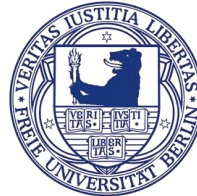


Closest Pairs in Doubling Metrics

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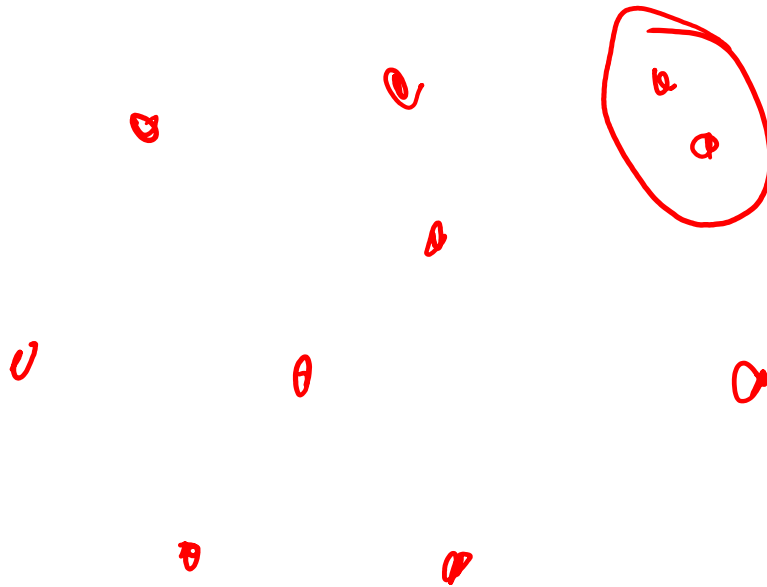
Michiel Smid



