



# Visual Analytics Using Density Equalizing Geographic Distortion

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# Why density equalization?

Visualizing the flood of large-scale geographic data can not cope with available screen space.

- Dens areas are hardly visible and accessible.
- Sparse areas waste space and bias perception.
- Analytic tasks – clustering, correlations, comparisons – can not be carried out.

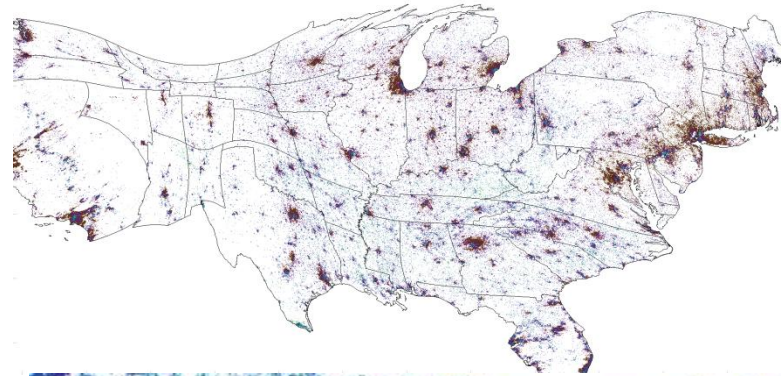


create density-equalized maps  
while preserve recognizable features  
and neighborhoods in the visualization

# Related Approaches

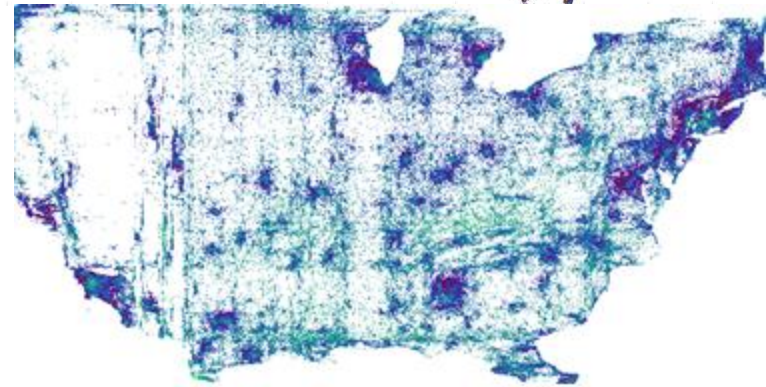
## Cartograms:

- ✓ Applicable for polygons
- ✗ Point data indirectly distortable
- ✗ Highly dependent on data resolution



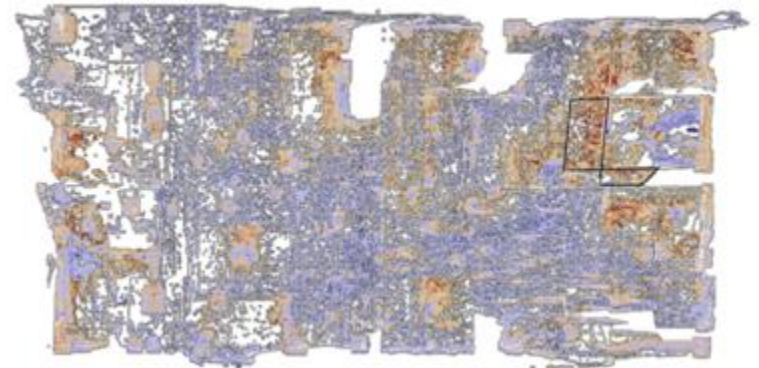
## HistoScale:

- ✓ Applicable to point data
- ✓ Good for reducing noise / outliers
- ✗ Creates artifacts (Euclidian dim.)



