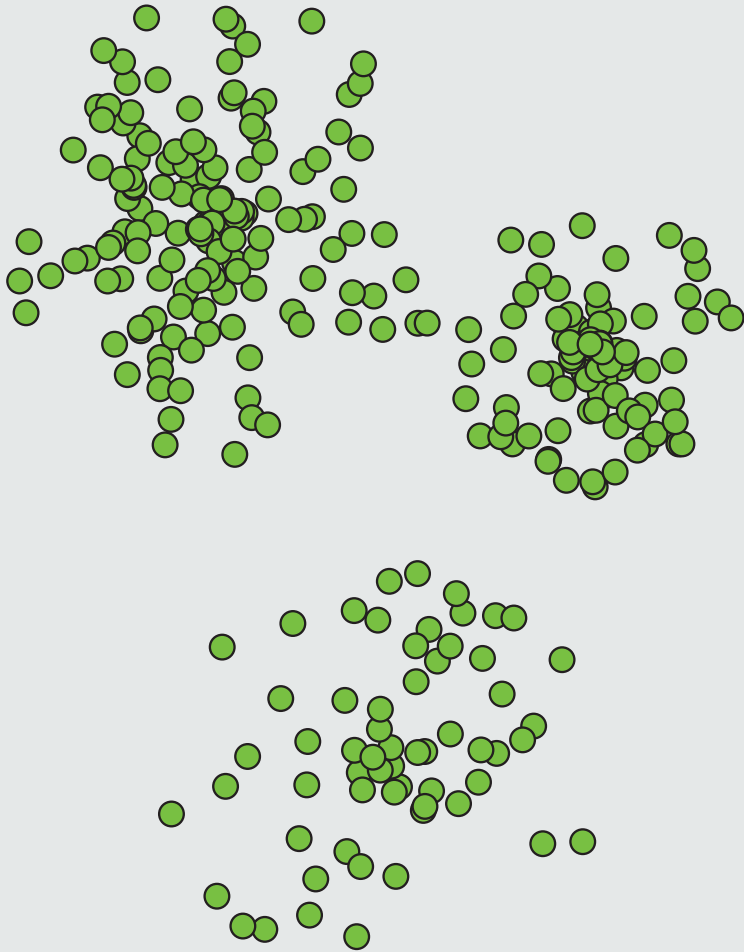


Clustering: The k -means Problem

Definition: The k -means Problem

Example

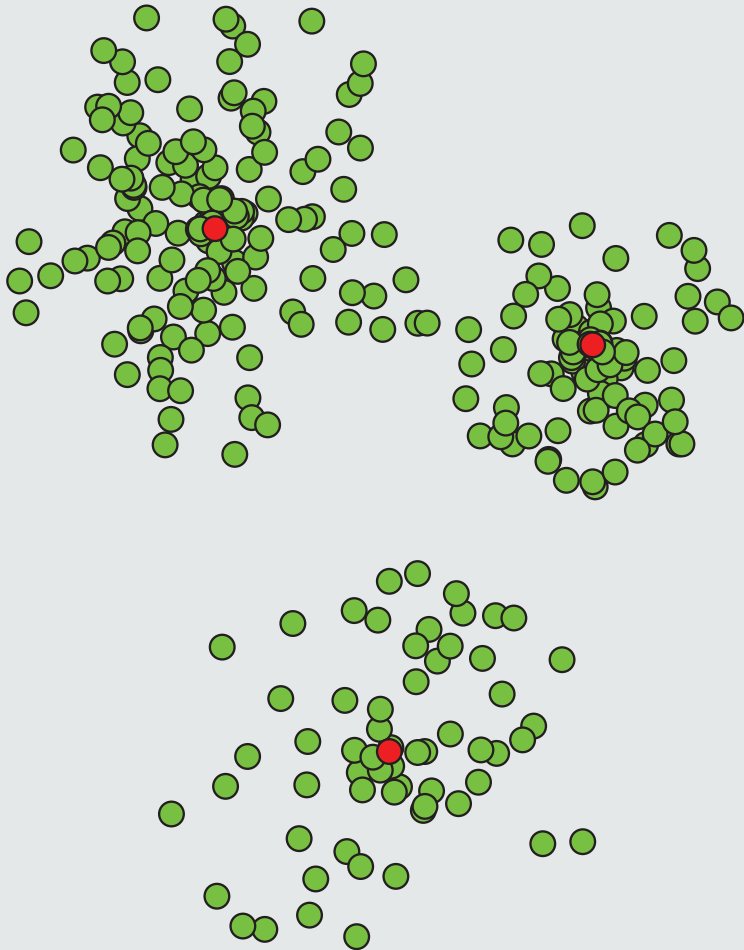


The Problem

- Input points $P \subseteq \mathbb{R}^d$

Definition: The k -means Problem

Example



The Problem

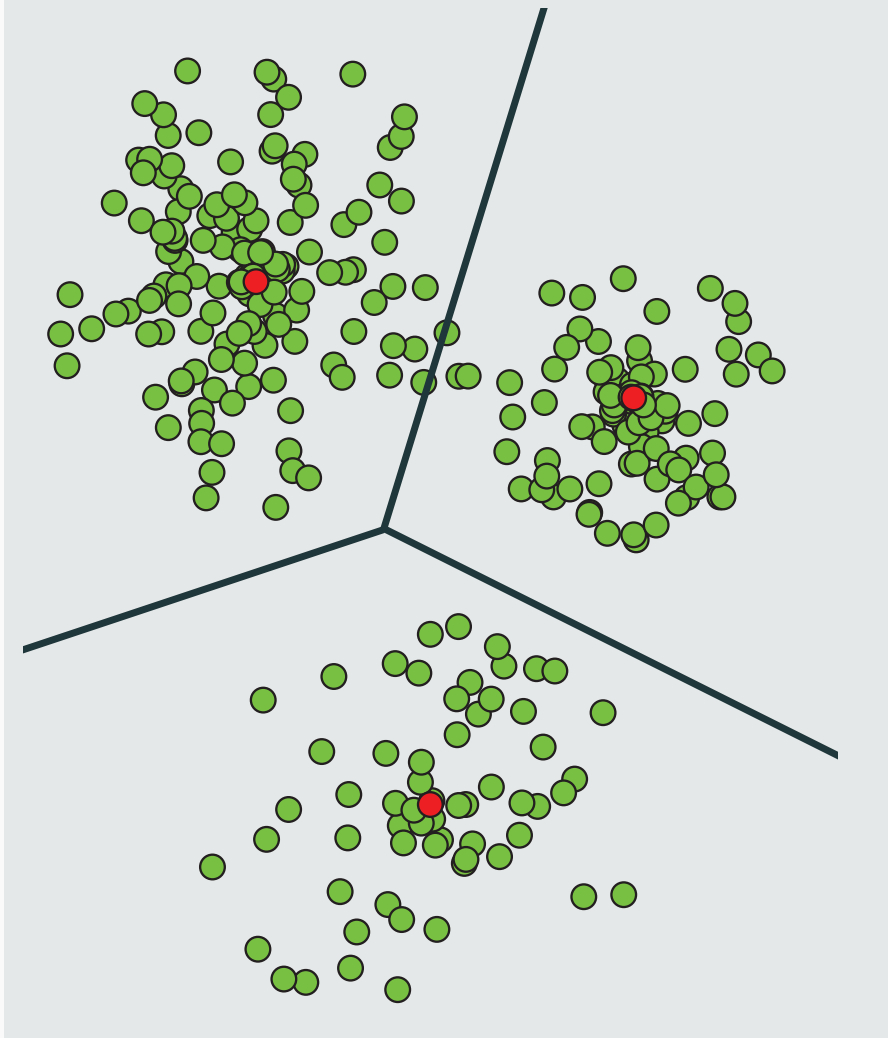
- Input points $P \subseteq \mathbb{R}^d$
- Compute a set $C \subseteq \mathbb{R}^d$ with $|C| = k$ centers such that the sum of squared distances