The Problem

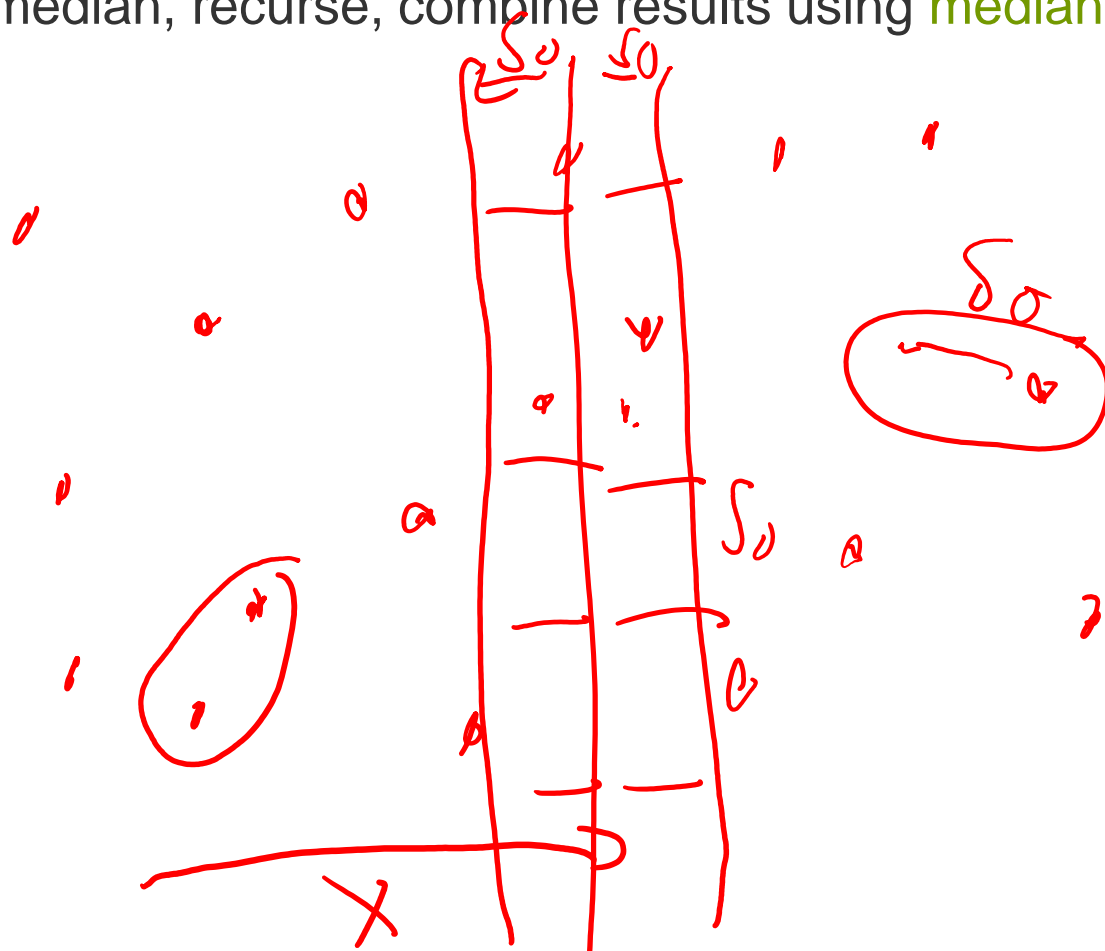
Given: N points P in the plane

Want: closest pair of P



$O(N \log N)$ Algorithm by Bentley-Shamos

classic textbook algorithm: sort by x -coordinate, split on median, recurse, combine results using **median slab**



General Metric Spaces

P : finite set with N elements

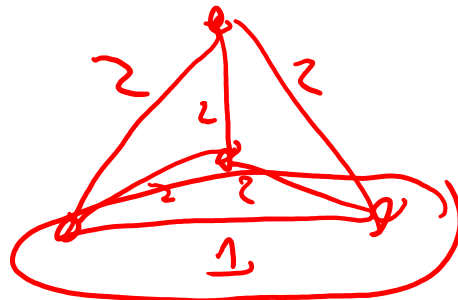
$d: P \times P \rightarrow \mathbb{R}_{\geq 0}$

1. $d(x, y) = 0 \leftrightarrow x = y$, f.a. $x, y \in P$
2. $d(x, y) = d(y, x)$, f.a. $x, y \in P$
3. $d(x, y) \leq d(x, z) + d(z, y)$, f.a. $x, y, z \in P$

Assumption: Have $O(1)$ oracle to compute $d(x, y)$ for given $x, y \in P$.

Lower bound: Need $\Omega(N^2)$ time in general metric spaces.

Exactly one pairwise distance = 1, all other pairwise distances = 2.

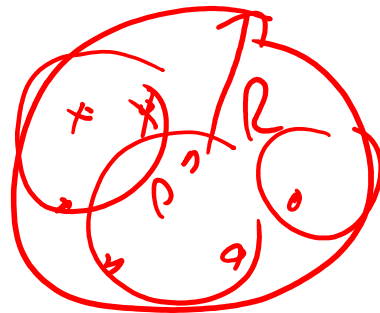


Doubling Dimension

ball $B(p, R) = \{ q \in P \mid d(p, q) \leq R \}$

Suppose every ball $B(p, R)$ in P can be covered by λ balls with radius $R/2$, for every $q \in P, R \geq 0$.

doubling dimension of P : $d = \log \lambda$



Doubling Dimension

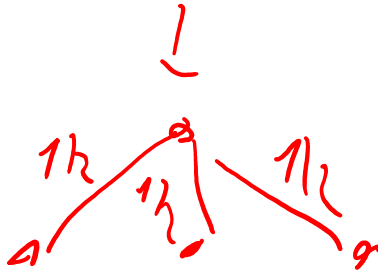
The **discrete metric space** has doubling dimension $\log N$.

→ \mathbb{R}^2 has doubling dimension $\log 7$.

The doubling dimension in a subspace may go up, but only by a factor of 2.

