



Basic evaluation and comparison of circulation classifications from the COST733 database

Christoph Beck
Institute for Geography
University of Augsburg

christoph.beck@geo.uni-augsburg.de



Framework

Objectives

Data
&
Methods

Results

Conclusions



Framework

COST733 Action

„Harmonisation and applications
of weather type classifications for European Regions“

Objectives

Working Group 1
Existing methods and applications

Data & Methods

Working Group 2
Implementation and development of
weather types classification methods

Results

Working Group 3
**Comparison of selected weather type
Classifications**

Conclusions

Working Group 4
Testing methods for various applications



Framework

COST733 Action

„Harmonisation and applications
of weather type classifications for European Regions“

Objectives

Working Group 3

**Comparison of selected weather type
Classifications**

Data & Methods

→ **Basic evaluation and comparison
of circulation type classifications**

Results

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(According to the Memorandum of Understanding):

- find or devise intercomparison tools
(for circulation type classifications)
- **statistical evaluation/comparison of classifications**
(provided by WG2)
- presentation and release of results
(to other WGs and scientific community)
- recommend specifications for a new (common) method
(to WG2 together with WG4)



Basic evaluation/comparison of classifications

- estimate the **performance** of circulation type classifications in terms of their „**discriminative power**“
 - for varying climatic **target variables** (MSLP, Temp, Prec)
 - determine the relevance of the underlying basic **methodological concepts**
 - analyse the effect of varying classification “**settings**”



Basic evaluation/comparison of classifications

- estimate the **performance** of circulation type classifications in terms of their „**discriminative power**“
 - for varying climatic **target variables** (MSLP, Temp, Prec)
 - determine the relevance of the underlying basic **methodological concepts**
 - analyse the effect of varying classification “**settings**”
- **are there superior individual methods?**
- **are there superior methodological concepts?**
- **are there superior classification settings?**



Framework

1) Circulation type classifications from the cost733cat 2.0 data base

Objectives

~ **5000 classifications** (provided by WG2)

**Data
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Data & Methods

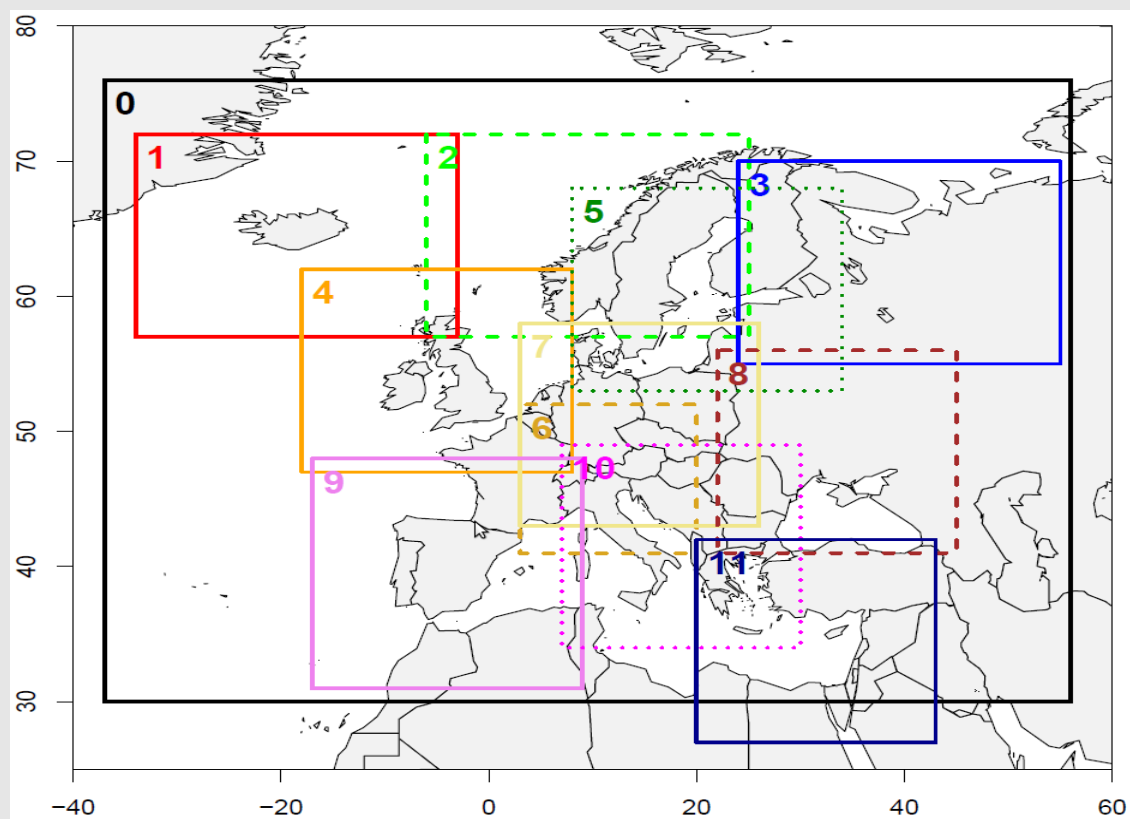
Results

Conclusions

1) Circulation type classifications from the cost733cat 2.0 data base

~ 5000 classifications (provided by WG2)

- for 12 spatial domains





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1) Circulation type classifications from the cost733cat 2.0 data base

- ~ **5000 classifications** (provided by WG2)
- **for 12 spatial domains**
- **using ERA40 data**
- **for fixed numbers of types (9, 18, 27)**
- **using MSLP**
- **for single days**
- **on an annual basis**



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1) Circulation type classifications from the cost733cat 2.0 data base

- ~ 5000 classifications (provided by WG2)
- ~ 20 methods, from 5 basic method groups

Method Group	Specific Method					
SUB jective	Hess-Brezowsky	Peczely	Perret	Schueepp	ZAMG	
THR eshold	GWT	JCT/LWT	LIT	WLK		
PCA	KRZ	PCT	PTT	PXE		
LeaDeR	ERP	KIR	LND	PTS		
OPT imization	CAP	CKM	NNW	PXK	SAN	SOM



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1) Circulation type classifications from the cost733cat 2.0 data base

~ 5000 classifications (provided by WG2)

- for 12 spatial domains
- using ERA40 data
- for fixed numbers of types (9, 18, 27)
- using MSLP / **using additional variables**
- for single days / **for 4-day sequences**
- on an annual basis / **on a seasonal basis**



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1) Circulation type classifications from the cost733cat 2.0 data base

~ 5000 classifications (provided by WG2)

enable the comparison of:

- **Methods**
 - is LUND better than KIRCHHOFER ?
- **Method Groups**
 - is OPT better than PCA ?
- **Settings**
 - is MSLP + GPH 500 better than MSLP alone ?



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2) Climatic target variable data from ERA40

(Uppala et al., 2005)

- daily mean SLP (**MSLP**)
- daily mean 2-metre Temperature (**2mT**)
- daily precipitation sum (**PREC**)
- for the period 1957 - 2002



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3) Evaluation criteria

- Explained Variation $EV = 1 - \frac{WSS}{TSS}$

- Pseudo-F statistic $PF = 1 - \frac{BSS/(k-1)}{WSS/(n-k)}$

- Within-type Standard Deviation $WSD = \sqrt{\frac{\sum_{k=1}^K (n_k - 1) \cdot SDI_k^2}{\sum_{k=1}^K (n_k - 1)}}$

- Pattern Correlation Ratio $PCR = \frac{PCI}{PCO}$

- (Fast)Silhouette Index $FSIL = \frac{1}{n} \sum_{i=1}^n \frac{fb_i - fa_i}{\max(fa_i, fb_i)}$

- Confidence Interval of the Mean $CIM = \frac{\sum_{k=1}^K z_{1-\alpha/2} \cdot \frac{SDI_k}{\sqrt{n_k}} \cdot n_k}{\sum_{k=1}^K n_k}$

SDI = standard deviation within class

PCI = mean pattern correlation within classes

PCO = mean pattern correlation between classes

fa_i = distance between case i and its own class centroid

fb_i = distance between case i and its nearest class centroid

TSS = total sum of squares

WSS = sum of squares within classes

BSS = sum of squares between classes

k = number of classes (types)

n = number of cases



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4) Determination of Evaluation indices

- for gridded SLP-, Temperature- and Precipitation data
 - for 12 different domains
 - for individual months, seasons and the whole year
 - for individual grid points / the whole gridded field
- ~ 4000 „performance index“ samples

Aggregation of evaluation indices for varying groupings
of classifications

(e.g. sequential classifications – non-sequential classifications)

→ relevance of basic methodological approach / settings
(e.g. effect of classifying 4-day sequences)



