

Fast Bulk Bitwise AND and OR in DRAM

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Bulk Bitwise Operations

- Important component of modern-day programming
- Wide variety of applications (e.g., database, graphics)
- Enable more efficient algorithms *

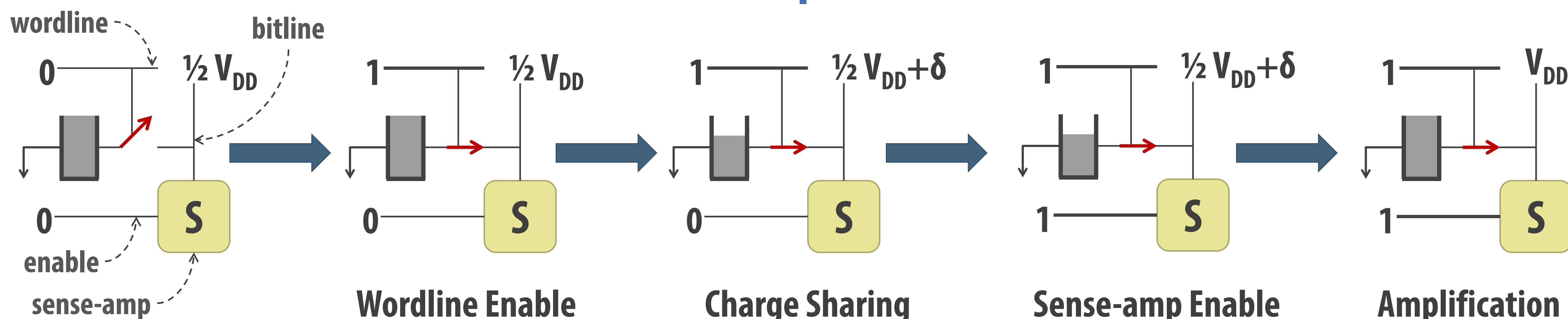
*D.E Knuth, Bitwise Tricks and Techniques, 2009