$$\sum_{x \in P} \min_{c \in C} \|c - x\|^2$$

is minimized.

Definition: The k -means Problem

Example



The Problem

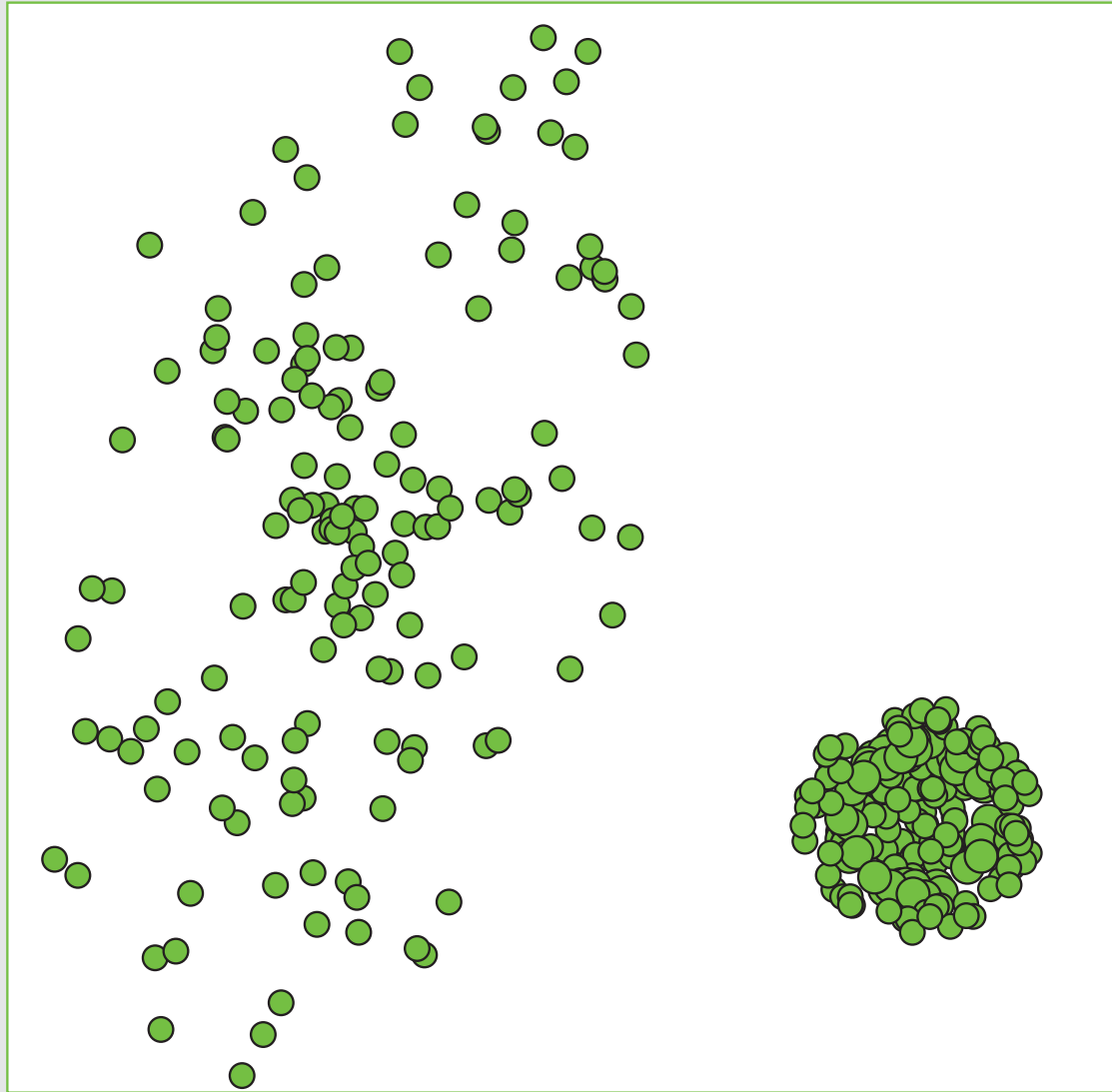
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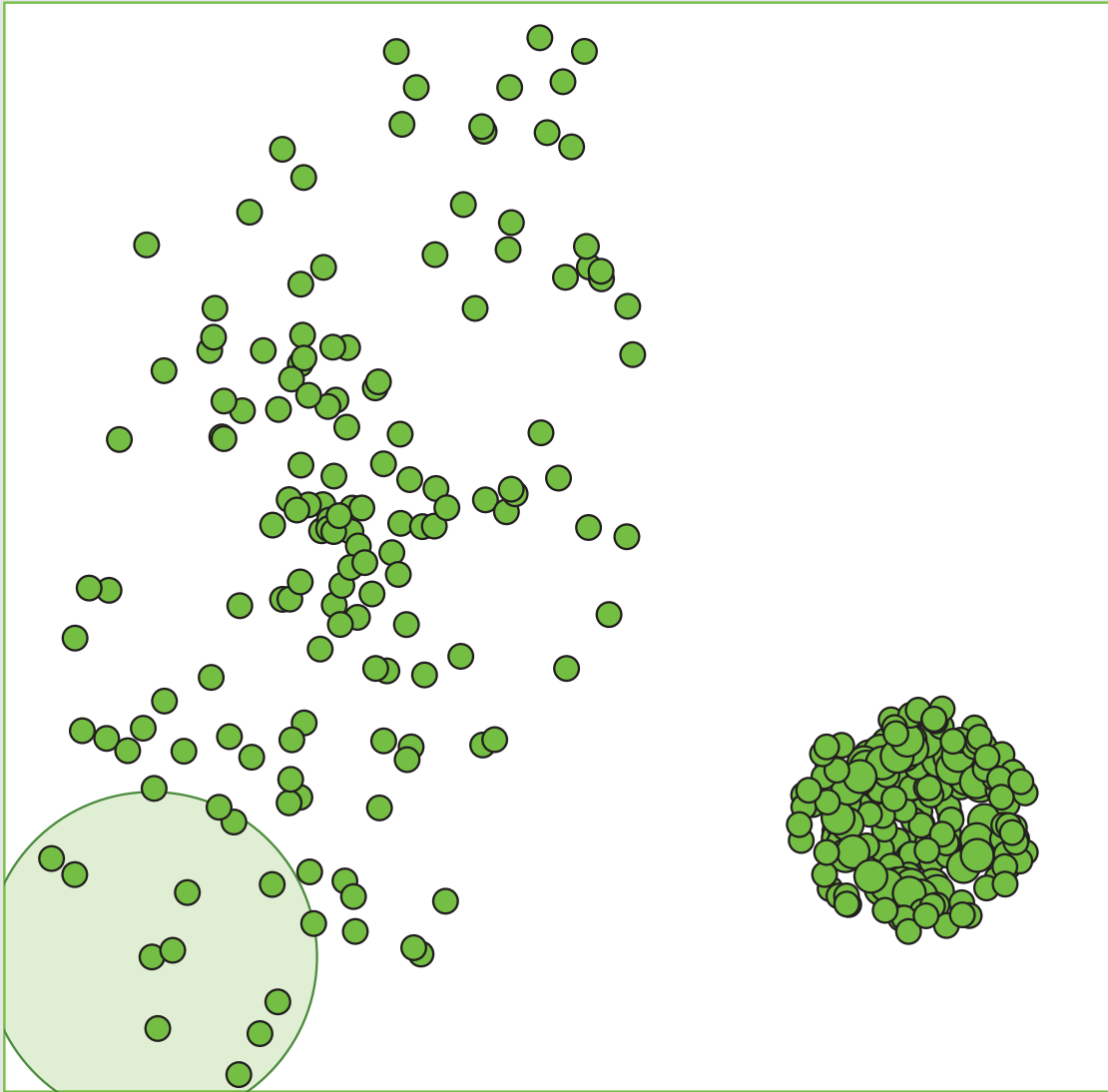
Reduction Idea: Smart Covering

