



NCAR



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## Spatial Verification: A New Spatial Alignment Error Summary

2020 International Verification Methods Workshop

16 November 2020

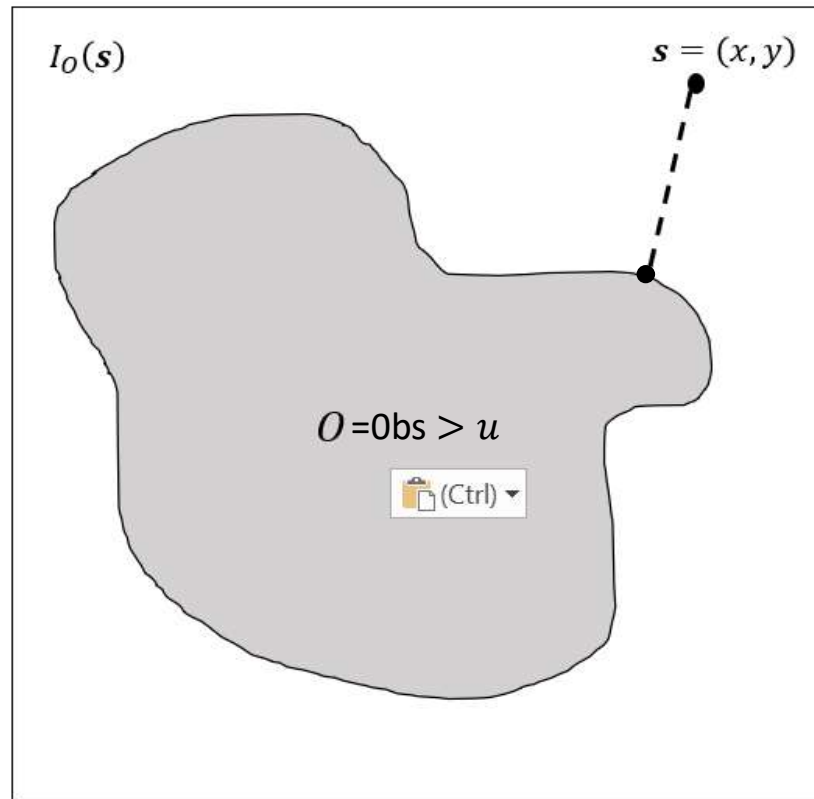
<https://jwgfvr.univie.ac.at/>

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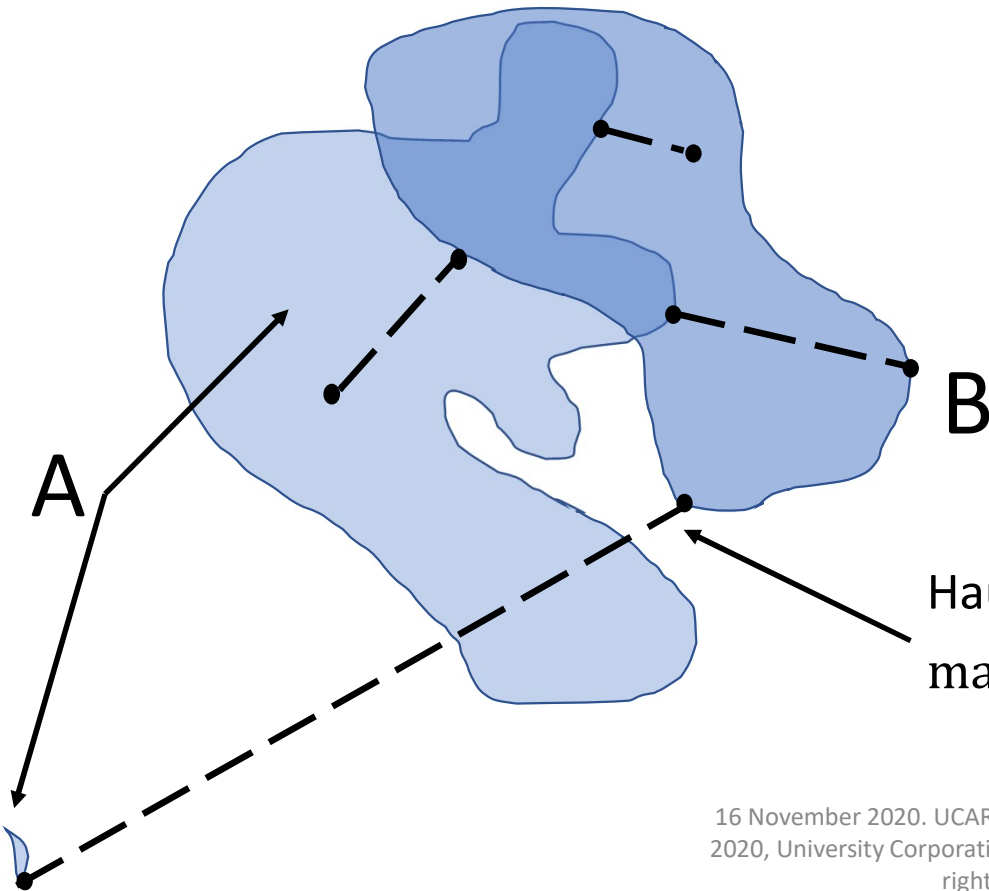
# Spatial Verification: Binary fields

$I_O(\mathbf{s}) = 1$  if  $Z(\mathbf{s}) > u$  for example  
 $I_O(\mathbf{s}) = 0$  otherwise

$\mathcal{D}$  →



# Spatial Verification: Binary fields



$d(\mathbf{s}, A)$  is the shortest distance from a grid point  $\mathbf{s} \in \mathcal{D}$  to the nearest grid point in the set  $A$ . Similarly for  $d(\mathbf{s}, B)$ .