Framework

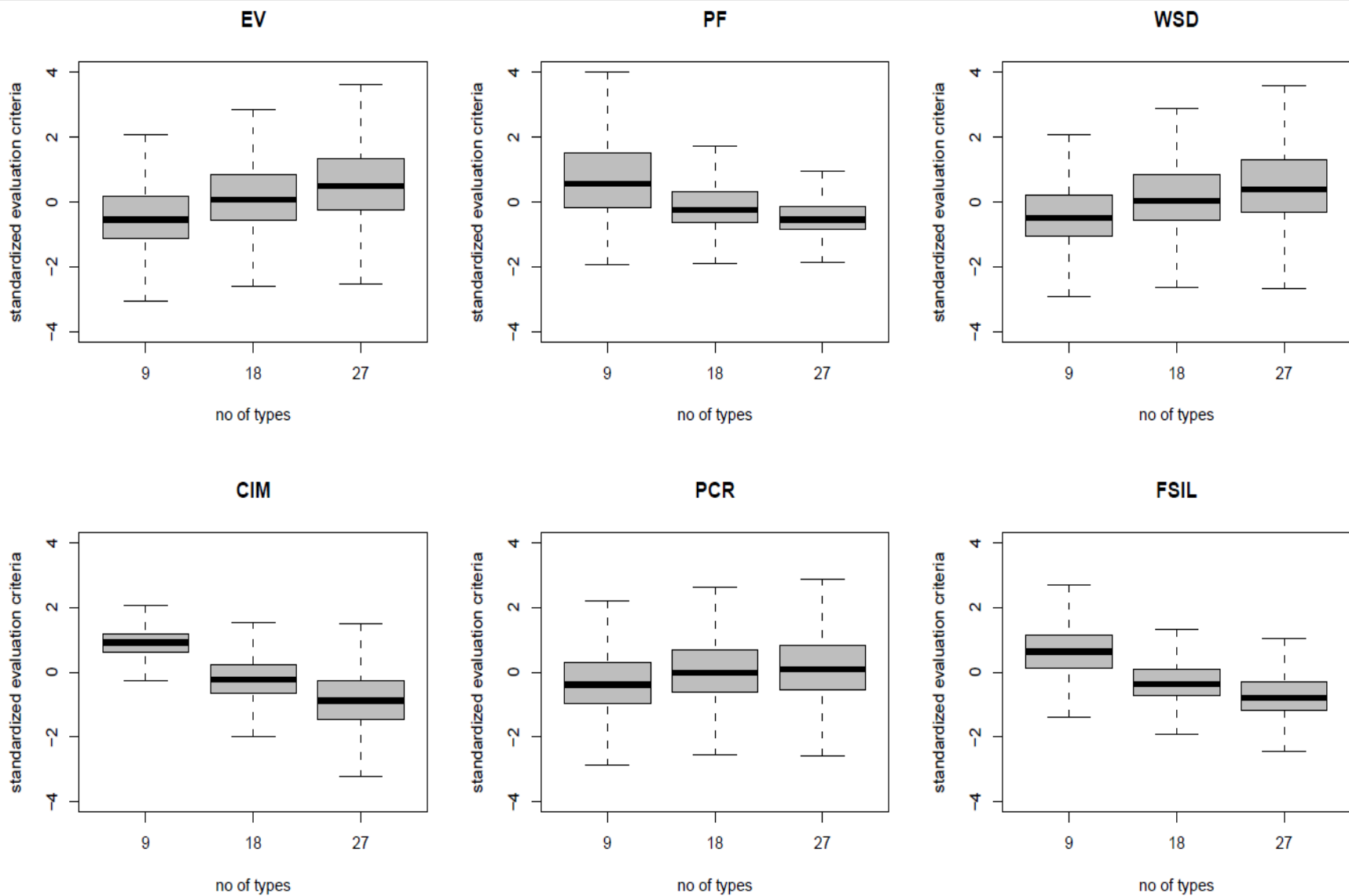
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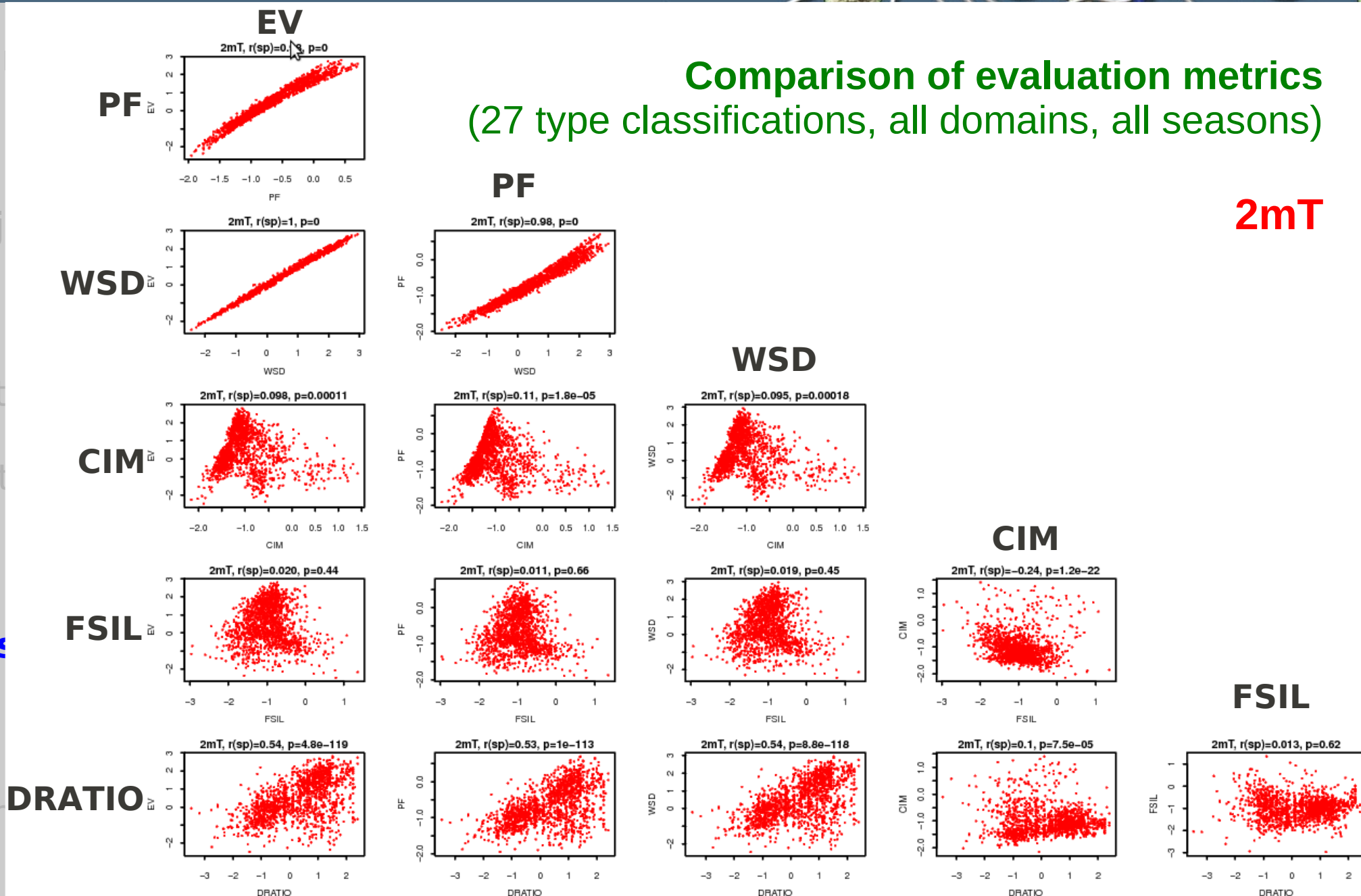
Relevance of the number of types





Comparison of evaluation metrics (27 type classifications, all domains, all seasons)

2mT

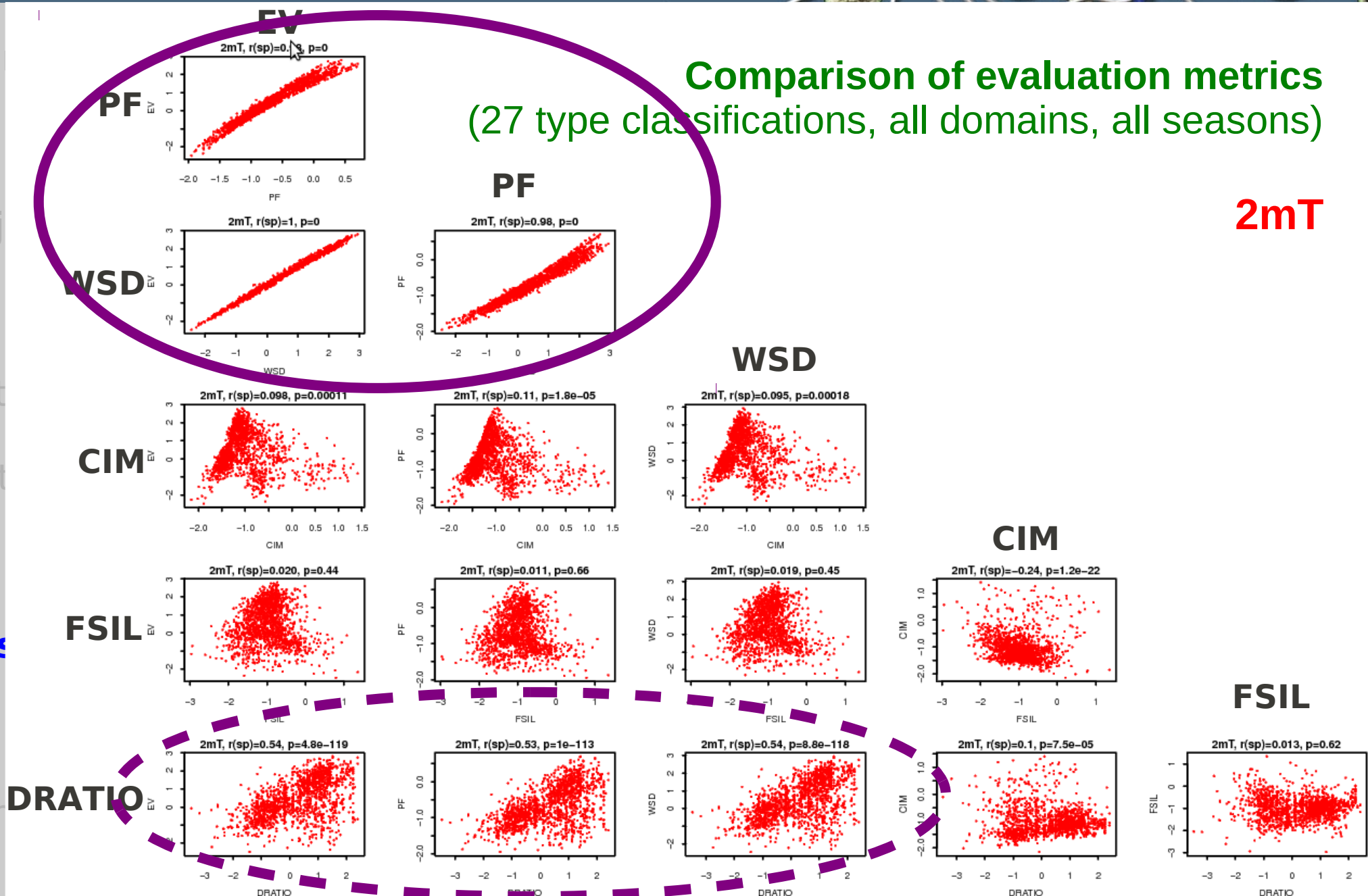


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Comparison of evaluation metrics (27 type classifications, all domains, all seasons)

