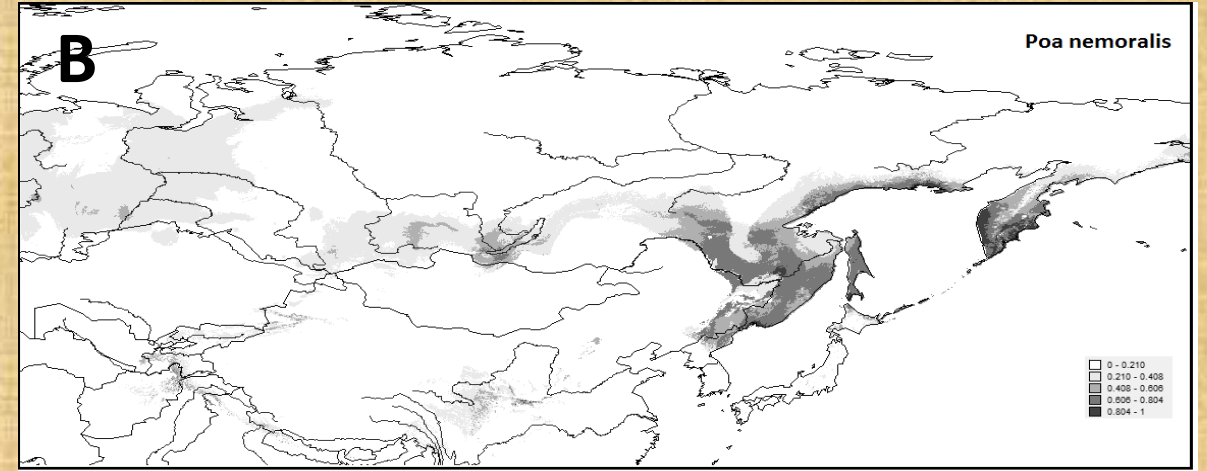
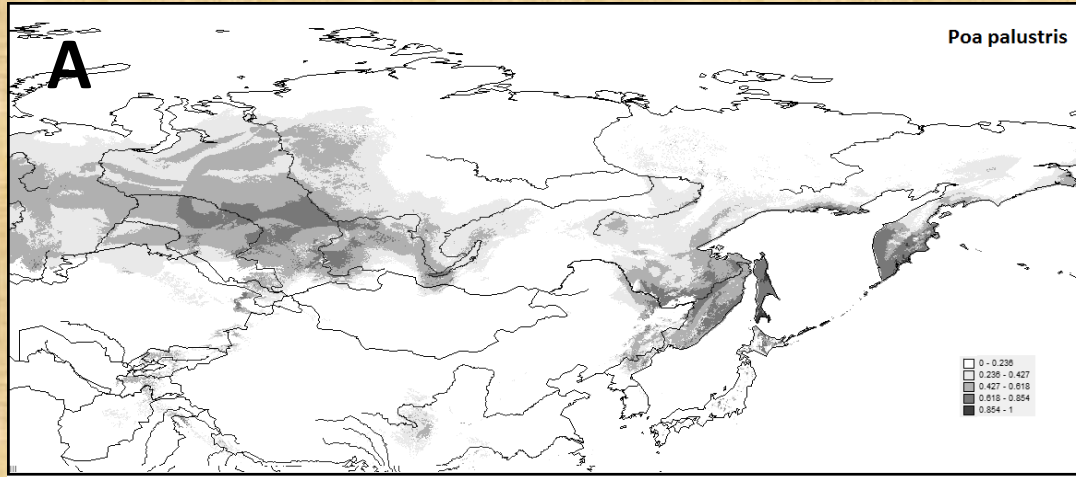
B - xeromorphic species

Sensitivity vs. 1 - Specificity for stepposa



**The MaxEnt algorithm allows not only to obtain a species distribution model, but also to evaluate it, using the AUC, showing the quality of prediction**

# The models of potential distribution of 3 relative species in Asian Russia, obtained using MaxEnt, based on Bio1, Bio2, Bio5, Bio7, Bio8, Bio12, Bio15 for current climate