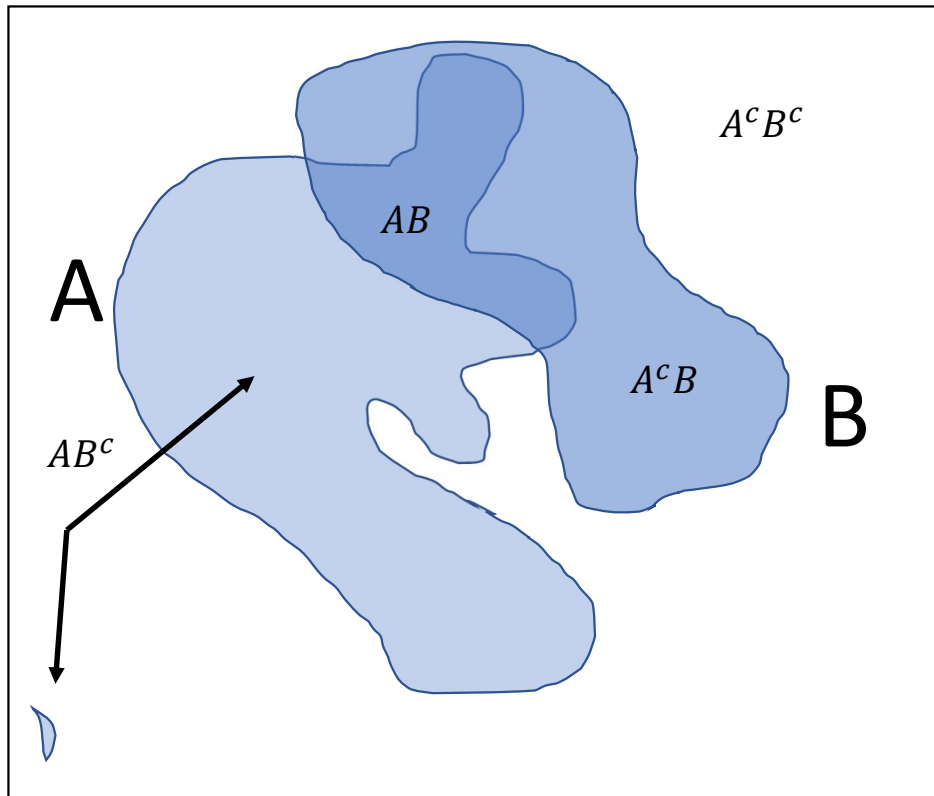
$$\text{MED}(A, B) = \frac{1}{n_B} \sum_{\mathbf{s} \in B} d(\mathbf{s}, A)$$

G. (2017, doi: 10.1175/WAF-D-16-0134.1)

Hausdorff distance,  $H(A, B) =$

$$\max \left\{ \max_{\mathbf{s} \in A} d(\mathbf{s}, B), \max_{\mathbf{s} \in B} d(\mathbf{s}, A) \right\}$$

# New bias/distance performance measure, $G$



$n_A$  = number of grid points in  $A$ ,  
 $n_B$  = number of grid points in  $B$ ,  
 $n_{AB}$  = number of grid points in  $AB$ .

$$G_\beta(A, B) = \max\{1 - \frac{y}{\beta}, 0\}$$

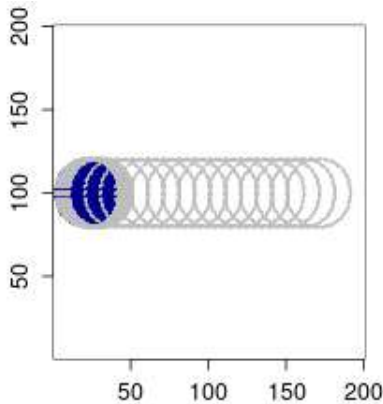
where

$$y = y_1 y_2$$

$$y_1 = n_A + n_B - 2n_{AB}$$

$$y_2 = \text{MED}(A, B) \cdot n_B + \text{MED}(B, A) \cdot n_A$$

# New bias/distance performance measure, $G$



- $0 \leq G_\beta(A, B) \leq 1$
- $G_\beta(A, B) = 1$  is a perfect match between  $A$  and  $B$ .
- $G_\beta(A, B) = 0$  is a user's idea of a bad match.