BICO – Birch meets COresets



Reduction Idea: Smart Covering

BICO – Birch meets COresets

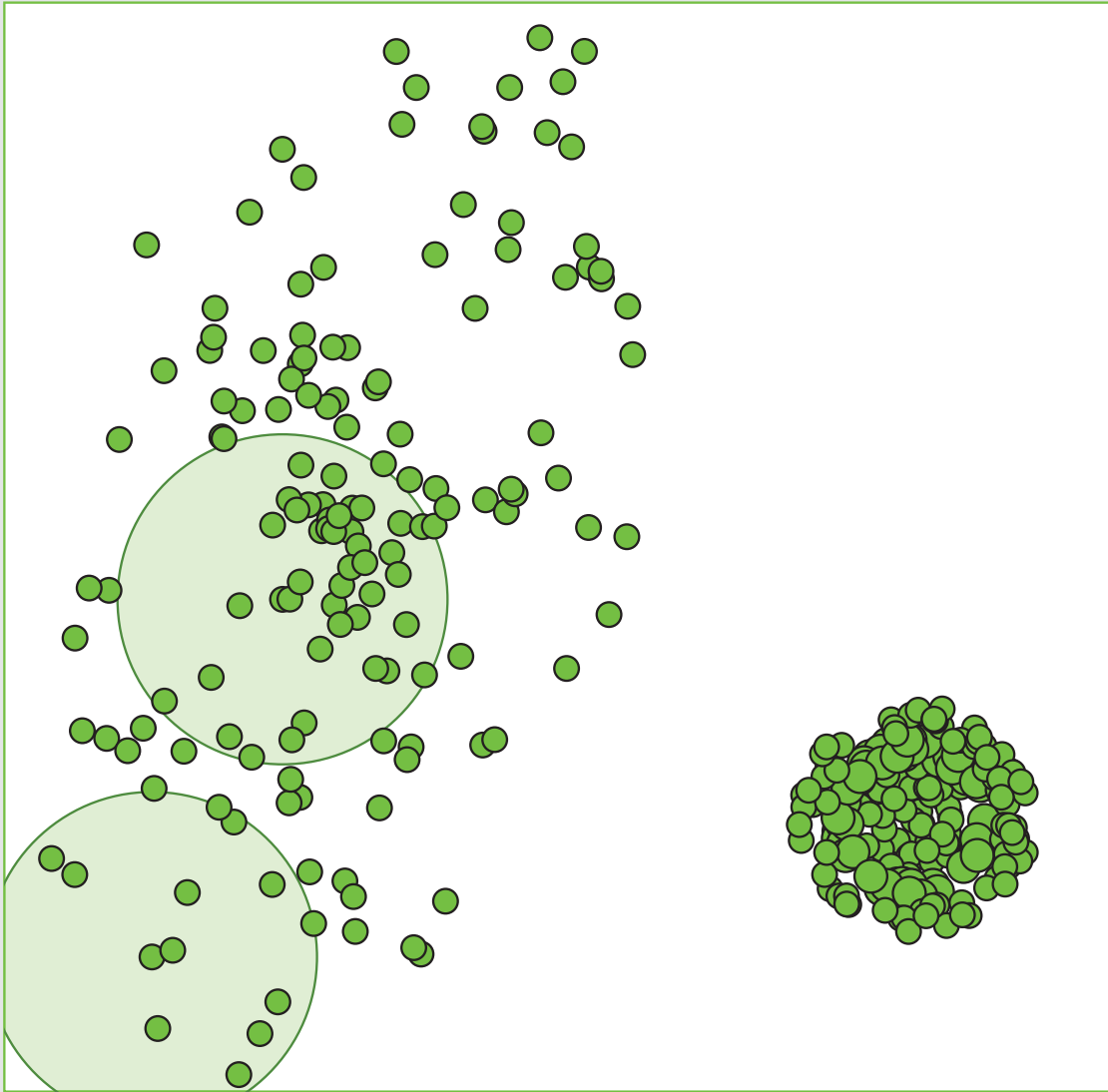


Idea

- Compute ball cover

Reduction Idea: Smart Covering

BICO – Birch meets COresets

