TinyLlama Embeddings on Me Before You and Wikipedia Corpus

1. Experiment Setup

Book: Me Before You (Romance)

Corpus Size: Middle 2000 sentences extracted

Model: TinyLlama Total Layers: 23

Layers Analyzed: Layer 14 (2/3rd), Layer 22 (Last)

2. Clustering Results: Me Before You

2.1 DBSCAN (cosine, $\epsilon = 0.1$)

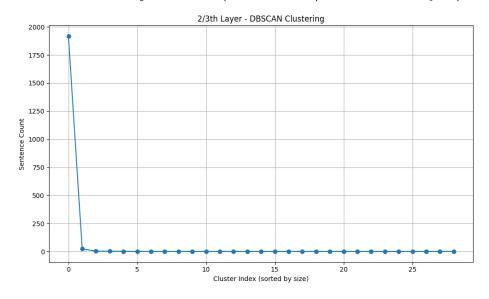
Cluster Counts:

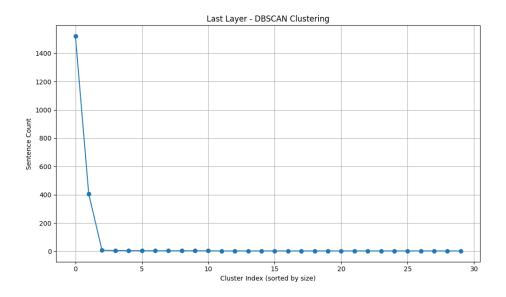
Layer 14: 29

Layer 22: 30

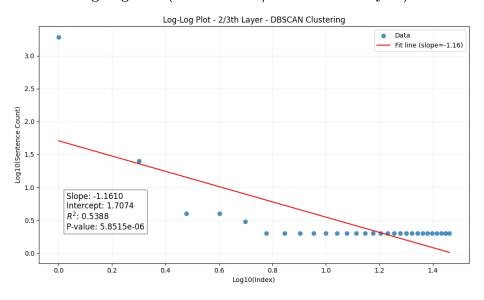
Sentence Counts (sorted):

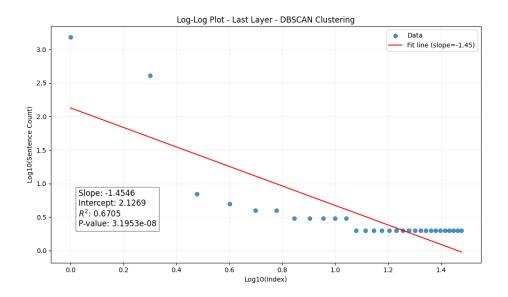
Sentence Count per Cluster (DBSCAN - 2/3th and Last Layers)





Log-Log Plot (DBSCAN - 2/3rd and Last Layers)





2.2 KMeans (knee detection)

Cluster Counts:

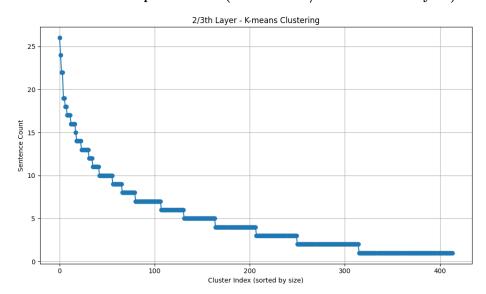
Layer 14: 414 clusters, WCSS=484.243

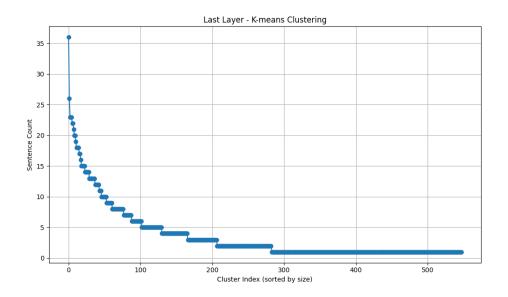
Layer 22: 548 clusters, WCSS=142.662

Sentence Counts (sorted):

