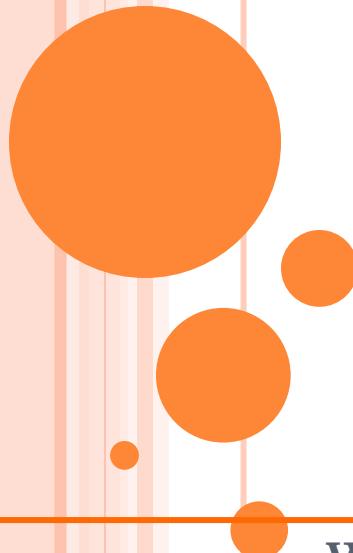


# PERSISTENCY AS A REFERENCE IN DETERMINING RARE EVENT FORECASTING SKILL

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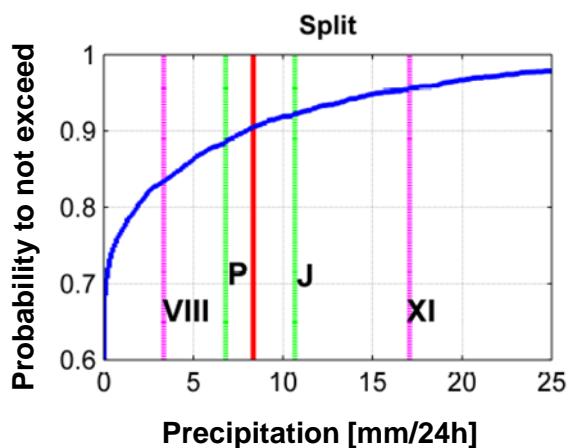
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# INTRODUCTION

- Verification: skill score
- Referent forecast:
  - Random chance, climatological mean, persistence
- Verification of the precipitation forecast (24h accumulation):
  - ALADIN regional model (2008.-2011.)  
8 km horizontal resolution, 37 vertical levels,
  - ECMWF global model (2007.-2011.)  
0.25° horizontal resolution, 62 vertical levels
  - Locations: Rijeka, Split, Zagreb, Osijek
- Categories:
  - Dry (< 0.2 mm / 24 h)
  - Light precipitation
  - Heavy precipitation



# METHODS

- Contingency tables
- Verification measures:
  - Climatological probability:  
 $P_{dry} = M/P$
  - Accuracy (Percent Correct):  
 $ACC = 100\% * (A+F+K)/P$
  - Frequency Bias:  
 $Fbias_{dry} = D/M$  (1)
  - Critical Success Indeks (Threat Score):  
 $CSI_{dry} = A/(D+M-A)$  (1)
  - Polychoric Correlation Coefficient:  
 $PCC$  – measure of association (1)

		OBSERVATIONS			$\Sigma$
		DRY	LIGHT	HEAVY	
FORECAST	DRY	A	B	C	D
	LIGHT	E	F	G	H
	HEAVY	I	J	K	L
		$\Sigma$	M	N	O
					P

perfect forecast:  
**(100%)**



# METHODS

- Skill Score – random chance as referent forecast:

- Heidke Skill Score:  $HSS = \frac{A+F+K-(MD+NH+OL)/P}{P-(MD+NH+OL)/P}$  (1)

- Pierce Skill Score  
(True Skill Score, True Skill Statistic, Kuipers Skill Score):  $PSS = \frac{A+F+K-(MD+NH+OL)/P}{P-(M^2+N^2+O^2)/P}$  (1)

- Stable Equitable Error in Probability Space: (1-SEEPS) (1)

- Skill score – persistence as referent forecast:

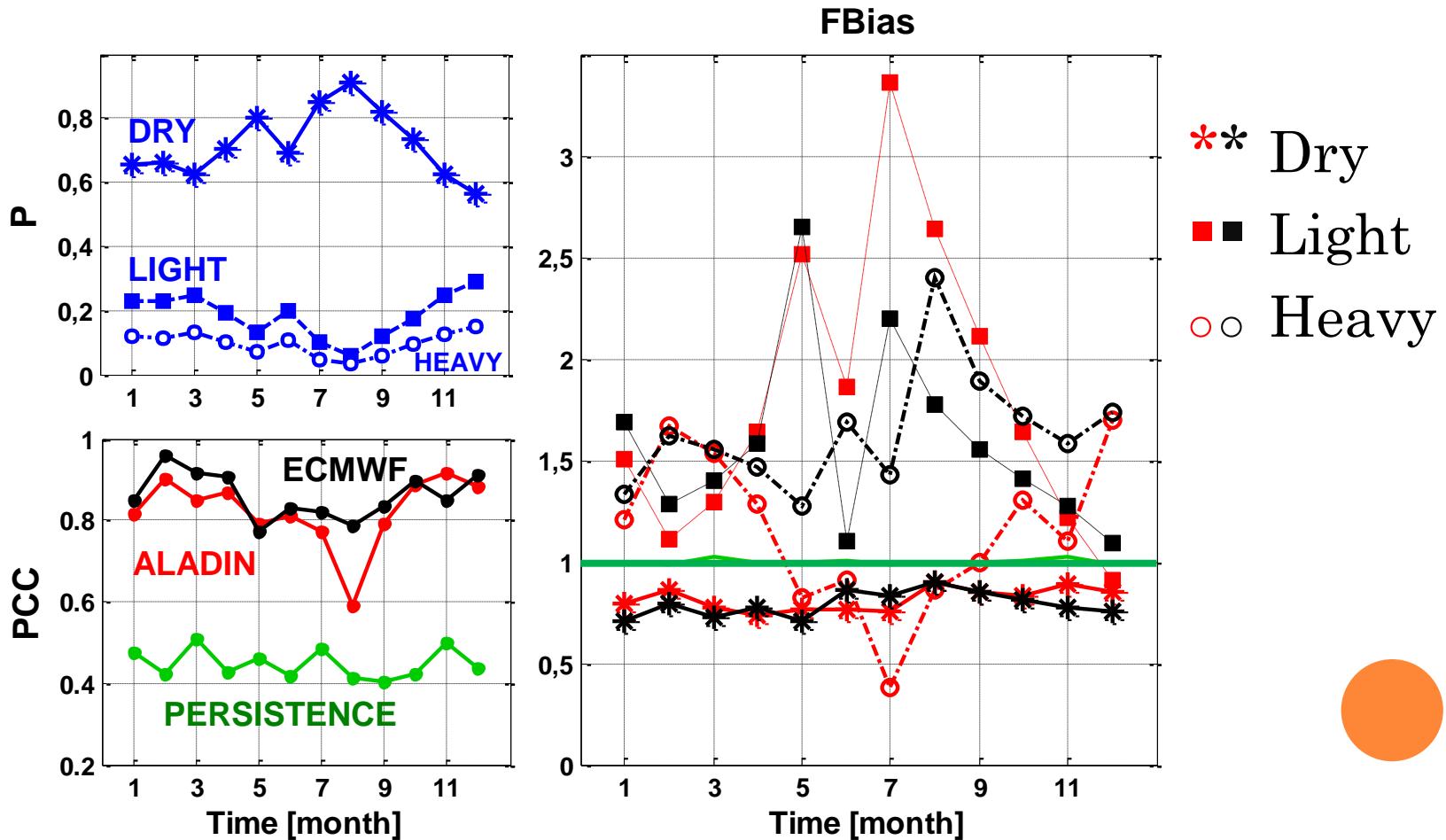
$$pSS = \frac{SS_{model} - SS_{pers.}}{SS_{ideal} - SS_{pers.}}$$

