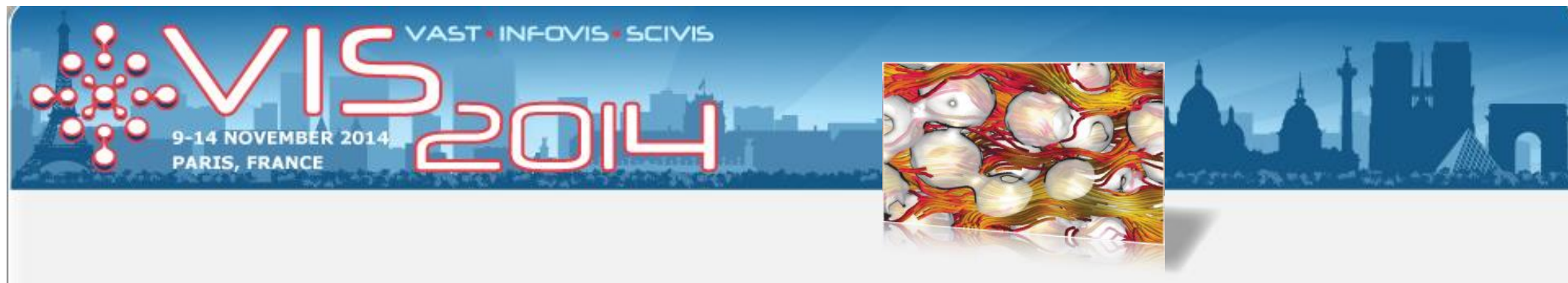
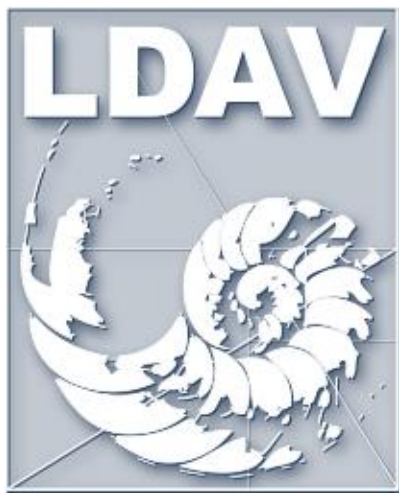


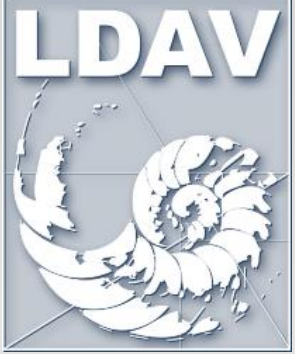
# Cache-Aware Sampling Strategies for Texture-Based Ray Casting on GPU