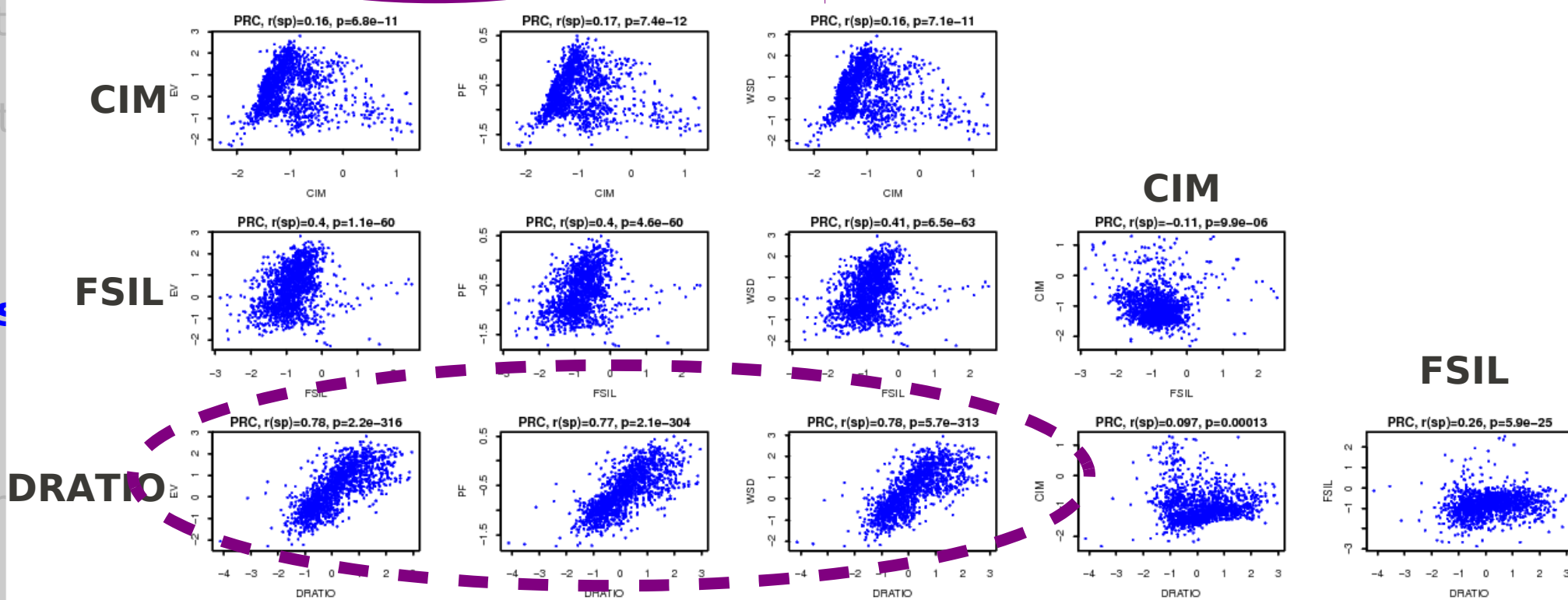
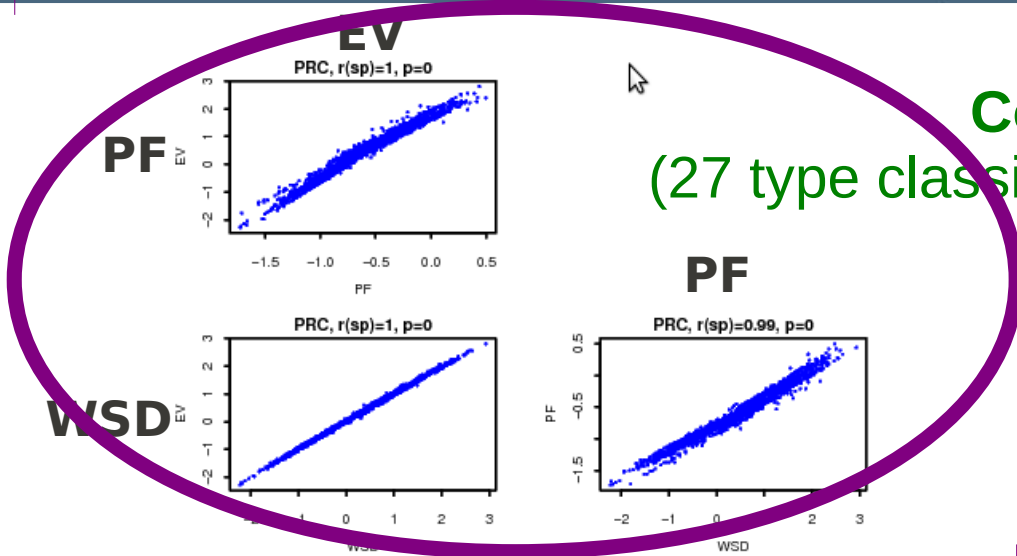
2mT





Comparison of evaluation metrics (27 type classifications, all domains, all seasons)

PREC

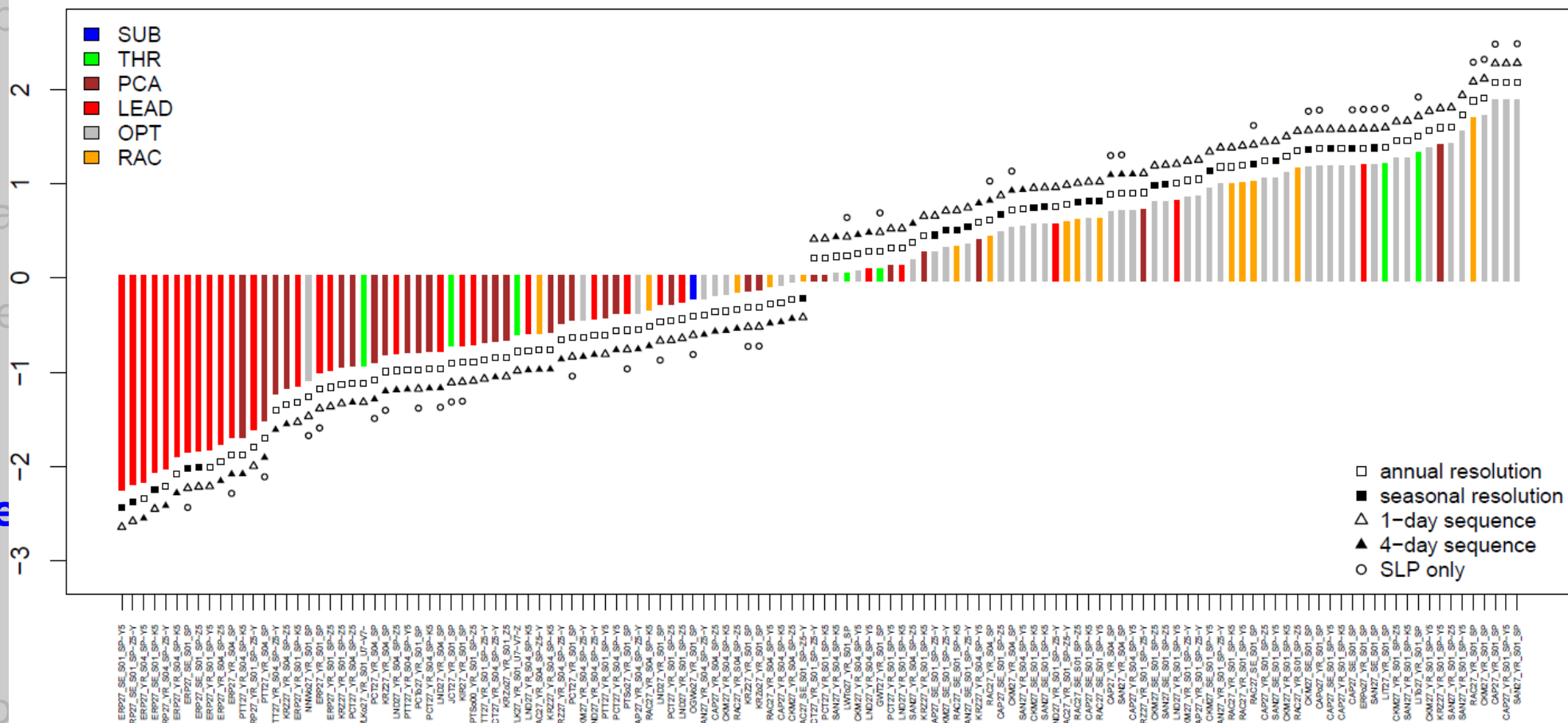




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Comparison / "ranking" of individual methods

