

Finding Transposable Elements in Genomic Data by Frequent Subsequent Detection

Chia-Hung Yang

Mining Frequent Patterns in DNA

- **Transposable Elements (TEs):**
 - Chunks of DNA sequence that are able to copy and move themselves to new positions in genomes.
- **Frequent Sequential Patterns Detection:**
 - Find sequential patterns from a group of sequences whose supports are not less than a pre-specified threshold.
- **Can we find TEs by mining frequent patterns in genomes?**

Existing Approaches

- **A-priori**

- *Monotonicity*: If a sequential pattern is frequent, so are its prefix and suffix.

ACTGGATTC

- **Position-based Method [1]**

- If a prefix and a suffix instance are adjacent, it implies an instance of the joint sequential pattern.

ACTGGATT
CTGGATTC

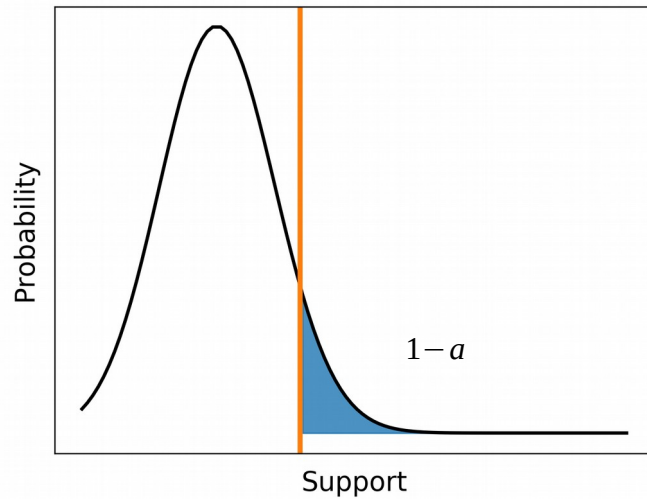
Support Threshold of Significance

- **Null Model:**

- Sequential patterns are drawn uniformly from all possibilities of the same length.

- **Hyperparameters:**

- Number of base pairs n
- Minimum pattern length l_{min}
- Support lower bound s_{min}
- Confidence level a



$$s_l = \min \left\{ m \left| \sum_{k=1}^m \binom{n-l}{k} p_l^{-k} (1-p_l)^{n-l-k} \geq a \right. \right\}$$

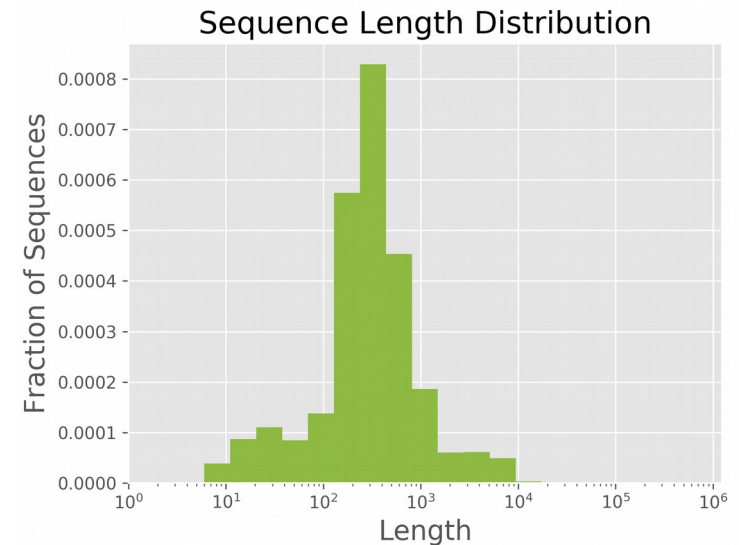
$$p_l = 4^{-l}$$

Implementation of Position-based Method

1. Obtain support thresholds of significance and thus the range of pattern length of interests.
2. Find sequential patterns with supports not less than the lower bound:
 - A) Obtain instances of short patterns and order them by position [2].
 - B) For each pattern length l :
 - i. Find length- l candidates from frequent patterns of length $l-1$.
 - ii. Merge adjacent length- $(l-1)$ instances if they form a candidate pattern, and calculate the supports.