Junpeng Wang

Fei Yang

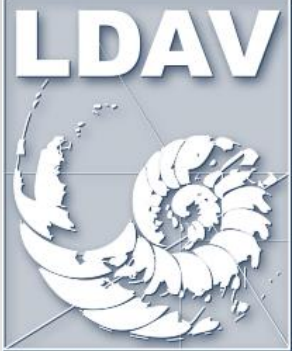
Yong Cao



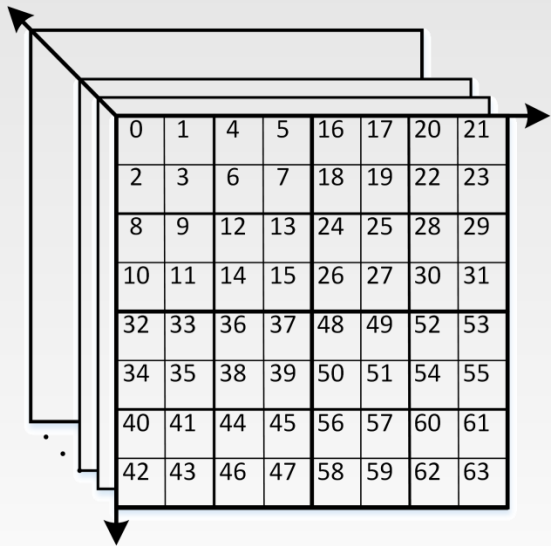


# Overview

- Introduction/Motivation
- Related Work
- Contribution
- Result
- Application



# Motivation



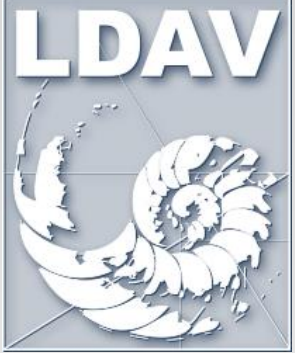
Motivation

Related Work

Contribution

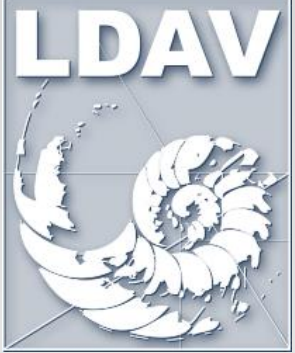
Result

Application

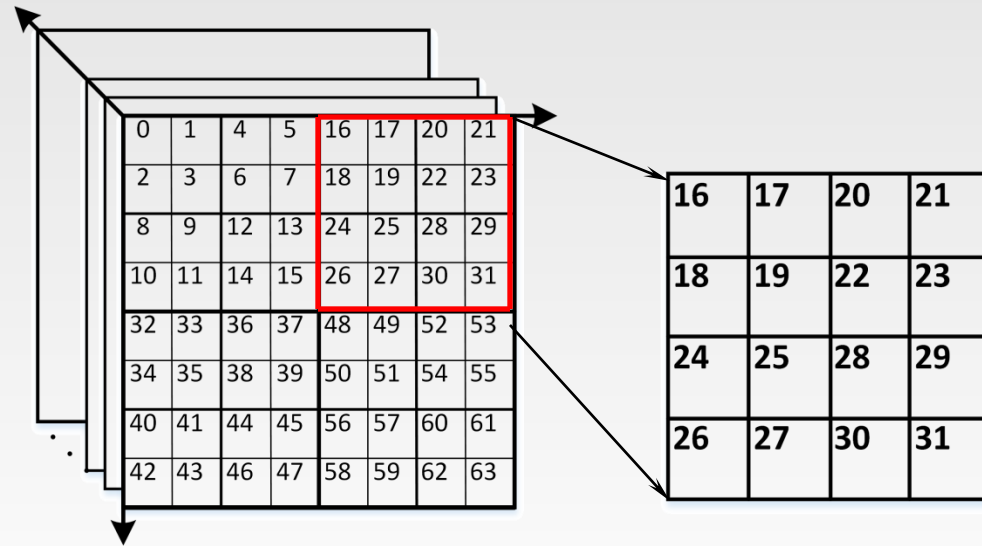


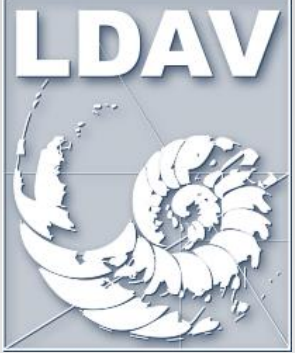
# Motivation

0	1	4	5	16	17	20	21
2	3	6	7	18	19	22	23
8	9	12	13	24	25	28	29
10	11	14	15	26	27	30	31
32	33	36	37	48	49	52	53
34	35	38	39	50	51	54	55
40	41	44	45	56	57	60	61
42	43	46	47	58	59	62	63