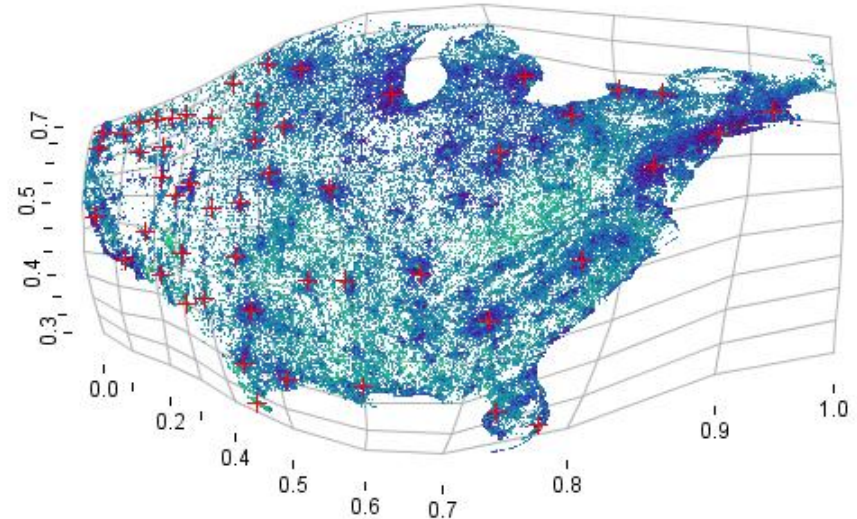
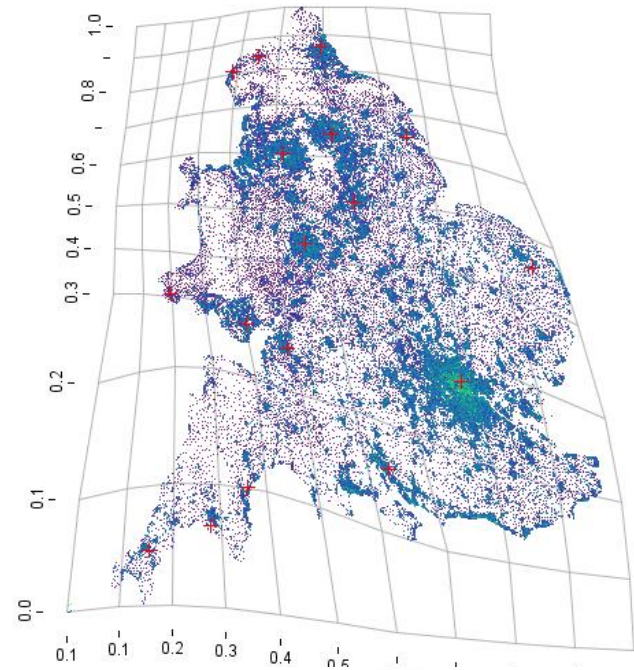
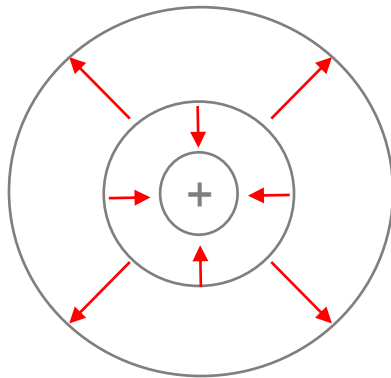
## Pixel Placement:

- ✓ Applicable to polygons and points
- ✓ Avoids overlap
- ✓ Equalized density
- ✗ Discontinuous neighborhood