Genomic Data

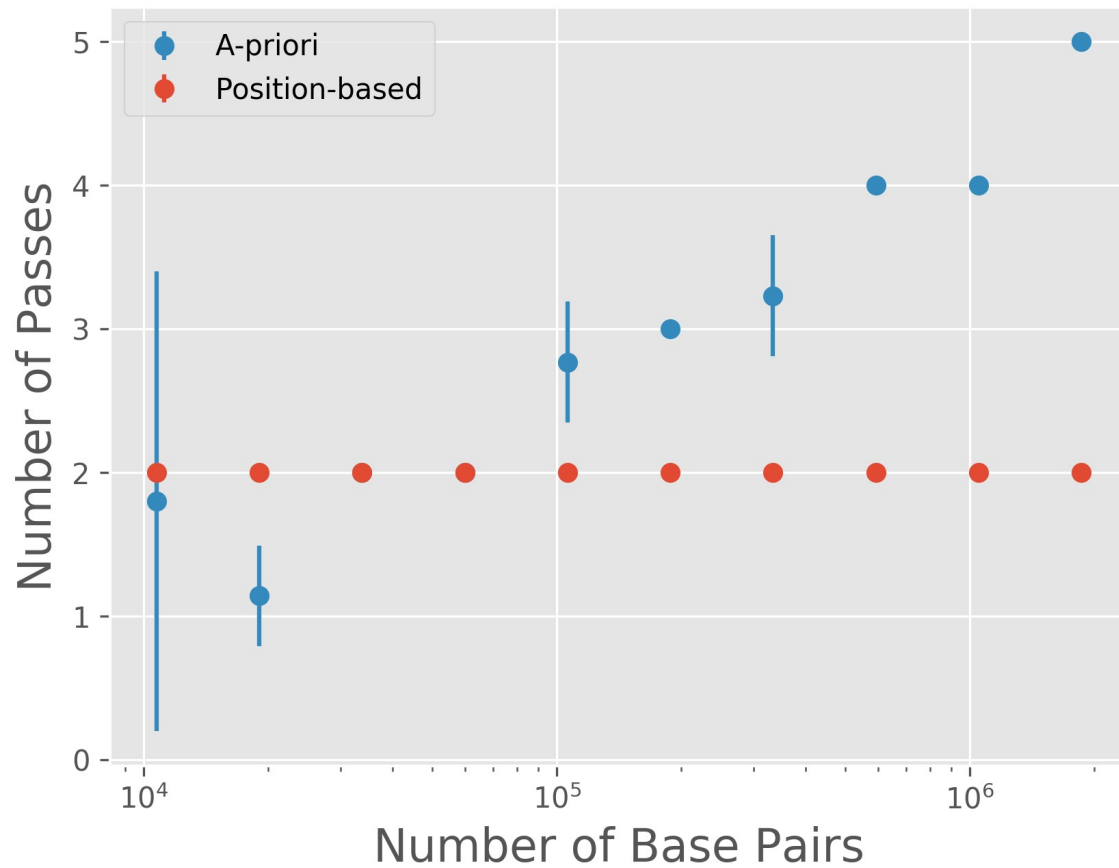
- **DNA sequences of *Arabidopsis thaliana* [3]**
 - ~120K sequences
 - Sequence length range from 6 to ~700K
 - Total ~340M base pairs
- **TE database: RepBase [4]**
 - ~500 sequences



