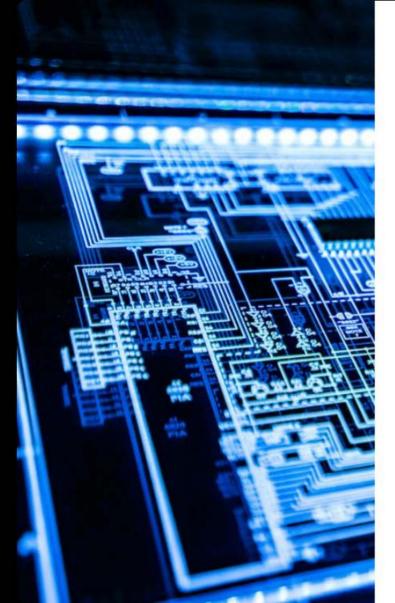


Triangle Counting
Optimization in Graph
Streams Leveraging
Degeneracy and Memory
Constraints



1 Importance of Triangle Counting in Network Science and Applications

#### **Triangles in Network Science**



### Importance of Triangles in Networks

Triangles serve as foundational structures for clustering, anomaly detection, and accurate database join size estimations in networks.



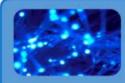
#### **Triangle Counting Challenges**

In graph streams, edge arrival is sequential, requiring efficient triangle counting methods due to limited memory resources.



#### **Worst-Case Space Bounds**

For arbitrary-order constant-pass streams, the worst-case space requirement is established at min{m³/2T, m $\sqrt{T}$ }, highlighting significant computational challenges.



#### **Real-World Graph Applications**

Practical applications of triangle counting span social networks and transportation systems, where understanding connectivity is crucial.

#### **Graph Degeneracy and Estimation**

#### 1 Understanding Graph Degeneracy

Graph degeneracy, characterized by the core number, plays a crucial role in optimizing triangle counting by reducing complexity.





## 2 Input Constraints for Triangle Counting

The input consists of an edge stream across n vertices, aiming for a 1±ε approximation of the true triangle count T while adhering to strict memory limits.



#### **Key Findings and Future Directions**

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#### **Leveraging Low Degeneracy**

Utilizing low degeneracy allows for circumventing worst-case space limitations, advancing triangle counting efficiency.

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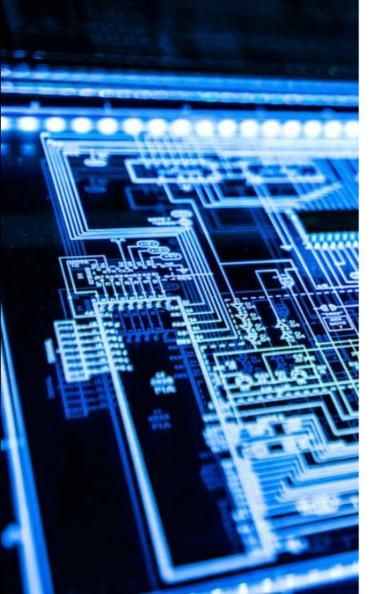
## Potential Extension to Other Problems

The methodology shows promise for addressing other subgraph counting challenges under similar bounded degeneracy conditions.

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#### **Need for Empirical Validation**

Future work should focus on empirical evaluations to ascertain practical performance across large-scale graph streams.



# 2 Challenges in Streaming Algorithms for Triangle Counting

Streaming algorithms face significant limitations due to memory constraints and edge arrival order.

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## Memory Limitations in Algorithms

Efficient triangle counting in graph streams is hindered by memory constraints, necessitating innovative approaches to data processing.

#### Edge Arrival Order Impact

The order of edge arrivals in streams greatly affects the performance and accuracy of triangle counting algorithms in graph processing.

#### **Worst-case Scenarios**

Algorithms face challenges in worst-case scenarios, emphasizing the need for resilient and adaptable solutions in triangle counting.

### Efficient Resource Utilization

Maximizing resource
utilization in streaming
algorithms requires a thorough
understanding of memory
constraints and edge
processing order.

## Worst-case scenarios pose challenges, requiring innovative solutions for efficient triangle counting.

#### 1 Triangle Counting Challenges

Accurate counting of triangles in graphs under worst-case conditions necessitates advanced algorithmic strategies to ensure efficiency.





#### 2 Innovation in Algorithms

Developing innovative solutions is critical for overcoming the inherent challenges presented by worst-case scenarios in graph processing.

## Graph degeneracy impacts stream processing efficiency, demanding sublinear memory usage strategies.

1 Understanding Graph Degeneracy

Graph degeneracy plays a key role in stream processing efficiency, influencing the design of memory-efficient algorithms.

