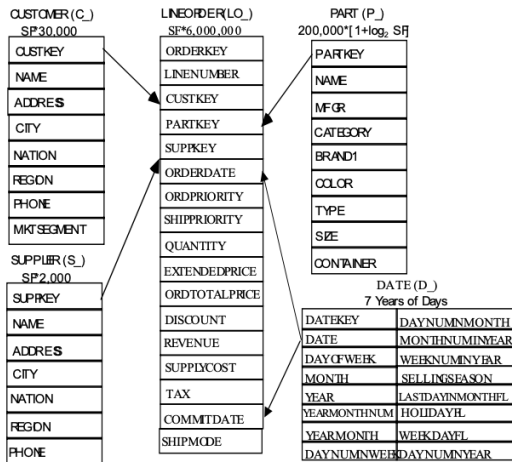


# Accelerating Joins with Filters: Keeping a Limited Memory is Robust

Nicholas Corrado   Xiating Ouyang

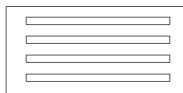
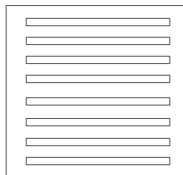
University of Wisconsin-Madison

# Star Schema

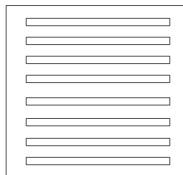


- Gigantic intermediate tables
- Filtering ahead of time before join

# Lookahead Information Passing (LIP)



# Lookahead Information Passing (LIP)



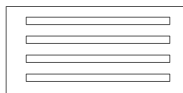
# Lookahead Information Passing (LIP)



# Lookahead Information Passing (LIP)



# Lookahead Information Passing (LIP)

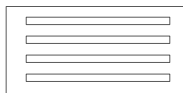
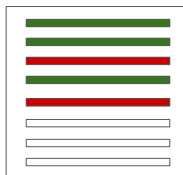


# Lookahead Information Passing (LIP)

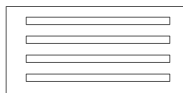
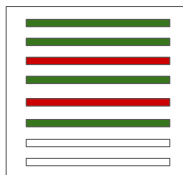




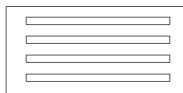
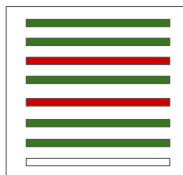
# Lookahead Information Passing (LIP)



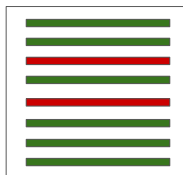
# Lookahead Information Passing (LIP)



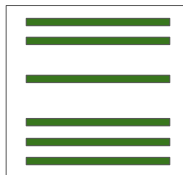
# Lookahead Information Passing (LIP)



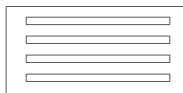
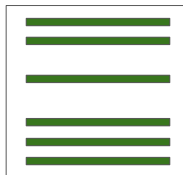
# Lookahead Information Passing (LIP)



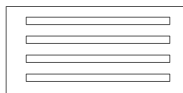
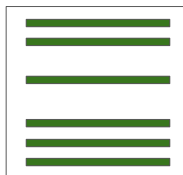
# Lookahead Information Passing (LIP)



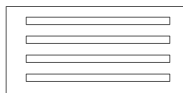
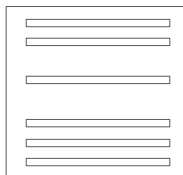
# Lookahead Information Passing (LIP)



