



# K-mer counts and phylogeny with kmerdb

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## Abstract

**Background:** With decades since Altschul’s BLAST, it is still important to reflect on the seed region, its algorithmic purpose, and the role of the k-mer in biological sequence relationships and even alignment-free methods. Specifically, k-mers are used to generate alignments, assemblies, and alignment-free sequence inferences across massive amounts of sequencing data being produced at an increasing rate. k-mers are the backbone of sequence assembly by virtue of the De Bruijn graph and again crucial for performance in sequence alignment heuristics like the seed region of BLAST. **Methodology:** kmerdb is a toolkit in C-Python 3.12.4+ that compresses conceivably large k-mer count profiles using a block-access model and the bgzf compression standard distributed with BioPython[1]. This program has additional characteristics such as an indexing functions, count normalization, PCA and t-Stochastic Neighbor Embedding (t-SNE) dimensionality reduction techniques, distance matrices, and k-means and hierarchical clustering features, and a log-odds ratio test for unknown sequences on the available k-mer frequencies. The variety of tools included in kmerdb facilitates any tetra-mer or arbitrary k-mer profile-based analysis, including word frequency analysis, custom seed regions, and assessment of k-mer uniqueness via NumPy compatibility. **Results:** kmerdb is a modern and ergonomic toolkit for k-mers and alignment-free sequence analysis pipelines, which rely on kmer indexing, counting nullomers, unique-kmers, and total-kmer counts on a per-input basis, and creating useful graphics and metrics on inter-species, inter-tissue, or locally disparate k-mer frequencies, and profile similarities/distances. Distributed on the Python Package Index and maintained on GitHub: <https://github.com/MatthewRalston/kmerdb> Features on the horizon include an aligner similar in strategy to vsearch, assembly and assembly diagnostic information, and a pseudoaligner. Ambitiously, kmerdb seeks to bridge the gap behind Jellyfish (C/C++, 2011 [2]) and kPAL (Python, 2014 [3]) for providing programmatic access to kmer count profiles, count matrices, matrix normalizations and transformations, clustering facilities, and Markov model utilities in the Python programming language.

# Author summary

K-mer counts, word-frequencies and alignment-free sequence analysis play crucial roles in modern Bioinformatics toolkits, pipelines, and algorithm design. Access to k-mer profiles and sequence compositional data in Python relies on intricate interfaces to C/C++ functions with Jellyfish [2], or a collection of scripts with kPAL [3]. Here I present a modern Python module and CLI suite for k-mer profiling, alignment-free similarities, clustering of datasets by k-mer frequencies, De Bruijn graphs, and more.

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