

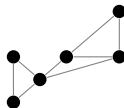
# Tight Bounds for Vertex Connectivity in Dynamic Streams

Sepehr Assadi & Vihan Shah

Rutgers University

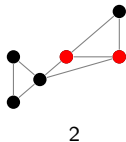
# Vertex Connectivity

- Undirected Graph  $G = (V, E)$
- Vertex Connectivity: Minimum number of **vertices** that need to be **deleted** to **disconnect**  $G$



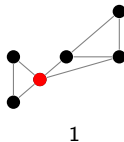
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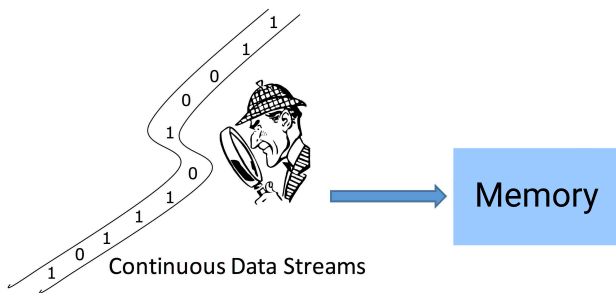
# Vertex Connectivity

- Undirected Graph  $G = (V, E)$
- Vertex Connectivity: Minimum number of **vertices** that need to be **deleted** to **disconnect**  $G$



# Graph Streaming

- $G = (V, E)$
- Edges of  $G$  appear in a stream
- Trivial Solution: Store all edges ( $\Omega(n^2)$  space)
- Goal: Minimize Memory ( $o(n^2)$  space)

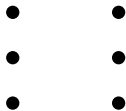


# Streaming Models

## Insertion-Only

# Streaming Models

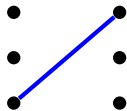
## Insertion-Only



# Streaming Models

## Insertion-Only

$e_1$

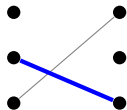




# Streaming Models

## Insertion-Only

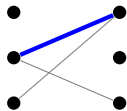
$e_1$	$e_2$
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# Streaming Models

## Insertion-Only

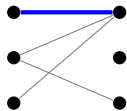
$e_1$	$e_2$	$e_3$
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# Streaming Models

## Insertion-Only

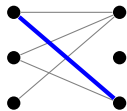
$e_1$	$e_2$	$e_3$	$e_4$
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# Streaming Models

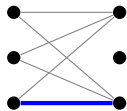
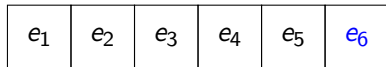
## Insertion-Only

$e_1$	$e_2$	$e_3$	$e_4$	$e_5$
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# Streaming Models

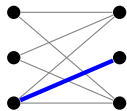
## Insertion-Only



# Streaming Models

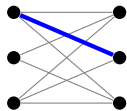
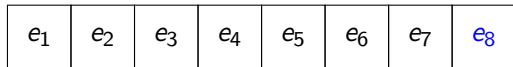
## Insertion-Only

$e_1$	$e_2$	$e_3$	$e_4$	$e_5$	$e_6$	$e_7$
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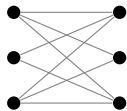
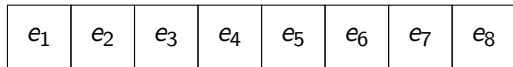
# Streaming Models

## Insertion-Only



# Streaming Models

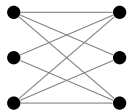
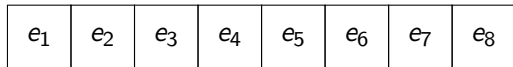
## Insertion-Only (finite stream)





# Streaming Models

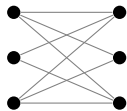
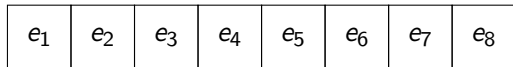
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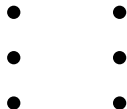
## Dynamic

# Streaming Models

## Insertion-Only (finite stream)

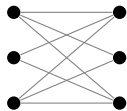
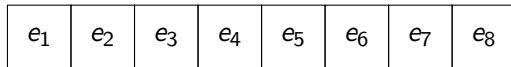