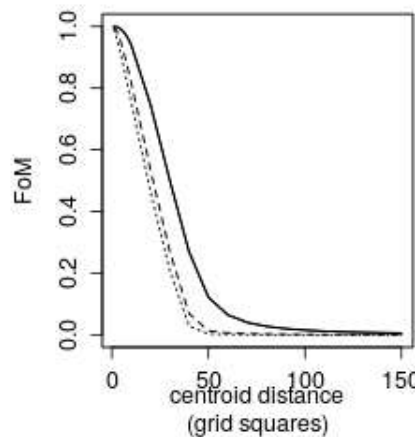
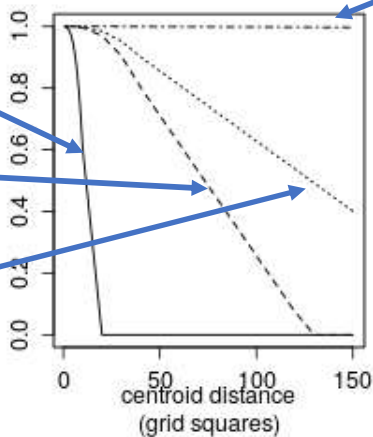
Maximum value of  $y_1$  occurs when  $n_A + n_B = N$  and  $n_{AB} = 0$

$$\beta = N\sqrt{N}$$

$$\beta = \frac{N^2}{2}$$

$$\beta = N^2$$

$$\beta = N^3$$



Maximum value of  $y_2$  depends on specific distance map and domain.

# New Geometric Test Cases

$$G_{\beta}(P_1, P_1) = 1 = G_{\beta}(P_2, P_2)$$

$$G_{\beta}(P_1, P_2) = G_{\beta}(P_2, P_1) = 0, \text{ using } \beta = \frac{N^2}{2}$$

## Pathological Cases

P1:  $I_{P_1}(\mathbf{s}) = 0$   
everywhere (Null Case)

P2:  $I_{P_2}(\mathbf{s}) = 1$   
everywhere

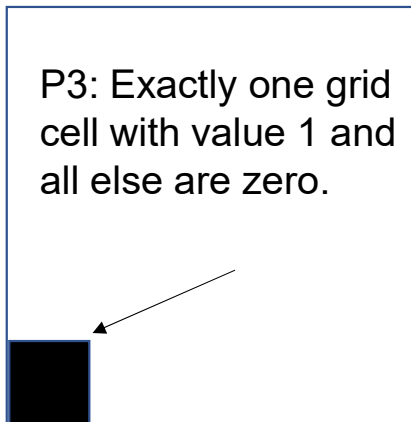
Other measures are generally either undefined or set, as a special case, to a very large number.

New geometric test cases are from G. et al. (2020, doi: [10.1175/MWR-D-19-0256.1](https://doi.org/10.1175/MWR-D-19-0256.1))

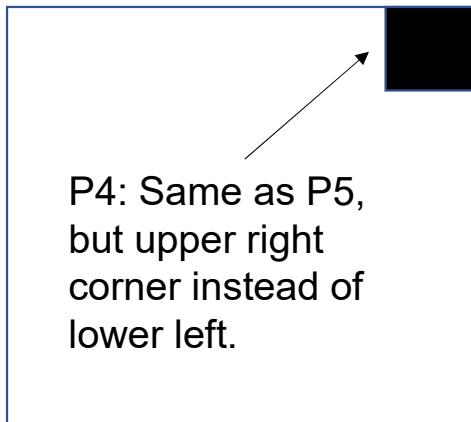
# New Geometric Test Cases

## Pathological Cases

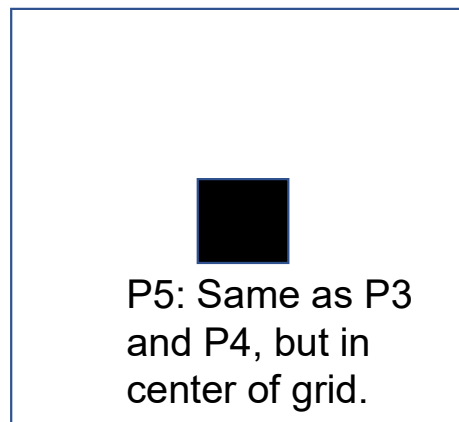
P3: Exactly one grid cell with value 1 and all else are zero.



P4: Same as P5, but upper right corner instead of lower left.



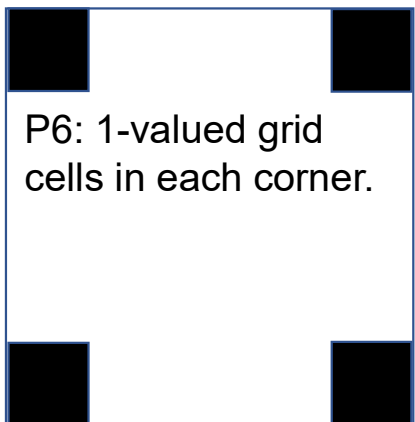
P5: Same as P3 and P4, but in center of grid.



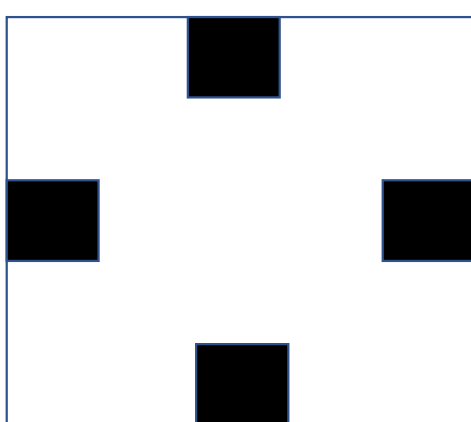
Going from no to one or a few event points.