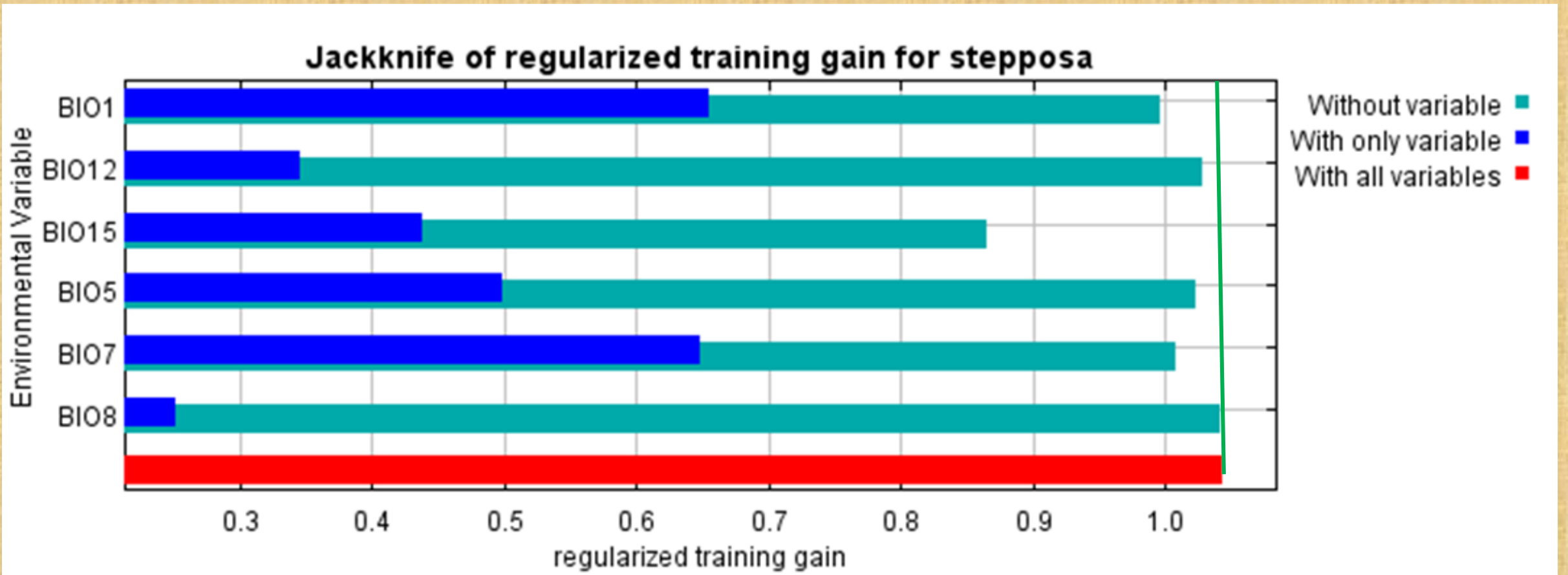
Correlated variables were deleted using SDMtools



The impact of variables can be evaluated in three independent ways:

- a direct contribution (in percent)
- b revaluation after permutation
- c with jackknife test

# jackknife algorithm



	1 speies = 290		2 species n = 229		3 species n = 97	
n tr/n tst	218/72		172/57		73/24	
AUCtr/AUCtst	0.887/0.871		0.920/0.902		0.922/0.884	
Standard deviation	0.016		0.020		0.036	
Logistic threshold	0.236		0.210		0.273	
Evaluation	% contribution	Permutation	% contribution	Permutation	% contribution	Permutation
	Bio12=32.6	Bio12=25.3	Bio12=42.7	Bio1=29.7	Bio12=36.8	Bio1=25.5
	Bio5=22.9	Bio1=23.6	Bio1=15.1	Bio2=24.1	Bio1=29.7	Bio15=22.2
	Bio1=20.5	Bio15=18.5	Bio5=13.5	Bio15=23.9	Bio15=22.1	Bio8=20.1
	Bio15=11.1	Bio5=14.6	Bio2=13.3	Bio5=7.3	Bio8=5.3	Bio12=17.7
AUCtr- AUC of training sampling; AUCtst – AUC of testing sampling						