- pCSI,
- pPCC,
- pHSS,
- pPSS,
- pSEEPS

		OBSERVATIONS			$\Sigma$
		DRY	LIGHT	HEAVY	
FORECAST	DRY	A	B	C	D
	LIGHT	E	F	G	H
	HEAVY	I	J	K	L
	$\Sigma$	M	N	O	P

# VERIFICATION: SPLIT

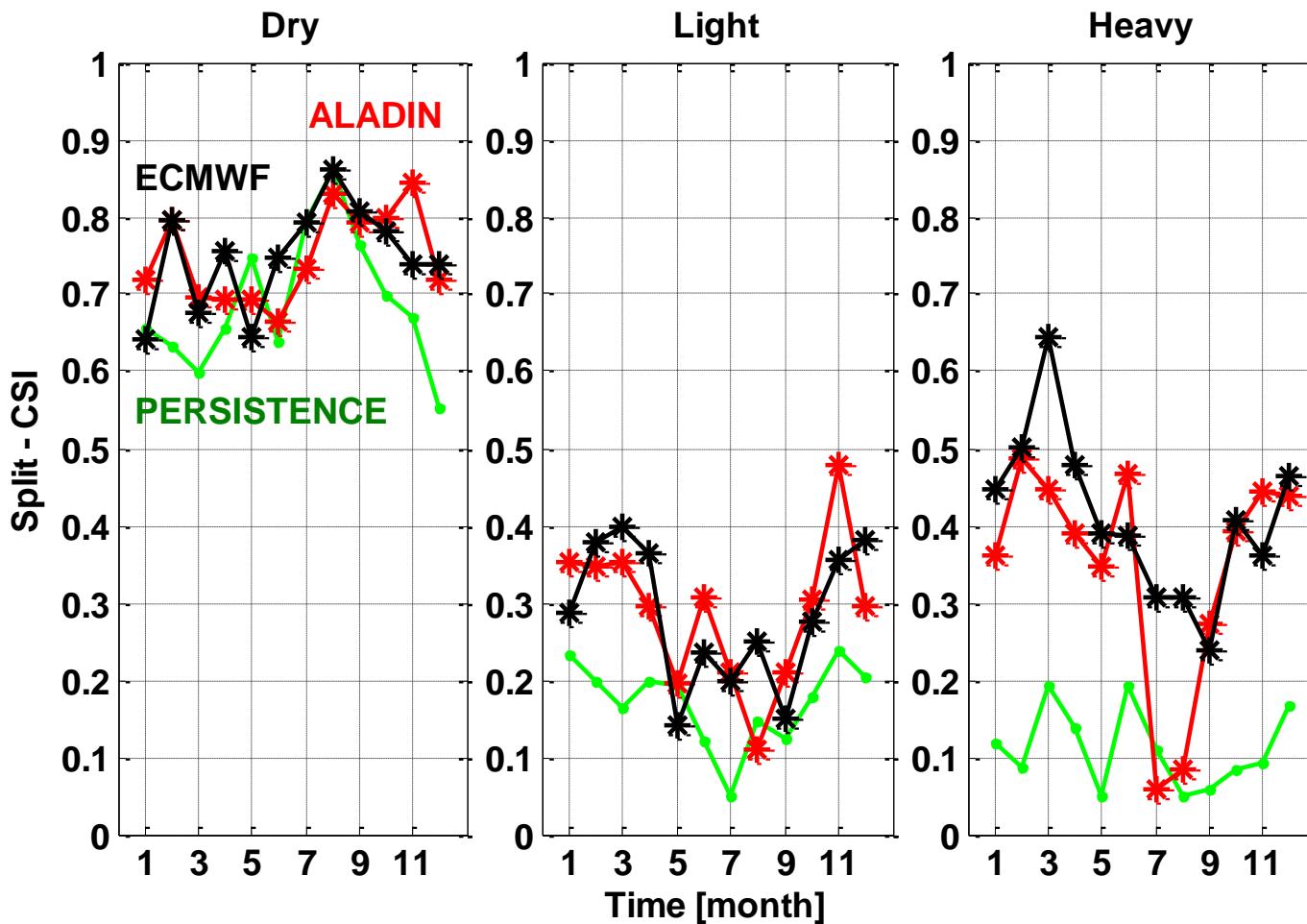
- ‘Dry’ – most probable
- Drier – less associated
- Under-forecasting ‘Dry’; over-forecasting ‘Light’ & ‘Heavy’