# Proposed Approach – Radial Scale

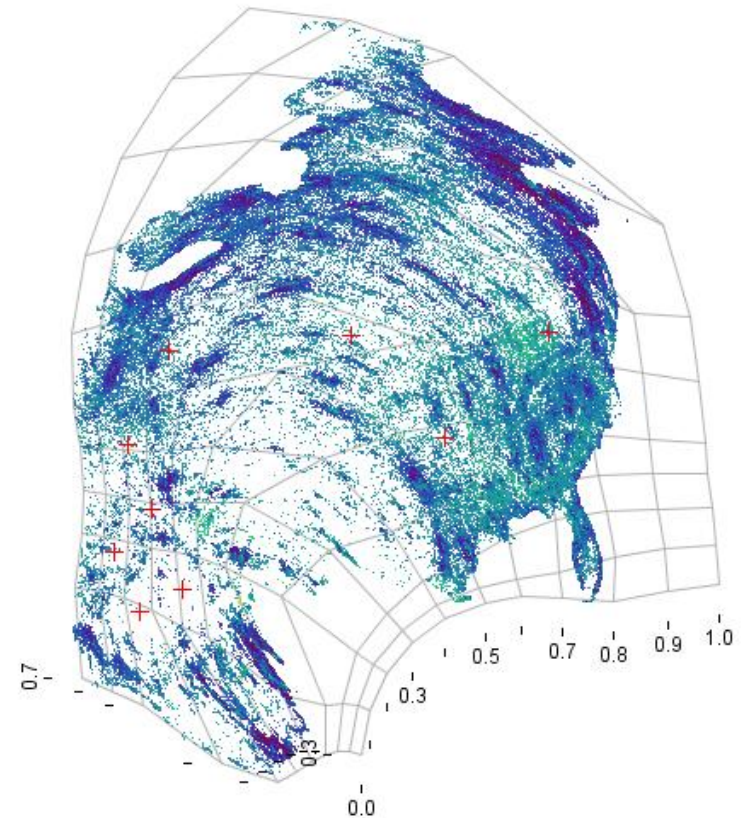
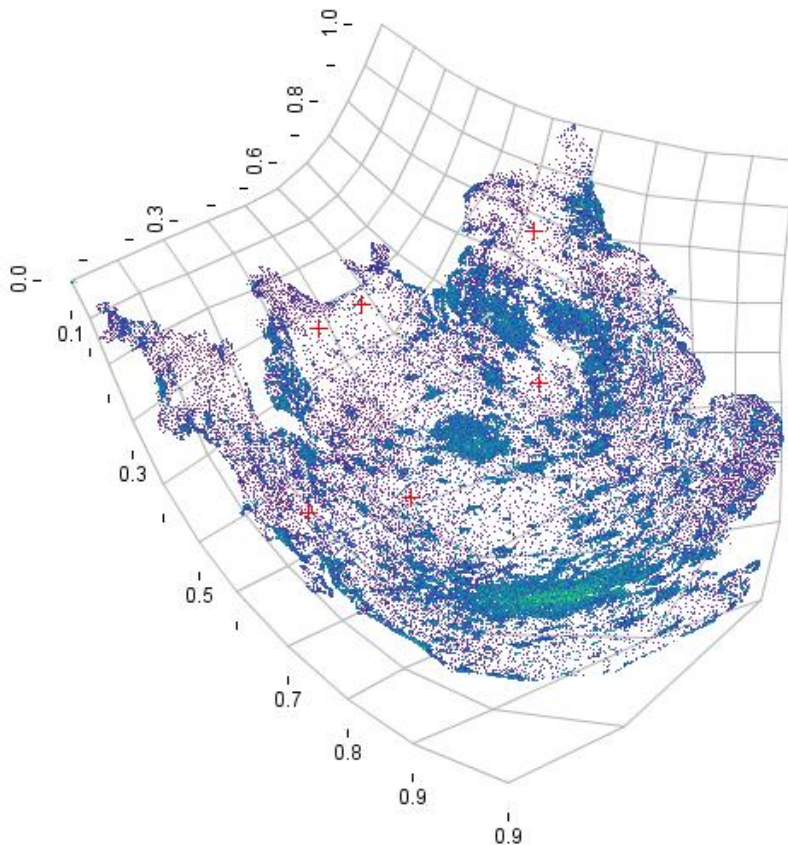
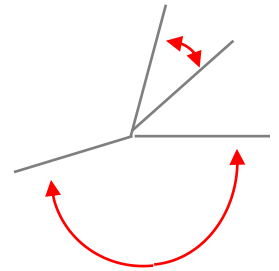
1. Determining centers of interest (high density areas)
2. Defining radial areas around each center point with equal area-size
3. Resize radial areas in accordance with their density
4. Scale with exponential decrease of the center's effect with distance.





# Proposed Approach – Angular Scale

1. Determining centers of interest (low density areas)
2. Defining angular segments around each center point
3. Resize angular areas in accordance with density.
4. Apply scaling for all points around all centers.