Centroid for P6 and P7 is the same, so  $CDST(P6, P7) = 0$  (perfect score!), but  $CDST(P3, P6) = CDST(P3, P7)$  is large.

P6: 1-valued grid cells in each corner.



P7: Four 1-valued grid cells located on boundaries midway between corners

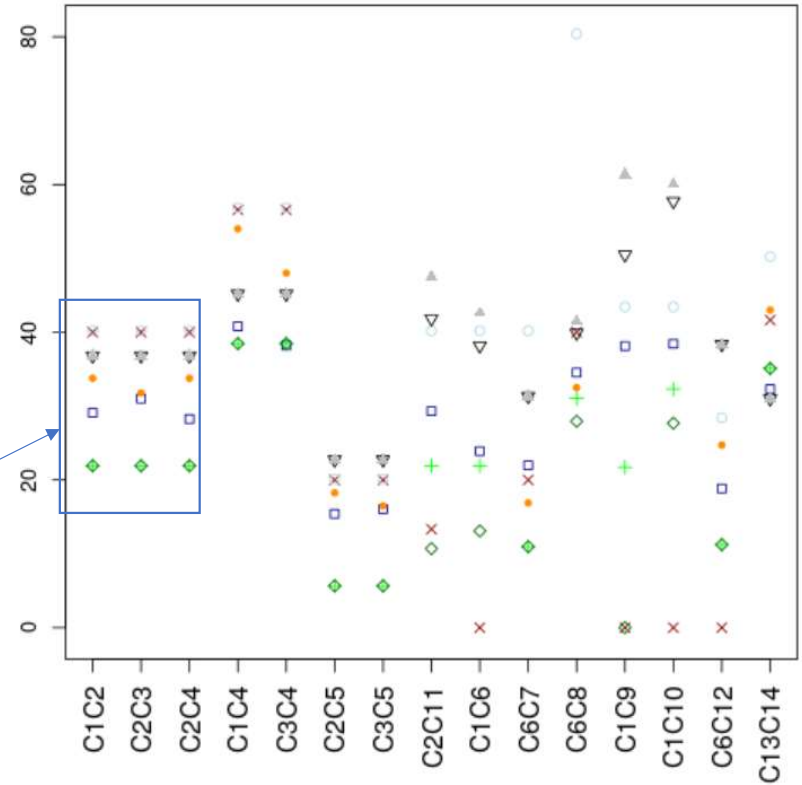
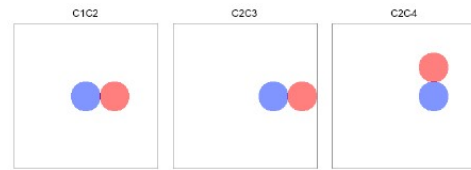
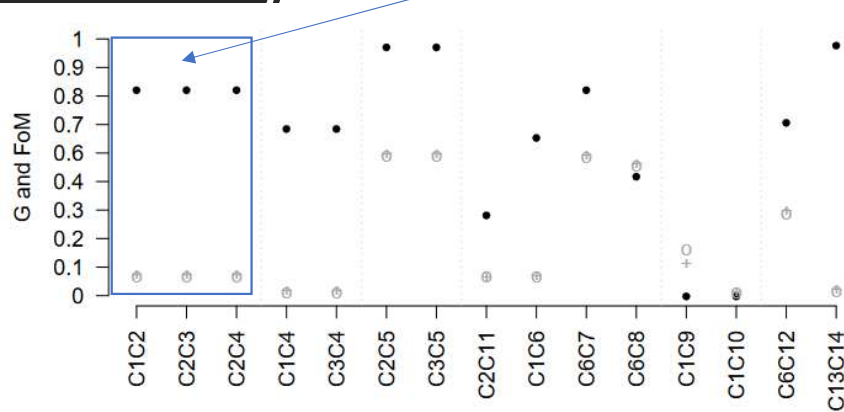
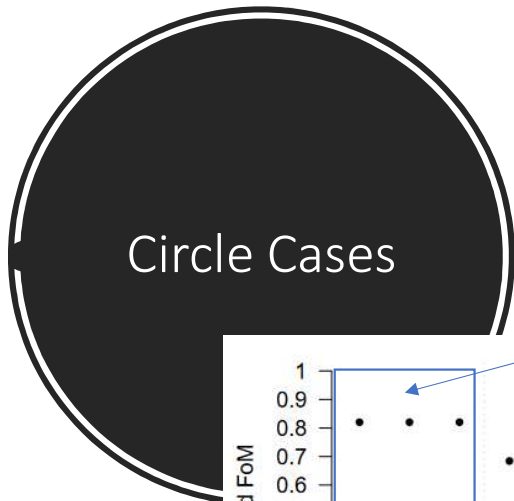


$G_\beta \approx 1$ , but slightly less than 1, for all of the comparisons involving these cases, as well as against P1.