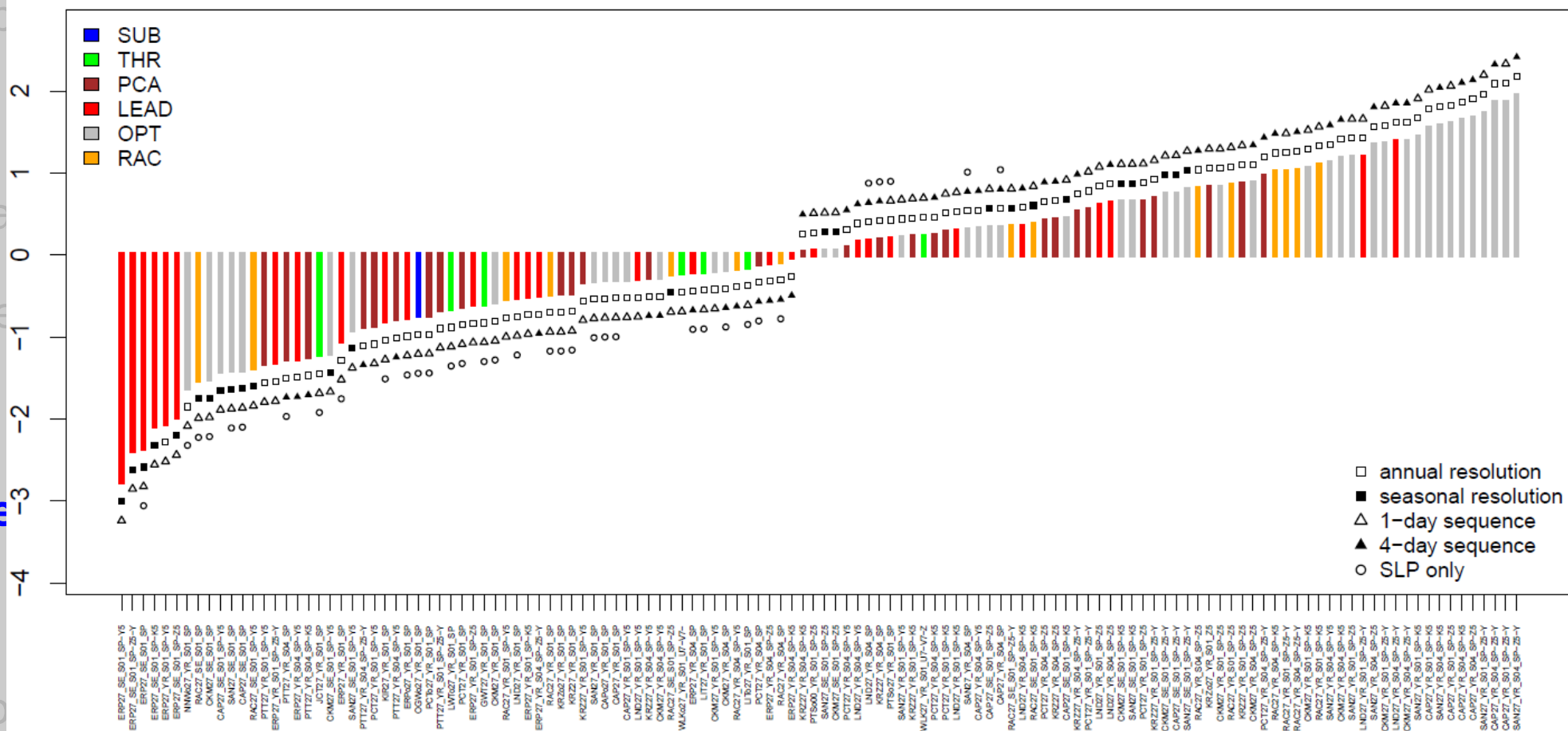
27 types, over all domains and all seasons, EV for MSLP





Comparison / “ranking” of individual methods

27 types, over all domains and all seasons, EV for 2mT

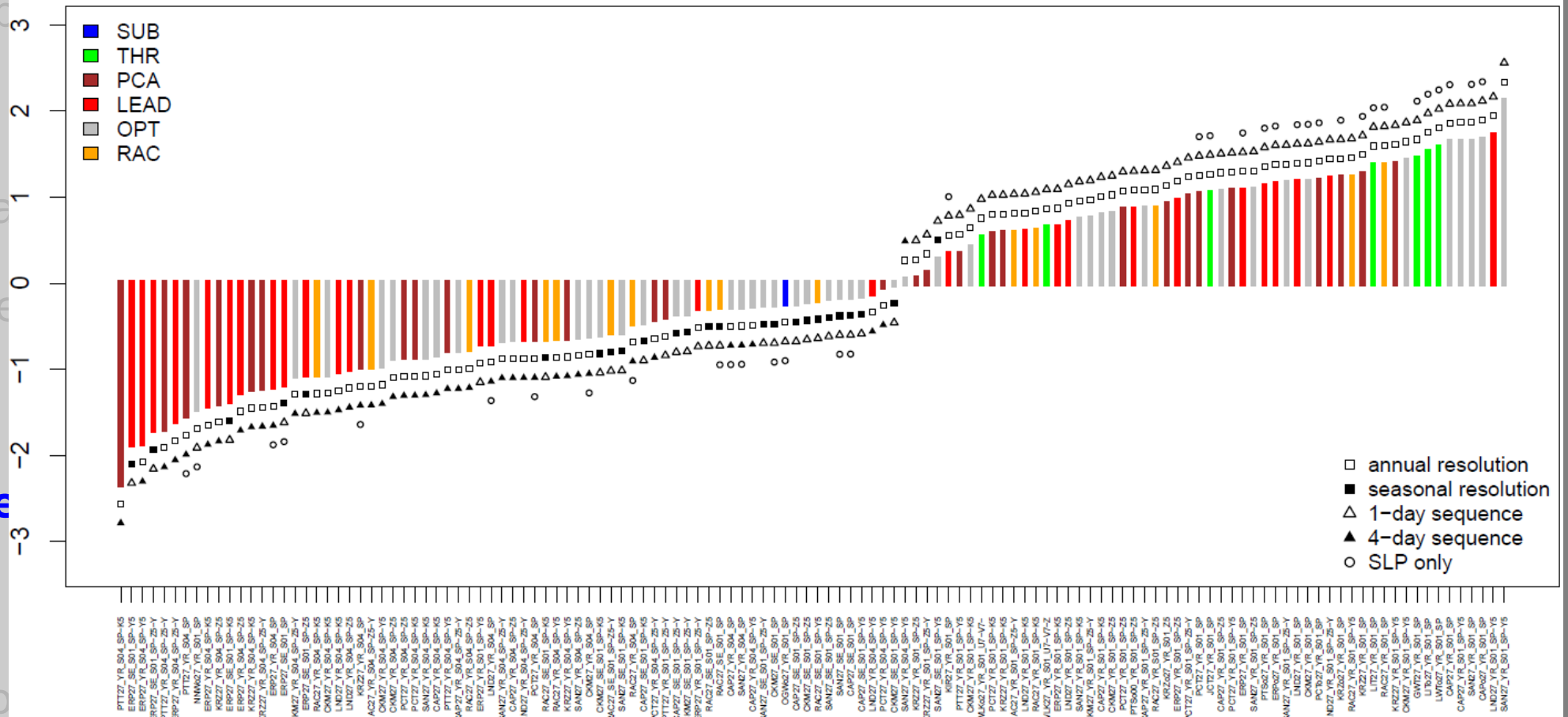




Framework

Comparison / "ranking" of individual methods

27 types, over all domains and all seasons, EV for **PREC**

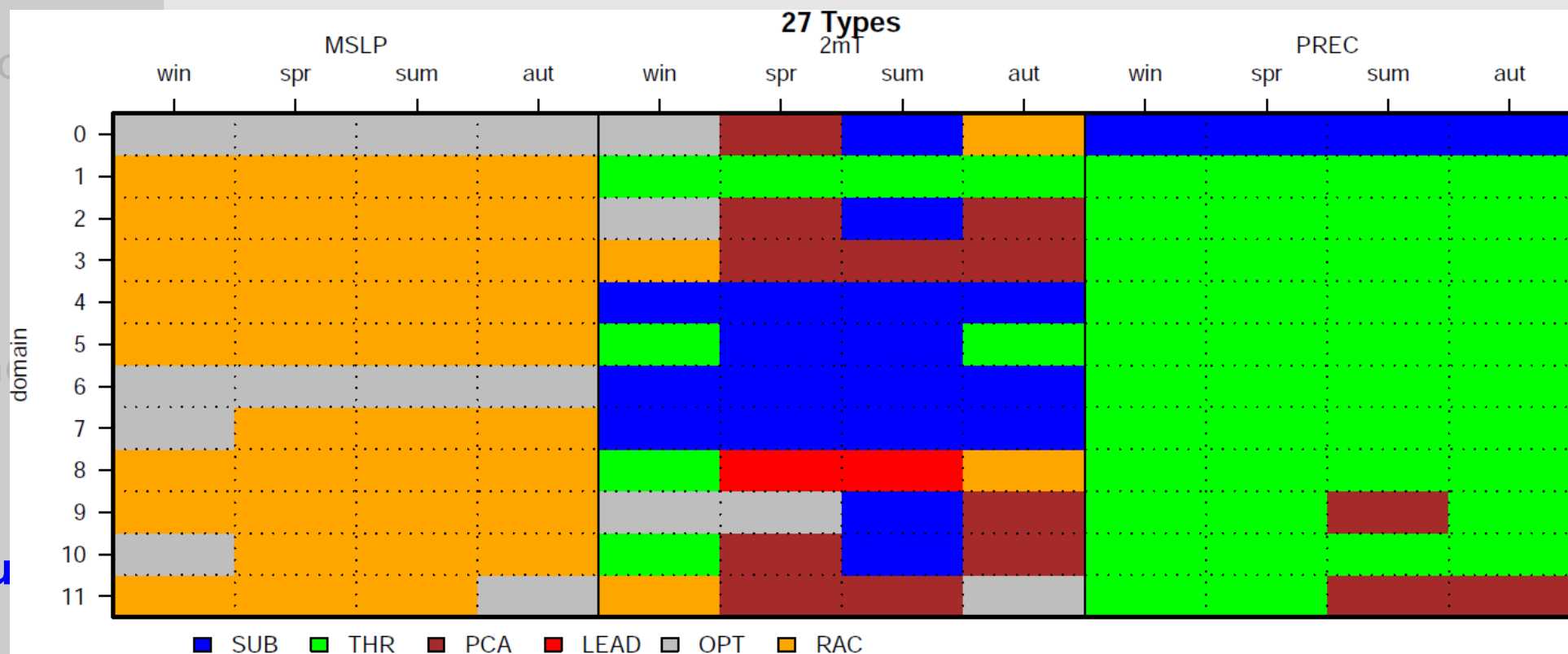




Framework

Relevance of the basic methodological approach

Method group with highest mean EV



Object

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SUB = Subjective methods
PCA = PCA based methods
OPT = Optimisation methods