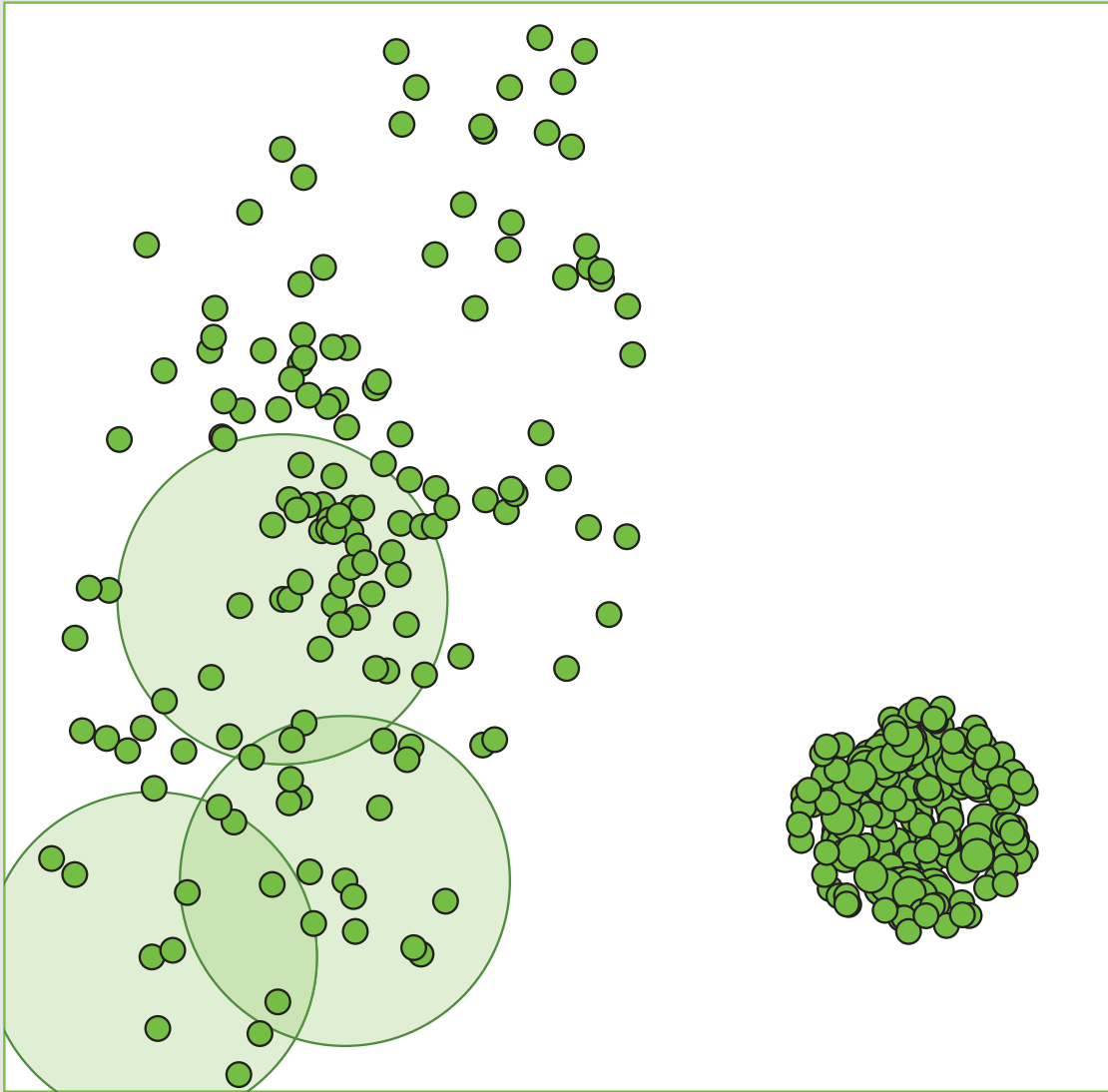


Idea

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BICO – Birch meets COresets

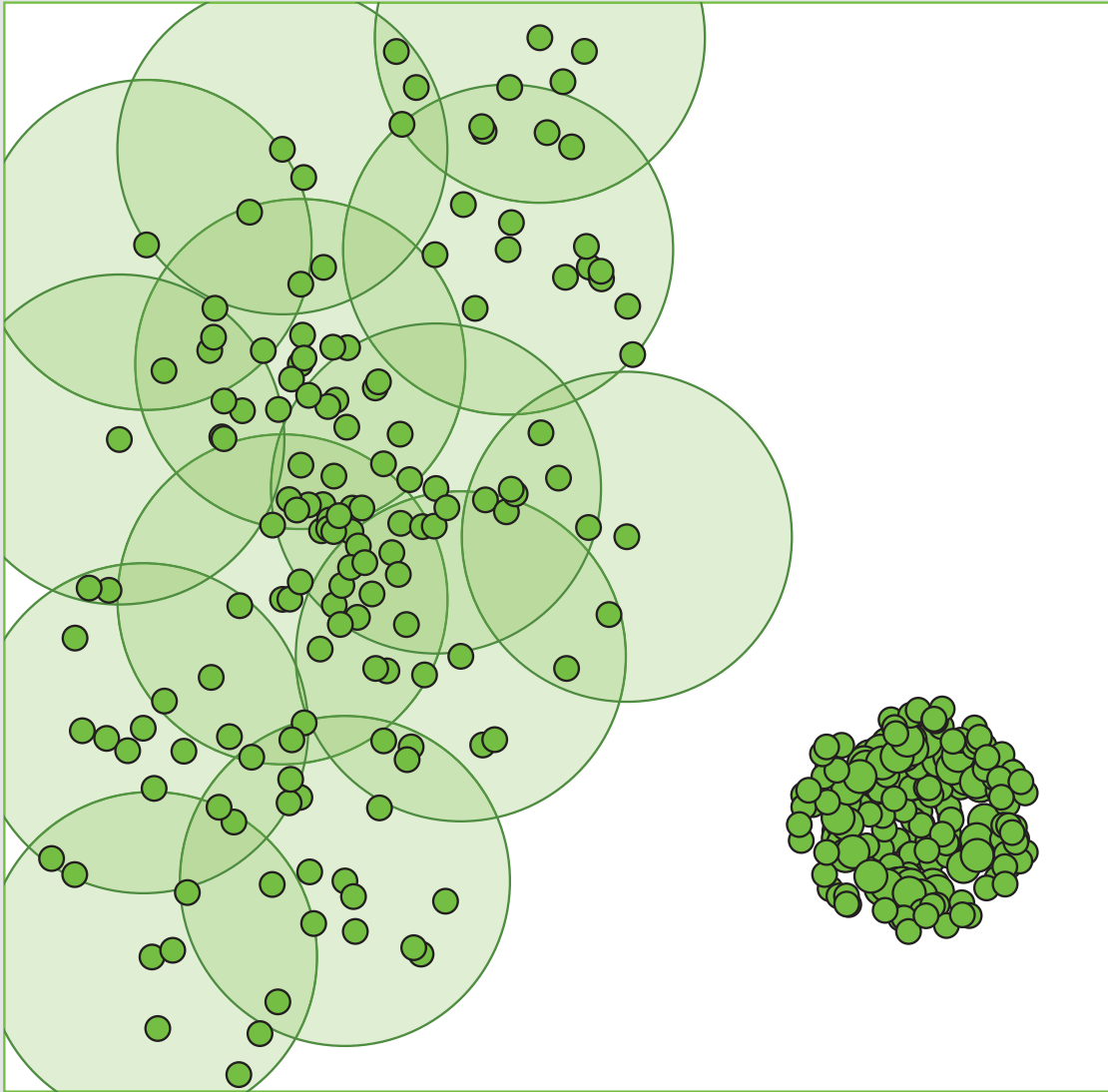


Idea

