

Volume Estimation

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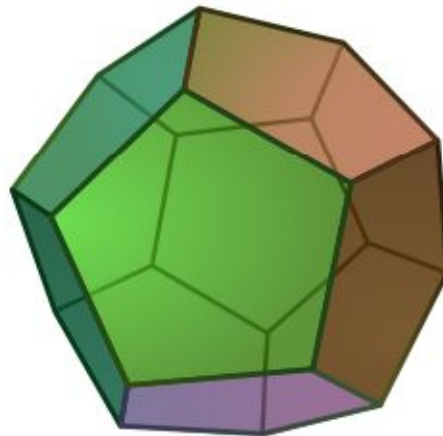
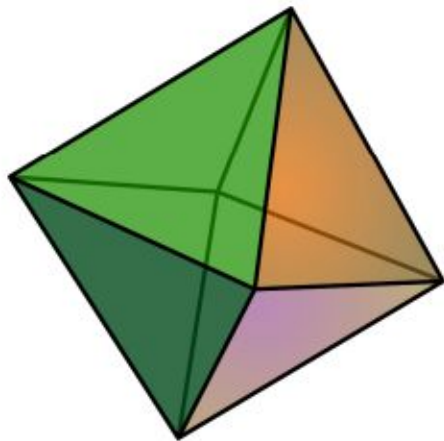


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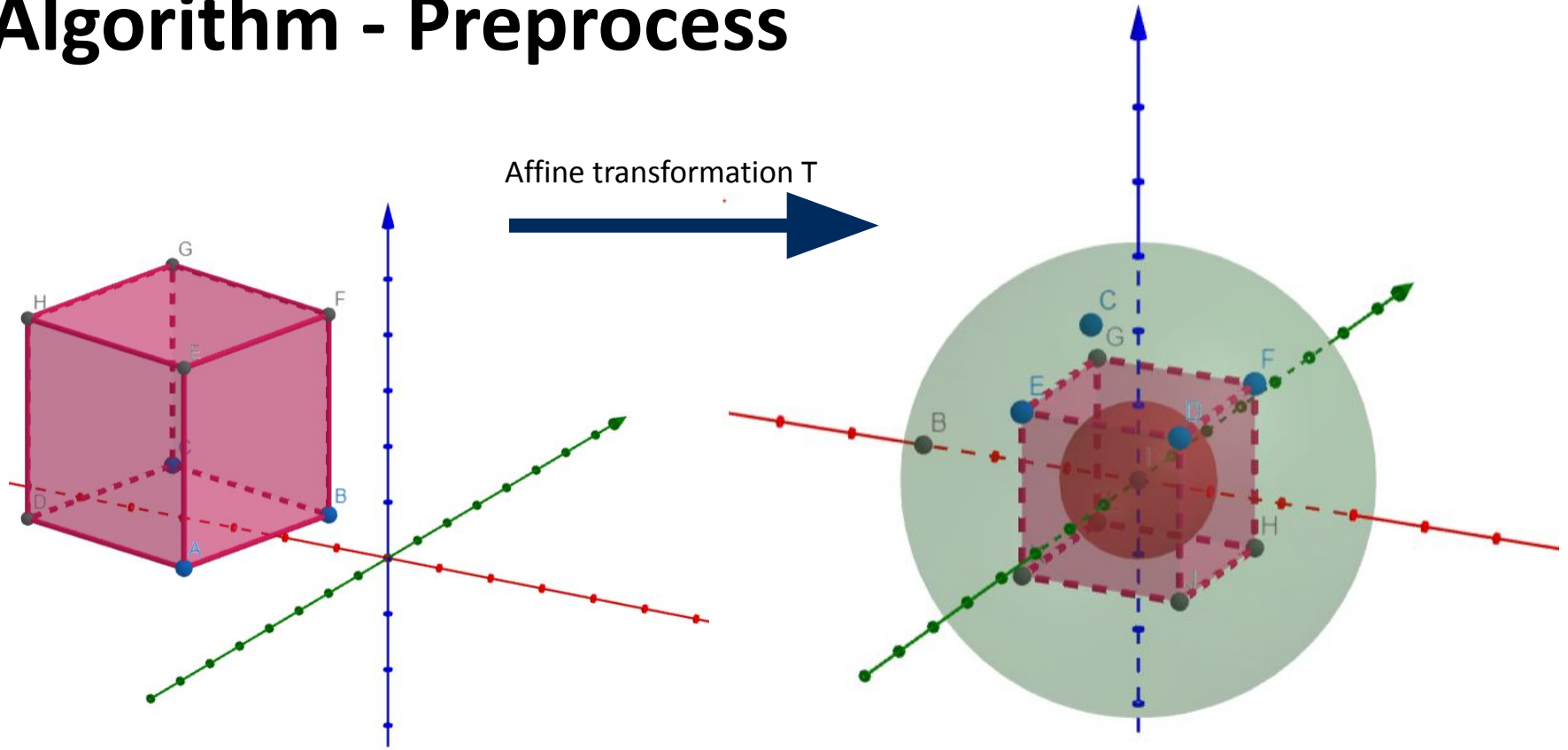
Algorithm