## Dynamic

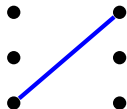


# Streaming Models

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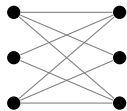
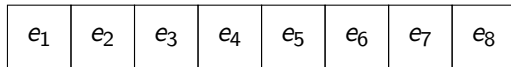


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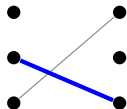
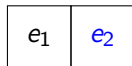


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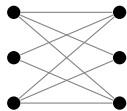
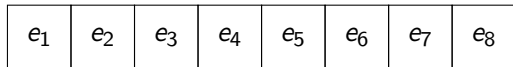


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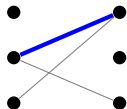
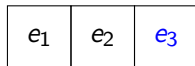


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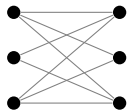
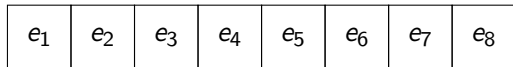


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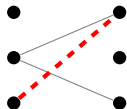
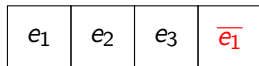


# Streaming Models

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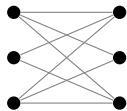
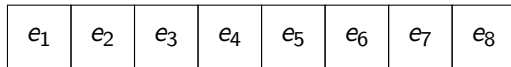


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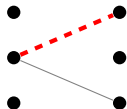
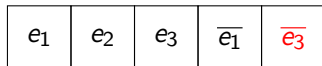


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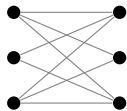
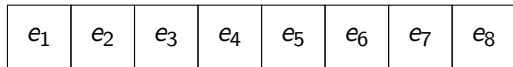


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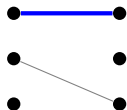
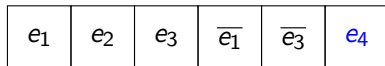


# Streaming Models

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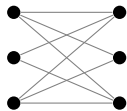
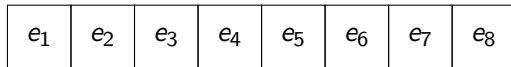
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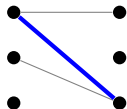
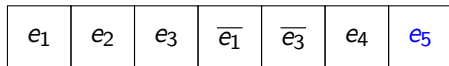


# Streaming Models

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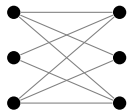
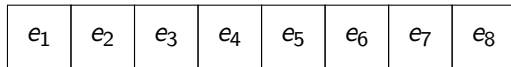


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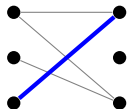
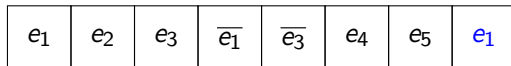


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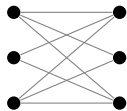
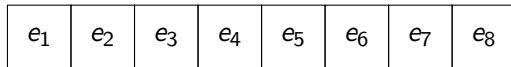


## Dynamic

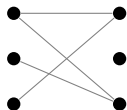
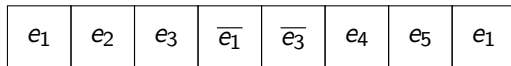


# Streaming Models

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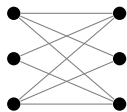
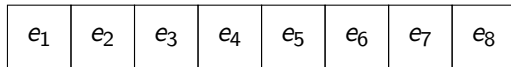


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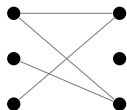
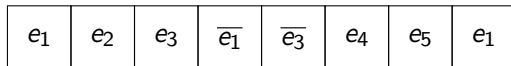


# Streaming Models

## Insertion-Only (finite stream)



## Dynamic (finite stream)



We want to solve the problem after a **single pass** of the stream

# Our Problem

- Finding exact vertex connectivity needs  $\Omega(n^2)$  space in the worst case [SW15]

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# Our Problem

- Finding exact vertex connectivity needs  $\Omega(n^2)$  space in the worst case [SW15]
- We want to solve the  $k$ -vertex connectivity problem in streaming (is the vertex connectivity of the input graph  $G < k$  or  $\geq k$ )
- We also want to output a certificate of connectivity (If  $G$  is  $k$ -vertex connected, output a subgraph  $H$  (certificate) that is also  $k$ -vertex connected)