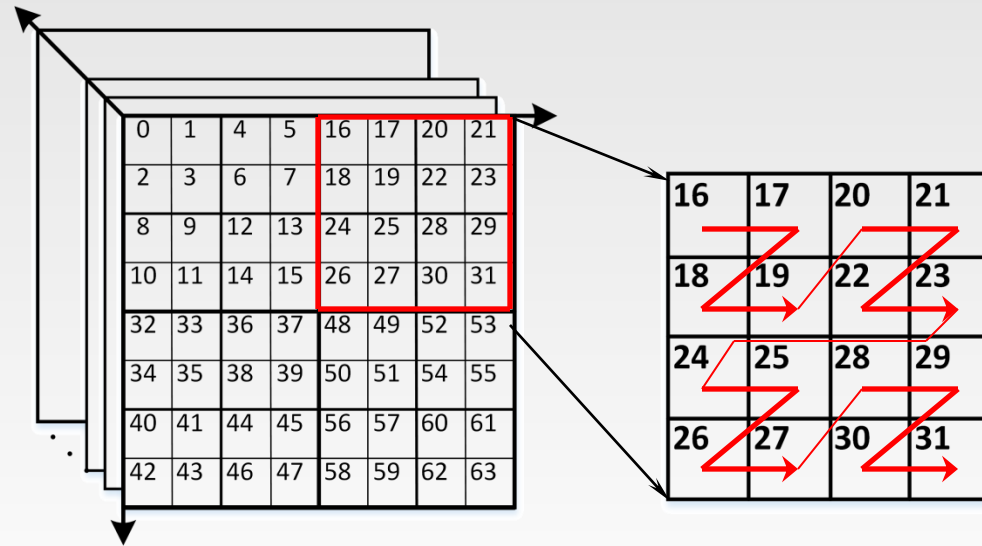


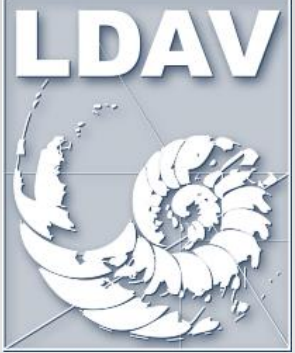
# Motivation





# Motivation





# Motivation

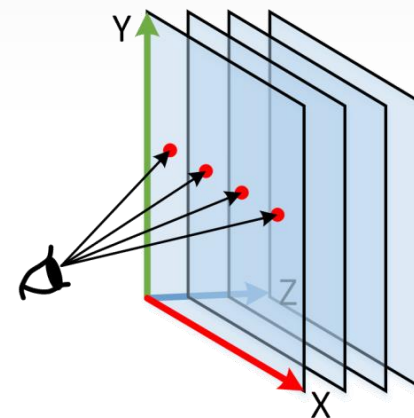
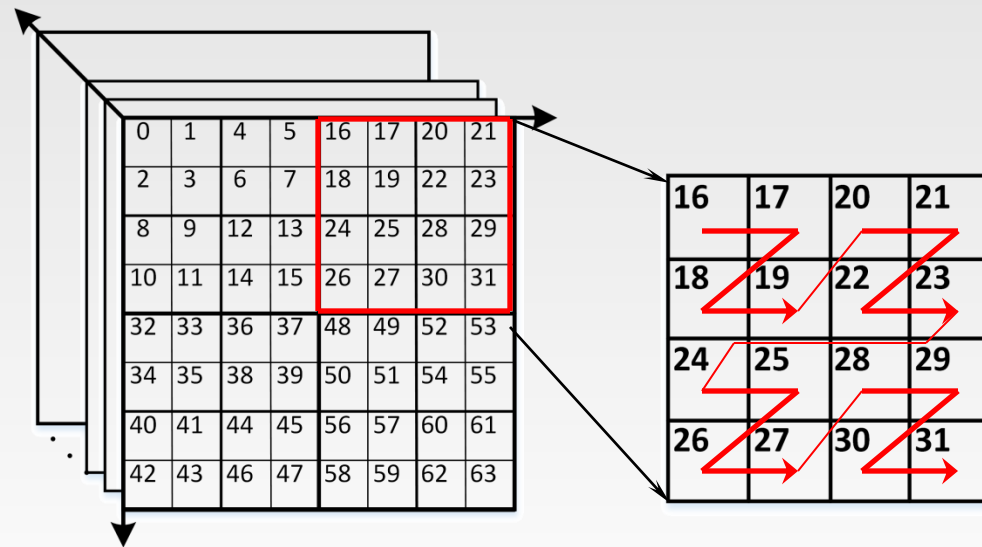
Motivation