# VERIFICATION: SPLIT

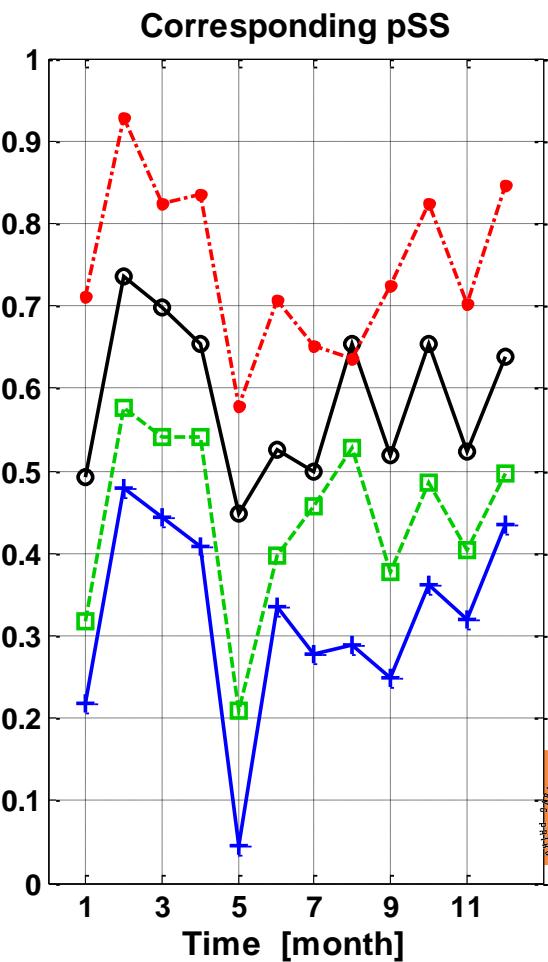
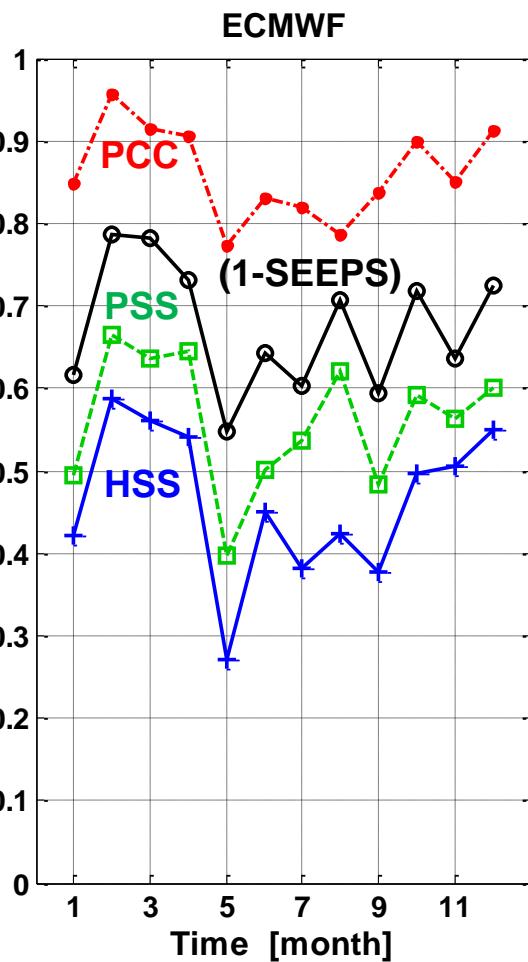
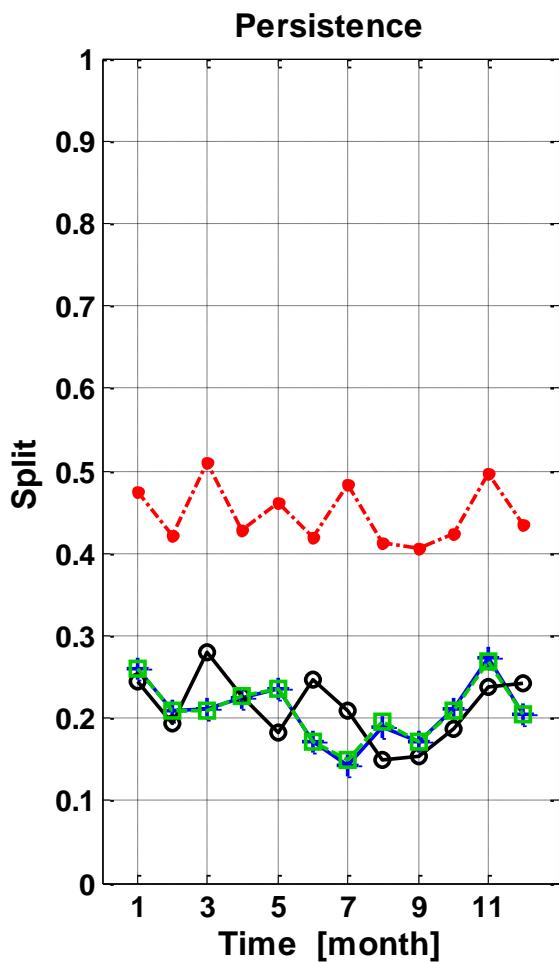
## ○ CSI:

- Highest for dominant category
- Lowest for „Light precipitation” category



# SKILL SCORES - PERSISTENCY AS A REFERENCE

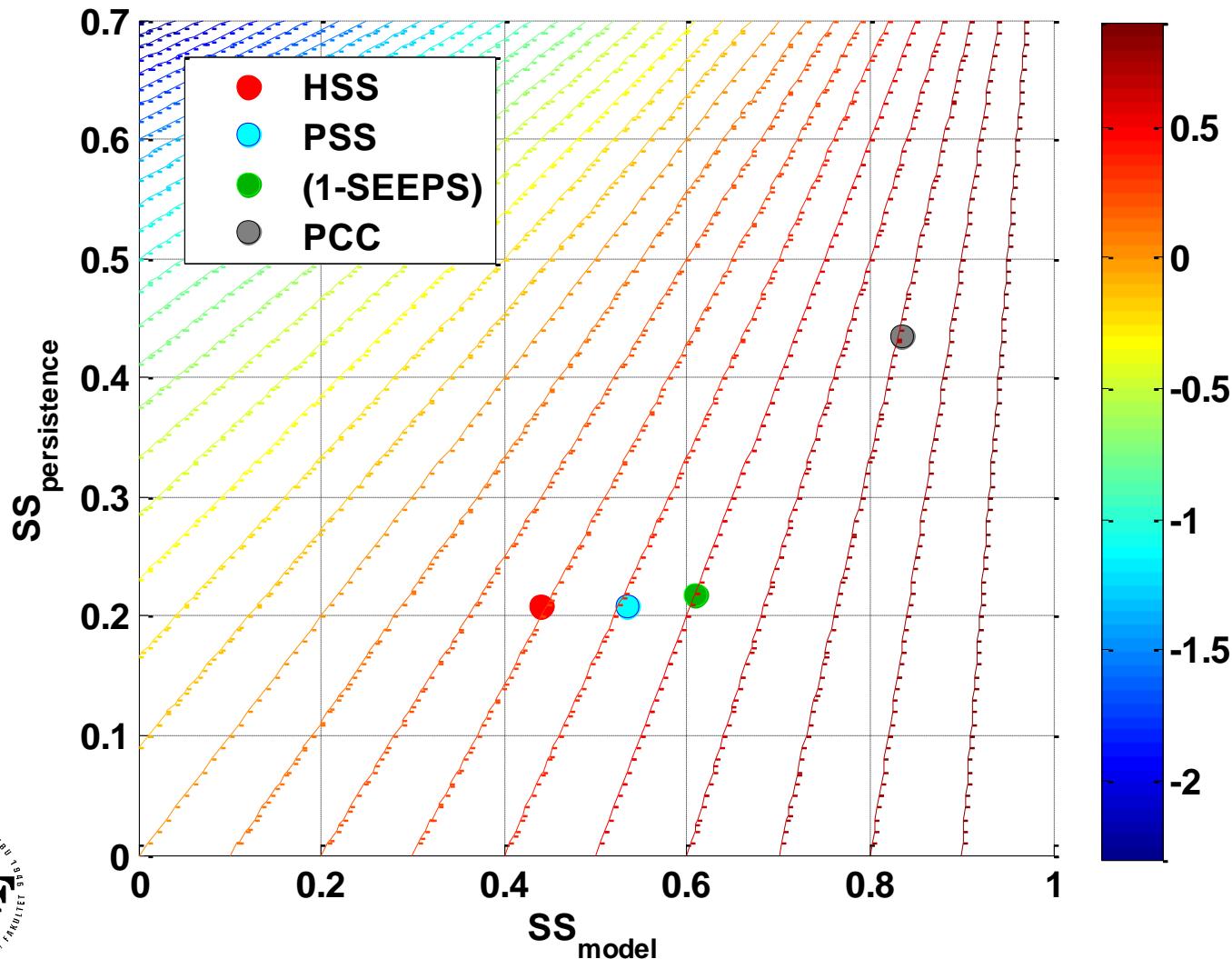
- SS generally differ in size → pSS as well
- Shape remains similar