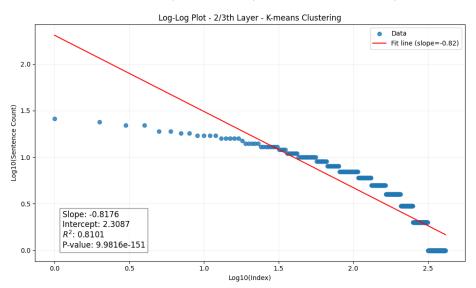
- Layer 22: [36, 26, 23, 23, 23, 22, 22, 21, 20, 20, 19, 18, 18, 18, 18, 17, 17, 16, 15, 15, 15, 15, 15, 14, 14, 14, 14, 14, 13, 13, 13, 13, 13, 13, 13, 13, 12, 12, 12, ..., 1]

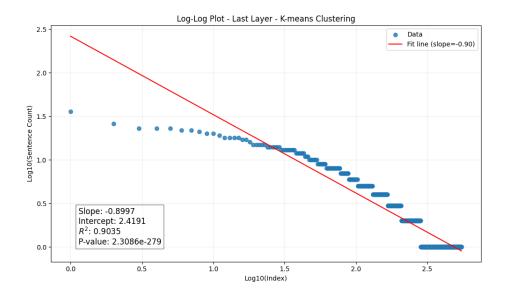
Sentence Count per Cluster (KMeans - 2/3th and Last Layers)





Log-Log Plot (KMeans - 2/3rd and Last Layers)





2.3 Cosine Similarity Grouping (threshold=0.9)

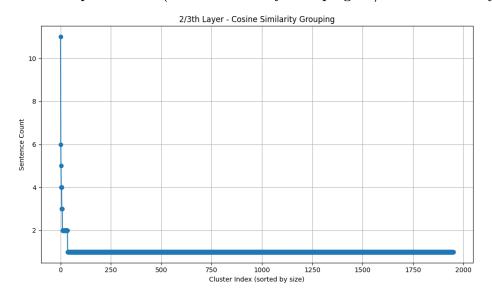
Group Counts:

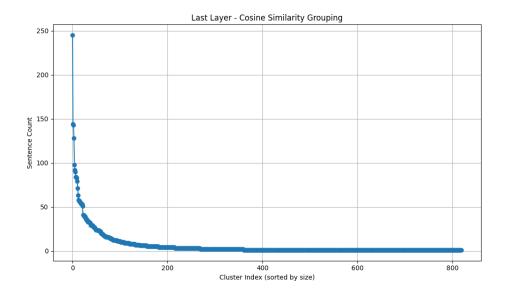
Layer 14: 1952 Layer 22: 820

Sample Sentence Counts:

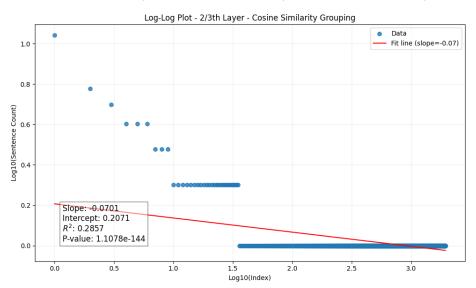
- Layer 22: [245, 144, 143, 128, 98, 92, 90, 84, 84, 83, 79, 71, 63, 58, 57, 57, 55, 55, 54, 53, 53, 51, 41, 41, 39, 39, 39, 37, 37, 35, 35, 35, 33, 33, 33, 33, 32, 32, 29, 29, ...]

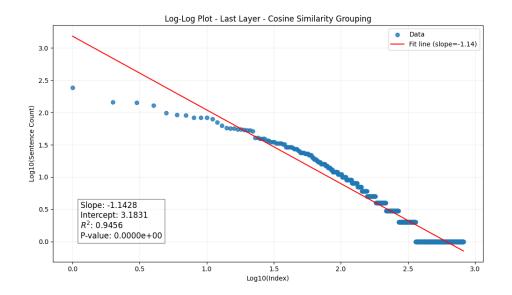
Sentence Count per Cluster (Cosine Similarity Grouping - 2/3th and Last Layers)





Log-Log Plot (Cosine Similarity - 2/3rd and Last Layers)





2.4 Graph-Based Grouping (threshold=0.85)

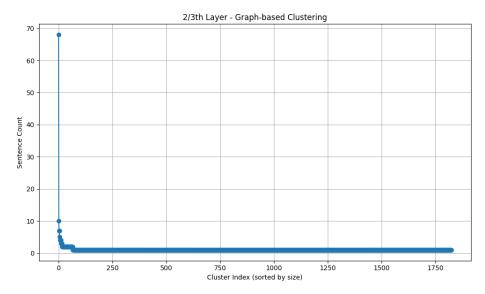
Group Counts:

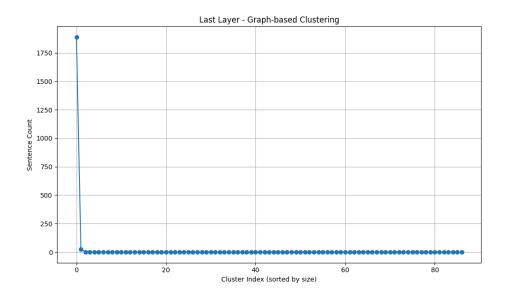
Layer 14: 1826

Layer 22: 87

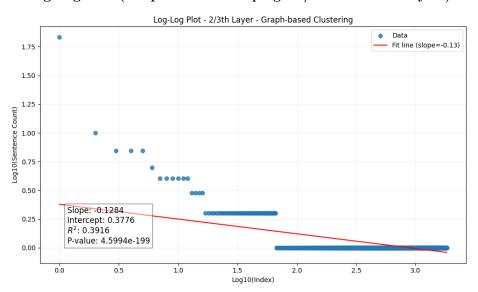
Sample Sentence Counts:

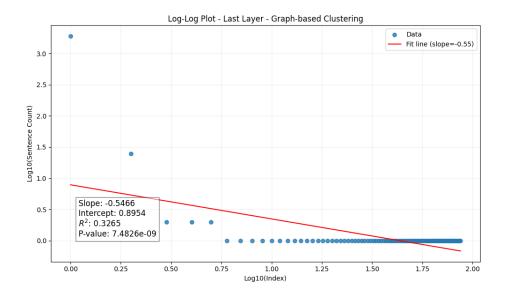
Sentence Count per Cluster (Graph-Based Grouping - 2/3th and Last Layers)





Log-Log Plot (Graph-Based Grouping - 2/3rd and Last Layers)





2.5 HDBSCAN (n_neighbors=30, n_components=20)

Cluster Counts:

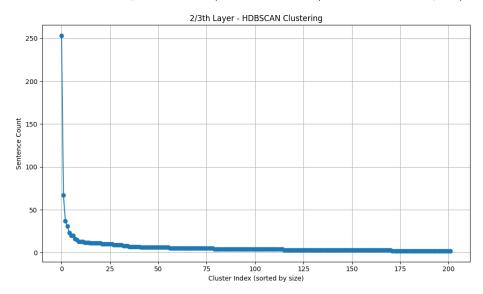
Layer 14: 202

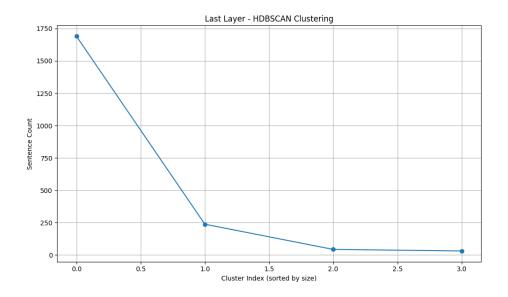
Layer 22: 4

Sentence Counts (sample):

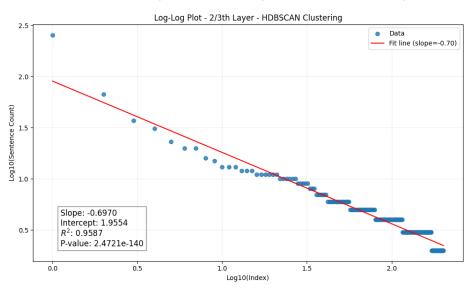
- Layer 22: [1691, 237, 42, 30]

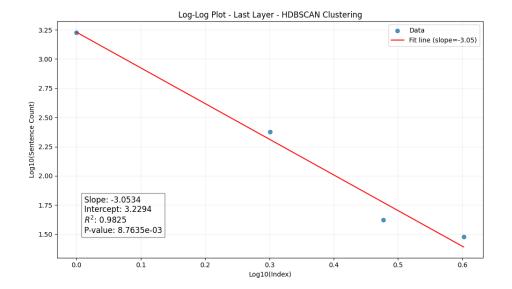
Sentence Count per Cluster (HDBSCAN - 2/3th and Last Layers)