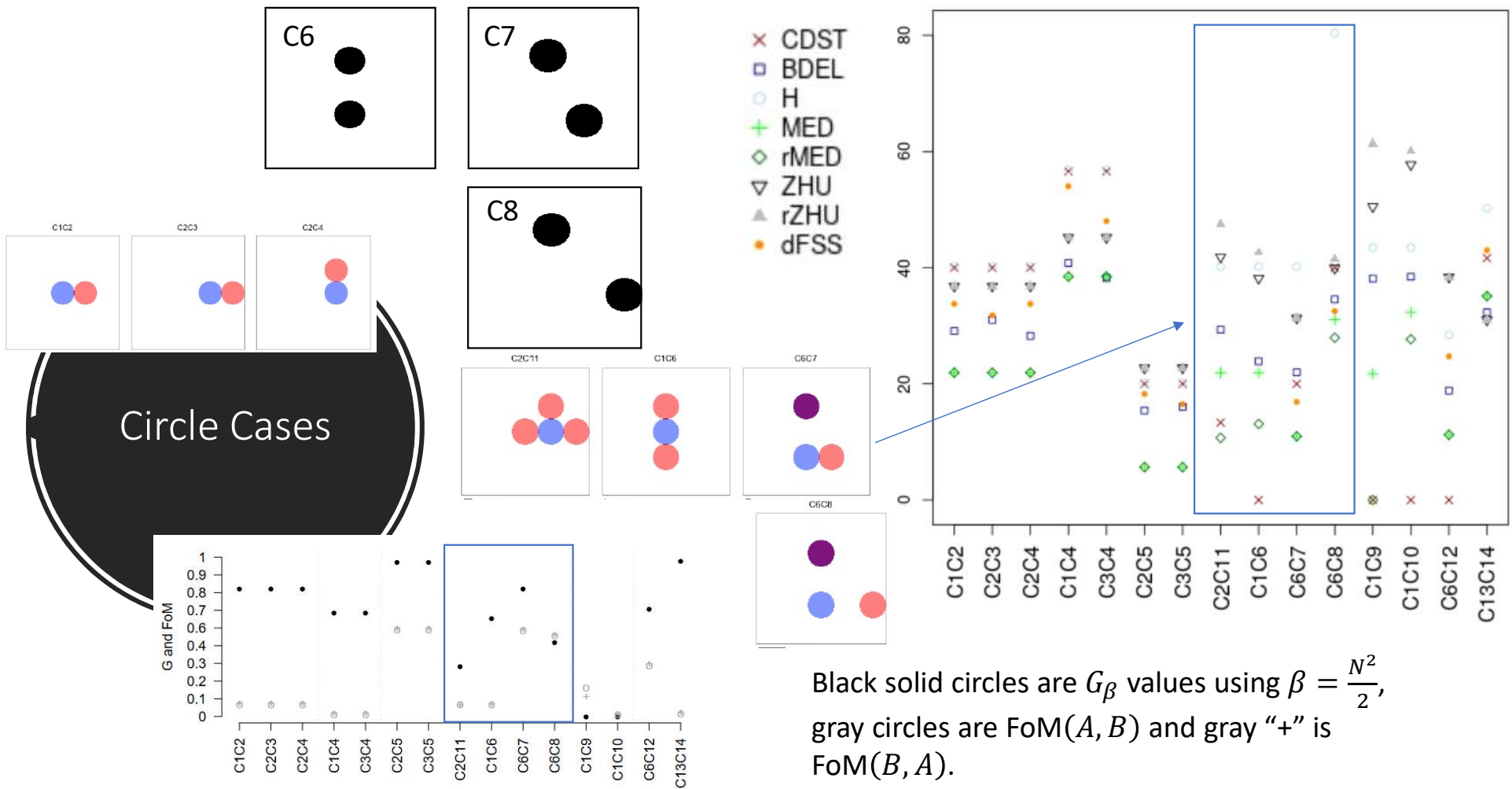
P7: Four 1-valued grid cells located on boundaries midway between corners

Black solid circles are  $G_\beta$  values using  $\beta = \frac{N^2}{2}$ ,  
 gray circles are FoM(A, B) and gray "+" is  
 FoM(B, A).

- × CDST
- BDEL
- H
- + MED
- ◇ rMED
- ▽ ZHU
- △ rZHU
- dFSS

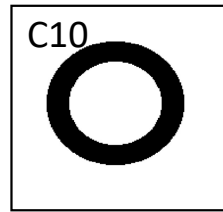
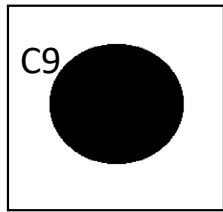
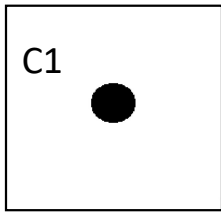