# PERSISTENCY AS A REFERENCE:

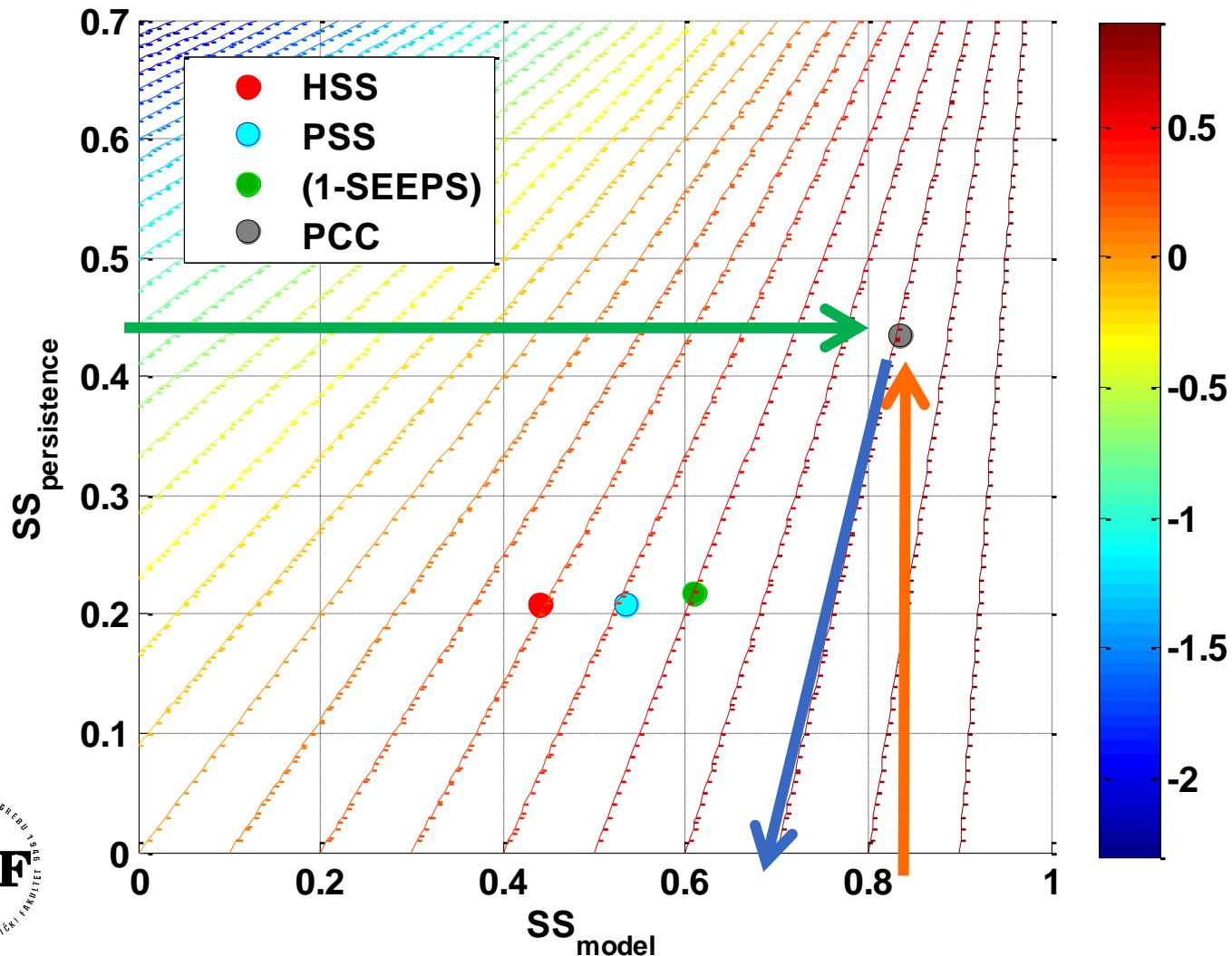
- Nomogram: contour lines for pSS

$$pSS = \frac{SS_{model} - SS_{pers.}}{SS_{ideal} - SS_{pers.}}$$

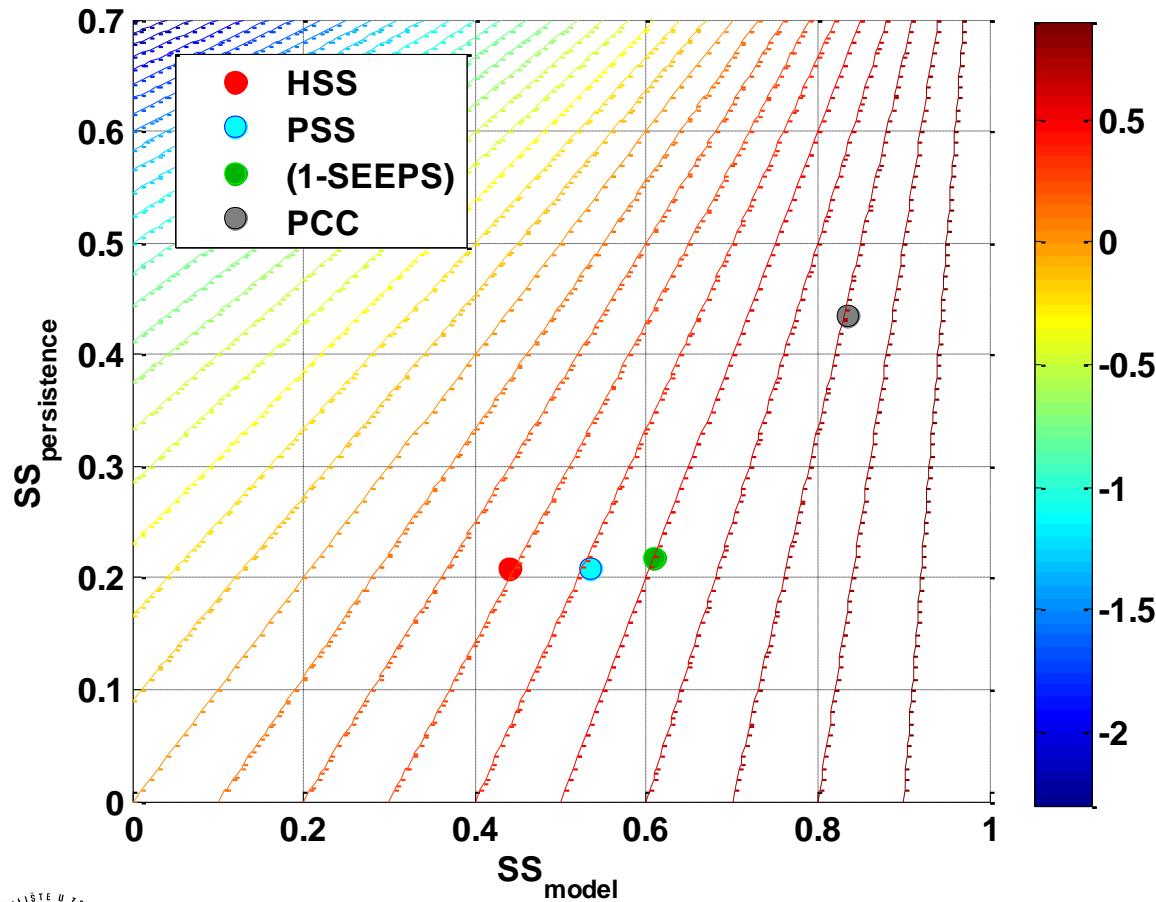


# PERSISTENCY AS A REFERENCE:

$$pSS = \frac{SS_{model} - SS_{pers.