Related Work

Contribution

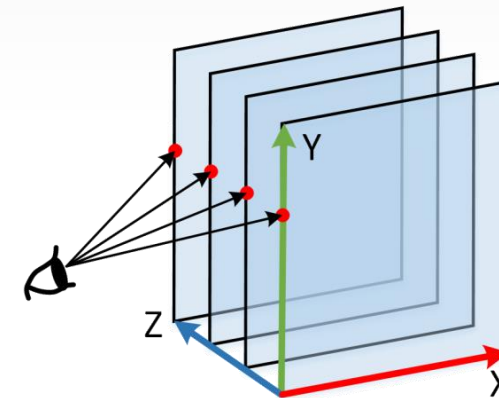
Result

Application



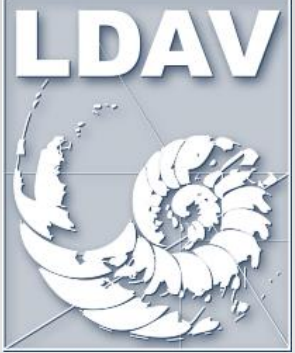
facing XY

Perpendicular



facing ZY

Parallel



# Motivation

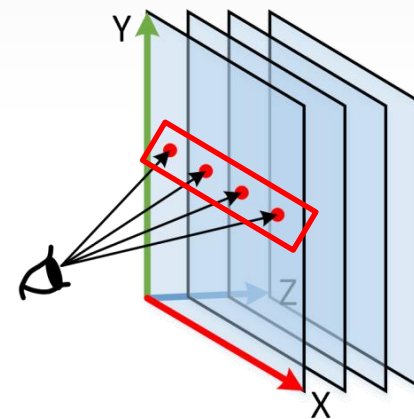
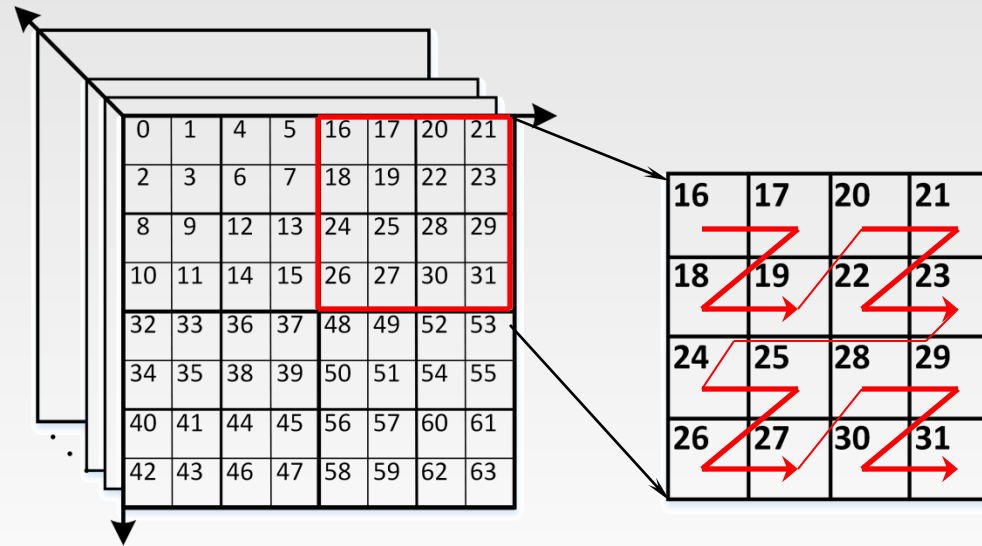
Motivation