Log-Log Plot (HDBSCAN - 2/3rd and Last Layers)





3. Clustering Results: Wikipedia Corpus

Dataset: Wikipedia Sentences (Kaggle)

3.1 DBSCAN (cosine, $\epsilon = 0.1$)

Cluster Counts:

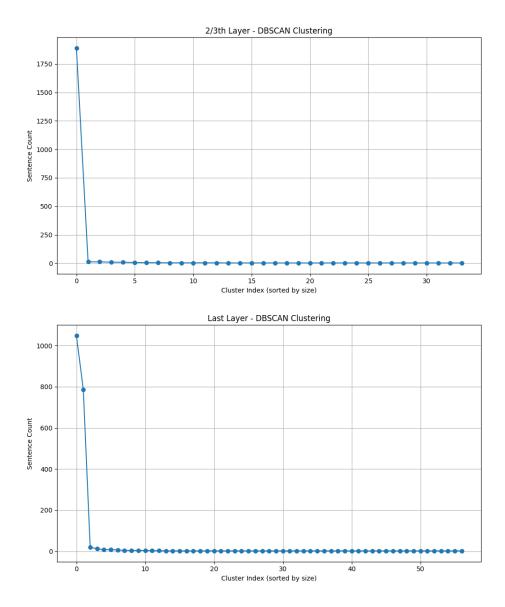
Layer 14: 34

Layer 22: 57

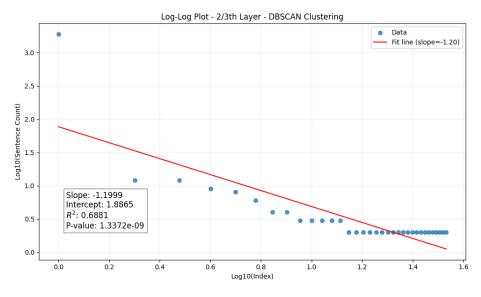
Sentence Counts:

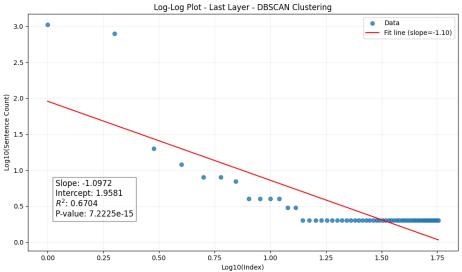
- Layer 14:

Sentence Count per Cluster (DBSCAN - 2/3rd and Last Layers)



Log-Log Plot (DBSCAN - 2/3rd and Last Layers)





3.2 KMeans (knee detection)

Cluster Counts:

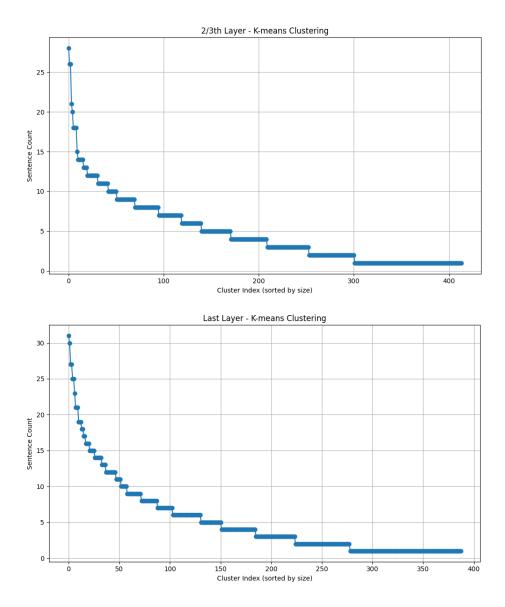
Layer 14: 414, WCSS=420.938

Layer 22: 388, WCSS=226.830

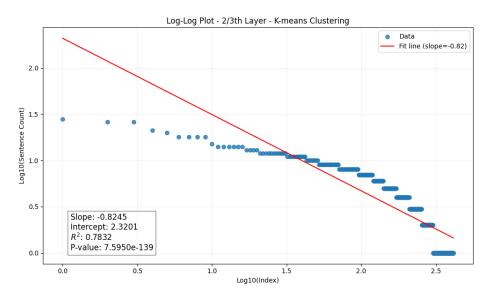
Sentence Counts (sample):