# Modelling for past and future

**MaxEnt**

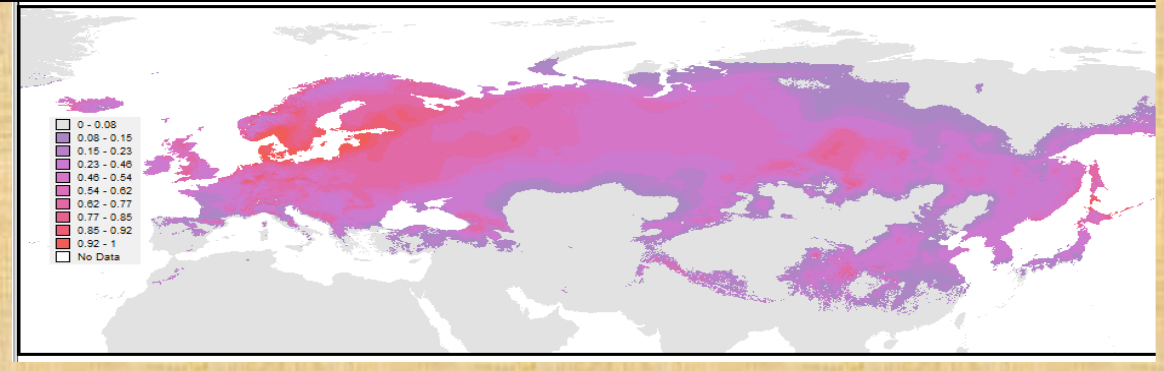
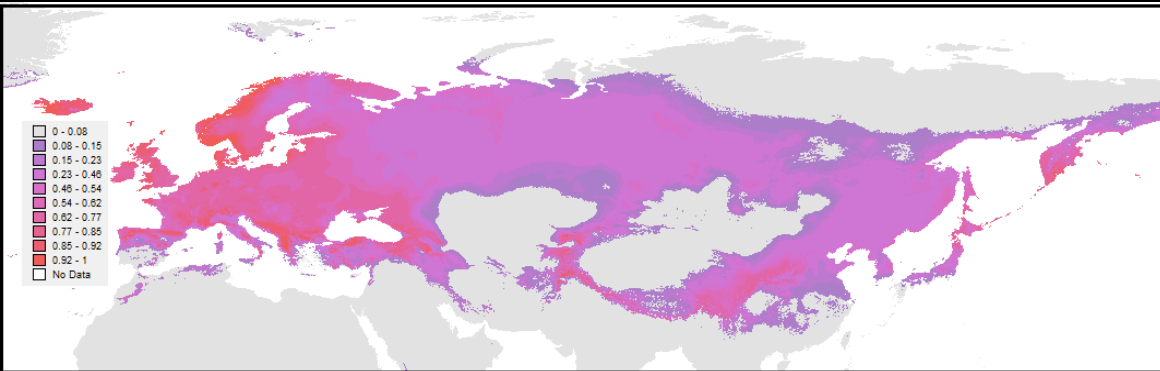
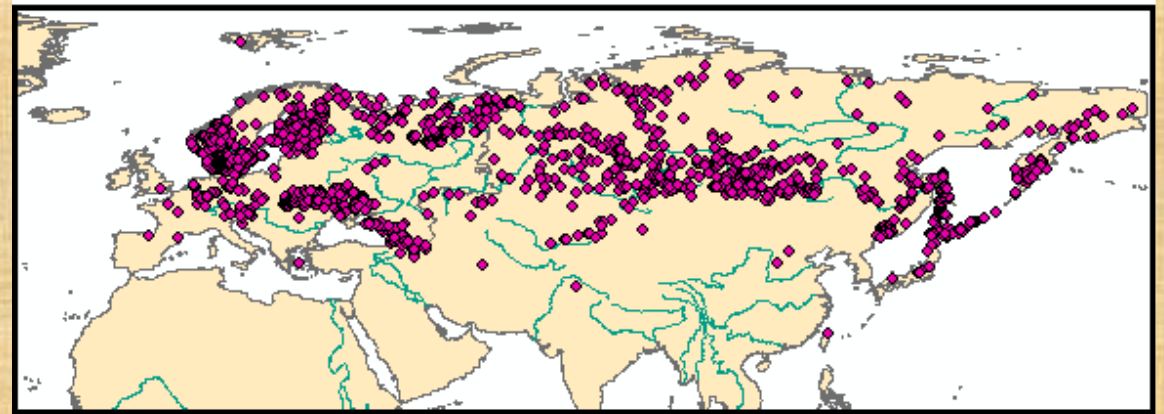
**GBIF**