Input: convex polytope $P = \{Ax \leq b\}$, A matrix $M \times N$, b vector of length M .

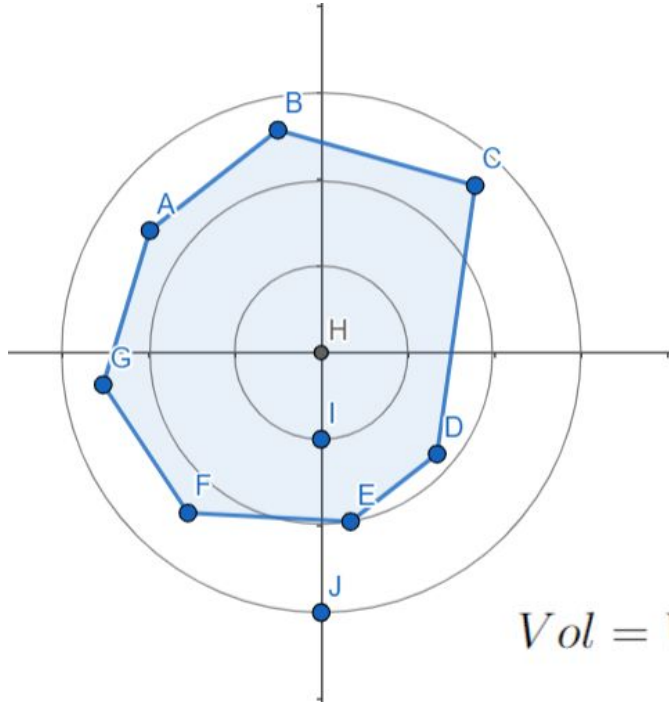
Output: volume.



Algorithm - Preprocess

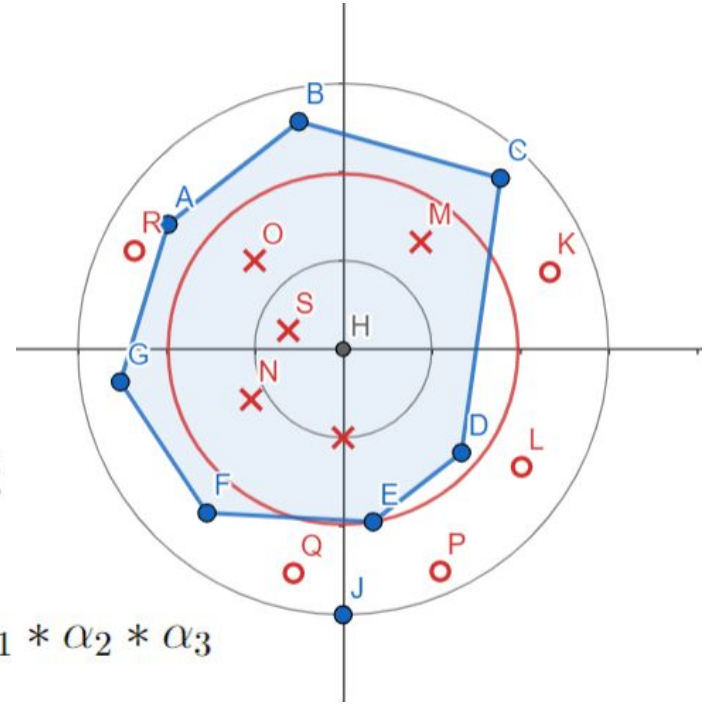


Algorithm - Estimate Volume



$$\alpha_i = \frac{\text{step_size}}{\text{count}_x}$$

$$Vol = Vol(\text{unit_ball}) * \alpha_1 * \alpha_2 * \alpha_3$$



Experimental Setup

Machine: Intel(R) Core(™) i7-10750H CPU@2.60GHz

Compiler: GCC 13.1.1. **Flags:** -O3 -ffast-math -mfma

Correctness checks: using C++ test suite & statistical results.