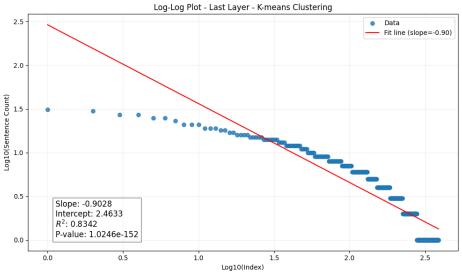
- Layer 22: [31, 30, 27, 27, 25, 25, 23, 21, 21, 21, 19, 19, 19, 18, 18, 17, 17, 16, 16, 16, 16, 15, 15, 15, 15, 15, 14, 14, 14, 14, 14, 14, 14, 13, 13, 13, 13, 12, 12, 12, ...]

Sentence Count per Cluster (KMeans - 2/3rd and Last Layers)



Log-Log Plot (KMeans - 2/3rd and Last Layers)





3.3 Cosine Similarity Grouping (threshold=0.9)

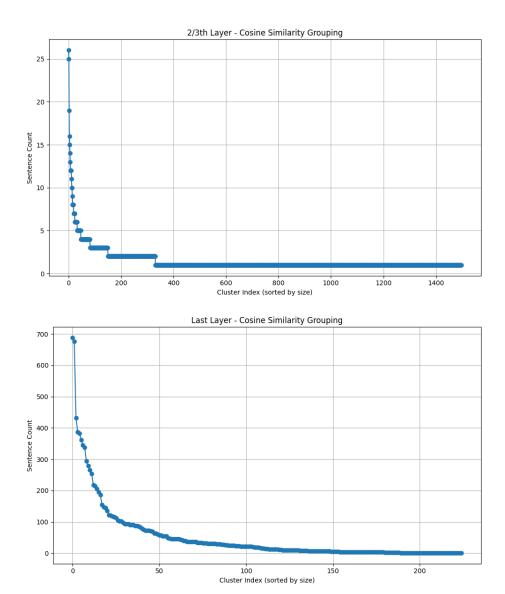
Group Counts:

Layer 14: 1498 Layer 22: 225

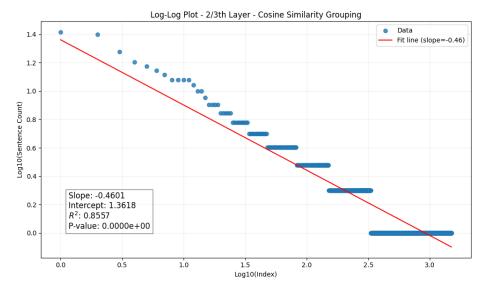
Sentence Counts (sample):

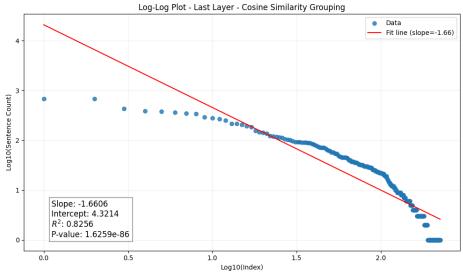
- Layer 14: [26, 25, 19, 16, 15, 14, 13, 12, 12, 12, 11, 10, 10, 9, 8, 8, 8, 8, 7, 7, 7, 7, 7, 6, 6, 6, 6, 6, 6, 6, 6, 6, 5, 5, 5, 5, 5, 5, 5, ...]
- Layer 22: [688, 677, 432, 387, 383, 362, 346, 338, 294, 280, 266, 254, 218, 215, 206, 195, 186, 155, 147, 144, 136, 122, 120, 118, 116, 113, 105, 103, 102, 98, 93, 93, 91, 90, 90, 88, 88, 86, 83, ...]

