

Approximate Nearest Neighbor (ANN): The Core Idea

The Problem

Given: Database of n vectors
 $D = \{d_1, d_2, \dots, d_n\}$

Query: Find k vectors closest to q

- Exact solution requires:
- Compute distance to ALL n vectors
 - Sort and return top- k
 - Time: $O(n)$ per query

$n = 1$ billion? That is 1 billion distance calculations per query!

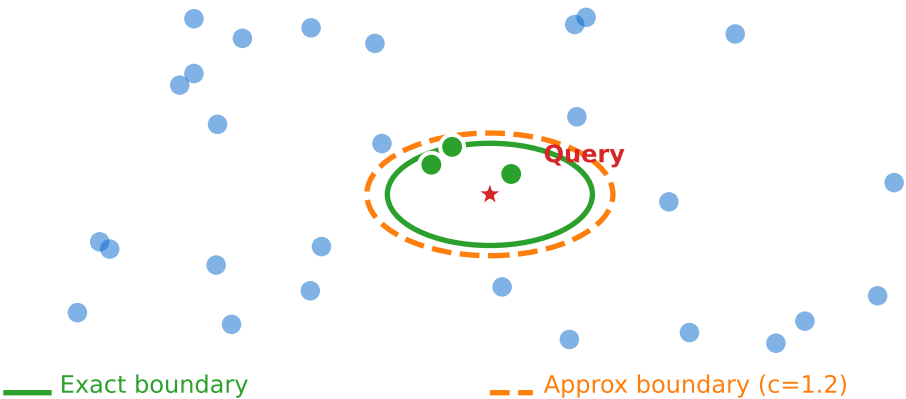
The Mathematics

Exact k -NN:
$$N_k(q) = \operatorname{argmin}_{|S|=k} \max_{d \in S} ||q - d||$$

c -Approximate k -NN:
For all d in $ANN_k(q)$:
$$||q - d|| \leq c * ||q - d^*||$$

where d^* is the true k -th neighbor
and $c \geq 1$ is the approximation factor
 $c = 1.05$ means we accept neighbors at most 5% farther than optimal

Visual Intuition



The Trade-off

Method	Time	Recall	Use Case
Exact (brute)	$O(n)$	100%	Small datasets
IVF	$O(\sqrt{n})$	~95%	Medium scale
HNSW	$O(\log n)$	~99%	Production
LSH	$O(1)^*$	~90%	Massive scale

Key: Accept 1-5% accuracy loss for 100-1000x speedup

* LSH: $O(1)$ query but $O(n)$ space for hash tables