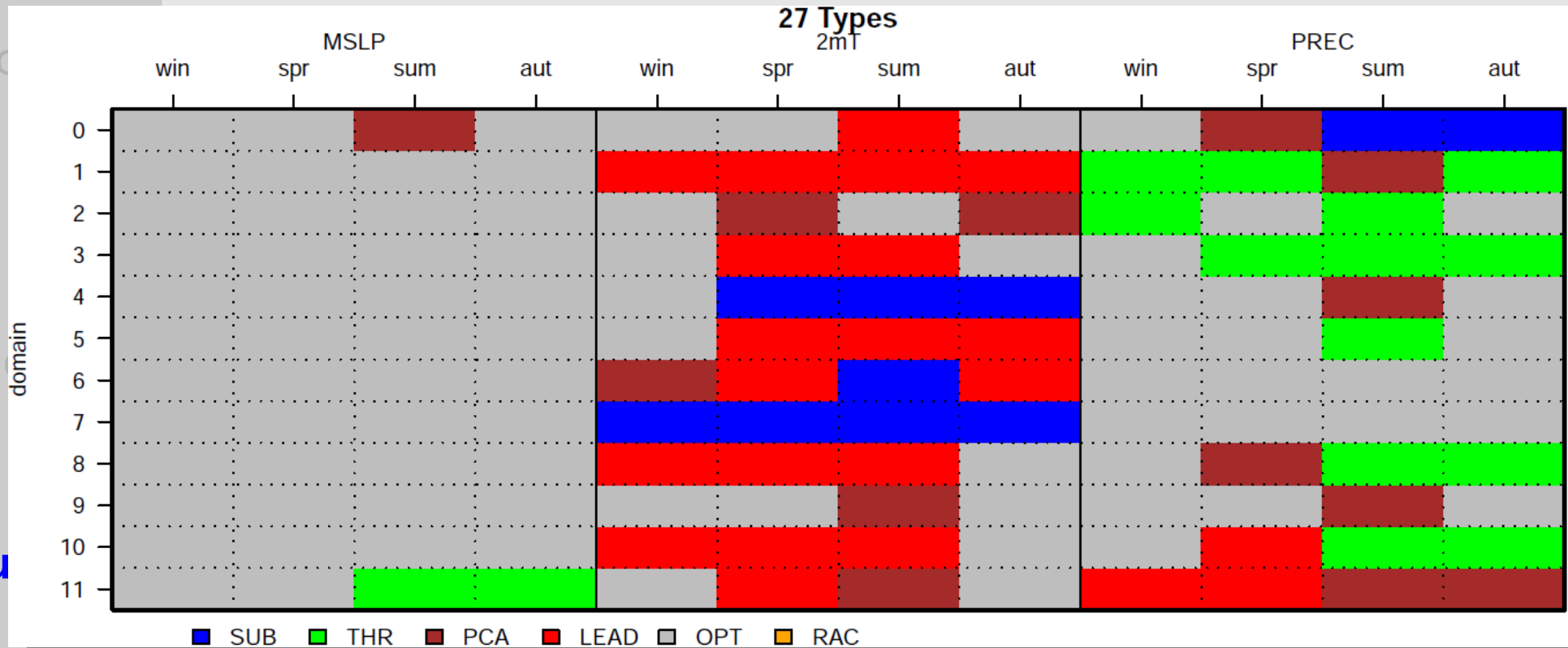
THR = Threshold based methods
LDR = Leader based methods
RAC = Random centroid methods



Framework

Relevance of the basic methodological approach

Method affiliation of best performing CTC



Object

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SUB = Subjective methods

PCA = PCA based methods

OPT = Optimisation methods

THR = Threshold based methods

LEAD = Leader based methods

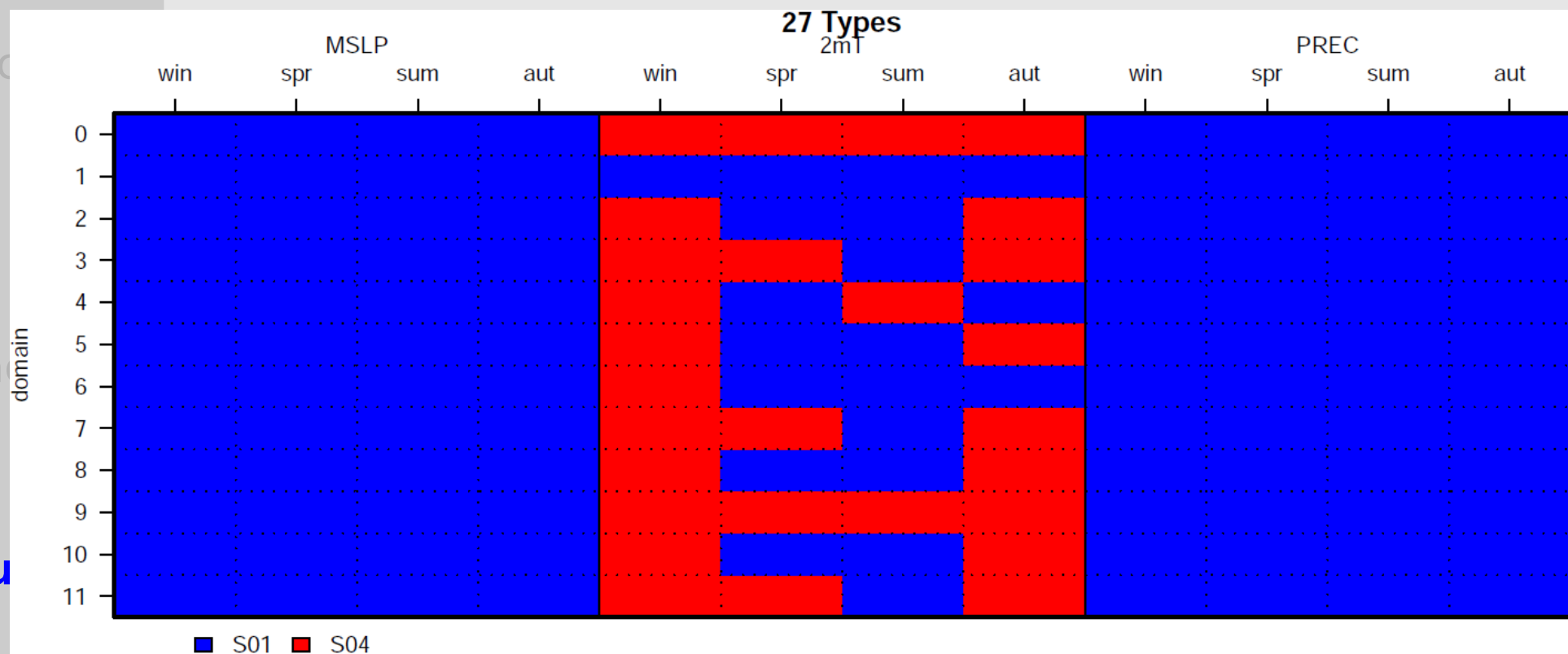
RAC = Random centroid methods



Framework

Relevance of sequence length

Sequence length of best performing CTC



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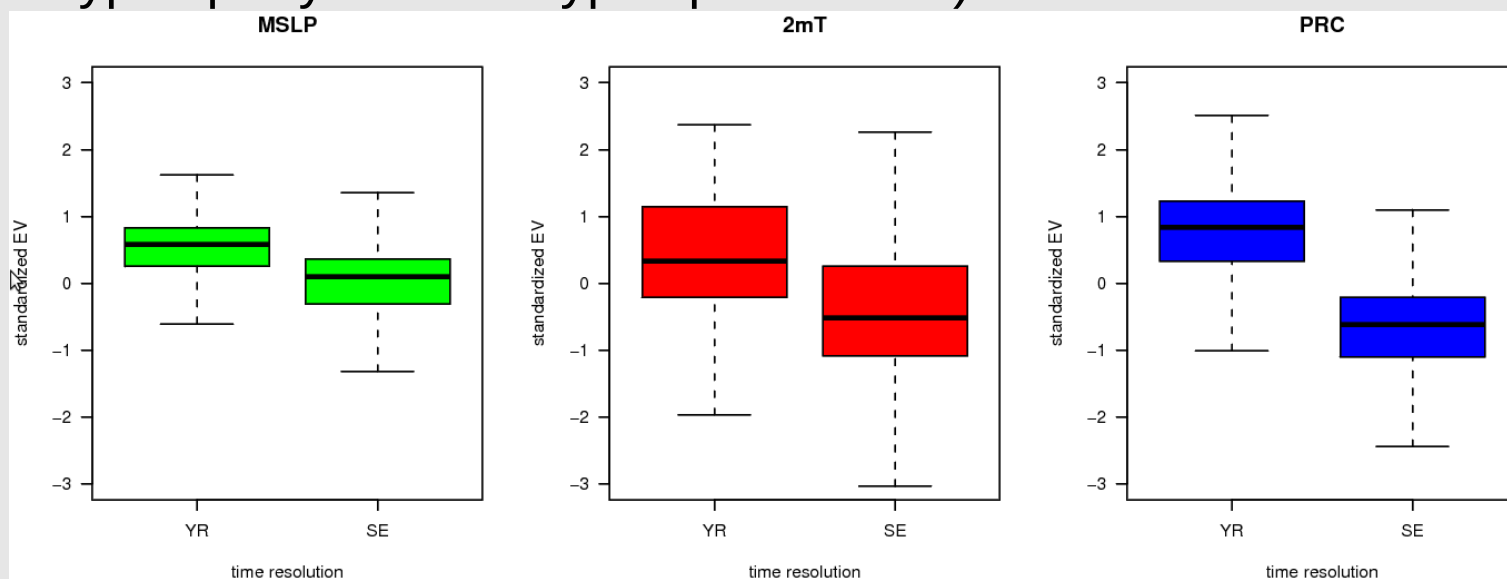
S01 = 1-day sequence

