向量数据库

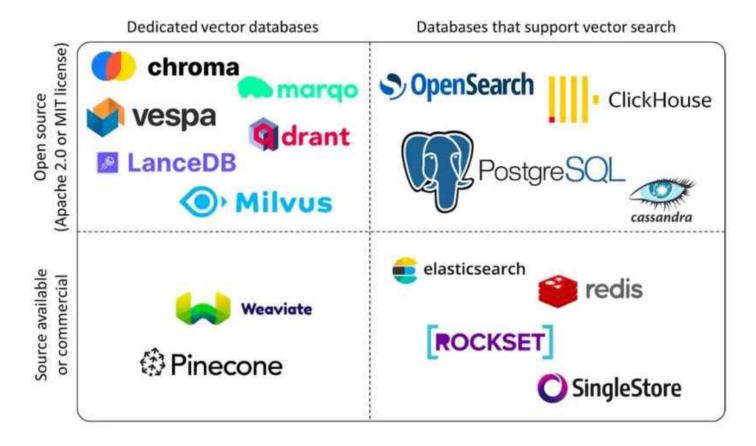
简介:专门存储和查询向量数据的数据库系统

优势:

a. 可处理高维数据。如图像、音视频

b. 可处理大规模数据。亿级

c. GPU 计算型近似搜索



有很多向量数据库,基本原理相似,主要介绍 FAISS

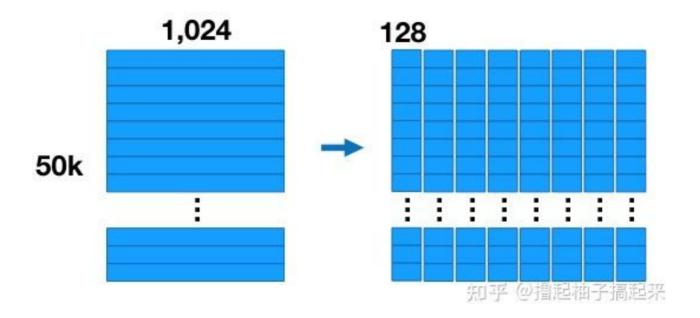
原理:

1. 信息压缩 -> Product Quantization (乘积量化)

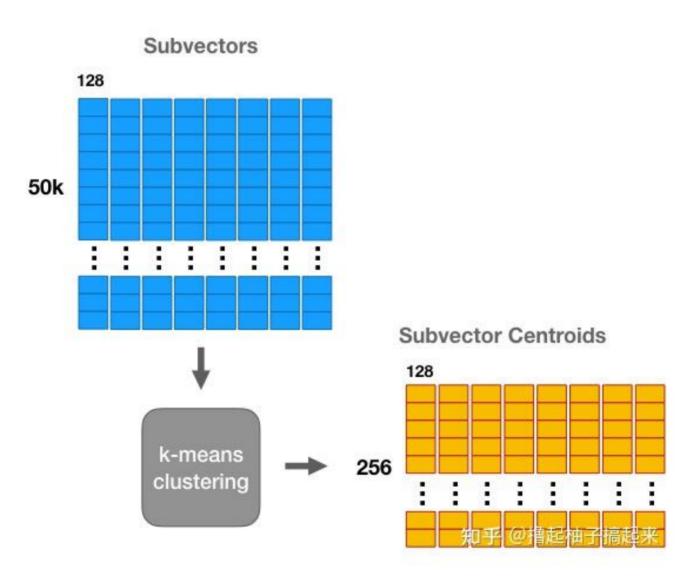
信息压缩是信息论中提高效率必要的方式,向量中一般用降维: PCA 或者 PQ

例如,50k 条 prompt 转换为 embeddings 之后,shape=(50k, 1024) # 注:不同的 text_encoder 生成的 embedding 维度不同,还有 512,768 等