# Framework: Pipeline of Separate Distortions

HistoScaling

☒ Delete

X Bins: 255

Y Bins: 255

Weight: 100

MultiAngular

☒ Delete

Centers: 70

Bins: 200

Weight: 100

MultiRadial

☒ Delete

Centers: 70

Bins: 20

Exponent: 4

Weight: 100

0%

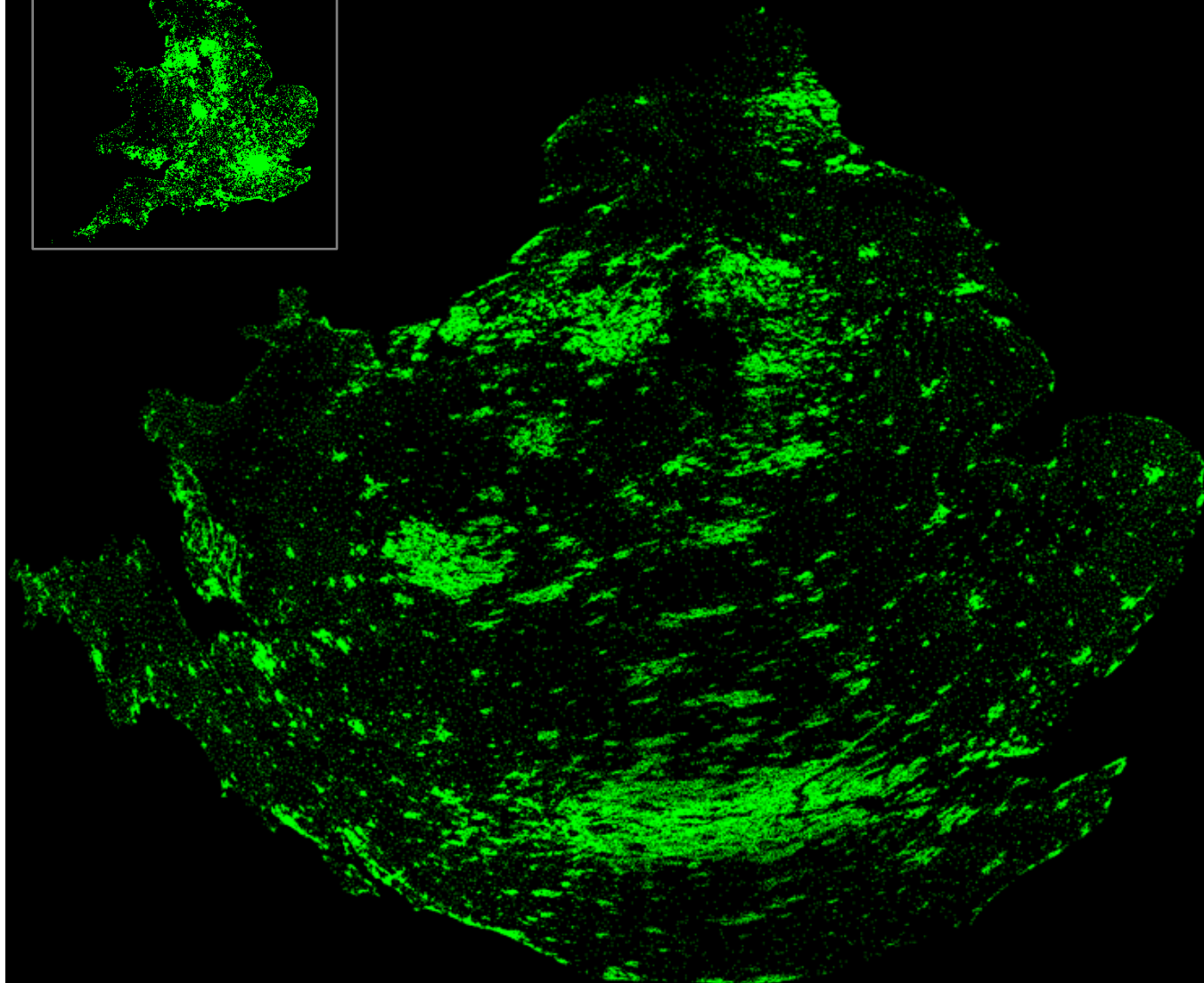
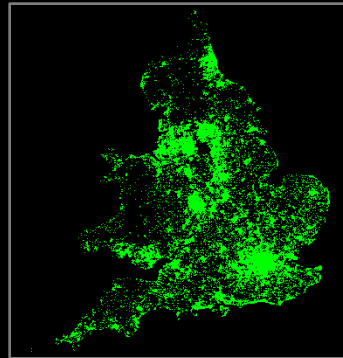
Distortion Weight