# Previous Work

## Insertion-Only

- ① Upper bound:  $\tilde{O}(kn)$  [FKM<sup>+</sup>05]
- ② Lower bound:  $\Omega(kn)$  [SW15]



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- ① Upper bound:  $\tilde{O}(kn)$  [FKM<sup>+</sup>05]
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## Dynamic

- ① Upper bound:  $\tilde{O}(k^2n)$  [GMT15]
- ② Lower bound:  $\Omega(kn)$  [SW15]

# Previous Work

## Insertion-Only

- 1 Upper bound:  $\tilde{O}(kn)$  [FKM<sup>+</sup>05]
- 2 Lower bound:  $\Omega(kn)$  [SW15]

## Dynamic

- 1 Upper bound:  $\tilde{O}(k^2n)$  [GMT15]
- 2 Lower bound:  $\Omega(kn)$  [SW15]

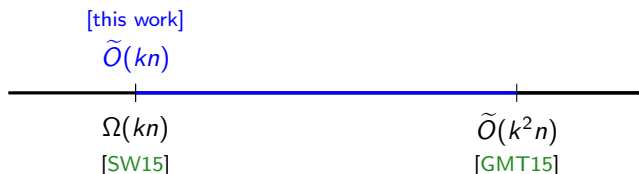
There is a gap of **factor  $k$**  between the best known upper and lower bound in dynamic streams

# Our Results

We bridge the gap between the upper and lower bound in dynamic streams

## Theorem

There exists a *randomized dynamic graph streaming* algorithm for *k*-vertex connectivity that succeeds with high probability and uses  $\tilde{O}(kn)$  space.

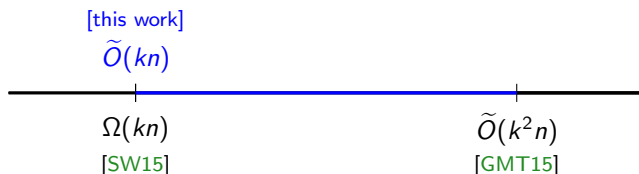


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Note: We also output a *certificate* of *k*-vertex connectivity

# Our Results

We also extend the lower bound of [SW15] to **multiple pass** streams:

## Theorem

*Any randomized  $p$ -pass insertion-only streaming algorithm that solves the  $k$ -vertex connectivity problem with probability at least  $2/3$  needs  $\Omega(kn/p)$  bits of space.*

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### Theorem

*Any randomized **p-pass** insertion-only streaming algorithm that solves the  $k$ -vertex connectivity problem with probability at least  $2/3$  needs  $\Omega(kn/p)$  bits of space.*

Note: This lower bound is for **multi-graphs** (also the case for [SW15])

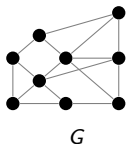
The upper bound also works for **multi-graphs**

## Algorithm of [GMT15]

For  $i = 1$  to  $r = O(k^2 \log n)$ :

- 1 Sample every vertex in  $V_i$  independently with probability  $1/k$
- 2 Store a spanning forest  $H_i$  on  $G[V_i]$

Output  $H = \cup_i H_i$  as the certificate

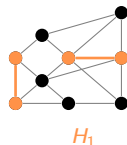
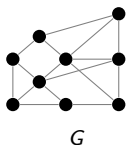


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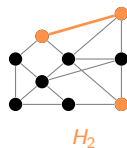
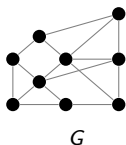


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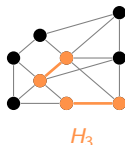
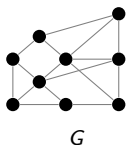


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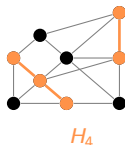
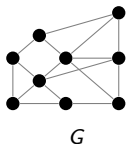


# Algorithm of [GMT15]

For  $i = 1$  to  $r = O(k^2 \log n)$ :

- 1 Sample every vertex in  $V_i$  independently with probability  $1/k$
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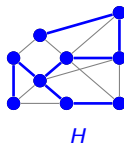
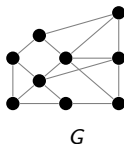


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## Open Problems

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You can visit my poster!

**Thank you!**

## References I

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