}}{SS_{ideal} - SS_{pers.}}$$

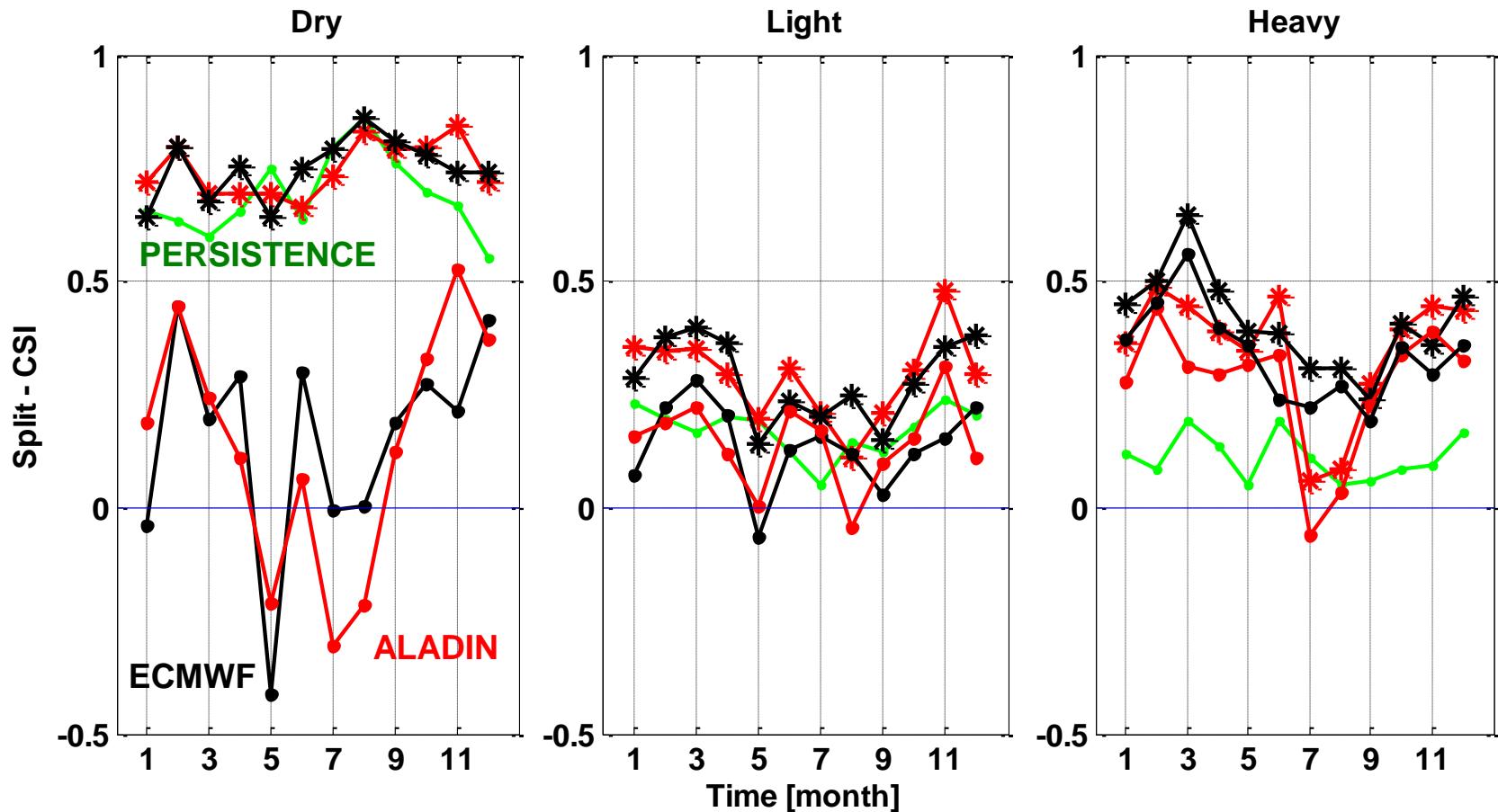


# PERSISTENCY AS A REFERENCE:



- $\overline{HSS}$ : low values  
biggest  
difference (0.14)
- $PSS, SEEPS$ : less  
sensitive
- $PCC$ : high values  
for persistency  
(0.12)