Weight: 100

Pixel Placement

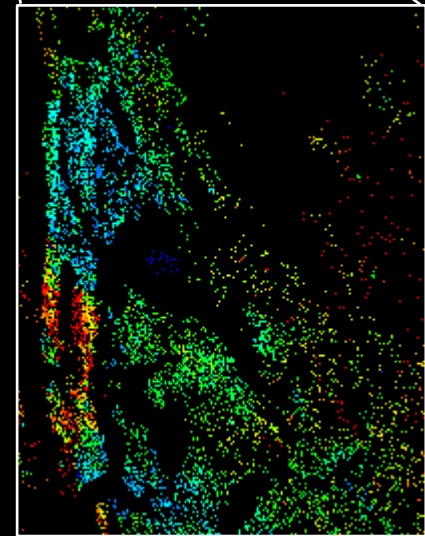
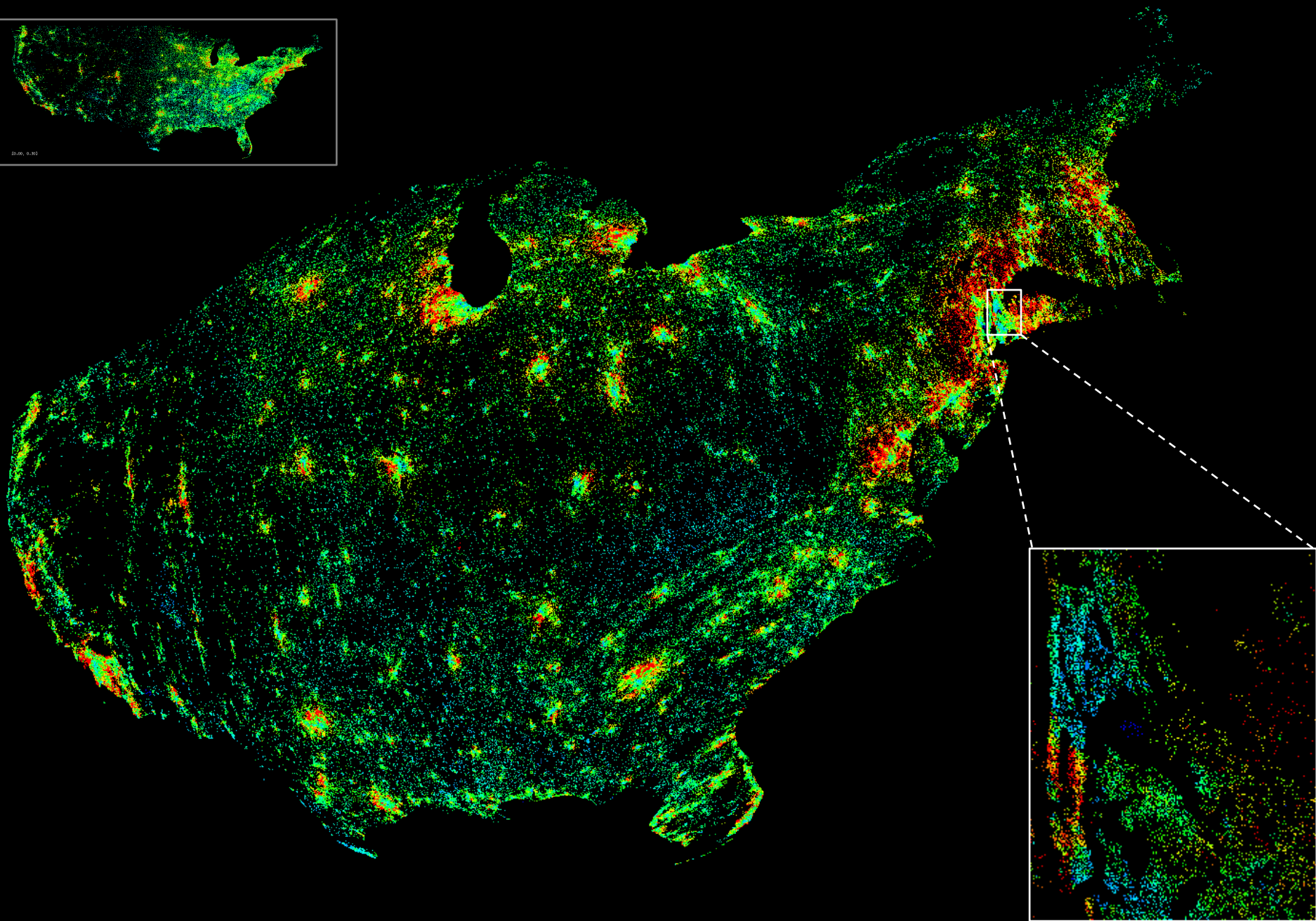
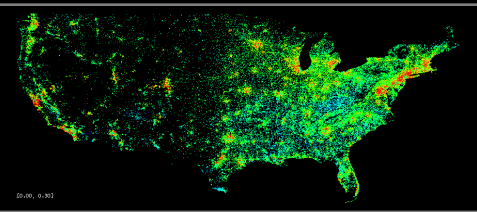
Weight: 0