Sentence Count per Cluster (Cosine Similarity - 2/3rd and Last Layers)



Log-Log Plot (Cosine Similarity - $2/3\mathrm{rd}$ and Last Layers)





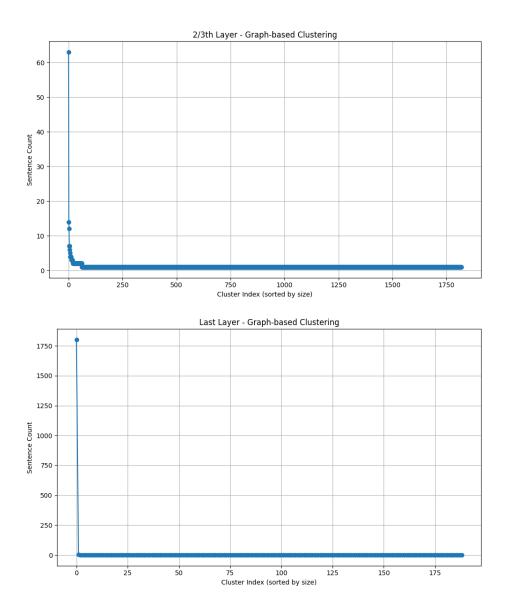
3.4 Graph-Based Grouping (threshold=0.85)

Group Counts:

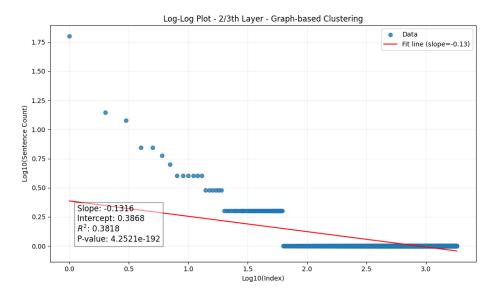
Layer 14: 1820 Layer 22: 189

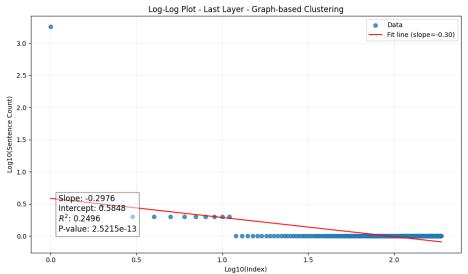
Sentence Counts (sample):

Sentence Count per Cluster (Graph-Based Grouping - 2/3rd and Last Layers)



Log-Log Plot (Graph-Based Grouping - 2/3rd and Last Layers)





3.5 HDBSCAN (n_neighbors=30, n_components=20)

Cluster Counts:

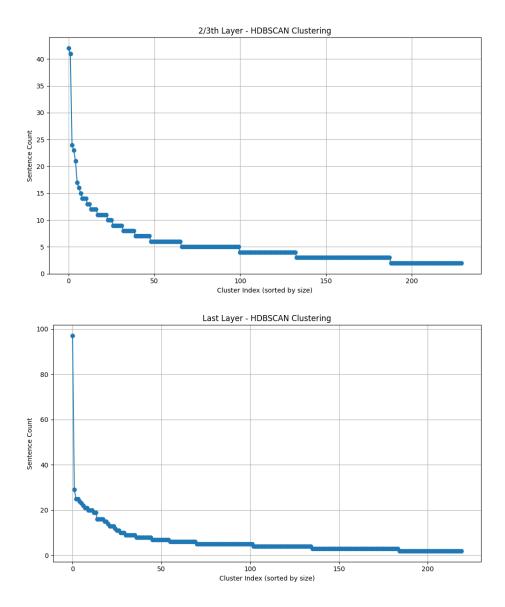
Layer 14: 1243 Layer 22: 1393

Sample Sentence Counts:

Sample Sentence Counts.

- Layer 14: [42, 41, 24, 23, 21, 17, 16, 15, 14, 14, 14, 13, 13, 12, 12, 12, 12, 11, 11, 11, 11, 11, 10, 10, 10, 9, 9, 9, 9, 9, 8, 8, 8, 8, 8, 8, 8, 7, ...]
- Layer 22: [97, 29, 25, 25, 24, 23, 22, 21, 21, 20, 20, 20, 19, 19, 16, 16, 16, 16, 15, 15, 14, 13, 13, 13, 12, 11, 11, 10, 10, 10, 9, 9, 9, 9, 9, 9, 9, 8, 8, 8, ...]

Sentence Count per Cluster (HDBSCAN - 2/3rd and Last Layers)



Log-Log Plot (HDBSCAN - 2/3rd and Last Layers)