Related Work

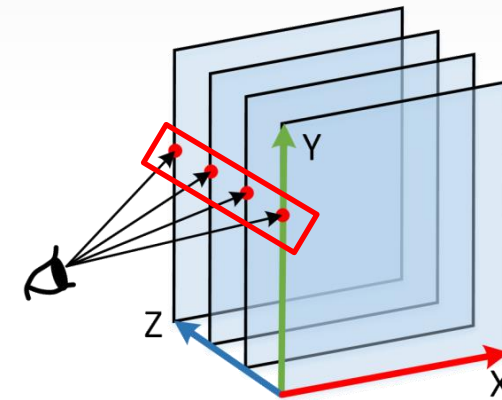
Contribution

Result

Application

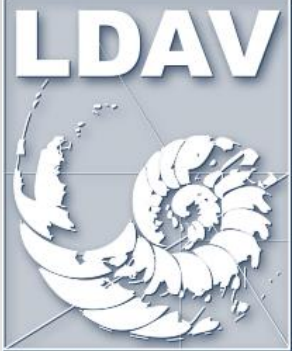


Perpendicular



Parallel





# Motivation

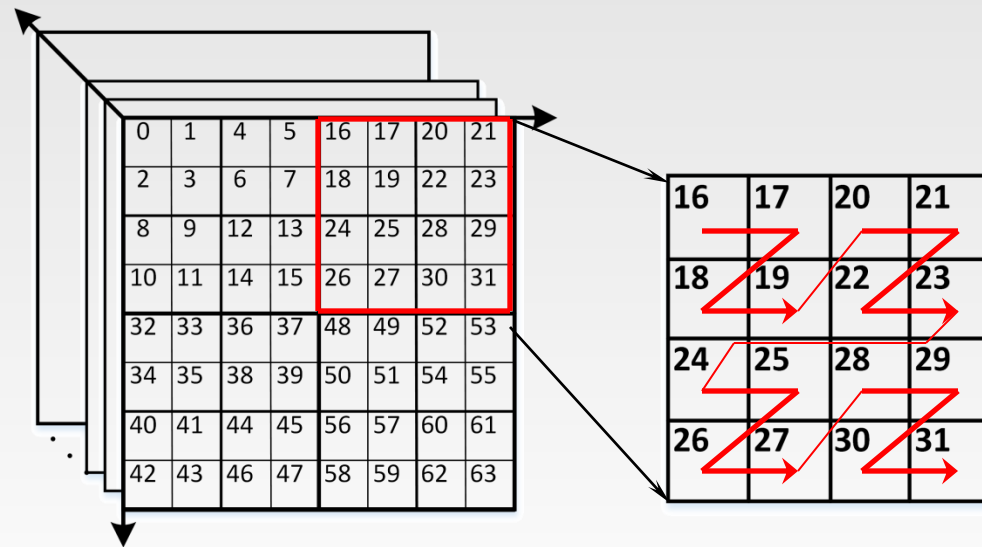
Motivation

Related Work

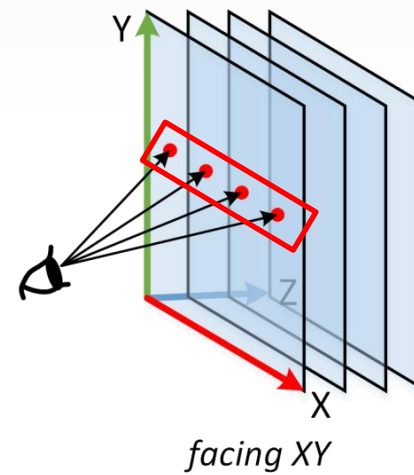
Contribution

Result