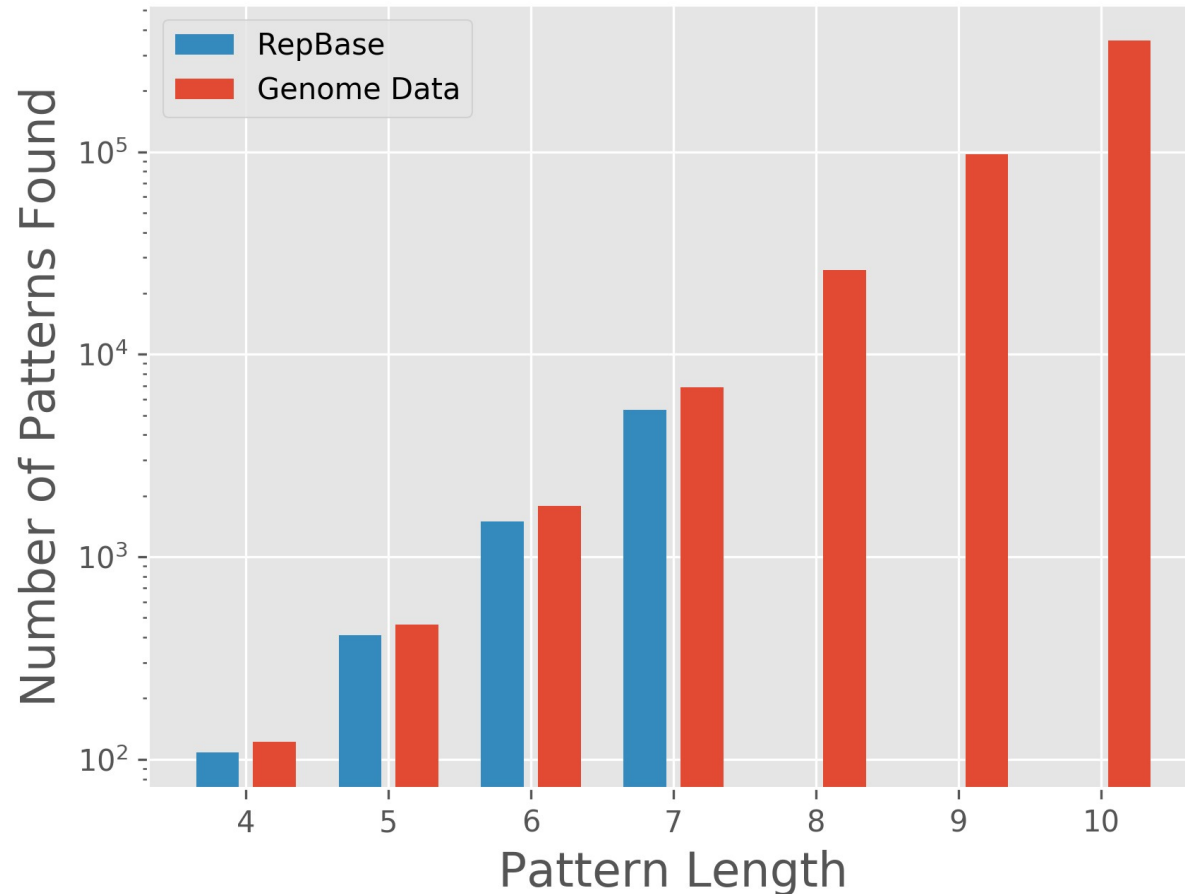
[3] Debladis *et al.*, BMC Genomics (2017)

[4] Bao, *et al.*, Mob DNA (2015)