# Modern distribution

*P. nemoralis*



*P. palustris*

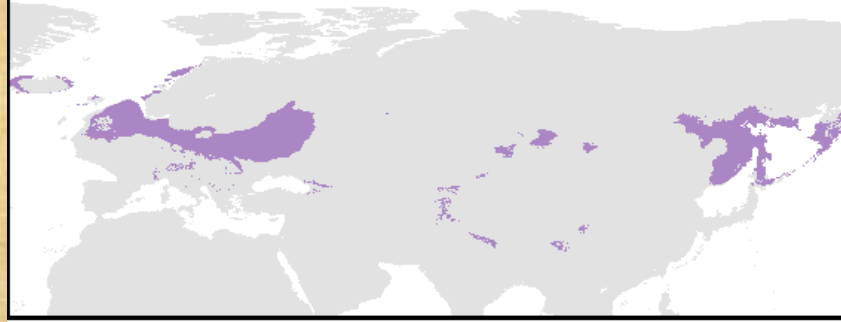
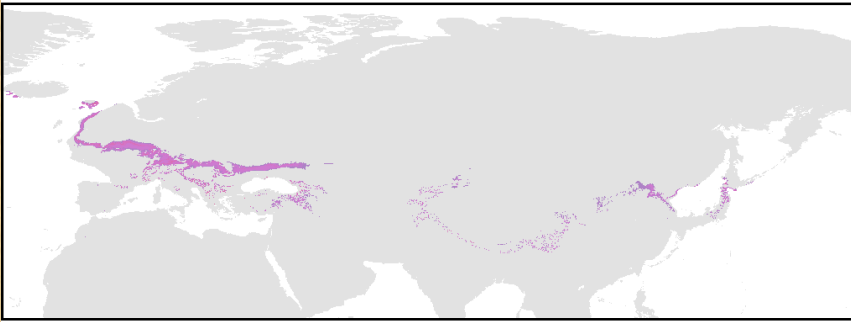


# LGM

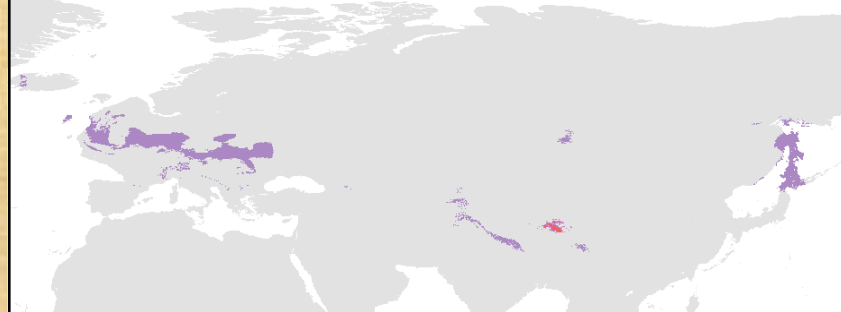
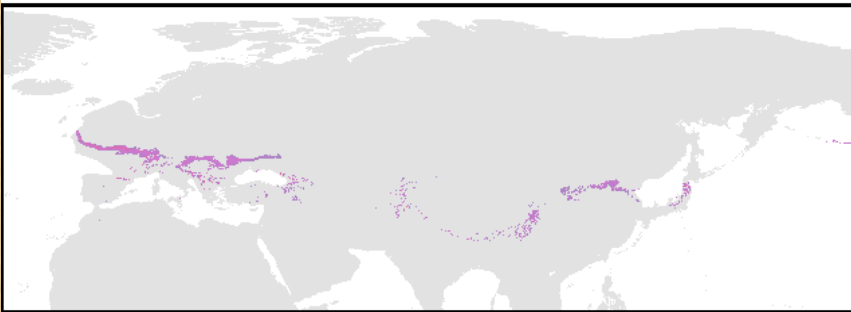
*P. nemoralis*