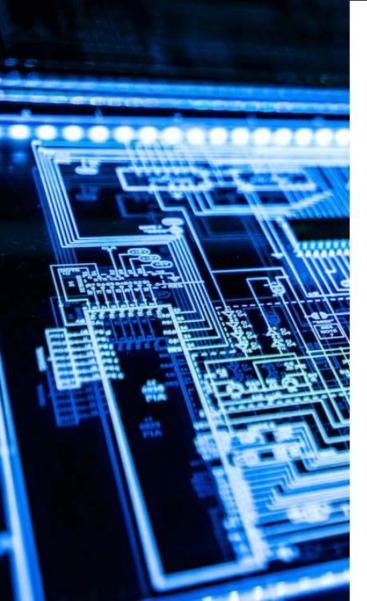
3 Real-world Graph Applications

Many real-world graphs exhibit properties suitable for triangle counting, highlighting the importance of degeneracy in practical scenarios. **2** Core Number Significance

The core number offers insights into graph structure, impacting the effectiveness of triangle counting in streaming contexts.

4 Advanced Estimation Techniques

Utilizing advanced estimation techniques under low degeneracy can significantly improve the efficiency of triangle counting algorithms.



## 3 Algorithm Design and Space Bound Analysis

#### **Context Motivation**

#### Importance of Triangles in Networks

Triangles are crucial in network science for applications like clustering, anomaly detection, and database join size estimation.

#### Streaming Data Challenges

In streaming settings, edges arrive sequentially, necessitating algorithms that function under stringent memory constraints.

#### Space Bounds in Triangle Counting

The worst-case space requirements for constant-pass streams with arbitrary edge order are proportional to min{m³/2T, m√T}, indicating significant limitations.



#### **High-Level Algorithm**



#### **Three-Pass Estimation Procedure**

The proposed algorithm follows a three-pass approach, sampling edges and checking for triangle closure without needing a degree oracle.



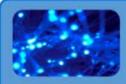
#### Sampling and Neighbor Selection

During the first pass, edges are sampled based on their degrees, and in the second pass, a neighbor is selected uniformly.



#### **Triangle Closure Check**

In the third pass, the algorithm checks if the sampled edge and neighbor form a triangle, assigning values accordingly.



#### **Parallel Execution for Estimation**

The final estimator runs multiple independent copies in parallel, utilizing a median-of-means strategy to enhance accuracy.



## Exploiting Low Degeneracy

By leveraging graphs with low degeneracy, the algorithm effectively circumvents the worst-case space lower bounds.

## Improved Space Complexity

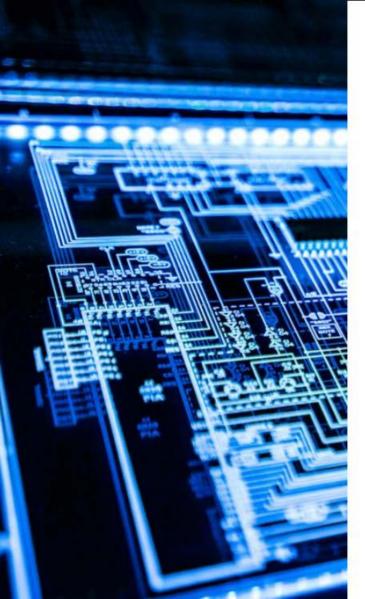
For low degeneracy graphs, the space complexity is reduced to Õ(mT), outperforming traditional bounds like m³/2T and m√T.

#### **Broader Applications**

The methodology may be extended to other subgraph counting problems, demonstrating versatility in bounded degeneracy contexts.

## Future Research Directions

Future work may include refinements for dynamic scenarios, expanding to larger motifs, and validating performance on substantial graph streams.



## 4 Future Research Directions and Practical Implementations

#### **Context Motivation**

1 Importance of Triangles in Networks

Triangles play a crucial role in network analysis, aiding in functions such as clustering, anomaly detection, and database join size estimation.

**3** Worst-case Space Bounds

The worst-case scenario for arbitrary-order constant-pass streams is constrained to  $min(m^3/2T, m\sqrt{T})$  as shown in previous research.

**2** Challenges in Streaming Settings

In streaming contexts, edges arrive sequentially, necessitating efficient algorithms due to limited memory availability.

4 Significance of Degeneracy

Understanding graph degeneracy is essential, as it influences algorithm efficiency and memory usage in triangle counting.

#### **Graph Degeneracy Core Number**



#### **Definition of Core Number**

The core number (kG) is defined as the maximum minimum degree across all subgraphs of G, indicating the degeneracy of the graph.



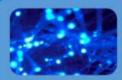
#### **Vertex Ordering**

Vertices can be arranged so that each vertex has at most k later neighbors, impacting the triangle counting efficiency.



## Characteristics of Real-world Graphs

Many real-world graphs exhibit properties such as being planar or having constant degeneracy, affecting algorithm design.



## Importance of Degeneracy in Algorithms

Graphs with low degeneracy allow for improved algorithmic strategies, overcoming worst-case space constraints.



## Leverage Low Degeneracy

Utilizing low degeneracy can help circumvent the worstcase space lower bounds, enhancing algorithm performance.

### Space Efficiency Achievements

For graphs with degeneracy k, algorithms can achieve space complexity of Õ(mT), surpassing previous bounds of m³/2T and m√T.

### Extension to Other Problems

The proposed techniques can be adapted to address other subgraph counting challenges under bounded degeneracy.

#### Future Research Directions

Potential future work includes multipass refinements, exploring dynamic weighted streams, and validating performance on large-scale graphs.

## **Thank You**