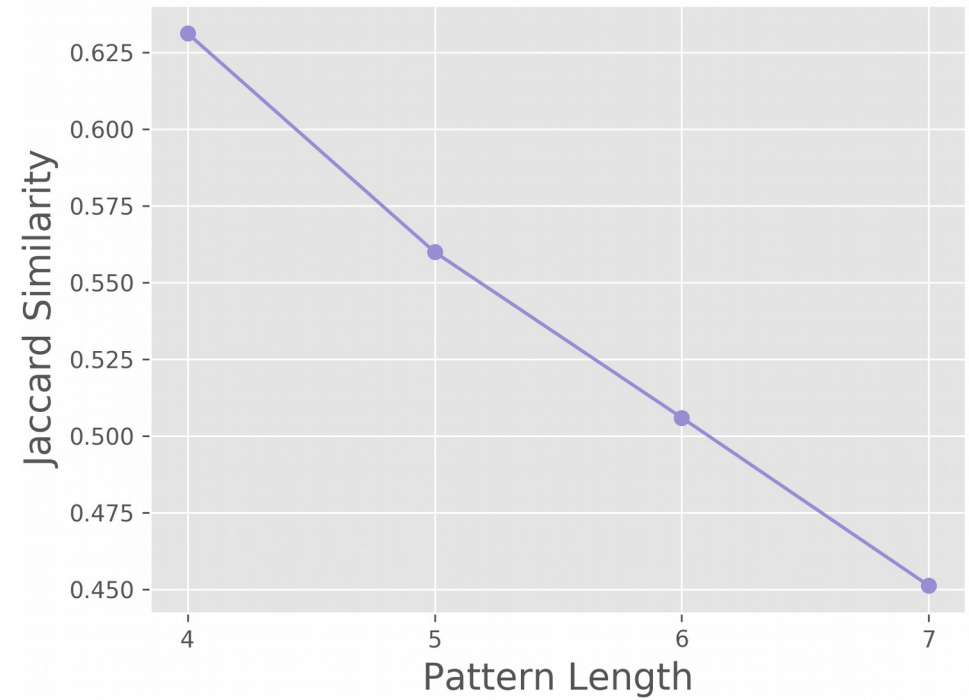
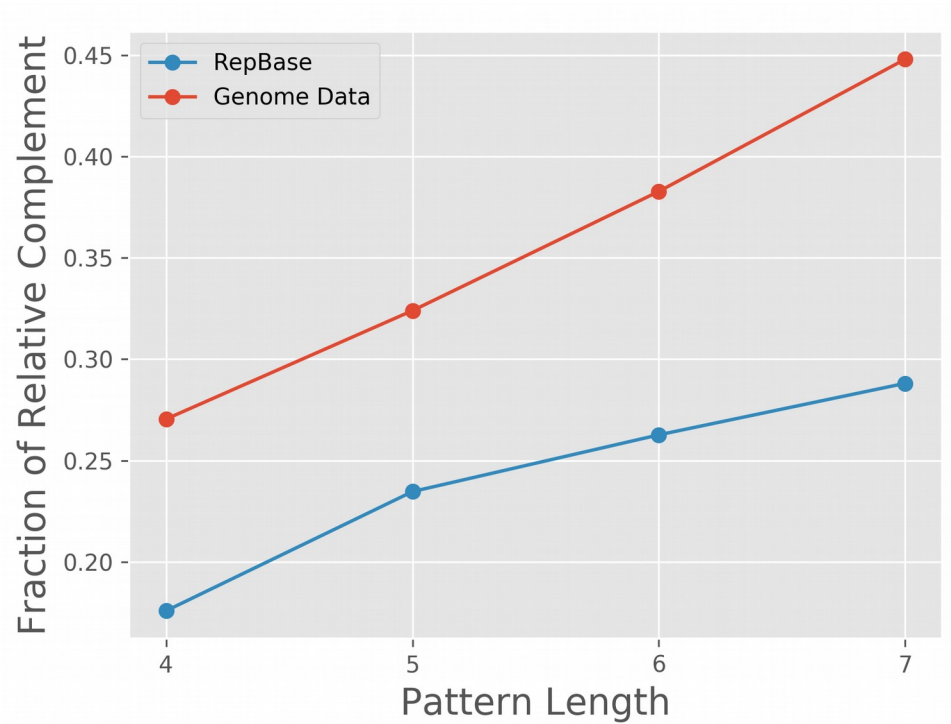
Computational Costs



Frequent Patterns in Genome and TEs



Frequent Patterns in Geome and TEs



Summary

- **Frequent sequential patterns detection through genome data recovers short patterns in transposable elements.**
- **Practical usage of mining frequent patterns in bioinformatics remains unclear, compared to popular probabilistic methods.**