# Lookahead Information Passing (LIP)

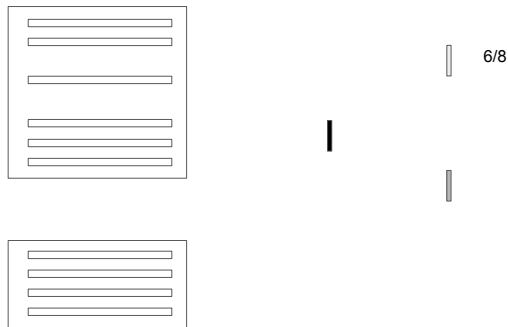


# Lookahead Information Passing (LIP)

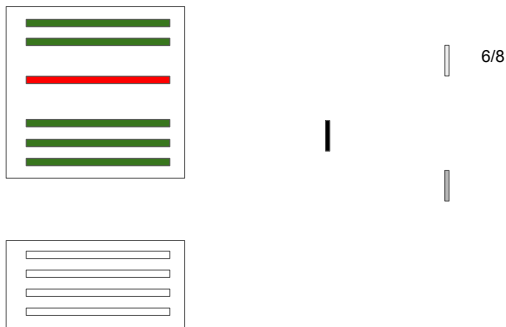




# Lookahead Information Passing (LIP)



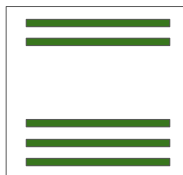
# Lookahead Information Passing (LIP)



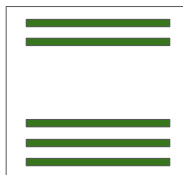
# Lookahead Information Passing (LIP)



# Lookahead Information Passing (LIP)



# Lookahead Information Passing (LIP)

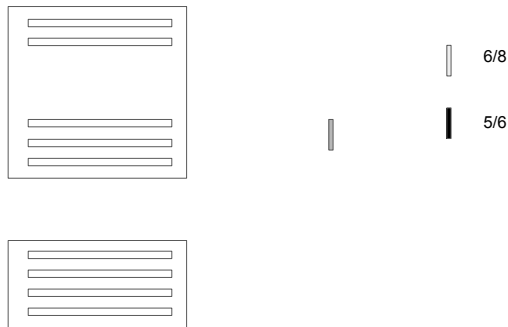


6/8

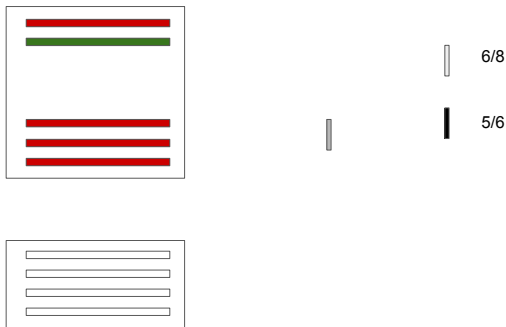
5/6



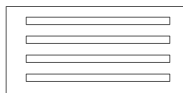
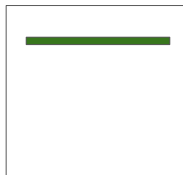
# Lookahead Information Passing (LIP)



# Lookahead Information Passing (LIP)



# Lookahead Information Passing (LIP)



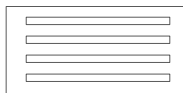
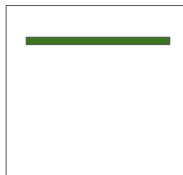
6/8



5/6



# Lookahead Information Passing (LIP)

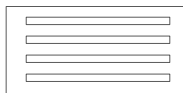
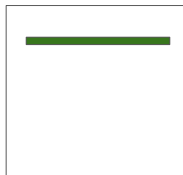


6/8

5/6



# Lookahead Information Passing (LIP)

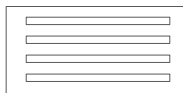
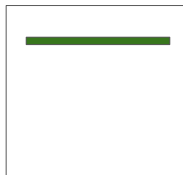


