### Funnel Sort\*: Cache Efficiency and Parallelism

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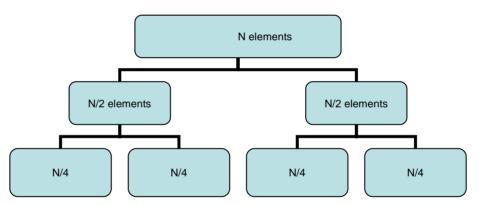
\* Developed by Frigo, Leiserson, et. al.

# Outline

- Cache Efficient vs Cache Oblivious
- Funnel Sort: How it achieves cache efficiency
- Performance:
  - Serial Execution
  - Cache Performance
  - Parallel Implementation
- Future Possible Work
- Conclusions

# **Cache Efficiency and Sorting**

 Cache Efficiency: Many sorting algorithms are cache oblivious, but not cache efficient. For example, a 2-way recursive sorting algorithm (such as Quick Sort or Merge Sort).



 At every level all N elements are processed, which means all N elements are loaded into cache. If loaded one line at a time, for every L (size of cache line) elements loaded into cache, there is 1 cache miss: 1/L amortized cache miss per element.

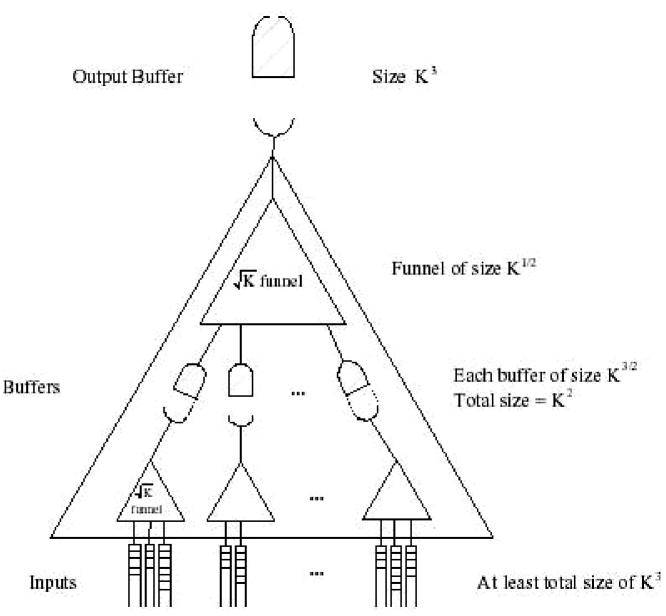
### **Cache Performance**

- Implies an O(n/L lg n) cache miss bound.
- If Z is the number of lines in a cache, Professor Bender's lecture showed cache aware O(n/L \* (log n)/(log Z)) cache miss sorting algorithm by doing an O(Z)-way merge sort.
- Works by decreasing the height of the tree.
- Can we achieve this bound with a cacheoblivious algorithm? Yes!

#### **Funnel Sort**

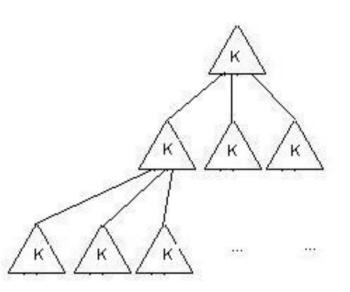
- Try to get as close to a *Z*-way merge as possible.
- Intuition: Want to recursively lay out a Kway merge (lets call it a K-funnel) to consist of smaller funnels.
- Important that all K-funnels be the same size no matter what location in the sort tree!

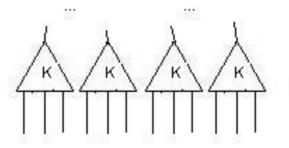
- Note that all *K*-funnels will be of the same size regardless of the size of inputs.
- At some point, K is small enough that the Kway merge fits into cache.

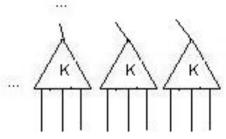


### When K fits in cache

- For some *K*, the entire *K*-funnel will fit in cache.
- Now, think of the original problem as a series of K merges, where K is close to Z.