Instance	Our implementation		PolyVest	
	Average volume	Std dev	Average volume	Std dev
cube_10_2	546926.68	21988.56	546268.81	22424.92
cube_20	1046997.12	49570.08	1046489.42	50500.44
cube_30	1057862200	65797587.76	1079077000	41080052.76
cube_40	1068423700000	52708695732	1080309700000	83085684089
rh_20_40	107.12566	5.833945972	109.1694	5.524649556
rh_30_60	14.54958	0.8593524937	14.09984	0.8817383741
cross_7	0.02513503	0.0008472310482	0.02583266	0.0004165696399

Baseline implementation

- Preprocess - $O(N^3)$
- Estimate Volume - $O(N^4 (\log N)^2)$
 - Walk - $O(N^2)$ called $1600 \cdot (N \cdot \log N)^2$ times

Bottleneck: Walk!

Basic optimizations

- Inline functions
- Remove repeated operations (eg. memory allocations on every function call)
- Pre-compute constants
- Simplify mathematical expressions
- Scalar replacement (eg. n instead of $p \rightarrow n$)
- Replace matrix-matrix operations with matrix-vector, in Preprocess
- Use xoshiro random number generator

Basic optimizations

Intel(R) Core(TM) i7-10750H CPU @ 2.60GHz

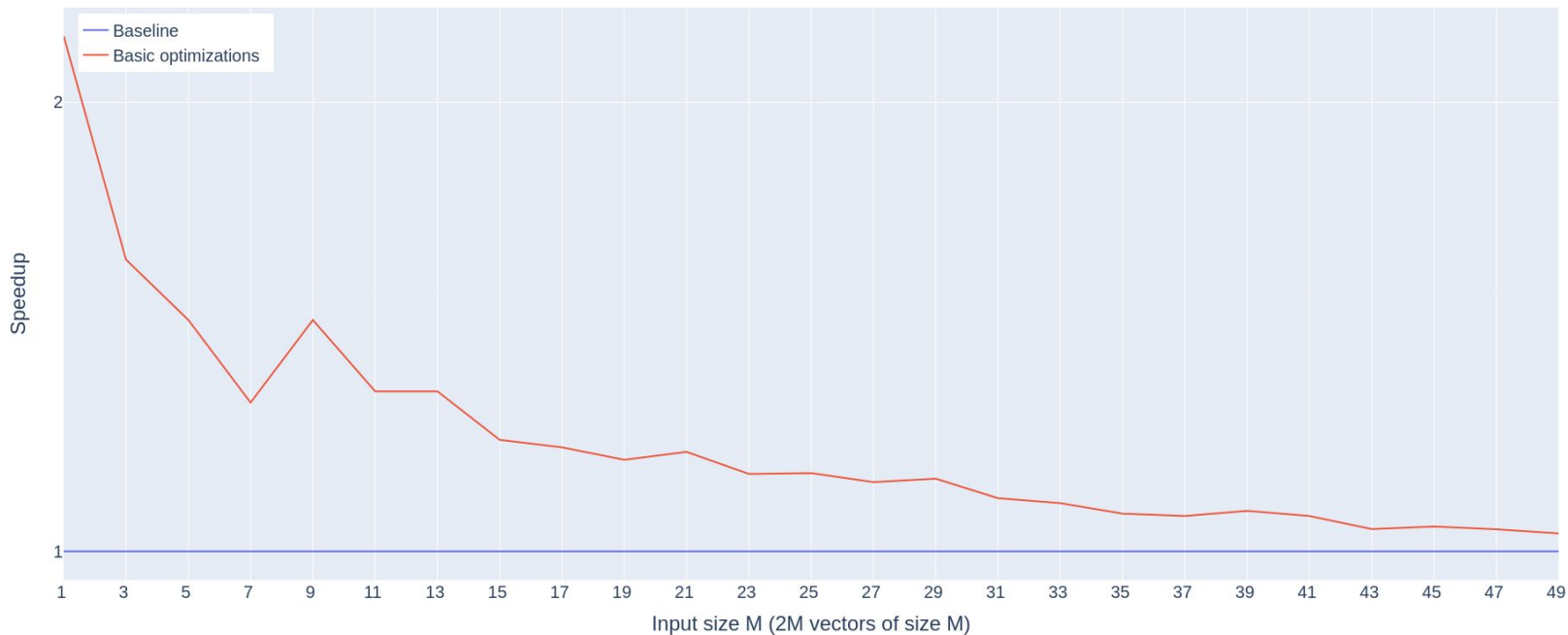
L1d cache: 256 KiB

L1i cache: 128 KiB

L2 cache: 1.5 MiB

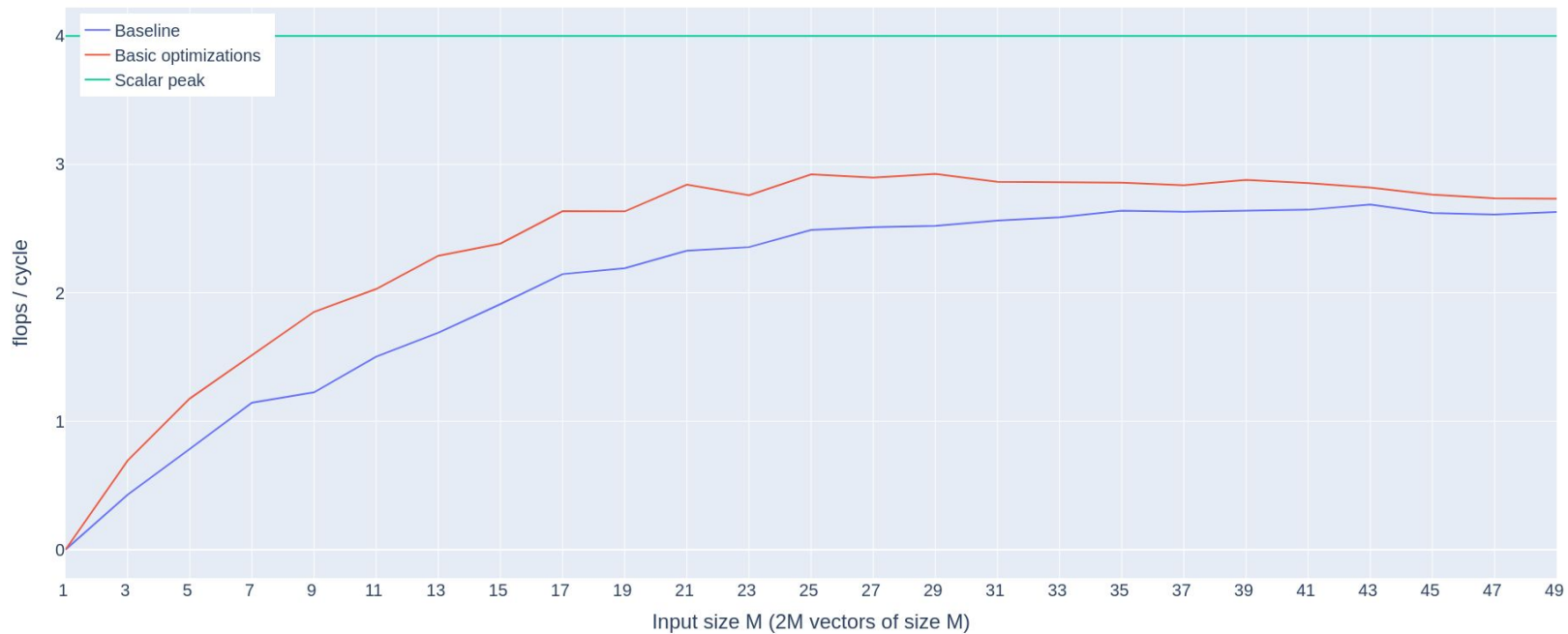
L3 cache: 12 MiB

Compiler: GCC 13.1.1 Flags: -O3 -ffast-math -mfma



Basic optimizations

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Algorithmic optimization

- The walk functions computes the matrix-vector product $(A / A.col(rand_dir)) * sampling_points$ in $O(N^2)$
- Idea: pre-compute $A * sampling_points$ once, take the division as a common factor. The result can be updated in $O(N)$
- Overall, reduce complexity from $O^*(N^4)$ to $O^*(N^3)$.