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Reduction Idea: Smart Covering

BICO – Birch meets COresets

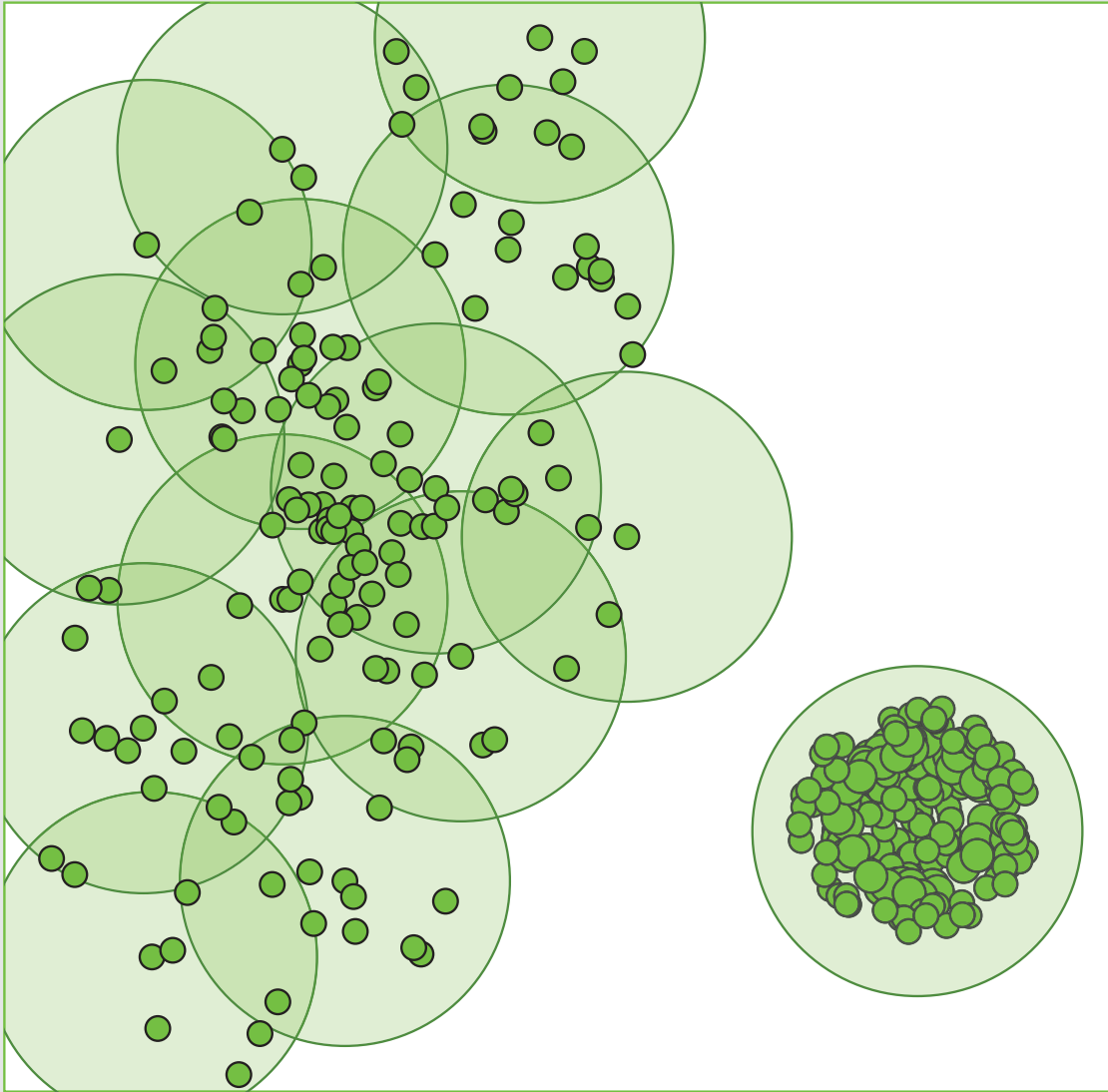


Idea

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Reduction Idea: Smart Covering

