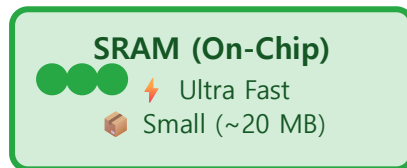


## Flash Attention: IO-Aware Optimization

### GPU Memory Hierarchy



Slow I/O



### Standard Attention:

- ✗ Load full attention matrix
- ✗ Multiple HBM reads/writes
- ✗  $O(n^2)$  memory bottleneck

### Flash Attention:

- ✓ Block-wise computation
- ✓ Minimize HBM access
- ✓  $O(n)$  memory usage

### Flash Attention v1

- Tiling and recomputation
- Block-wise attention
- 2-4x speedup

### Flash Attention v2

- Better parallelization
- Improved work partitioning
- 5-9x faster than standard

### Medical Impact

- Real-time patient analysis
- Affordable long-context
- Clinical deployment ready

### Key Innovation

- Fuse operations in SRAM
- Avoid materialization
- 3-10x less HBM access



### Revolutionary Efficiency

Flash Attention achieves exact attention with  $O(n)$  memory and 3-10x speedup by optimizing GPU memory access patterns, making long-context medical AI practical. **The bottleneck is I/O, not computation!**