England & Wales – Population 2001 (estimate) ■



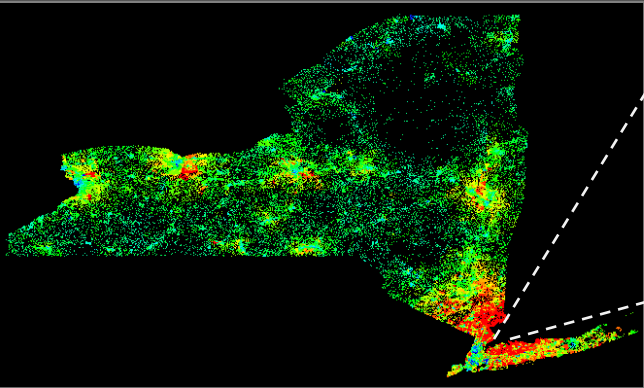
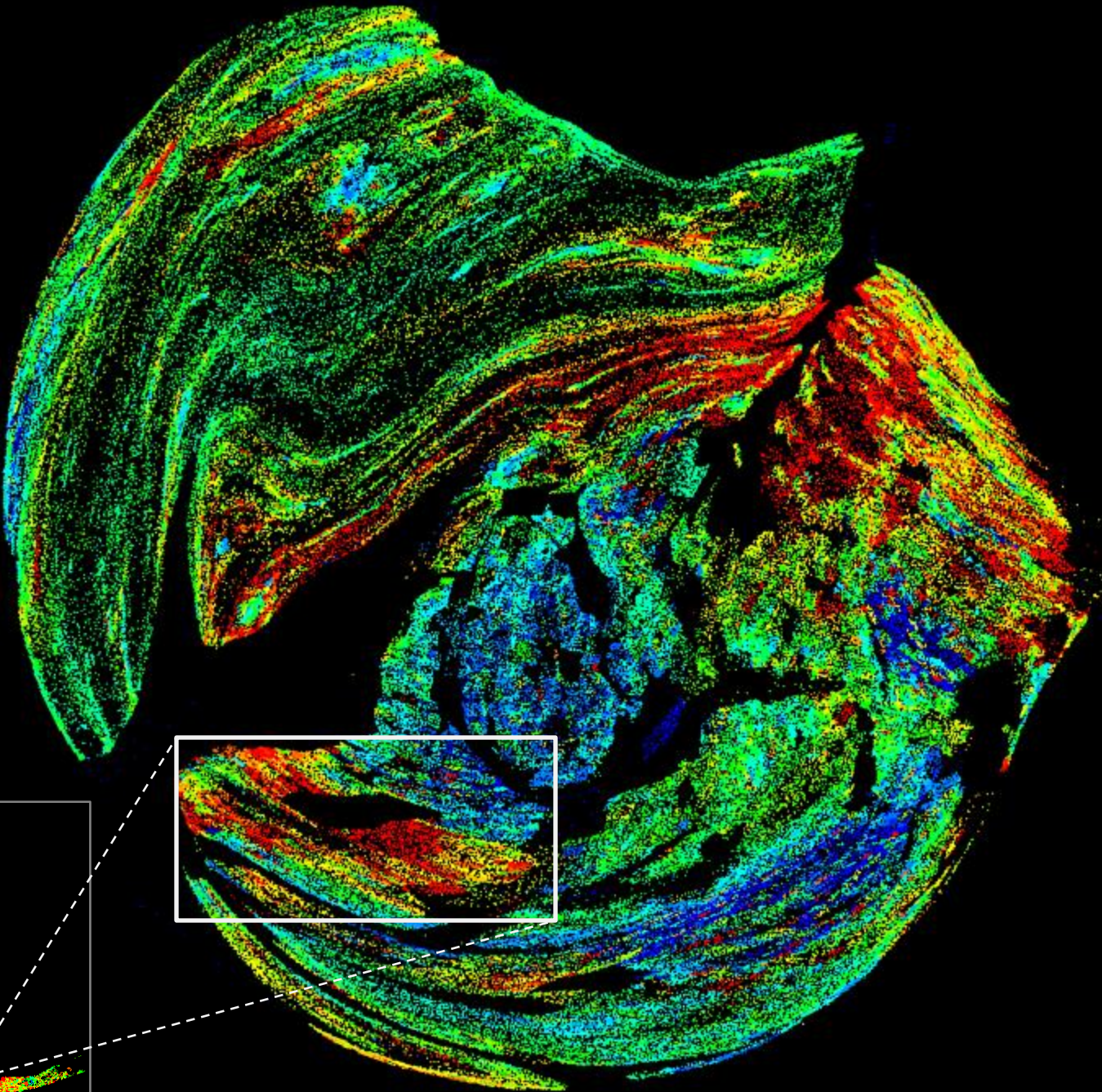