BICO – Birch meets COresets

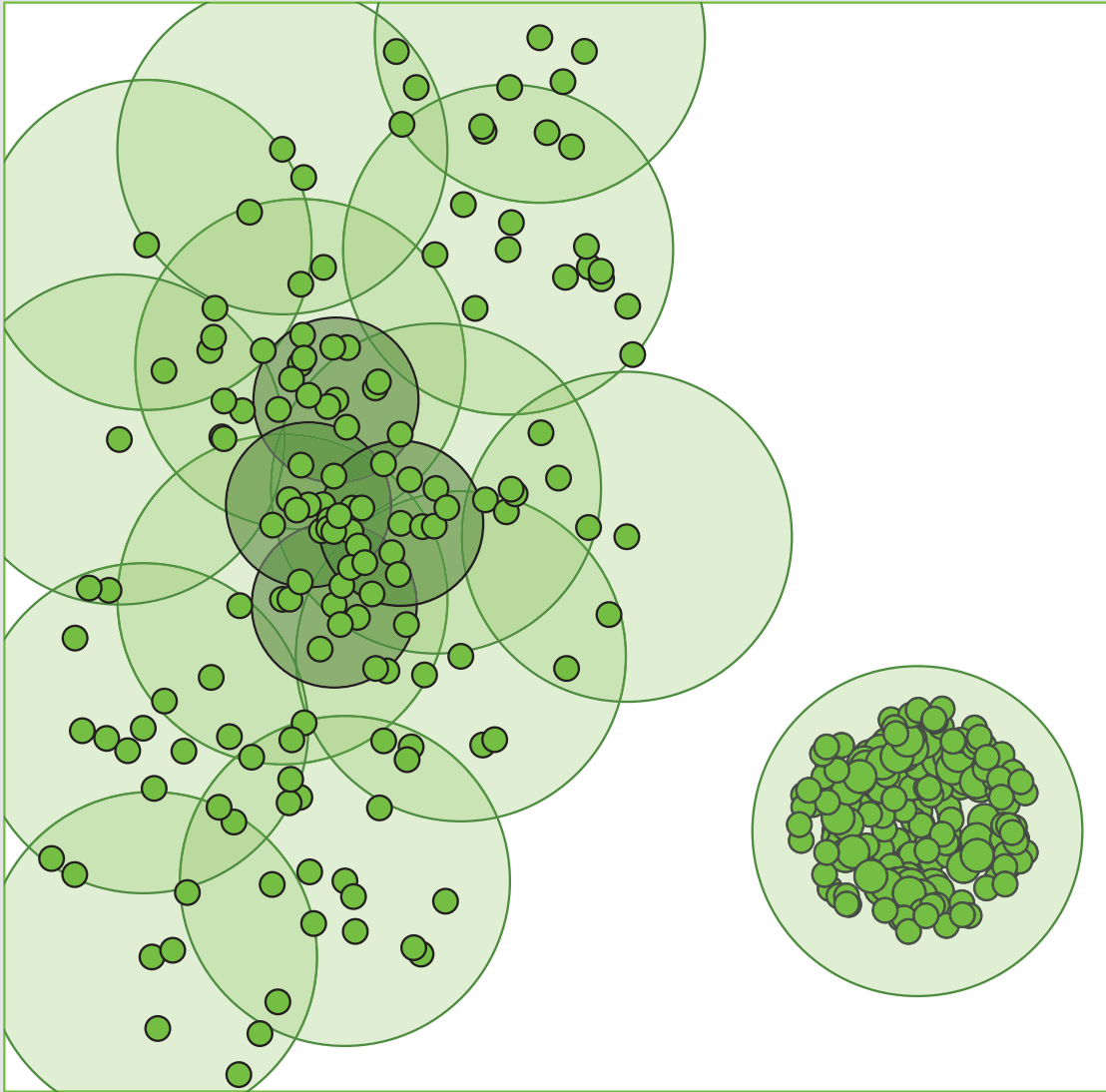


Idea

- Compute ball cover
- Replace points within each ball by center

Reduction Idea: Smart Covering

BICO – Blrch meets COresets

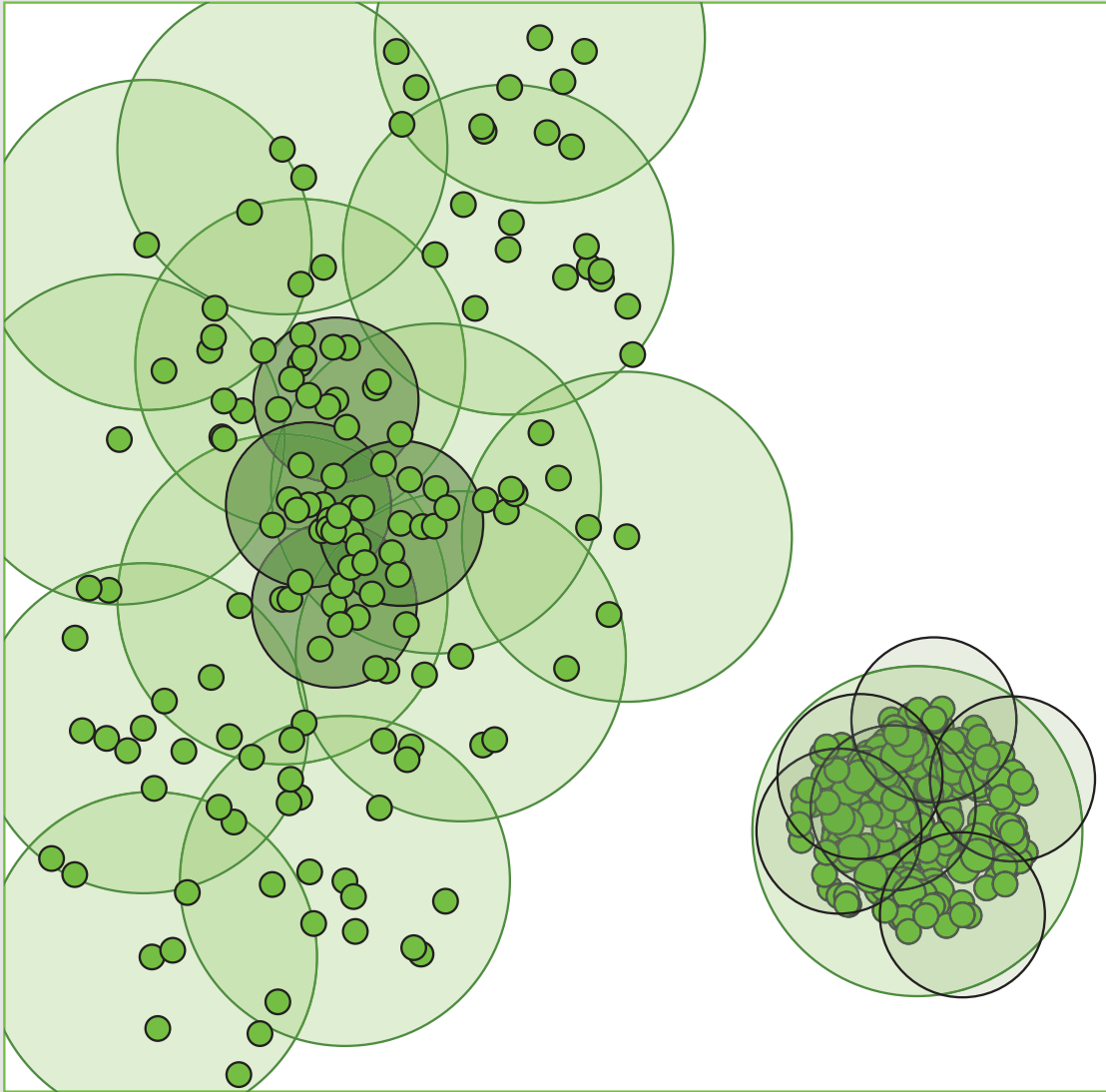


Idea

- Compute ball cover
- Replace points within each ball by center
- If ball gets too *heavy*, open new ball with smaller radius