Algorithmic optimization

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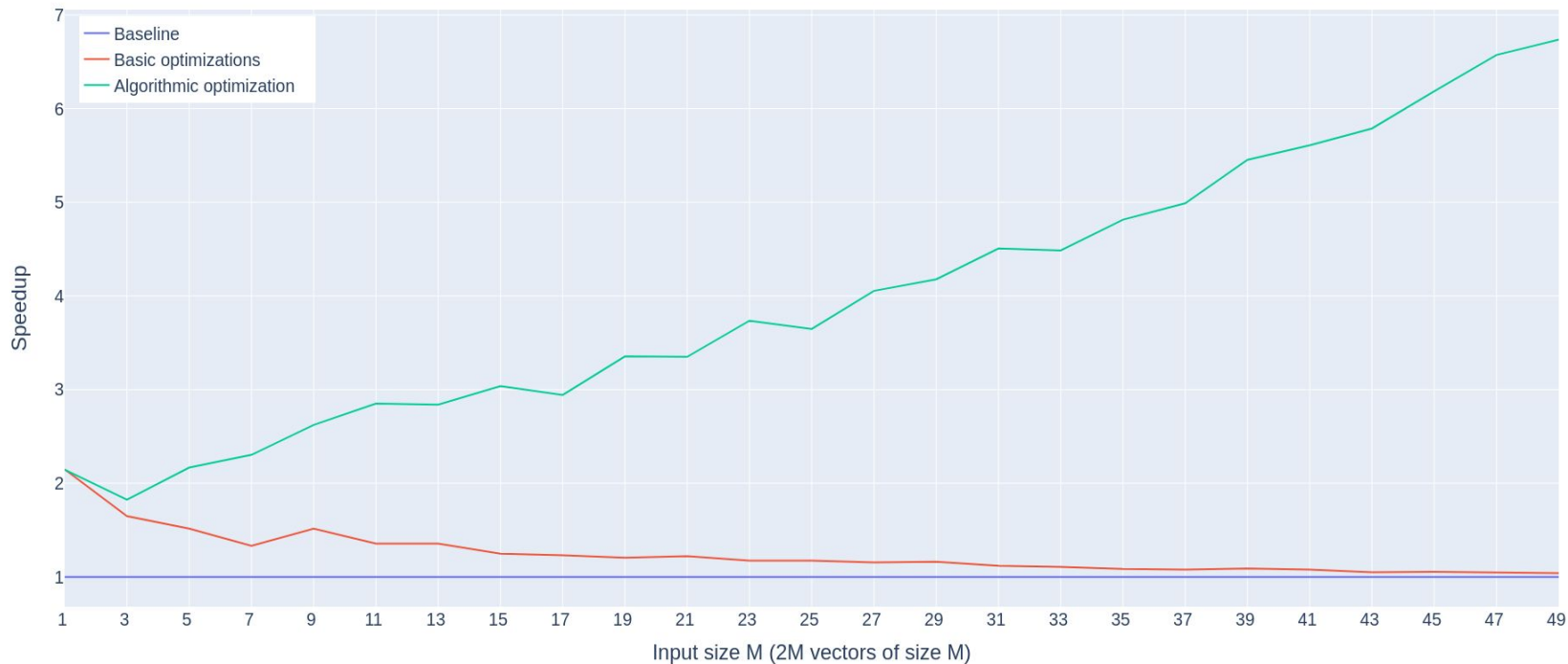
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Algorithmic optimization