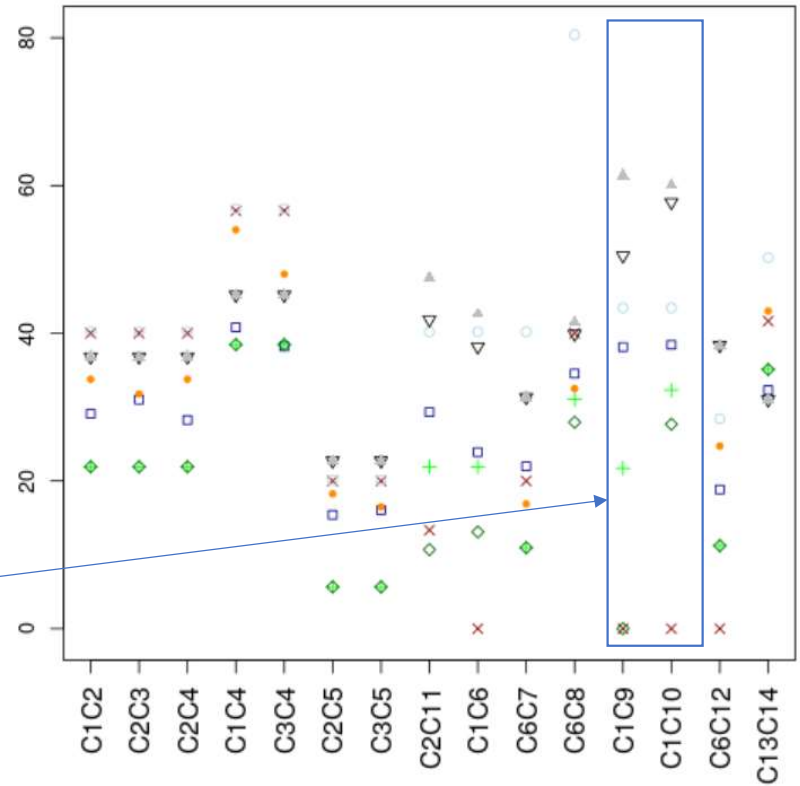
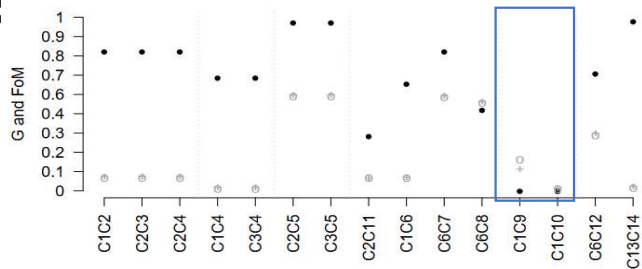


Black solid circles are  $G_\beta$  values using  $\beta = \frac{N^2}{2}$ ,  
 gray circles are  $FoM(A, B)$  and gray "+" is  $FoM(B, A)$ .

# Circle Cases

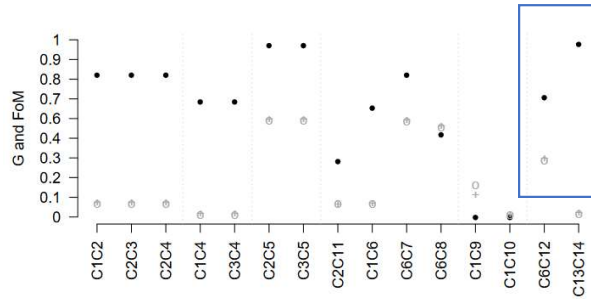


- × CDST
- BDEL
- H
- + MED
- ◇ rMED
- ▽ ZHU
- △ rZHU
- dFSS

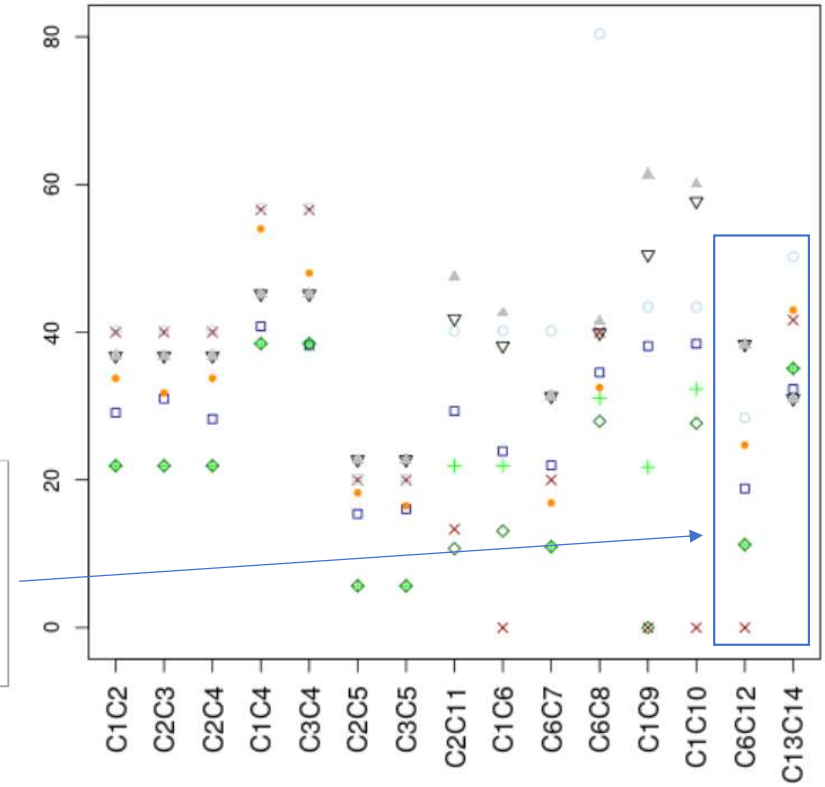
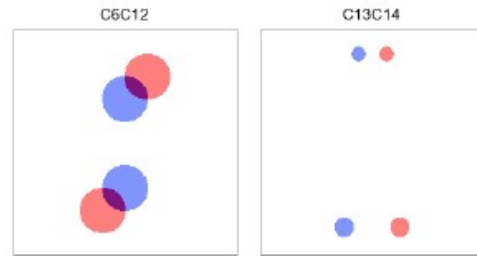