Reduction Idea: Smart Covering

BICO – Birch meets COresets

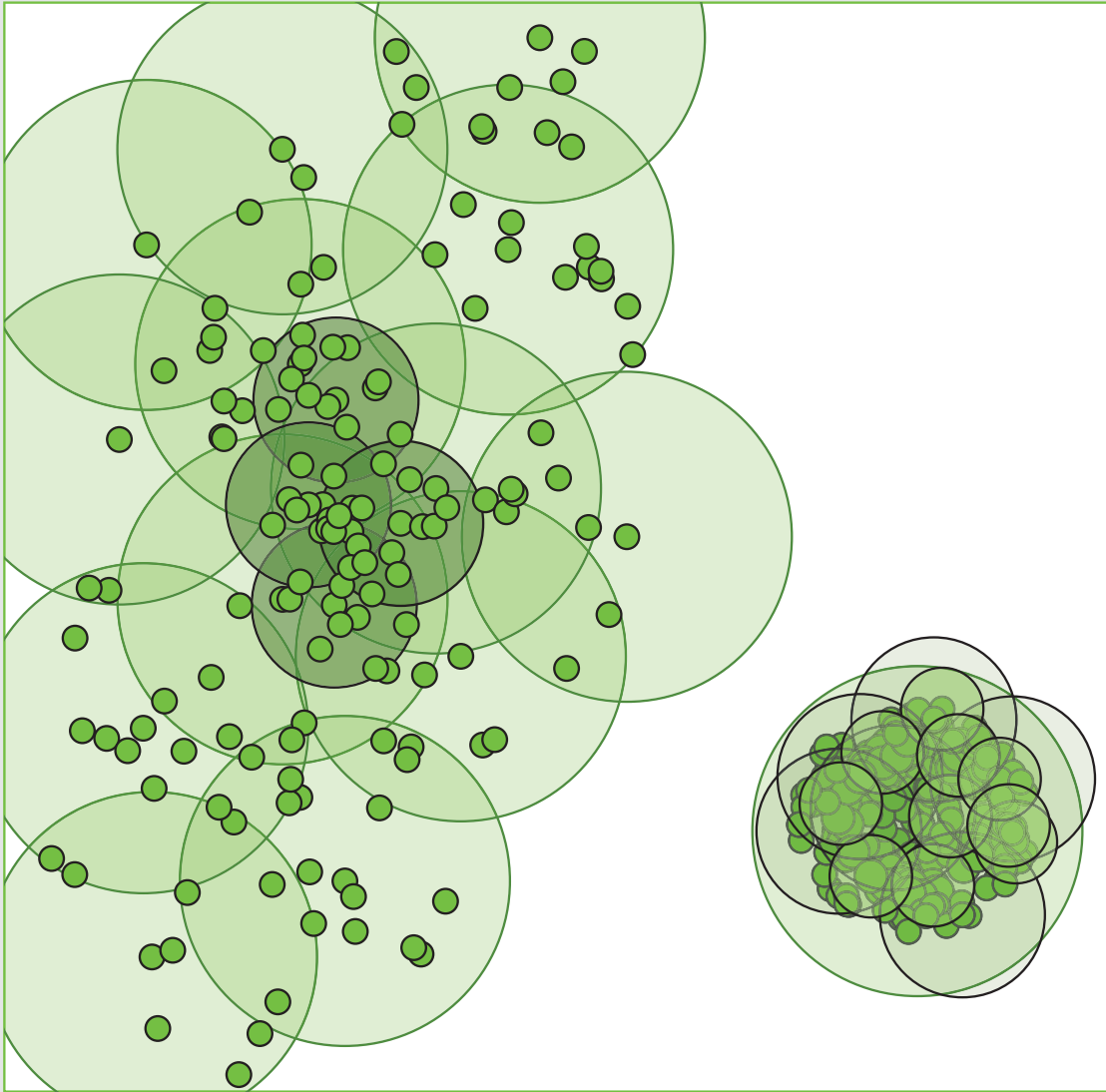


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BICO – Birch meets COresets

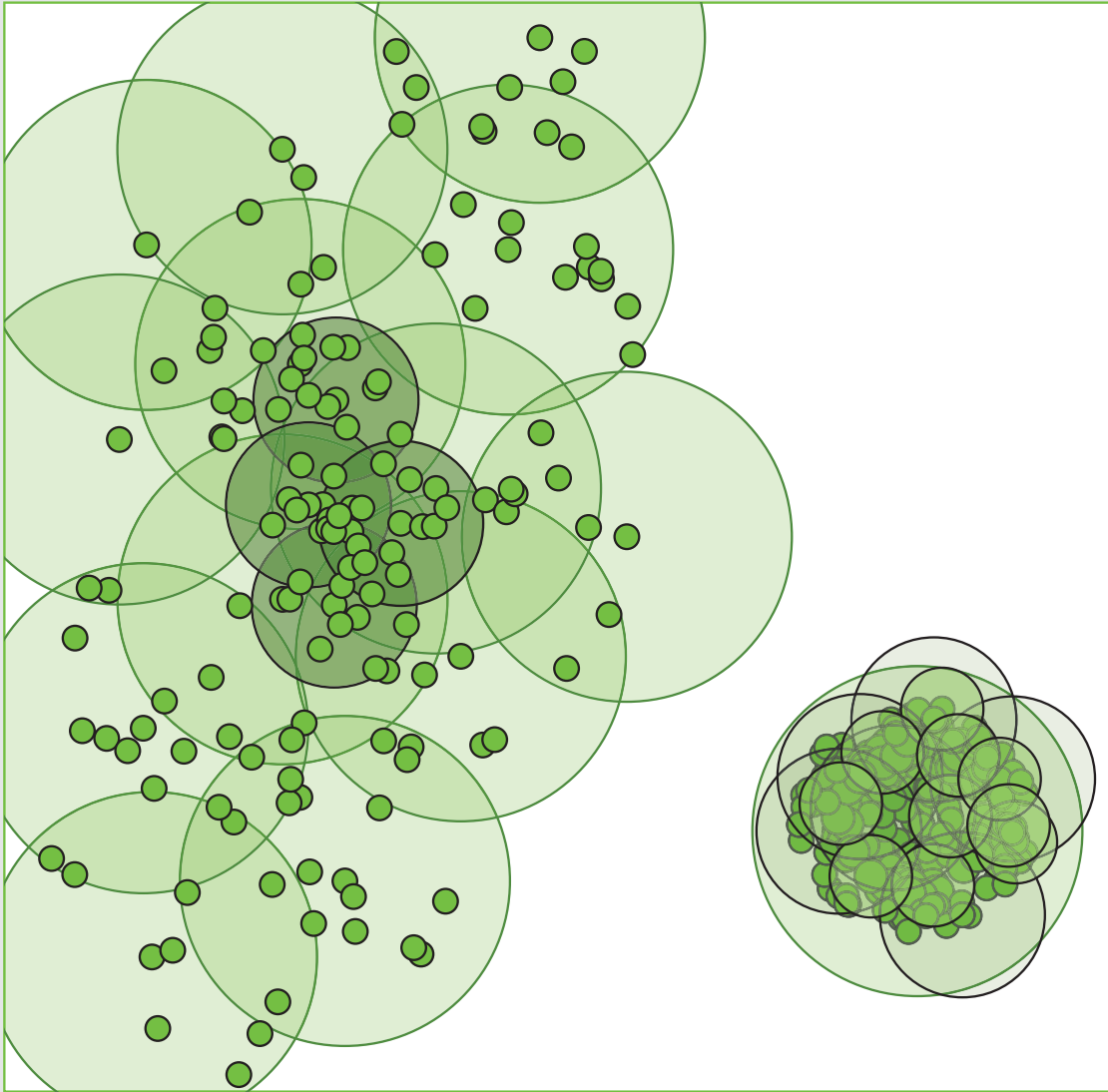


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Reduction Idea: Smart Covering