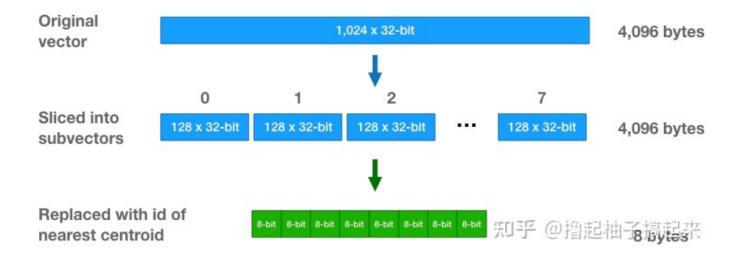
a. 首先在 embedding_dim=1024 维度将 embeddings 切分为 m=8 组 sub_embedding



b. 在每一组 sub_embedding # shape=(50k, 128) 内,做 k-means 聚类 # k=256 便于 uint8 保存



c. 这样,每个单条 embedding 就被压缩编码为 uint8 * 8,也可以叫索引。



2. 向量检索 -> Asymmetric Distance Computation (非对称距离计算)

向量检索中使用几乎所有的 ANN 方法都是:聚类全向量空间、查询向量快速锁定子空间、精确遍历。

- a. 查询向量切分 m=8 组
- b. 计算与每组 k=256 个聚类中心的距离,取最近
- c. 在簇中精确计算子向量距离, 取最小

3. Prompt embeddings FAISS Search

a. 用户定义:角色 A,角色 B,行为 ->原始 prompt

b. 预定义图库:图片,描述,标签 -> faiss.index

1	26	230912834	https://cdn.create.vista.com	Multicultural group of young people using digital devices while man holding coffee to go isolated on wh	12982378	IgorVetushko	['230912886', '619684330',	['Group', 'Chairs', 'Compute
2		7260594	https://cdn.create.vista.com	Composition of different smiling people	1008939	olly18	['32380407', '116932692', '1	['Fun', 'Group', 'White', 'Bea
3		224908070	https://cdn.create.vista.com	Successful businesspeople speaking with bullhorn isolated on white	13193658	AndrewLozovyi	['224891124', '224908174',	['Beautiful', 'Business', 'Fem
4		55311869	https://cdn.create.vista.com	Crowd of people in the city out of focus	3378121	Madrabothair	['55312407', '148994747', '1	['Focus', 'People', 'Unrecogr
5		305981468	https://cdn.create.vista.com	Panoramic shot of three friends using laptop and doing paperwork in office	12982378	IgorVetushko	['172089712', '475388304',	['Beautiful', 'Business', 'Girl',
6		31294803	https://cdn.create.vista.com	Large group of diverse people. Isolated on white	1010613	AndreyPopov	['607893274', '413680228',	['Fun', 'Group', 'Large', 'Whi
7		184131020	https://cdn.create.vista.com	Shocked girl gesturing with hands and looking at camera isolated on purple	12985848	EdZbarzhyvetsky	['574046972', '490145998',	['Beautiful', 'Person', 'Sign',
8		32380407	https://cdn.create.vista.com	Different people with different expressions	1008939	olly18	['156458886', '19066015', '4	['Color', 'Fun', 'Group', 'Whi
9	34	185179220	https://cdn.create.vista.com	Happy multicultural retro styled friends looking at camera isolated on grey	13194036	VitalikRadko	['185179214', '185179418',	['Beautiful', 'Happy', 'Female
10		48786423	https://cdn.create.vista.com	$large group of people in the shape of an arrow pointing up symbolizing direction\ ,\ progress\ or\ growth.$	1162342	digitalstorm	['91849974', '60178937', '70	['Bar', 'Group', 'Large', 'Back
11		216473576	https://cdn.create.vista.com	Beautiful young family spending time together in nature	12982378	IgorVetushko	['207412540', '216473714',	['Sport', 'Ball', 'Happy', 'Girl'
12		45169135	https://cdn.create.vista.com	Summer, holidays, vacation, happy people concept - group of teenagers looking down and showing fing	1017986	Syda_Productions	['32677917', '69826495', '70	['Game', 'Fun', 'Group', 'Vict
13	38	177722522	https://cdn.create.vista.com	Young african amercian businessman with laptop and businesswoman with tablet in hands looking at each	13194036	VitalikRadko	['577648966', '447300016',	['Blue', 'Beautiful', 'Business

- i. description embedding
- ii. tags embedding
- iii. image detection + tags embedding
- c. 原始 prompt 查询,筛选对应 image 做 control 引导图