Existing systems require large data movement

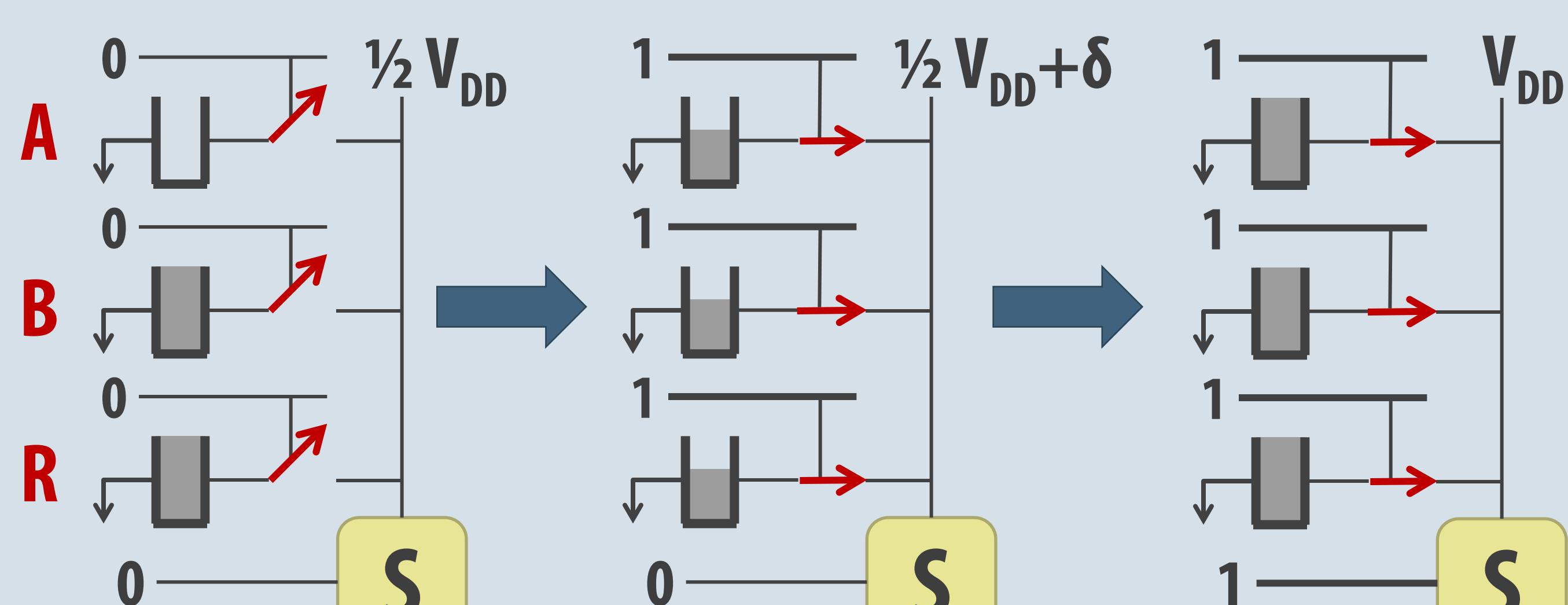
Processor \leftrightarrow Main Memory

1. High Latency
2. High Bandwidth Consumption
3. High Energy Consumption

DRAM Cell Operation



Triple Wordline Activation



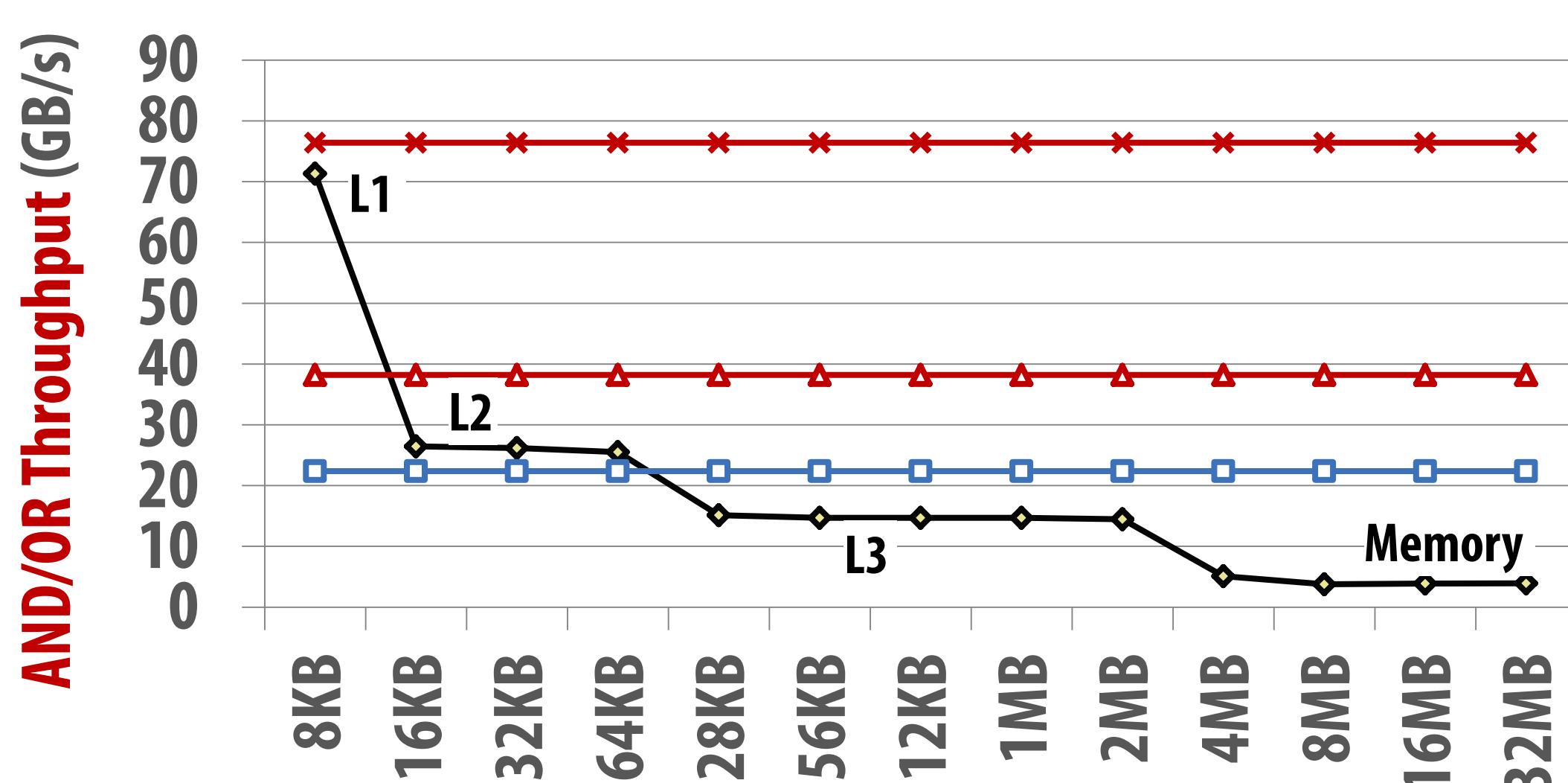
$$\text{Output} = R \cdot (A \text{ OR } B) + \neg R \cdot (A \text{ AND } B)$$

- Enables row-wide bitwise AND/OR operation
- Minimal changes to DRAM row decoder
- Support for RowClone (fast in-DRAM copy/init)

Algorithm for $C = A \text{ (AND/OR) } B$

1. Copy src row A to temporary row D1
2. Copy src row B to temporary row D2
3. Init temporary row D3 with 0/1
4. Activate D1, D2, D3 simultaneously
5. Copy D1/D2/D3 to result row C

- Intel-AVX (one core)
- In-DRAM (Cons.) (1 bank)
- In-DRAM (Aggr.) (1 bank)
- * In-DRAM (Aggr.) (2 banks)



In-Memory Bitmap Indices

- Bitmap bins used to represent conditions (e.g., age < 18)
- Bitwise AND/OR of bitmaps used to evaluate query conditions!
- Performance depends on throughput of bitwise AND/OR

FastBit: Real world bitmap index library

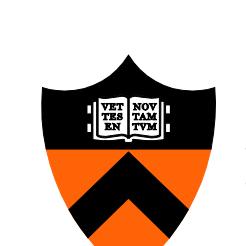
- Index-intensive queries: 33% of execution spent in bitwise OR
- Average performance improvement using In-DRAM OR: 30%



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