S04 = 4-day sequence



Relevance of seasonality

Mean EV over all CTCs performed on an annual or seasonal basis (27 types per year vs. 7 types per season)



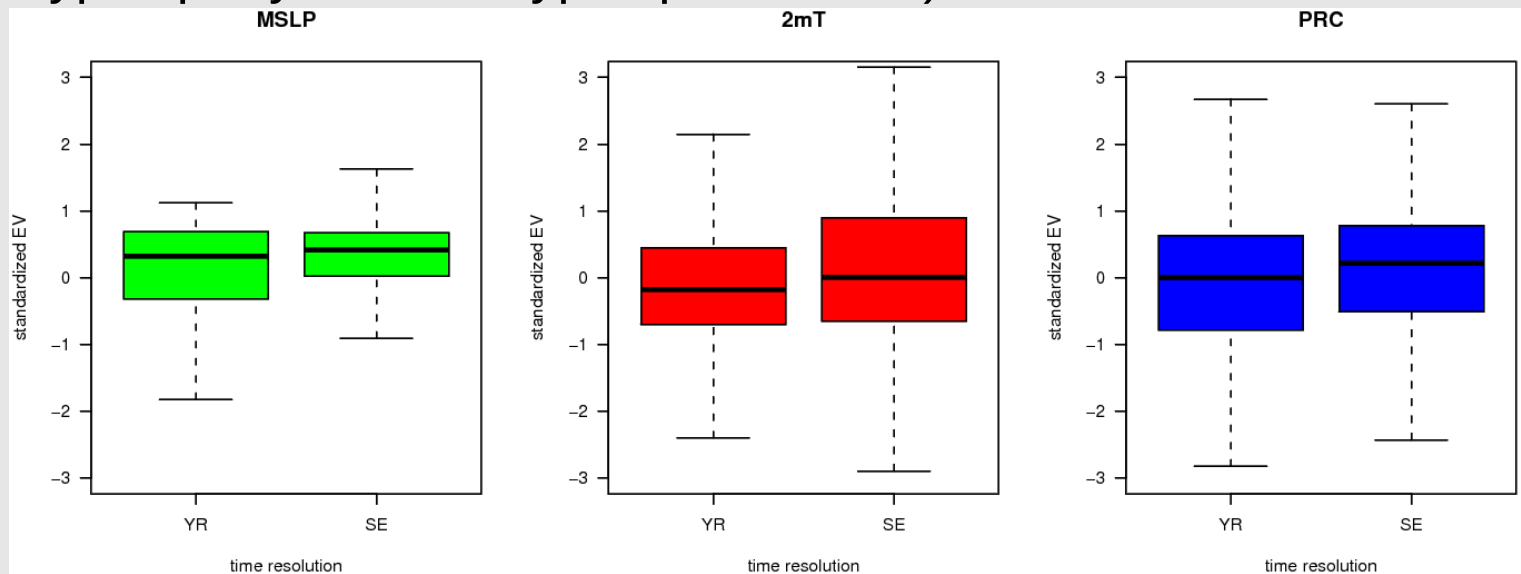
YR = annual classification

SE = seasonal classification



Relevance of seasonality

Mean EV over all CTCs performed on an annual or seasonal basis (9 types per year vs. 7 types per season)



YR = annual classification

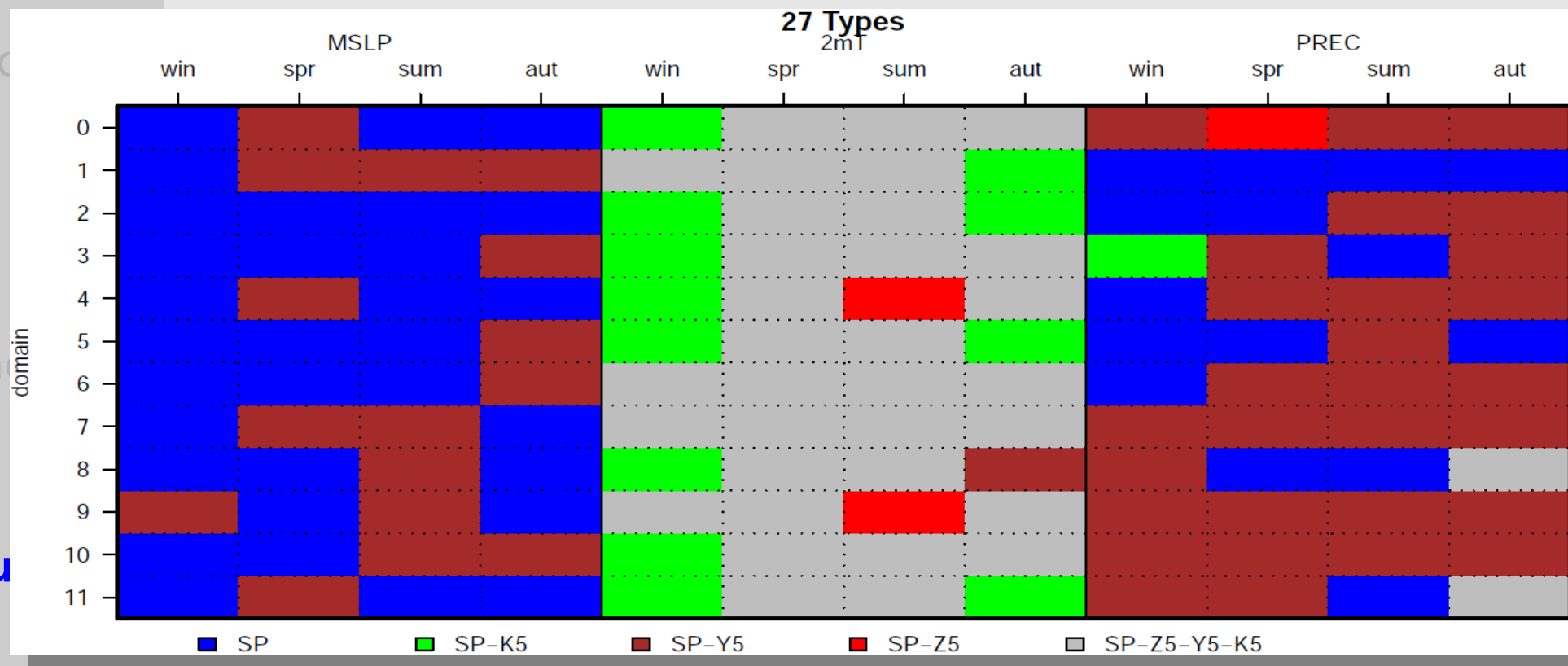
SE = seasonal classification



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Relevance of additional input variables

Input variable(s) used by the best performing CTC



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SP = MSLP
Y5 = 500hPa vorticity