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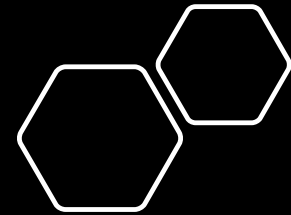
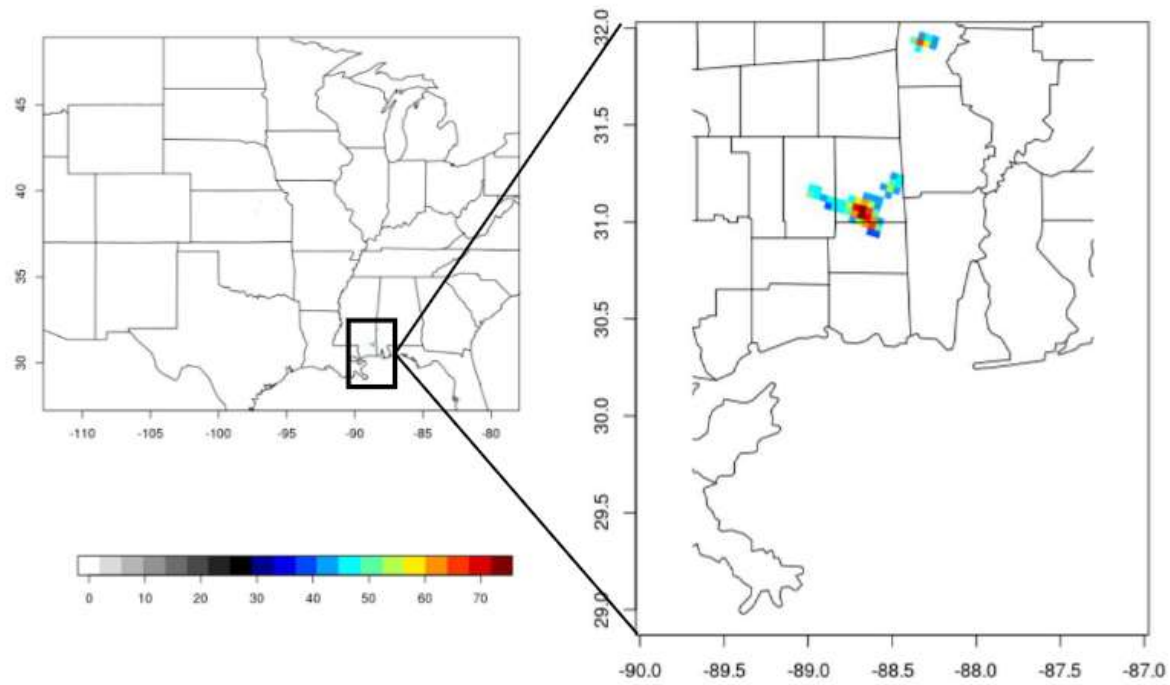
# Circle Cases