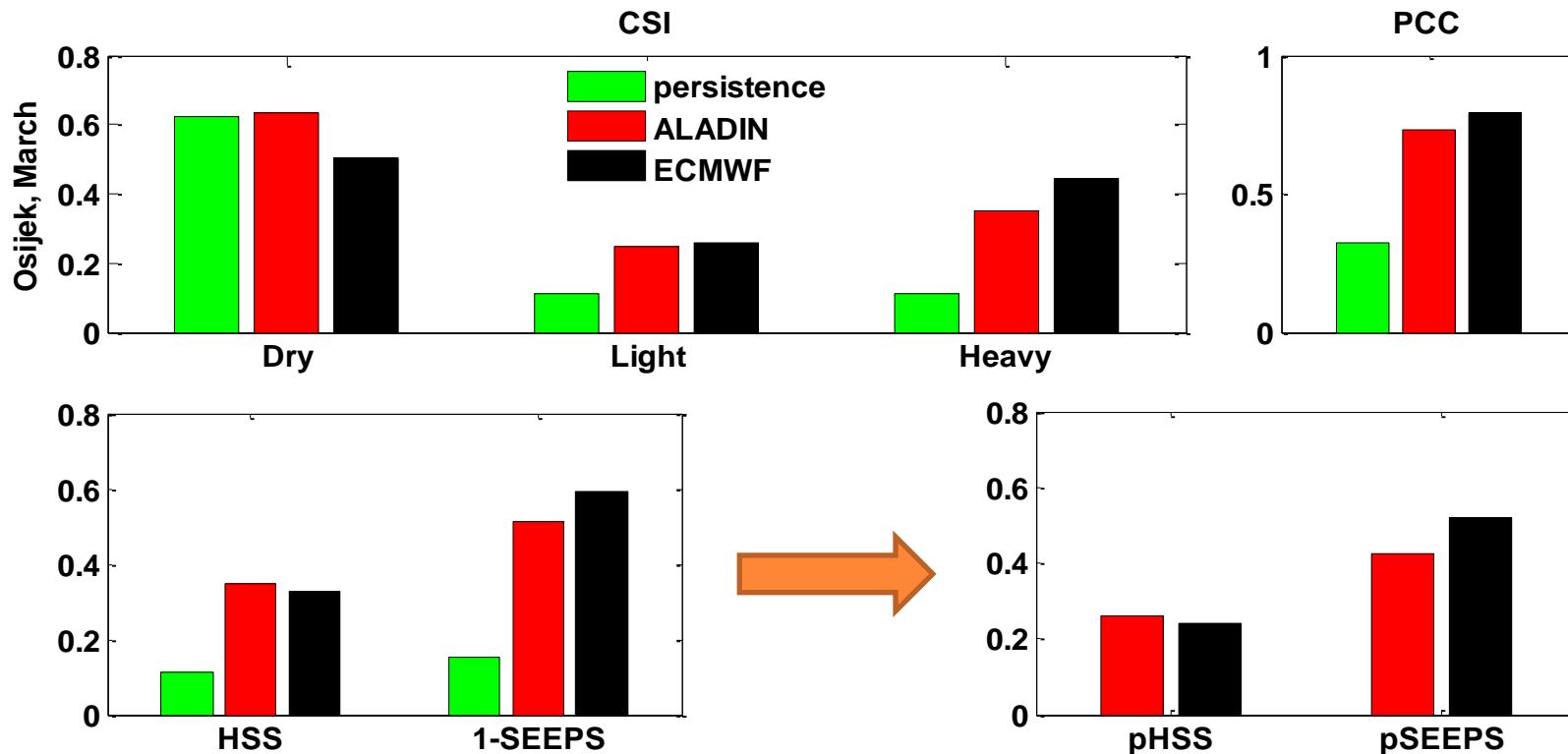
# PERSISTENCY AS A REFERENCE:



- Persistence  $CSI_{dry}$  larger in May than April → large difference
- $CSI_{heavy}$ : in March ECMWF > ALADIN → larger difference SS and pSS
- Difference between  $CSI$  and  $pCSI$ :
  - largest in „Dry“ category
  - Small in „Heavy“ category

# PERSISTENCY AS A REFERENCE:

- Inheritance of original verification measure properties



- Osijek (March):