K5 = 1000/500hPa thickness
Z5 = 500hPa height



Framework

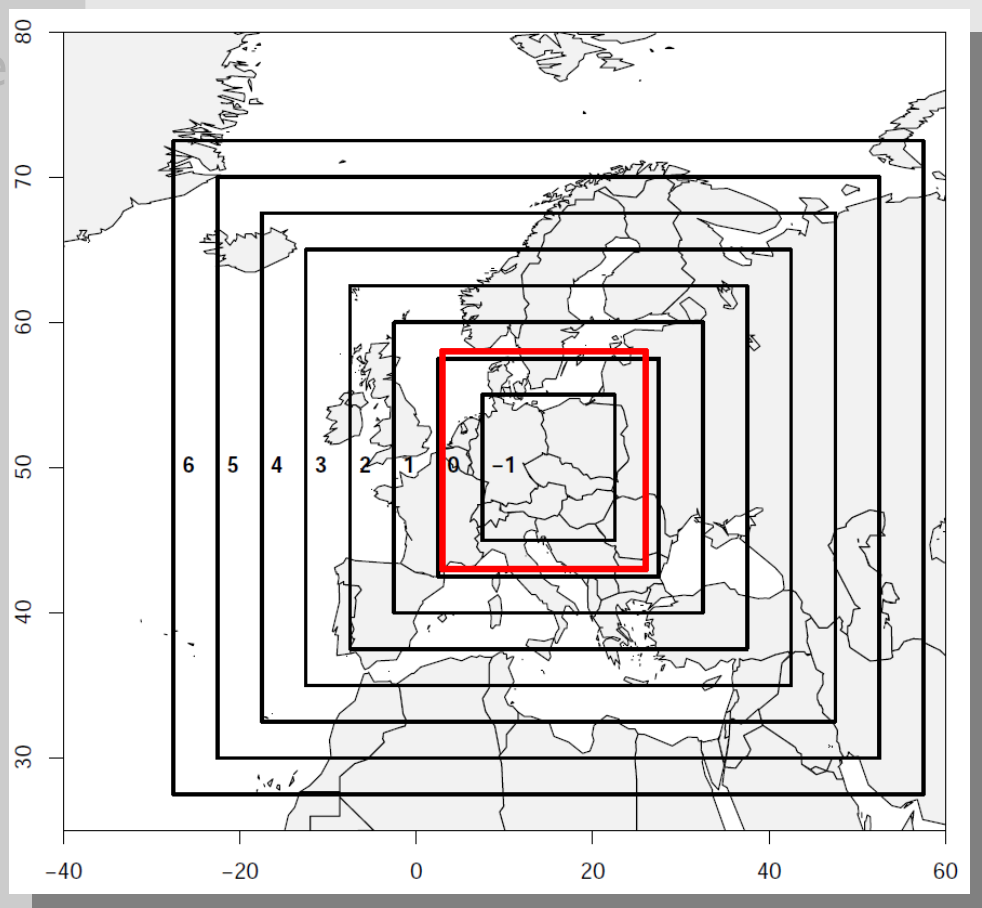
Relevance of domain size

Objective

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- 1) CTCs for varying spatial domains centered over Central Europe (from largest domain 6 to smallest domain -1)
- 2) Evaluation of each CTC for COST733 domain 7 („original size“ domain 0)

Only for a subsample of CTCs:

- CAP
- GWT
- LND
- SAN
- TPC



Framework

Objectives

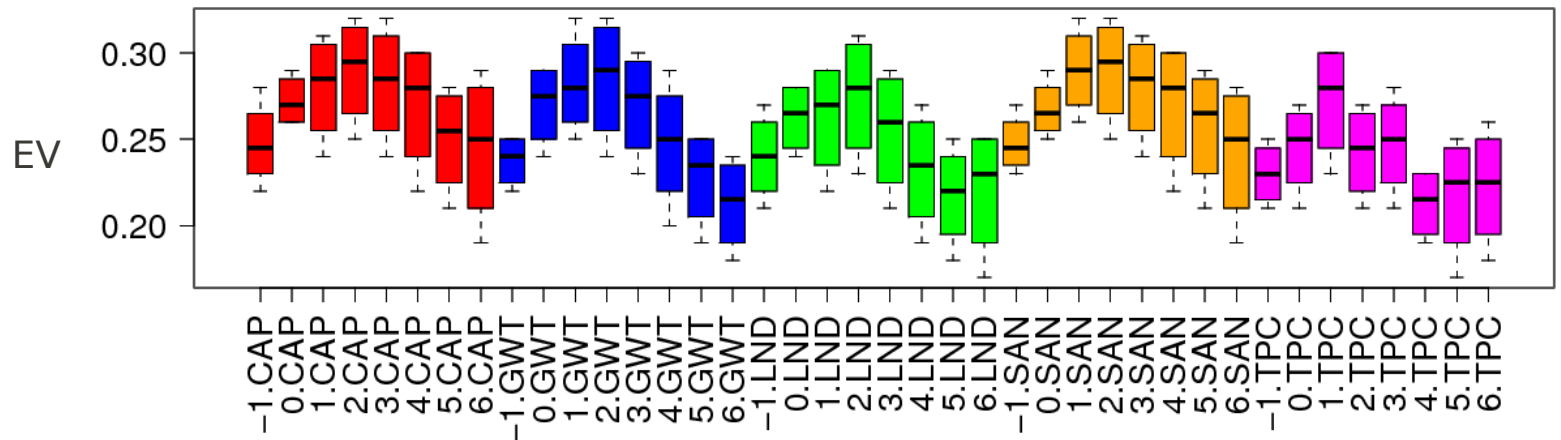
Data & Methods

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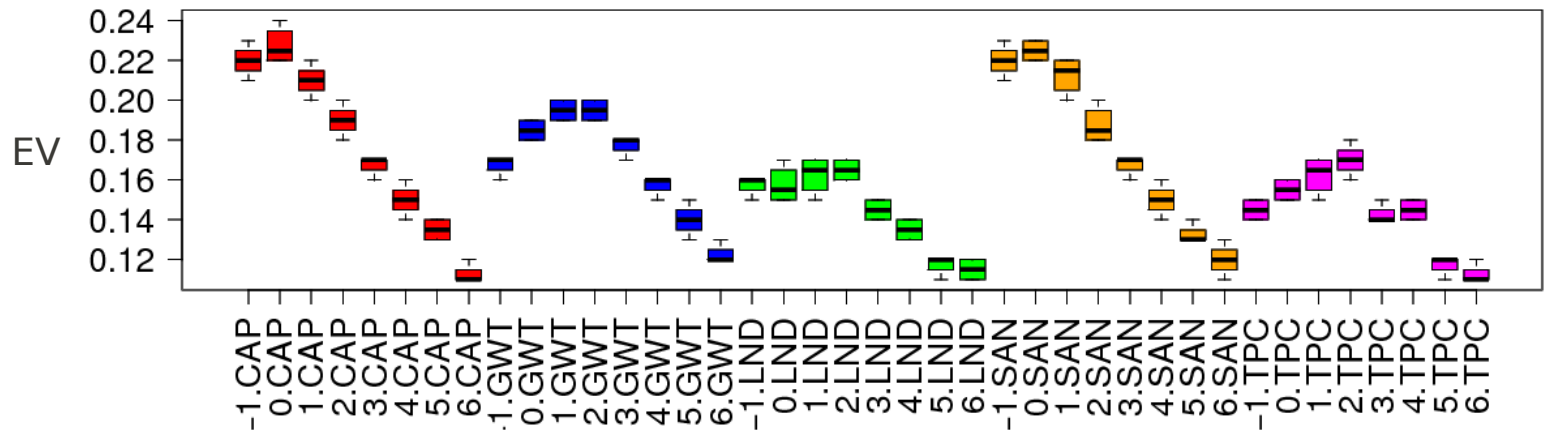
Conclusions