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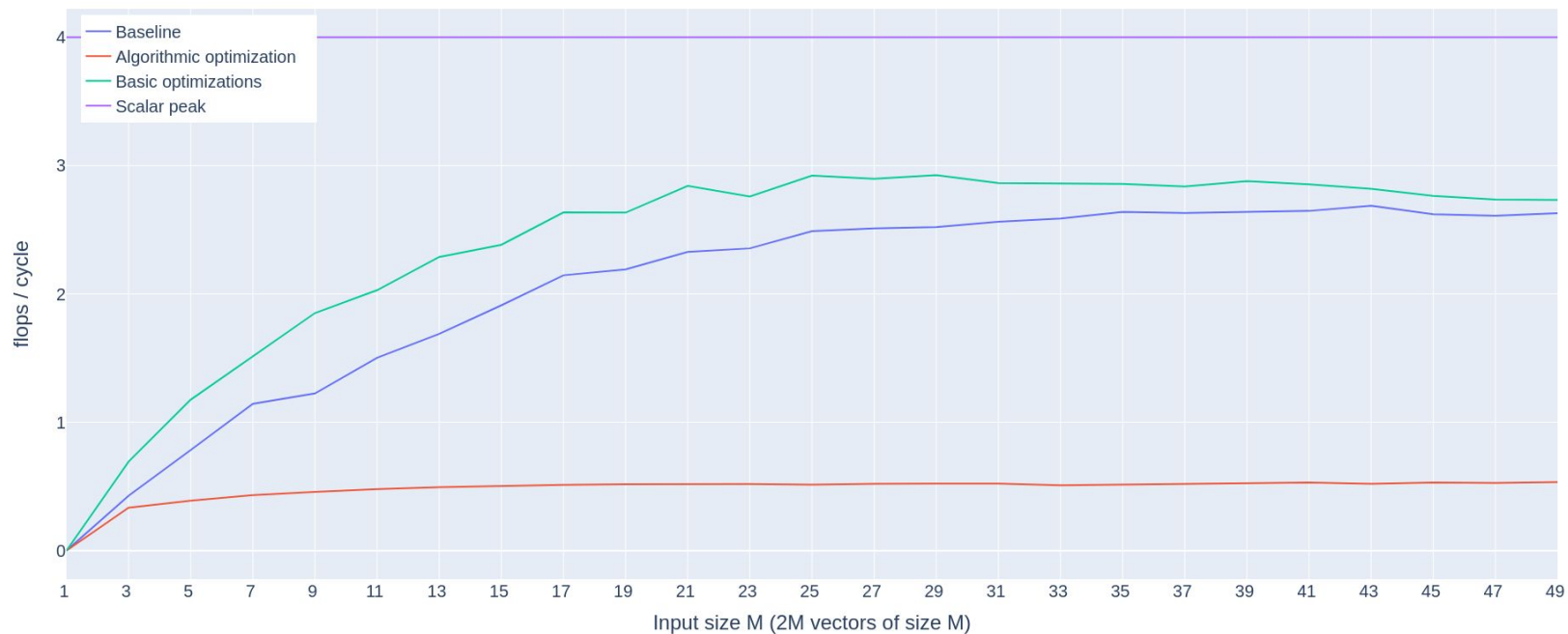
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Vectorization