BICO – Birch meets COresets



Idea

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Theoretical Result

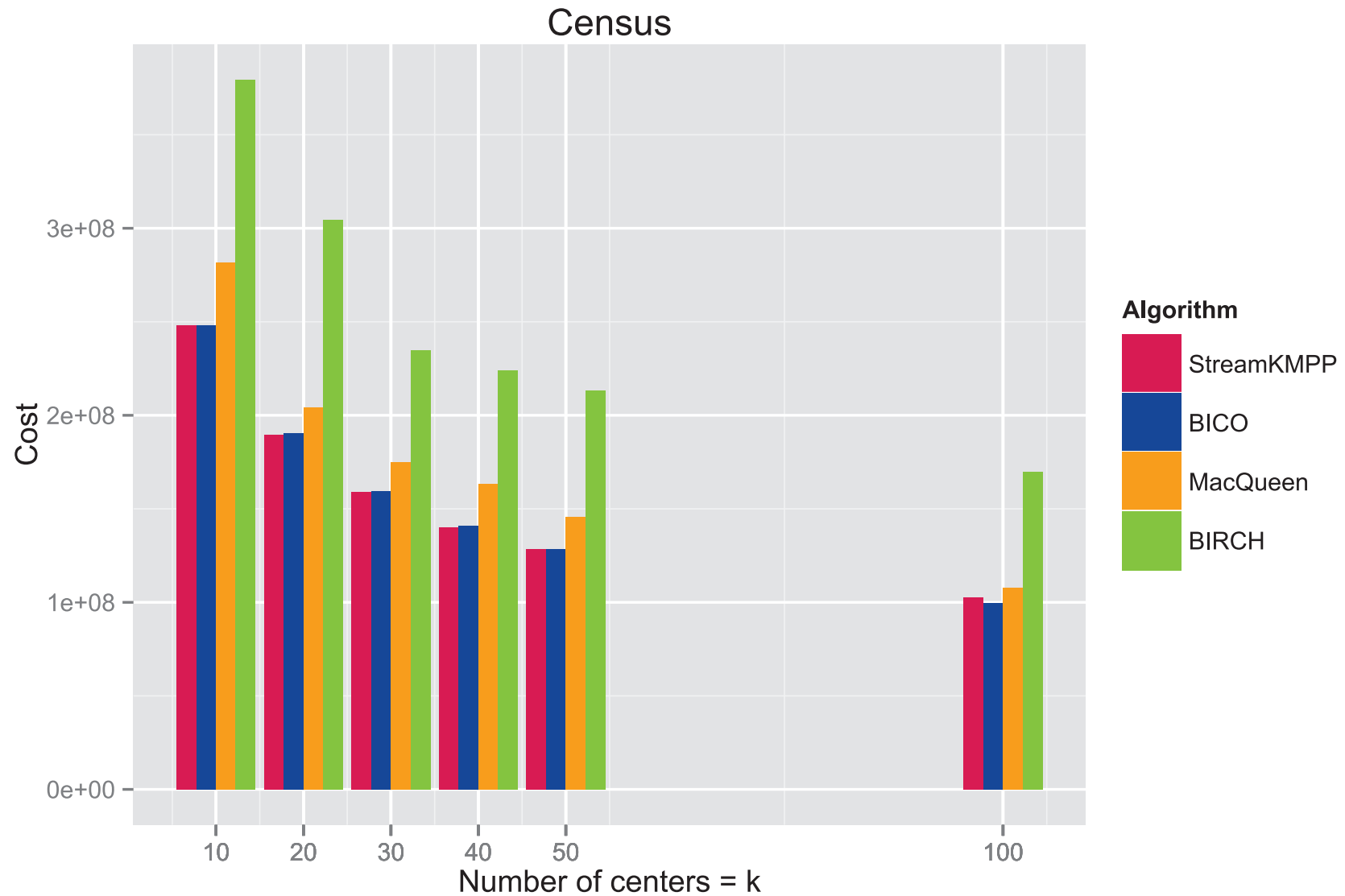
Low dimensions:

$$\text{Size} \approx k \log n \ll n$$

Implementation

Good results with size $200k$

BICO: Experimental Results



BICO: Experimental Results