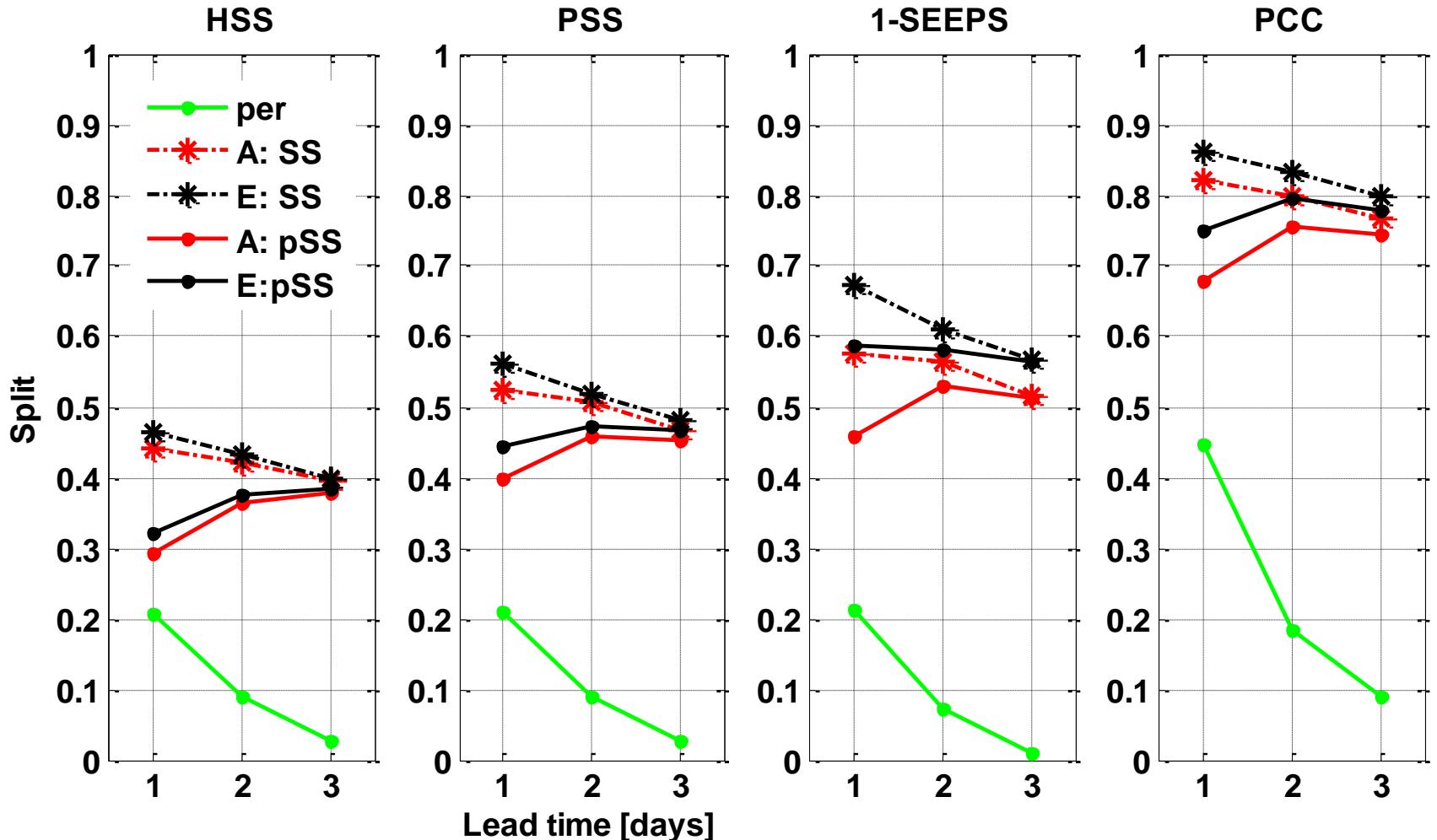
$CSI_{dry}$ : ALADIN > ECMWF

$CSI_{heavy}, PCC$  : ECMWF > ALADIN

→ smaller HSS for ECMWF → smaller pHSS

→ larger  $(1 - SEEPS)$  → larger pSEEPS

# DEPENDENCE ON LEAD TIME



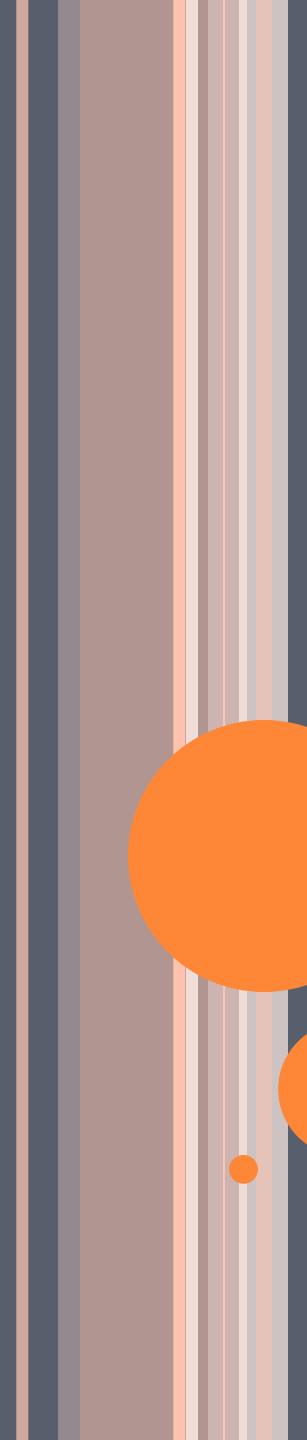
- Reference: random forecast  $\rightarrow$  SS monotonically decreases  
persistency  $\rightarrow$  pSS has a maximum!!!

# CONCLUSION

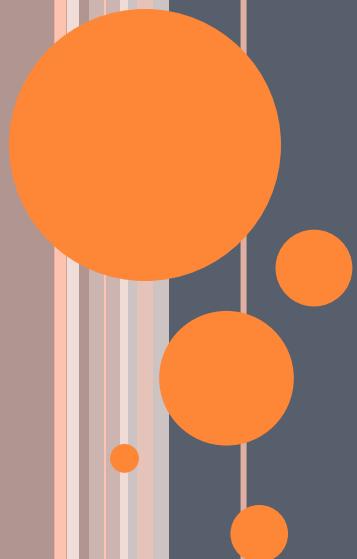
- pSS mostly affects the most probable category - less sensitive to climatology
- It usually maintains the similar shape as measure it is derived from and inherits properties of original measure
- Affects more measures that have smaller values in general than larger one
- Has a specific dependency on lead time that has to be taken into consideration
- Rare or extreme events → persistency as a reference makes more sense

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Questions?



THANK YOU!!!

## VERIFICATION MEASURES:

- Climatological probability:  $P_d = \frac{M}{P}$ ;  $P_l = \frac{N}{P}$ ;  $P_h = \frac{O}{P}$ 
  - Based only on observations
- Accuracy (Percent Correct):  $ACC = \frac{A + F + K}{P} * 100\%$ 
  - Influence of P
- Frequency bias:
  - < or > 1?  $FBIAS_d = \frac{D}{M}$ ;  $FBIAS_l = \frac{H}{N}$ ;  $FBIAS_h = \frac{L}{O}$