*P. palustris*

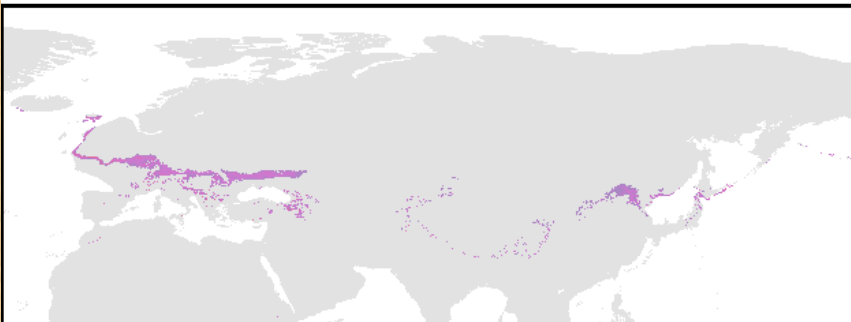
CCSM4



MIROC-ESM



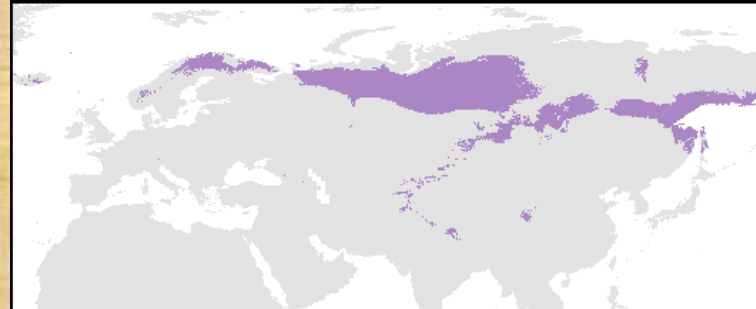
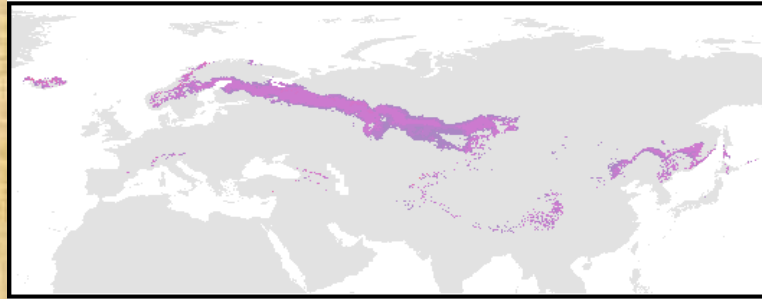
MPI-ESM



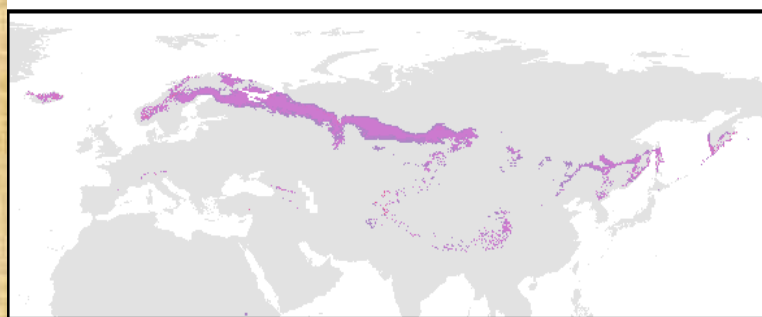


# Middle Holocene

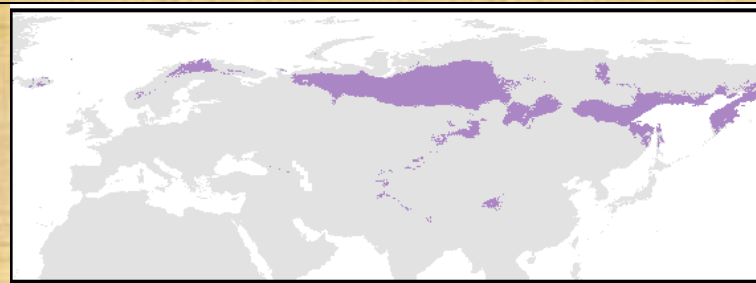
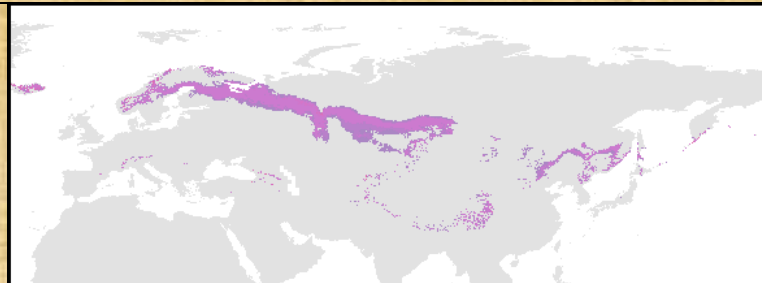
CCSM4



MIROC-ESM



MPI-ESM



# Models of distribution of *Poa nemoralis* and *P. palustris* for 2080

SCIRO scenario of emission– A2a 2080



The models of potential species distribution, constructed on the basis of ecologo-climatical niches can be used not only for paleogeographical reconstructions, but also are of a great practical value.

They allow

- A** To predict the expansion of invasive species
- B** To reveal the possibility of the useful species introduction
- C** To predict probable dynamics of ranges in accordance with various scenarios of climate change in the future
- D** To reveal the possible locations of rare species.



# Thank you for your attention

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Tomsk State University.**