### Funnel Sort cache efficiency

- For the appropriate constants for the size of buffers, achieve O(n/L \* (log n)/(log Z)) cache misses for this cache-oblivious sorting algorithm.
- Provable that no better cache-oblivious bound exists.

### **Performance: Serial Execution**

- Actual implementation performed poorly!
- Runs significantly slower than Quicksort (about 4x as slow).

# Why? Possible Reasons

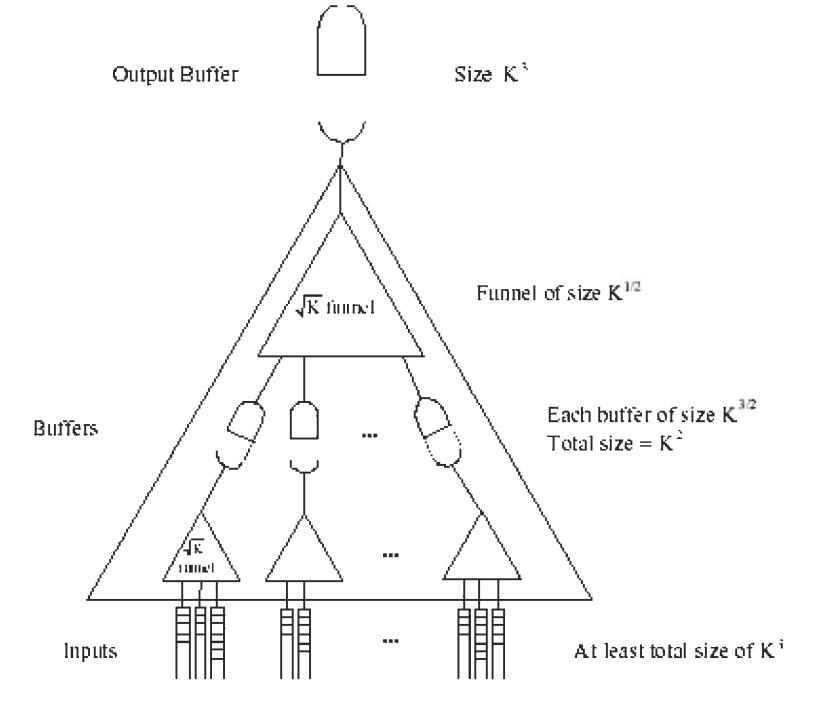
- Bad implementation.
- Runtime not dominated by cache misses.
- Much more memory management than Quick Sort (not in place).
- Lots of calculations to keep track of buffers and how full they are.
- Cache dominated by the internal buffers of a funnel, for a K-funnel, K^2 memory used for internal buffers, 2\*K used for input buffers.
- Rounding errors! Funnel sort relies on taking square roots, and cube roots often, which in practice yields an imbalanced funnel.

### Cache Performance

- Tested by changing type of item being sorted from int to long. Should approximately double the number of cache misses!
- Change in performance is less than 5% slower in a 4-way merge sort (Cilk Sort, implemented by Matteo Frigo), implying perhaps that cache misses are not a large cost.
- Appears that Funnel Sort suffers the smallest slowdown from increasing the size of data (versus Quick Sort and Cilk Sort), but difficult to say accurately.

### Parallelize FunnelSort?

- Not terribly practical without a fast serial implementation.
- Lends well to parallelism.
  - Recursive merging can be done on separate processors.
  - Because of buffering, final merge shortly after inputs start being processed.
  - Could use locks on the circular buffers so that simultaneous reads from the head and writes to the tail are possible.
  - With log(n)/log(Z) processors, possibly O(n) sorting?



### Conclusions

- Possible to create a cache-oblivious sorting algorithm that has cache misses on the order of a cache-aware algorithm.
- In practice, difficult to implement correctly.
- Extra overhead difficult to recover with the reduced cache misses.
- Potentially very parallelizable.