\sqrt{N}

$$\log \sqrt{N} = \frac{1}{2} \log N$$



$$B(p, 1) = \{p\}$$

$$B(p, 1/2) = \{p\}$$

$$\log N$$

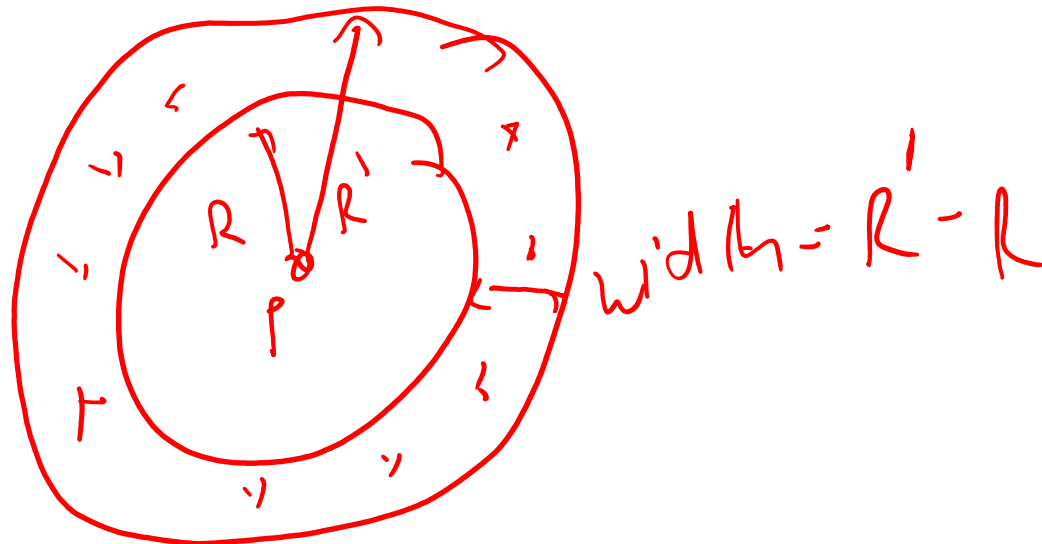
Closest Pairs in Doubling Metrics

doubling metric: metric space with constant doubling dimension

Can still find the closest pair in $O(N \log N)$ **expected** time.

No coordinates? No Slabs? No Grids?

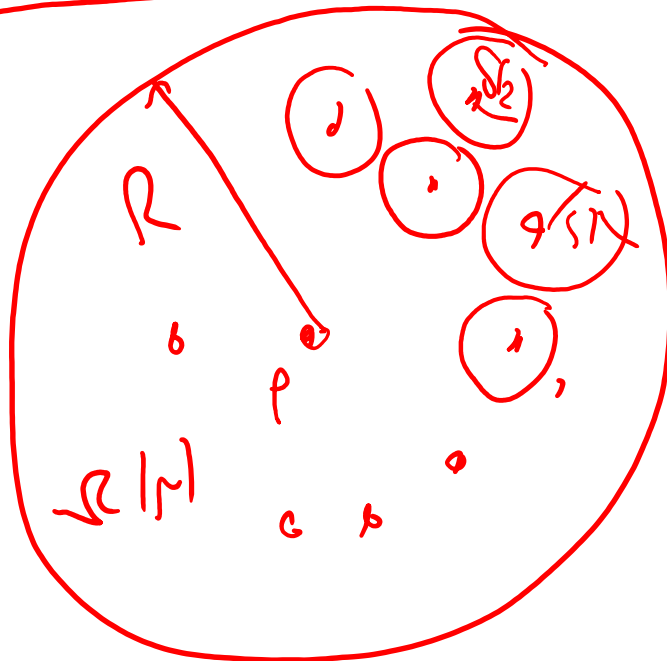
Use balls and **annuli**.



Closest Pairs in Doubling Metrics

First $O(N \log N)$ expected time algorithm by **Har-Peled** and **Ali Abam** (SSPD) (2010). We make it simpler.

Lemma: Let B be a ball in \mathbb{P} with $N/8^d$ points. Then, $\text{radius}(B) = \Omega(\delta N^{1/d})$, where $\delta =$ closest pair distance.