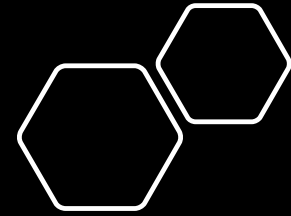
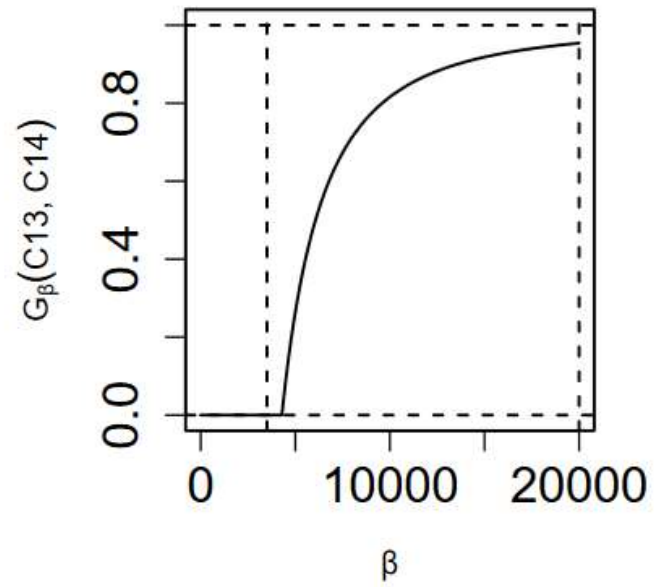
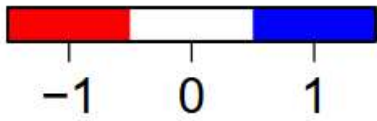
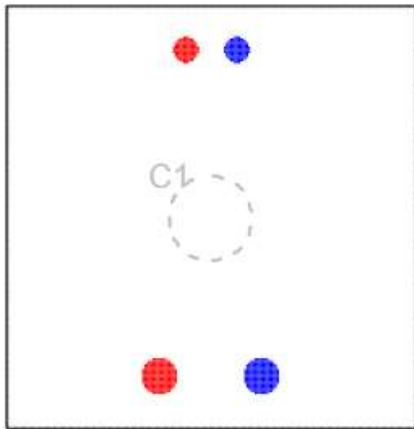
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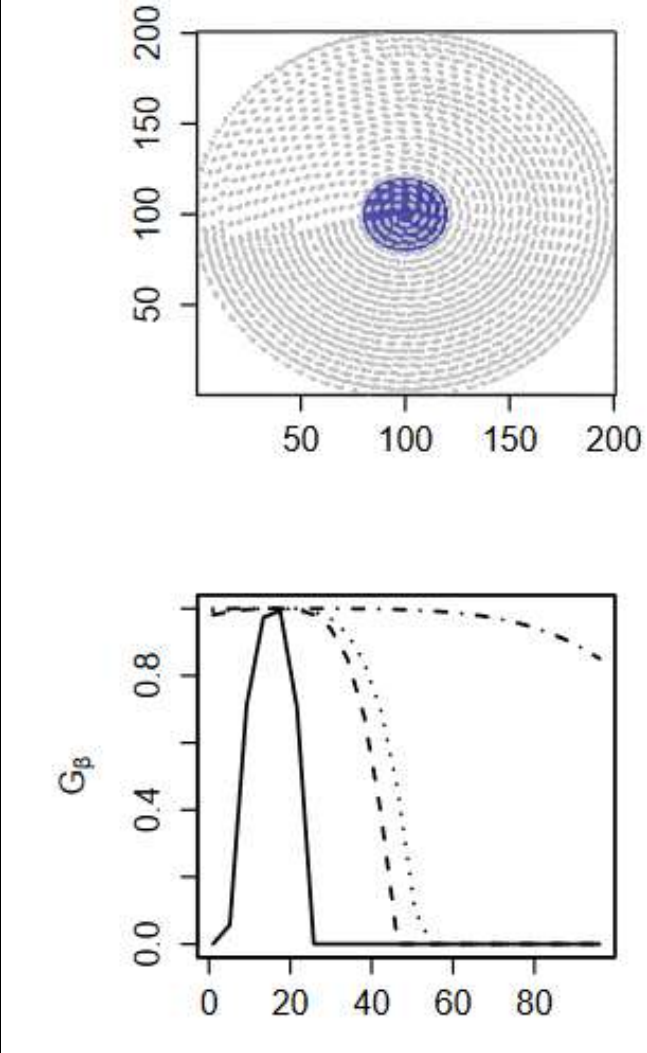
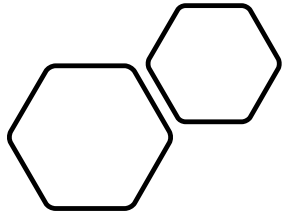


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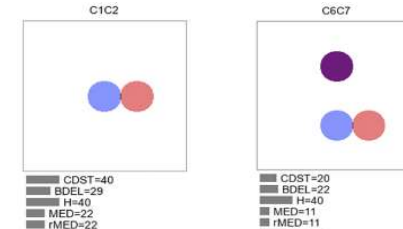


## C14 - C13





# Summary



	Handles Pathological Cases well?	No positional effects?	Sensitive to frequency bias?	Useful for rare events?	Reward partial perfect match?	Correctly penalize despite partial perfect match?
$G_\beta^*$	Yes	Yes	Yes	Yes	No	Yes
Centroid distance	No	Yes	No	No	No	No
Baddeley's $\Delta$	No	No	Yes	No	Yes	No
Hausdorff	No	Yes	No	Yes	No	No
MED**	No	Yes	No	Yes	Yes	Yes
FoM	No	Yes	Yes	Unclear	No	Yes

\*Answers may depend on choice of  $\beta$

\*\*Answers may depend on the asymmetry of MED (i.e., may only be true in one direction but always true if looking at both directions).

# Thank you

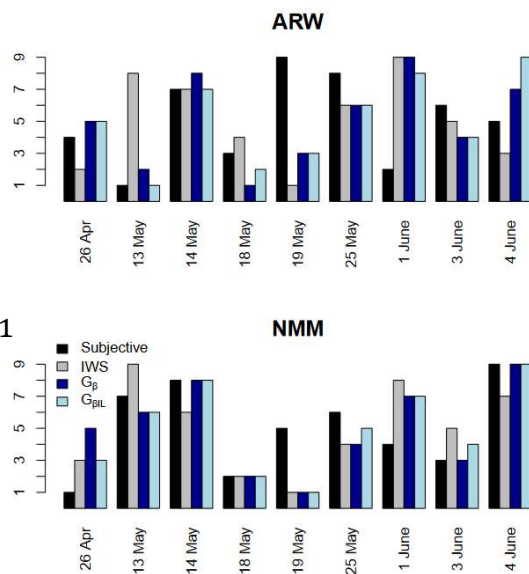
This presentation mostly covers the material in the paper below. For questions, I can be reached at the email address from my home page at:

<https://ral.ucar.edu/staff/ericg/>

Gilleland, E., 2020. Novel forecast performance metrics for high-resolution verification sets.

Submitted to *Advances in Statistical Climatology, Meteorology and Oceanography* (in review; temporarily available at:

<https://ral.ucar.edu/staff/ericg/Gilleland2020.pdf>)



Using  $\beta = \frac{N}{2}$   
and threshold  
of  $2.1 \text{ mm} \cdot \text{h}^{-1}$