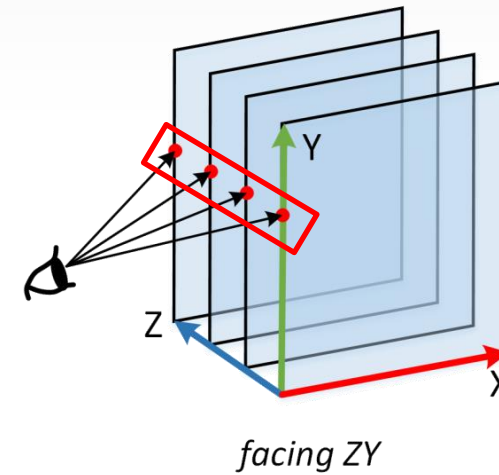
Application



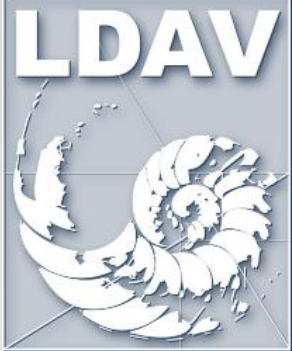
Viewing  
Direction



Perpendicular



Parallel



# Motivation

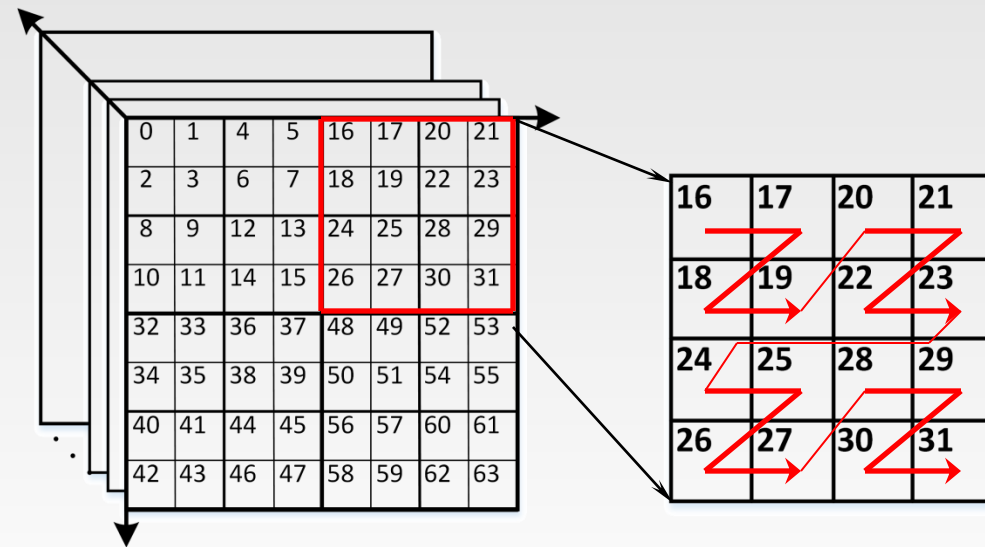
Motivation

Related Work

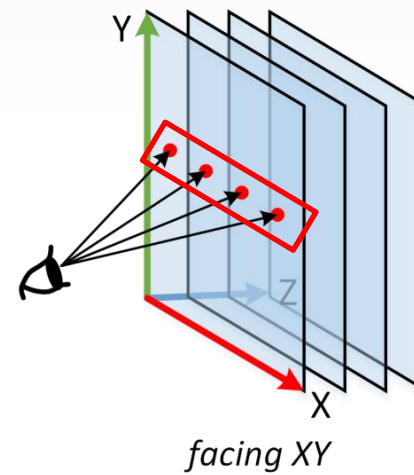
Contribution

Result

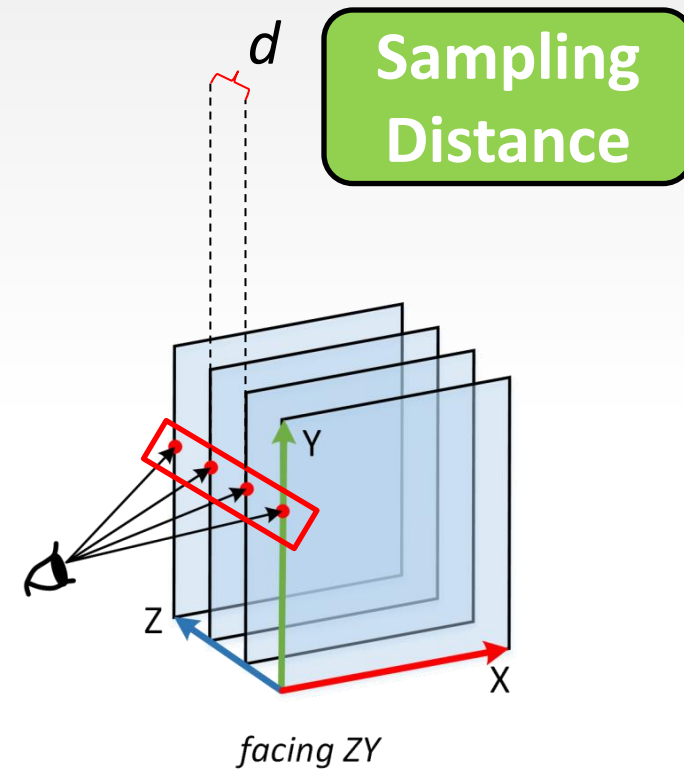