Intel(R) Core(TM) i7-10750H CPU @ 2.60GHz

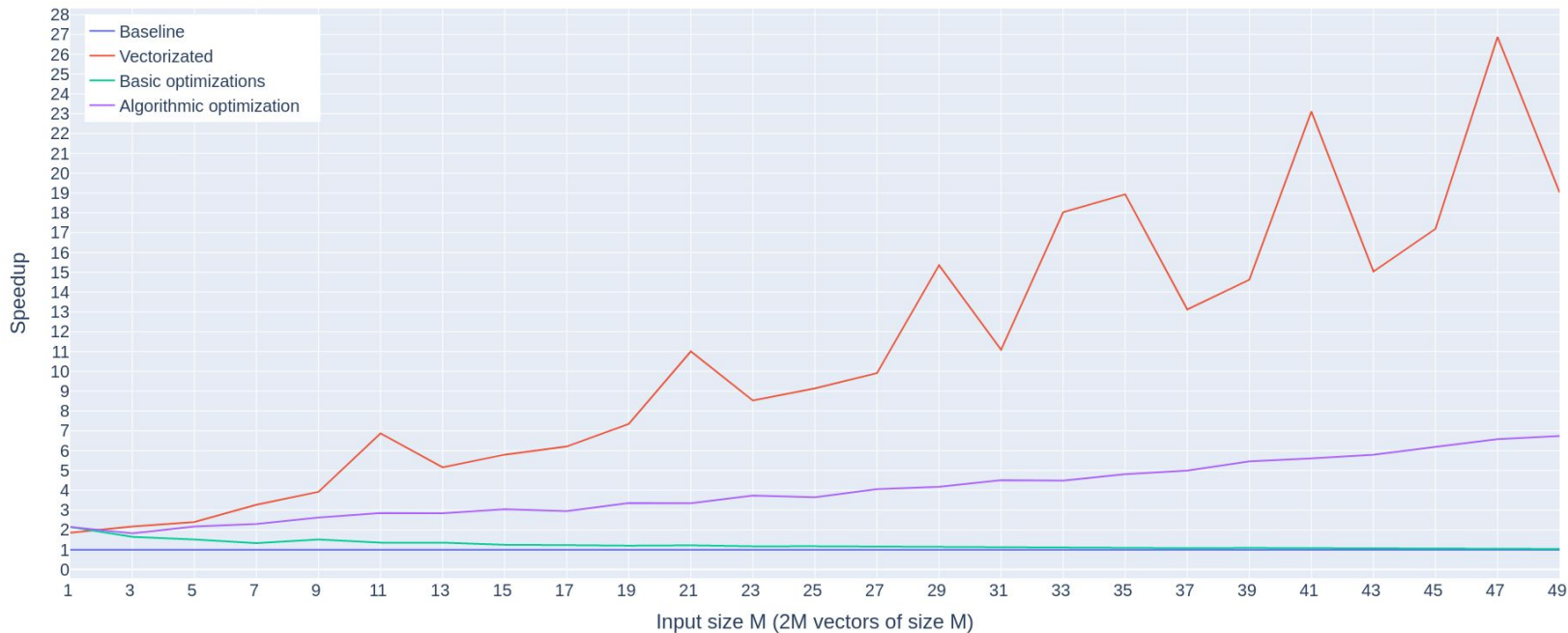
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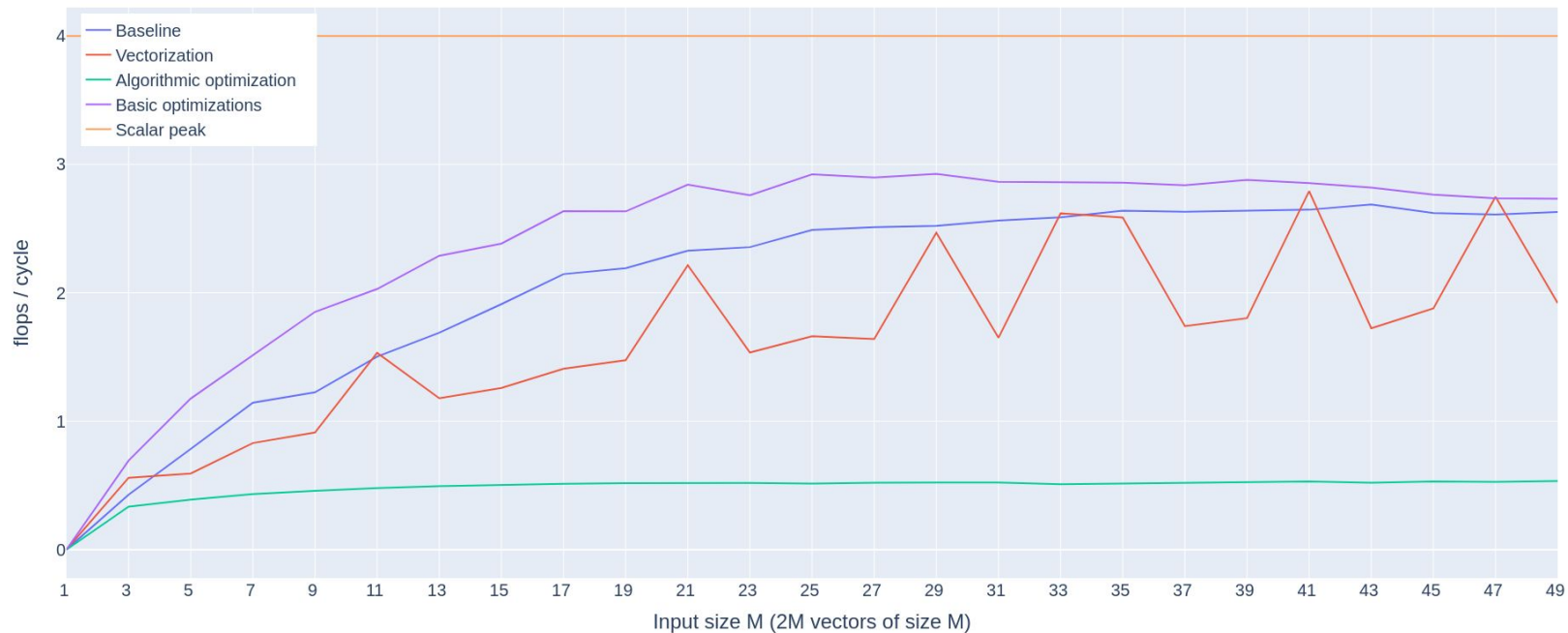