# US – Median Household Income 1999





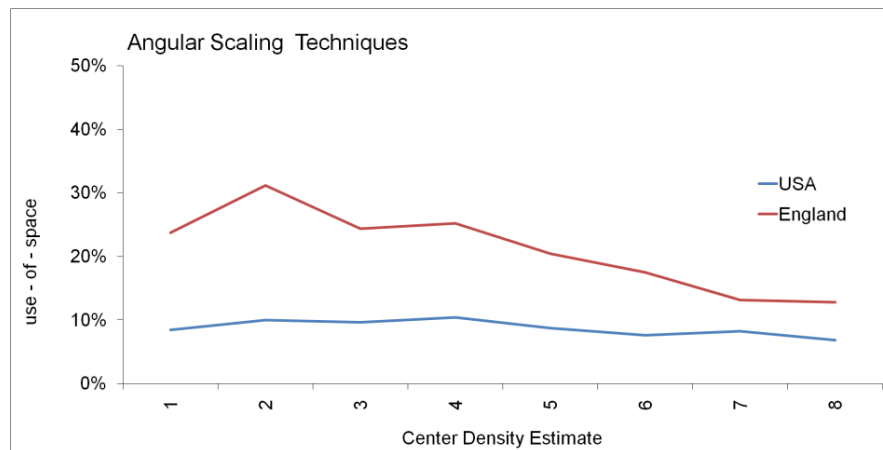
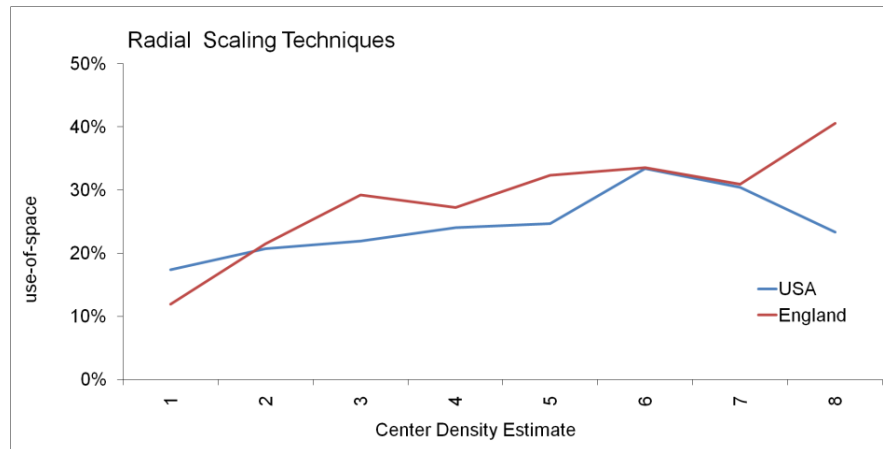
New York State –  
Median Household  
Income 1999





# Use-of-Space Estimate

Estimate the amount of efficiently used screen-space:



Similar Patterns for both datasets:

- Performance improves with more centers, just until a certain point, after which it decreases.

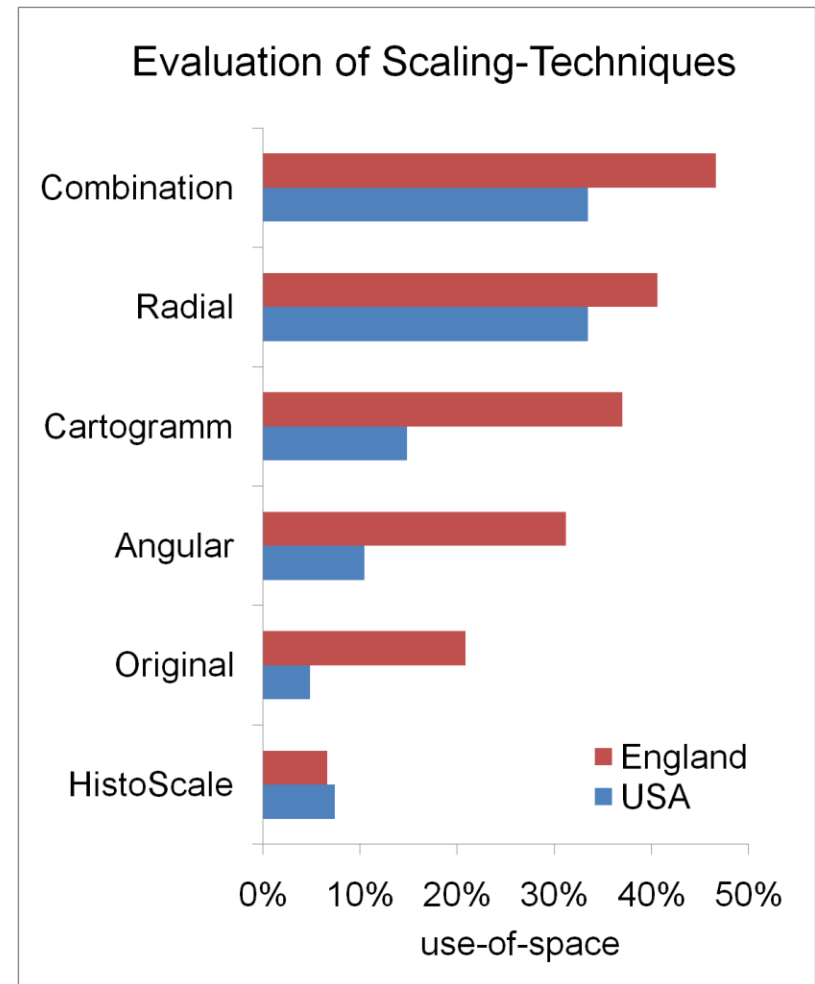
Data Dependency:

- England data shows a clear peak of performance.
- USA showed no effect of number of center points on performance.

# Discussion

## Advantages depend on:

- ✓ Data Properties:
  - Distribution in space,
  - Size of dataset
  - Type of data
- ✓ Task of the Distortion:
  - Highlighting,
  - Area-relations,
  - Density-equalization
- ✓ Type of evaluation measures:
  - Use – of – space
  - Shape-keeping
  - Information Visualization



Techniques should adjust to properties of the data.  
User-involvement improves performance

THANK YOU FOR  
YOUR ATTENTION





# Computation – Radial Scale

The input for the distortions are the data-points  $P = \{p_1; p_2; p_3; \dots\}$ , the centers  $C = \{c_1; c_2; c_3; \dots\}$ , and the number of bins to use  $w$ .

With  $d_{ij}$  as the distances between point  $p_i$  and the center  $c_j$ .

Area of one bin:

$$a_j = 2\pi/w \cdot \max_{p_i \in P} (d_{i,j}^2),$$

Radius of a bin  $k$ :

$$r_j^{(k)} = \sqrt{k \cdot a_j / (2\pi)}, k \in \{1, 2, \dots, w\}$$

new Radius of a bin  $k$ :

$$r_j'^{(k)} = \sqrt{\frac{\left| \left\{ p_i \mid d_{i,j} \leq r_j^{(k)} \right\} \right| (w \cdot a_j)}{|P| 2\pi}}$$

Relative Radius of point in the bin:

$$r_j'^{(b_{i,j})}$$

Bin number of point and center:

$$b_{i,j} = \left\lfloor \frac{2\pi d_{i,j}^2}{a_j} \right\rfloor + 1$$

Width of a bin  $k$  before distortion:

$$\Delta r_j^{(k)} = r_j^{(k)} - r_j^{(k-1)} \quad \text{after:} \quad \Delta r_j'^{(k)} = r_j'^{(k)} - r_j'^{(k-1)}$$

new distance of point from center:

$$d_{i,j}' = d_{i,j} + \left( r_j'^{(b_{i,j})} - \frac{r_j^{(b_{i,j})} - d_{i,j}}{\Delta r_j^{(b_{i,j})}} \cdot \Delta r_j'^{(b_{i,j})} - d_{i,j} \right) \frac{1}{e^{d_{i,j}}}$$

# Computation – Angular Scale

The input is the point set  $P$ , the centers  $C$ , and the number of bins to use  $w$ . With  $d_{ij}$  as the distances between point  $p_i$  and the center  $c_j$ .

Angle of one point for center:

$$\phi_{i,j} \in [0, 2\pi)$$

Bin number of point for center:

$$b_{i,j}$$

Scaled Angle of bin  $k$ :

$$a_j^{(k)}$$

} analog to Radial Scale

Relative Angle of point in the bin:

$$a_j^{(b_{i,j})}$$

new angle of point from center:

$$\phi'_{i,j} = \phi_{i,j} + \left( a_j^{(b_{i,j})} - \left( b_{i,j} - \frac{\phi \cdot w}{2\pi} \right) \cdot \Delta a_j^{(k)} - \phi_{i,j} \right)$$

Final location of a point as vector sum:

$$p'_i = p_i + \sum_{j=1}^{|C|} (p'_{i,j} - p_i)$$