		OBSERVATIONS			$\Sigma$
		DRY	LIGHT	HEAVY	
FORECAST	DRY	A	B	C	D
	LIGHT	E	F	G	H
	HEAVY	I	J	K	L
$\Sigma$		M	N	O	P

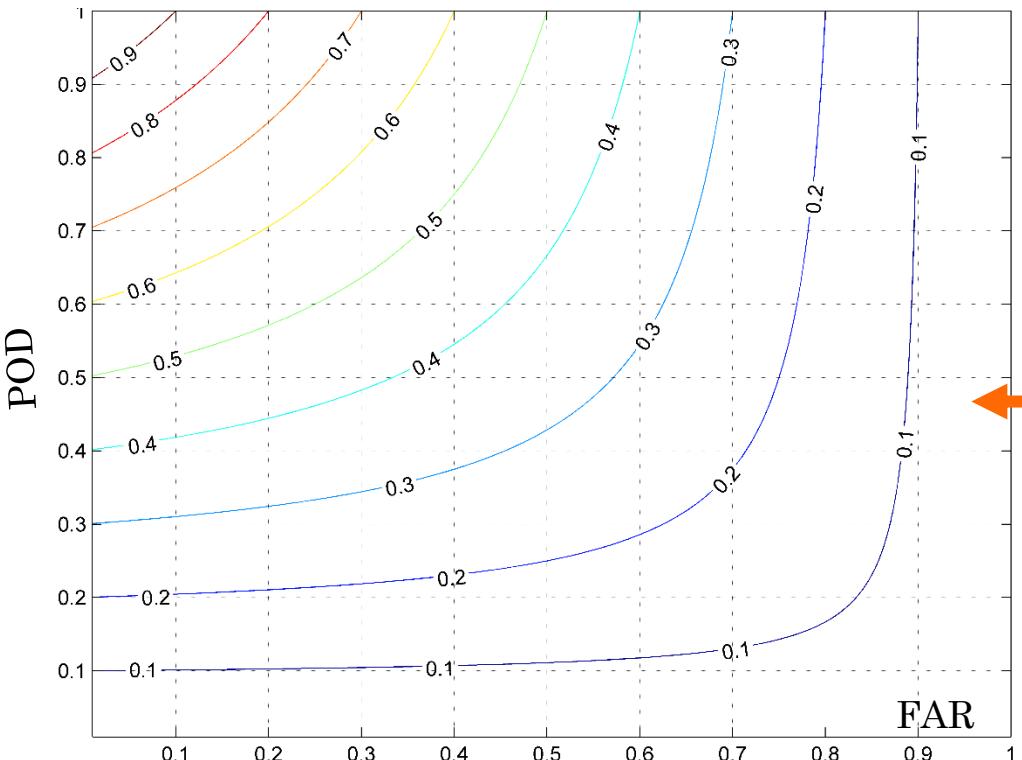


# VERIFICATION MEASURES

	OBSERVATIONS			
	DRY	LIGHT	HEAVY	$\Sigma$
FORECAST	A	B	C	D
LIGHT	E	F	G	H
HEAVY	I	J	K	L
$\Sigma$	M	N	O	P

- Critical Success Index:

$$CSI_d = \frac{A}{D + M - A}; \quad CSI_l = \frac{F}{H + N - F}; \quad CSI_h = \frac{K}{O + L - K}$$



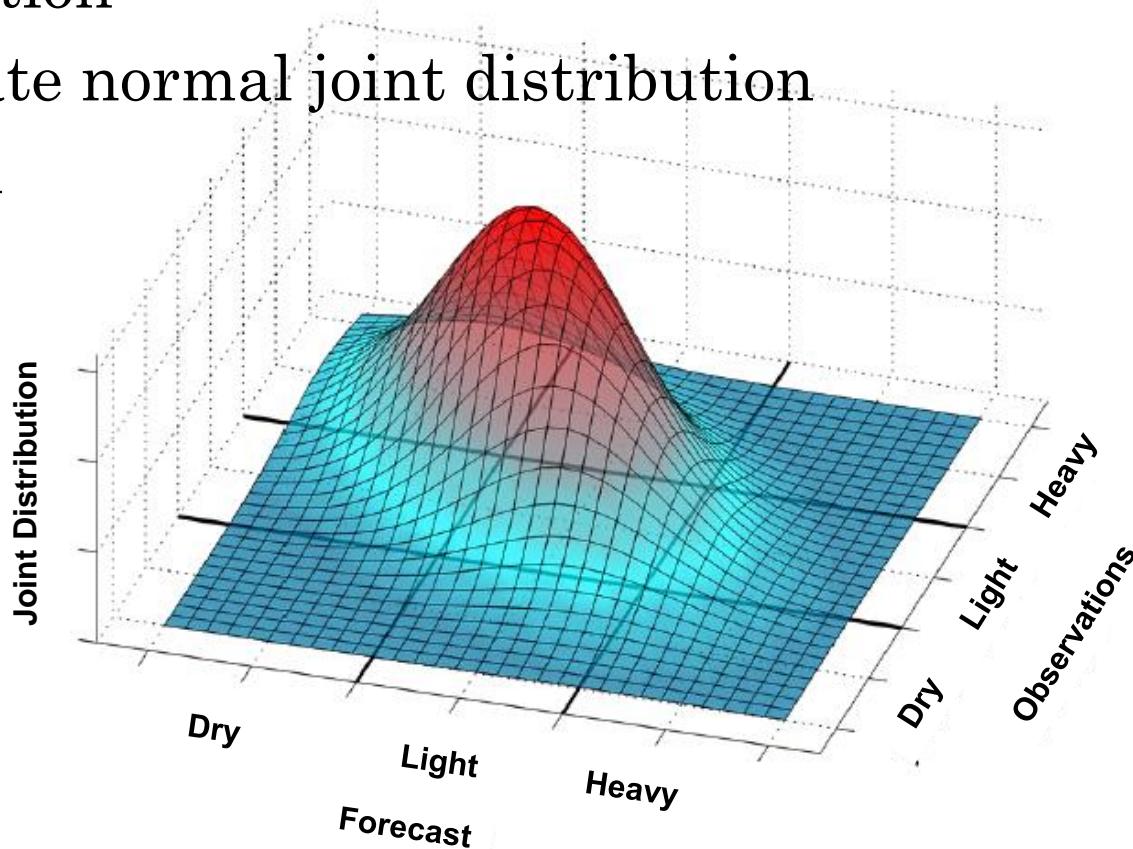
- Measure of relative accuracy:

$$CSI = \frac{1}{\frac{1}{(1 - FAR)} + \frac{1}{POD} - 1}$$



## VERIFICATION MEASURES:

- Polychoric Correlation Coefficient – measure of association
- Bivariate normal joint distribution
- Ideal: 1



# SKILL SCORES:

		OBSERVATIONS			$\Sigma$
		DRY	LIGHT	HEAVY	
FORECAST	DRY	A	B	C	D
	LIGHT	E	F	G	H
	HEAVY	I	J	K	L
	$\Sigma$	M	N	O	P

- General: 
$$SS = \frac{S_{prog} - S_{ref}}{S_{ideal} - S_{ref}}$$
- Random forecast as a reference:

- Heidke Skill Score: 
$$HSS = \frac{A + F + K - \frac{MD + NH + OL}{P}}{P - \frac{MD + NH + OL}{P}}$$

- Pierce Skill Score: 
$$PSS = \frac{A + F + K - \frac{MD + NH + OL}{P}}{P - \frac{M^2 + N^2 + O^2}{P}}$$



## SKILL SCORES:

- Persistency as a reference:

$$pCSI_k = \frac{CSI_{model,k} - CSI_{perz,k}}{1 - CSI_{perz,k}}$$

$$pPCC = \frac{PCC_{model} - PCC_{perz}}{1 - PCC_{perz}}$$

$$pHSS = \frac{HSS_{model} - HSS_{perz}}{1 - HSS_{perz}} \qquad pPSS = \frac{PSS_{model} - PSS_{perz}}{1 - PSS_{perz}}$$

Same for (1-SEEPS), GSS and any other....