Relevance of domain size

Domain 7, winter, 2mT



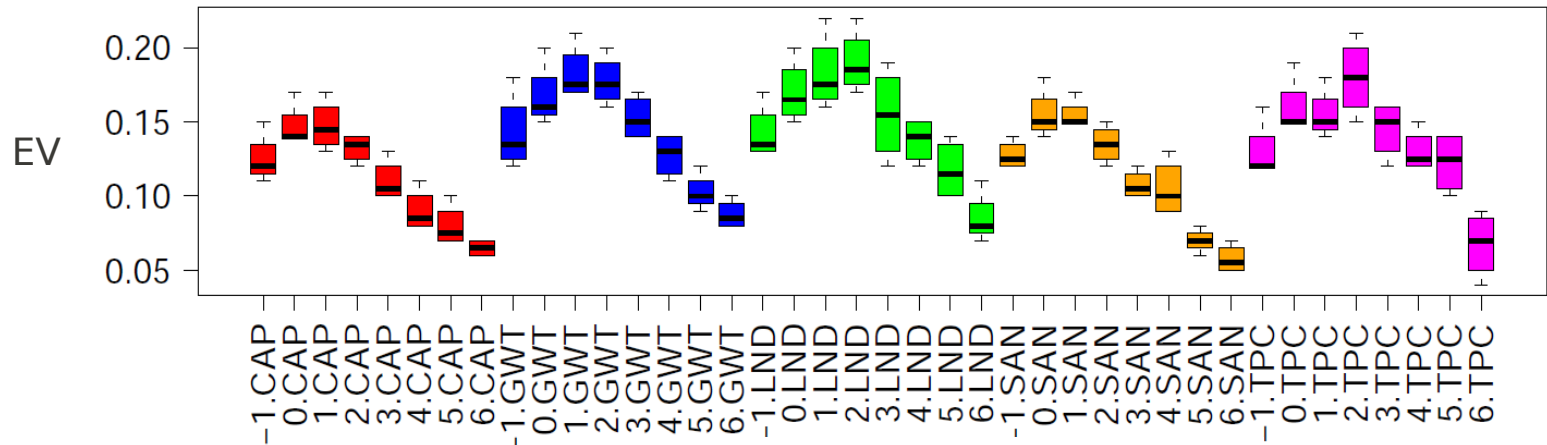
Domain 7, winter, PREC



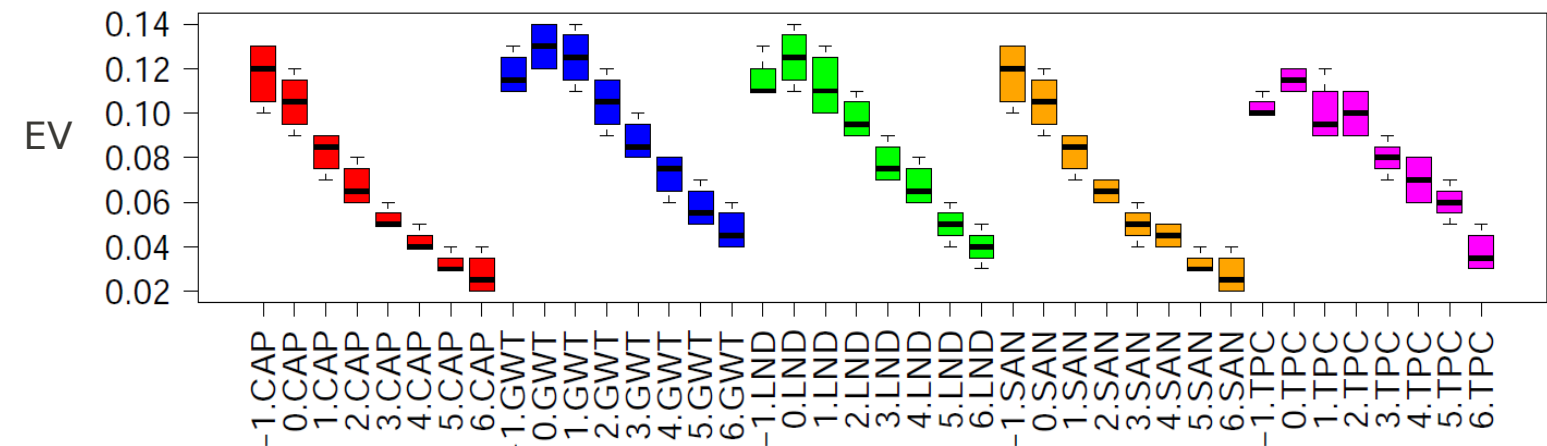


Relevance of domain size

Domain 7, summer, 2mT



Domain 7, summer, PREC





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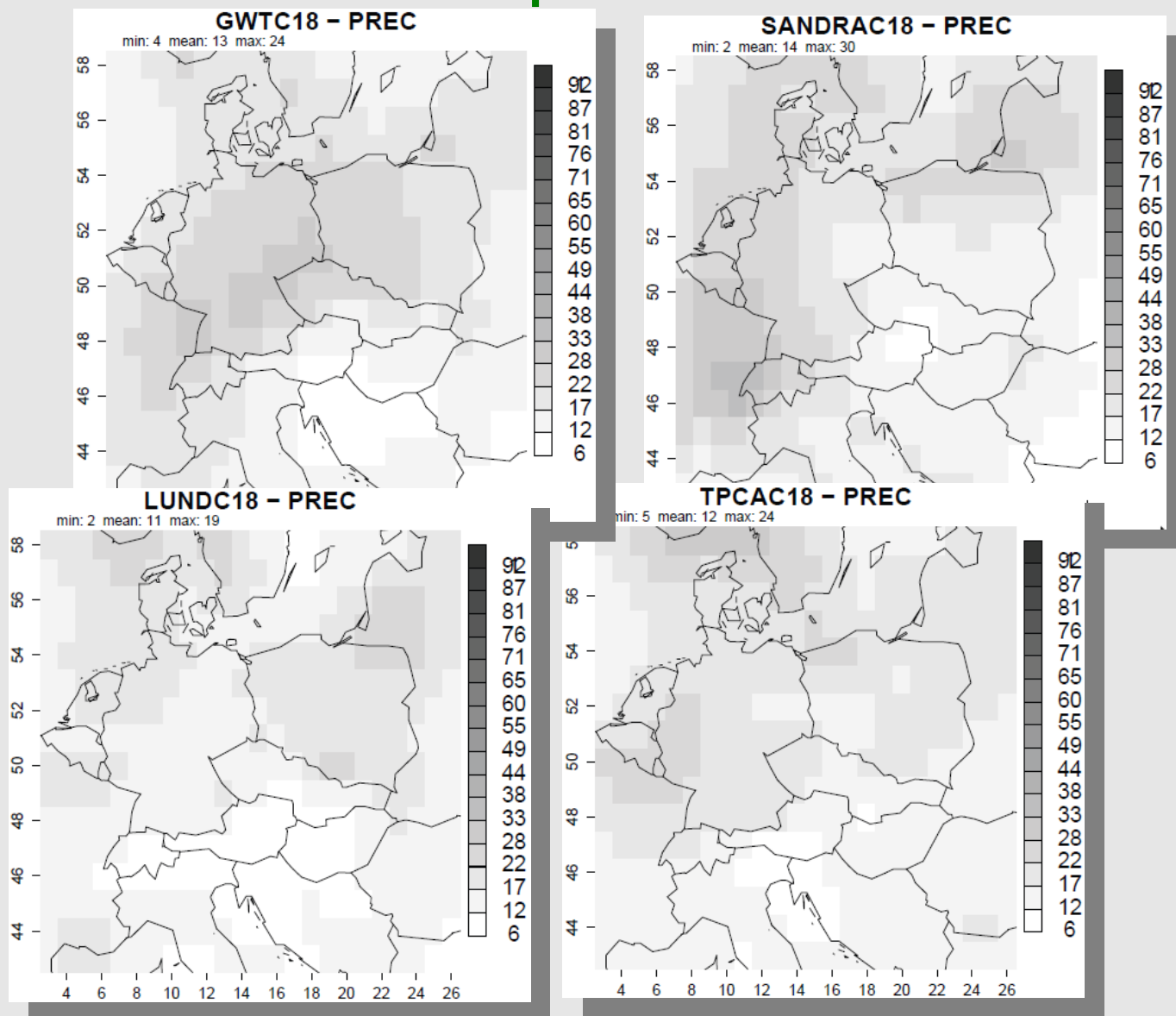
Domain 7

winter

PREC

EV at gridboxes

Performance variations within spatial domains





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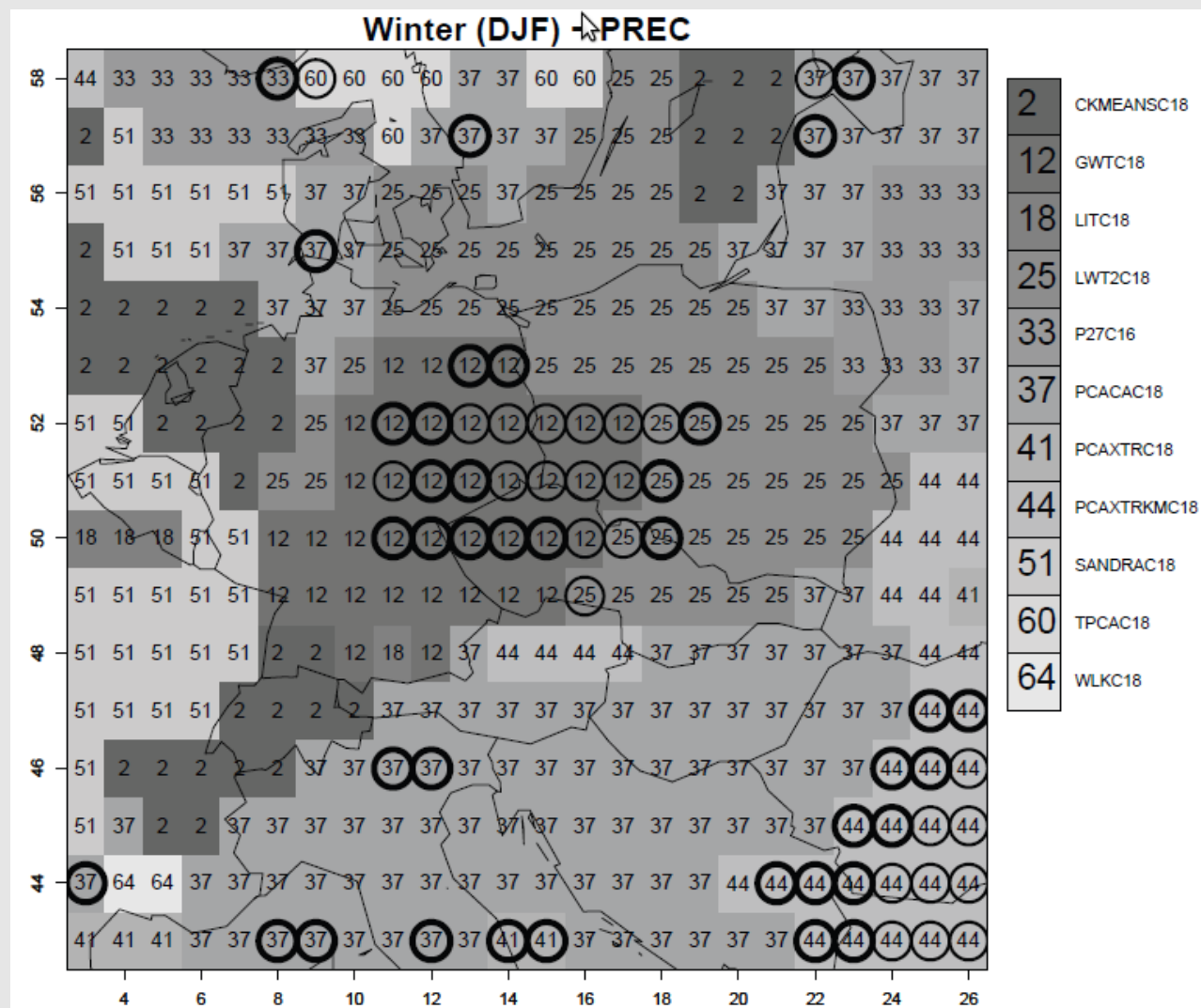
Performance variations within spatial domains

Domain 7

winter

PREC

best performing CTC at each gridbox





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What can we learn from comparison studies in COST733 ?

- **there is not one generally best individual CTC**
- **there is not one generally best basic approach**
- **distinct variations in performance among and within basic method groups**
- **performance shows marked seasonal and spatial variations (among and within spatial domains)**
- **high performance for the classified variable or for one target variable are not necessarily related to high performance for other target variables**



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What can we learn from comparison studies in COST733 ?

- indications on strengths and weaknesses of basic methodological approaches:
 - OPT + MSLP
 - LDR/PCA + 2mT
 - THRES + PREC
- effect of varying classification settings on performance:
 - sequencing: + 2mT / - PREC
 - seasonal classifications: + / - ?
 - additional input variables
 - Vorticity: +PREC
 - 1000/500 thickness: +2mT
 - importance of domain size: the smaller the better?



Framework

What can we learn from comparison studies in COST733 ?

- **there is still some work left ...**

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