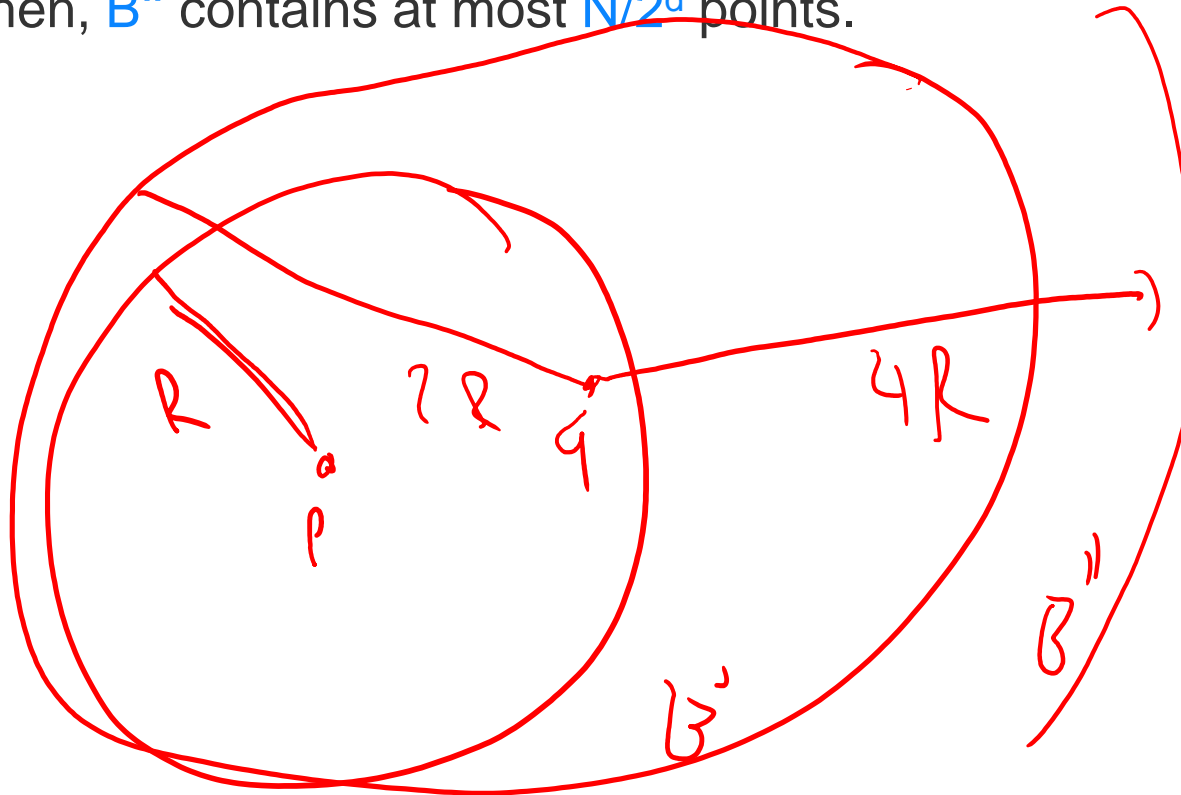


$$N \leq 2^d \left(\frac{R}{\delta} \right)^d$$

$$R \geq N^{1/d} \cdot \delta$$

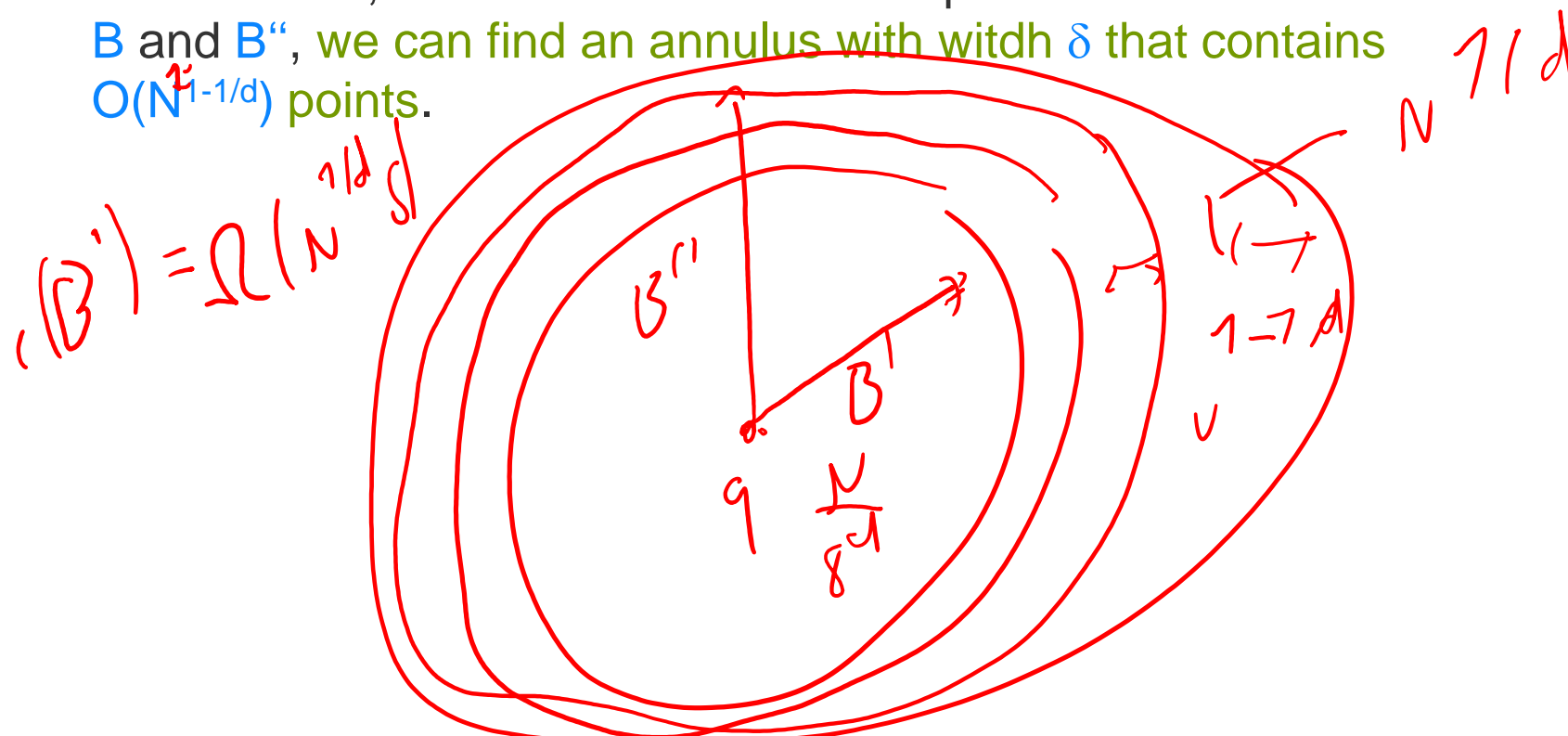
Closest Pairs in Doubling Metrics

Lemma: Let B be minimum-radius ball in P with $N/8^d$ points. Let $q \in B$ and B' minimum-radius ball around q with $N/8^d$ points. Let B'' be concentric ball to B' around q with double radius. Then, B'' contains at most $N/2^d$ points.