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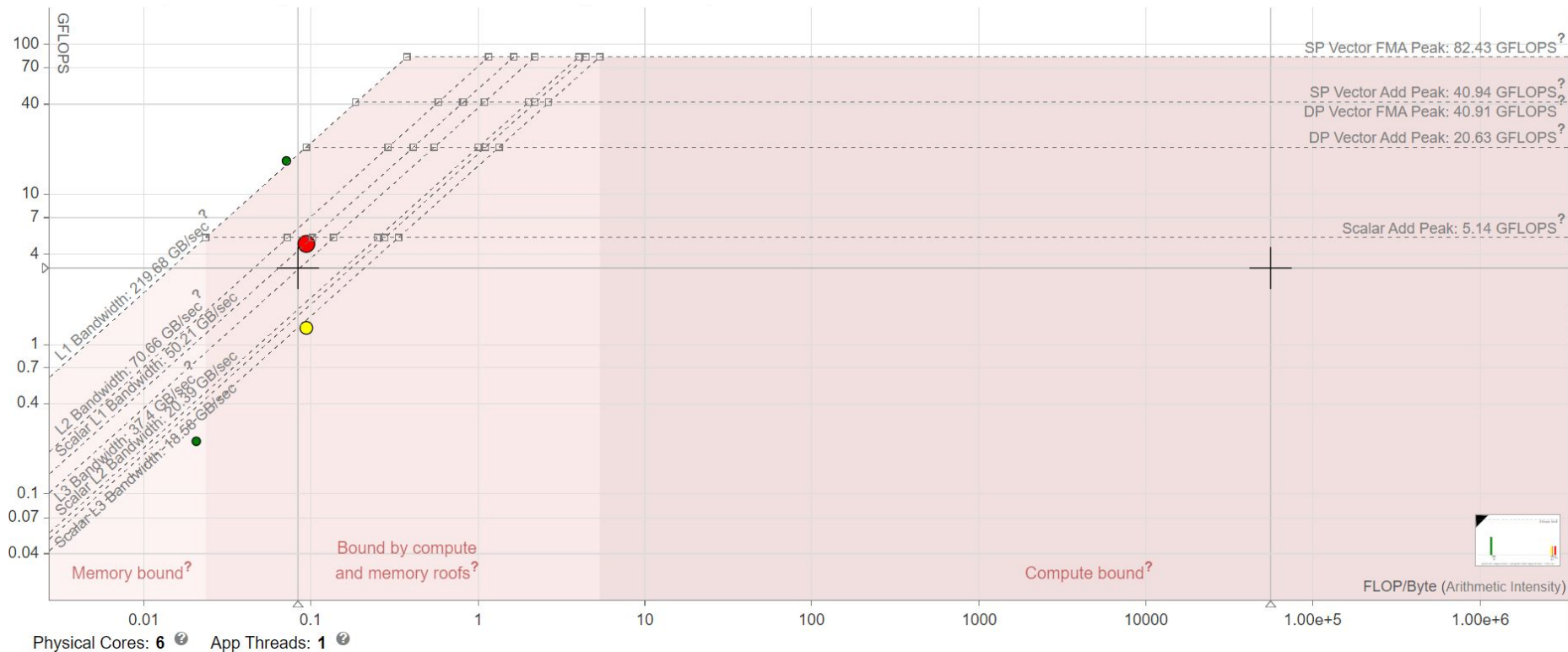


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Roofline plot



Thank you! Questions?