6/8

5/6

1/5

# Lookahead Information Passing (LIP)

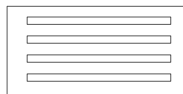


1/5

6/8

5/6

# Lookahead Information Passing (LIP)



1/5



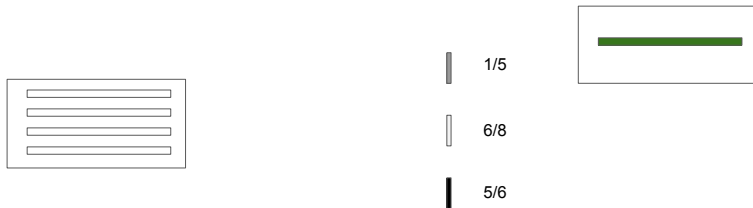
6/8



5/6

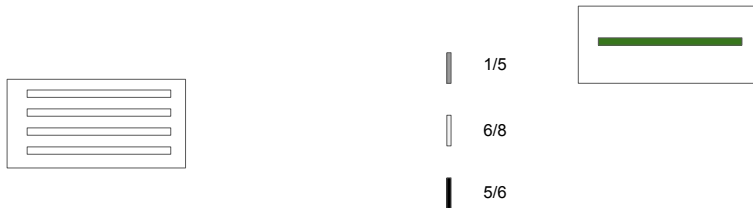


# Lookahead Information Passing (LIP)



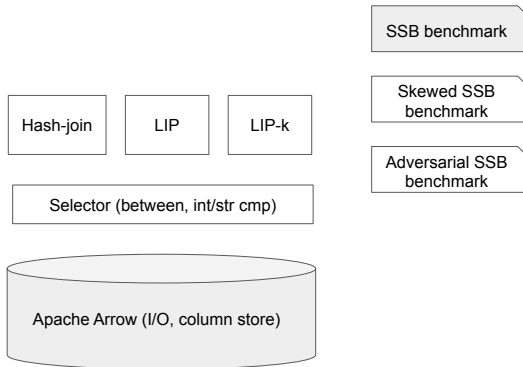
- Using statistics from all previous batches
- Just the previous  $k$

# Lookahead Information Passing (LIP)



- Using statistics from all previous batches
- Just the previous  $k$  — LIP- $k$

# Implementation and benchmarking



# Experiments



# LIP is solving an online problem

- Tuples arriving one at a time
- Upon arrival, decide a sequence of filters
- Minimize the total probes
- Deterministic!

# LIP is solving an online problem

- Tuples arriving one at a time
- Upon arrival, decide a sequence of filters
- Minimize the total probes
- Deterministic!

## Theorem

*Let  $n$  be the number of filters in the LIP problem. There is no deterministic mechanism  $\mathcal{M}$  achieving a competitive ratio less than  $n$  for the LIP problem.*

# LIP is solving an online problem

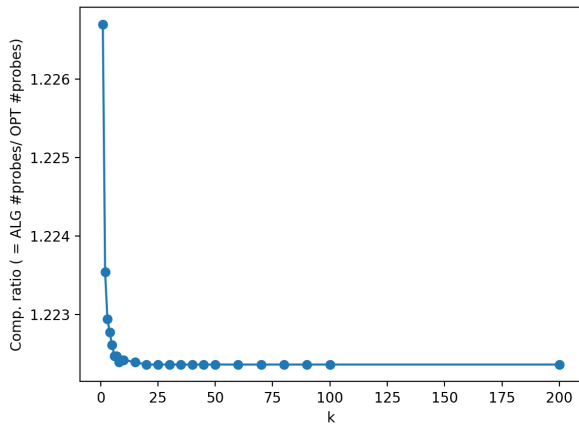
- Tuples arriving one at a time
- Upon arrival, decide a sequence of filters
- Minimize the total probes
- Deterministic!

## Theorem

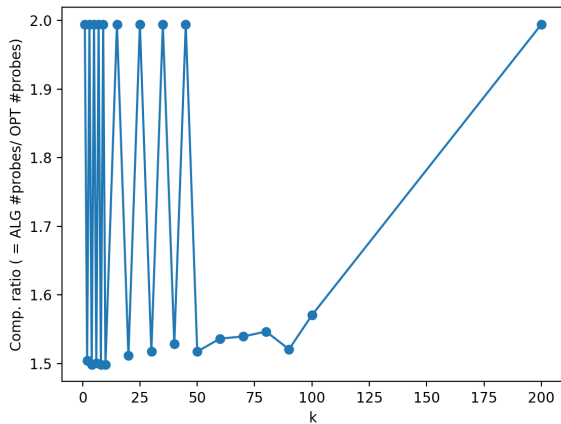
*Let  $n$  be the number of filters in the LIP problem. There is no deterministic mechanism  $\mathcal{M}$  achieving a competitive ratio less than  $n$  for the LIP problem.*

- Not observed in practice, but a theoretical lower bound
- Randomness?

# Competitive ratio vs. $k$ on Uniform



# Competitive ratio vs. $k$ on skewed



# Conclusion

- Implemented LIP and its variant LIP- $k$
- LIP- $k$  is better than LIP in the adversarial/skewed settings
- Randomness to achieve better robustness guarantee

# Thank you!

# Questions?