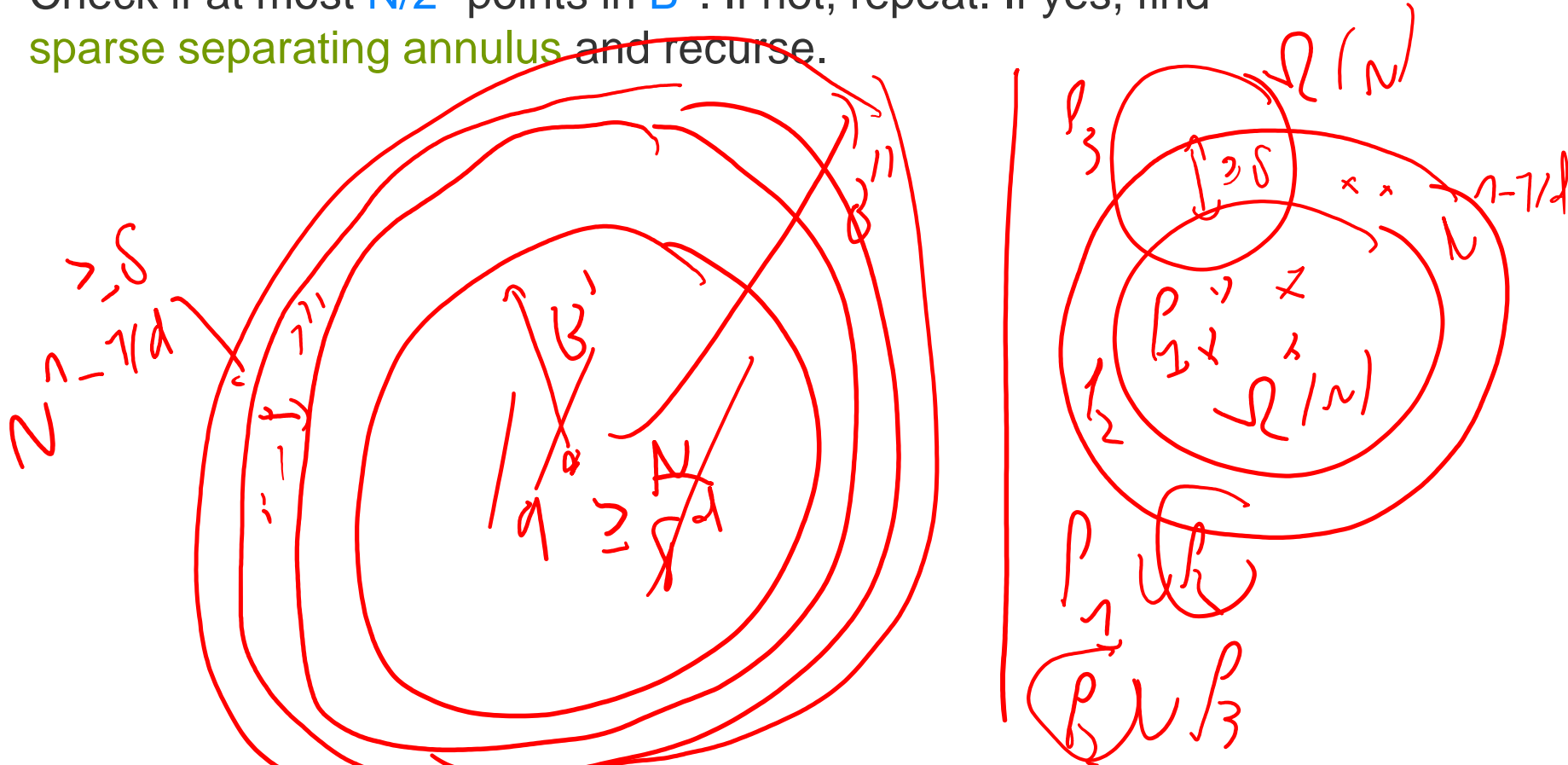
Closest Pairs in Doubling Metrics

Lemma: Let B be minimum-radius ball in P with $N/8^d$ points. Let $q \in B$ and B' minimum-radius ball around q with $N/8^d$ points. Let B'' be concentric ball to B' around q with double radius. Then, B'' contains at most $N/2^d$ points and between B and B'' , we can find an annulus with width δ that contains $O(N^{1-1/d})$ points.



Closest Pairs in Doubling Metrics

Algorithm: Pick random $q \in P$. With probability $1/8^d$, we have $q \in B$. Take minimum-radius ball B' around q with $N/8^d$ points. Check if at most $N/2^d$ points in B'' . If not, repeat. If yes, find **sparse separating annulus** and recurse.



Closest Pairs in Doubling Metrics

Result: The expected running time of this algorithm is $O(N \log N)$.

$$T(N) = T(N_1) + T(N_2) + O(N)$$

$$N_1, N_2 \leq N + N^{1-1/d}$$

$$N_1, N_2 = \Omega(N)$$