



## API for Clustering Geo-References Data on Maps: 1M Objects in 1s

Mohammad Rezaei, Pasi Fränti Speech and Image Processing Unit School of Computing

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## **TOO MANY MARKERS**



#### **Problems:**

- Interaction
- Covering Map

## DIFFERENCE WITH NORMAL DATA CLUSTERING

#### Normal clustering



#### Clutter removal



## **CLUSTERING PROBLEM**

Cluster representative: icon with the size  $(W_I, H_I)$ There can be as many as clusters without overlap of their representatives:

$$\|C_i - C_j\| \ge T \times \sqrt{W_i^2 + H_i^2}$$
,  $T \ge 1$ 



# NON-SPATIAL AND SPATIAL

- Non-Spatial: query for other attributes of the objects rather than location
- **Spatial:** query for the objects in a specified region, given a set of data



## **CLUSTERING STRATEGIES**

#### **Client-side clustering**

- All results (1M) are sent to client (bandwidth)
- Clustering is performed on client

#### Server-side clustering

- Only summary of clusters are sent to client
- Spatial query: pre-clustering of entire data
- Non-spatial query: need on-demand clustering

## MARKER CLUSTERING API

• Grid-based clustering

• Server-side approach

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## **GRID-BASED CLUSTERING**

#### **Three steps**

- 1. Grid construction
- 2. Assign objects to cells
- 3. Merge neighbors based on a criteria to form final clusters





## ASSIGNMENT

Row and column of the for an object at (x, y):

$$row = \left[\frac{y - y_{\min}}{H_c}\right]$$
$$column = \left[\frac{x - x_{\min}}{W_c}\right]$$

Cells that contain any objects become initial clusters. From each cluster we store:

- Average location of objects (centroid)
- Number of objects (N)
- Bounding box to cover the area of objects

## **MERGING OVERLAPPING CELLS**

Checking overlap of representative icons Consider a cell and its 8 neighbors

Merging clusters:  $x = \frac{n_1 x_1 + n_2 x_2}{n_1 + n_2}$   $y = \frac{n_1 y_1 + n_2 y_2}{n_1 + n_2}$   $n = n_1 + n_2$ 











## **STEP 3: MERGNIG OVERLAPPING CELLS**



## **SERVER-SIDE APPROACH**



## ACCESS TO OBJECTS IN THE CLUSTER

# **Goal:** Show *m*<sup>th</sup> object **Steps:**

- 1. Spatial query using the bounding box of a cluster
- 2. Get the id of  $m^{\text{th}}$  object
- 3. Make query using id
- 4. Send the data to client



## ACCESS TO OBJECTS IN CLUSTER

**Goal:** Show  $m^{\text{th}}$  object

#### Steps:

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## **BOUNDING BOX OF MERGED CLUSTER**

**Issue:** bounding box of a merged cluster might contain objects from other clusters



**Solution:** Use bounding boxes of initial clusters cells

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## CONCLUSION

- $\bullet$  Freeware implementation using C code
- Very fast: 1M objects in 0.23 seconds!
- Download size is naturally limited by screen size

## <u>Demo</u>

- <u>http://cs.uef.fi/paikka/rezaei/markerClustering\_paper/markerClustering\_test/</u>