Application



Viewing  
Direction

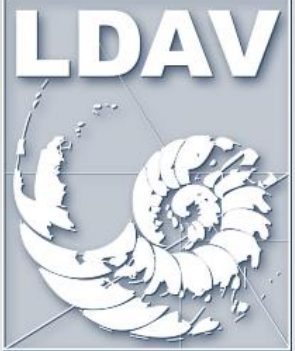


Perpendicular



Parallel

Sampling  
Distance



# Motivation

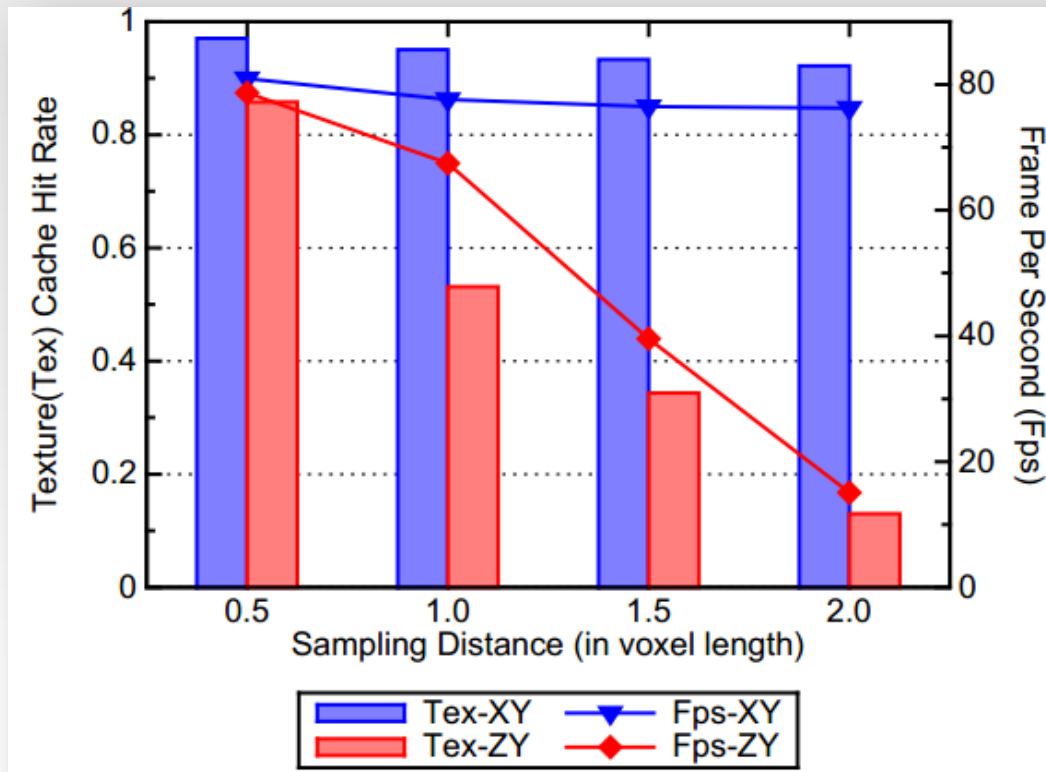
Motivation

Related Work

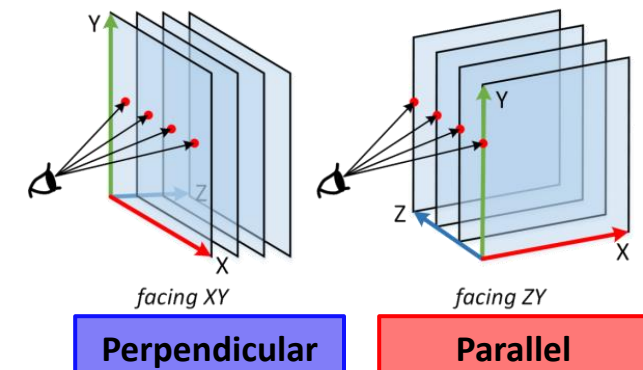
Contribution

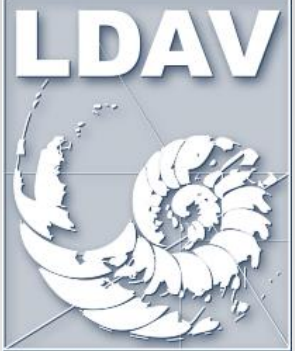
Result

Application

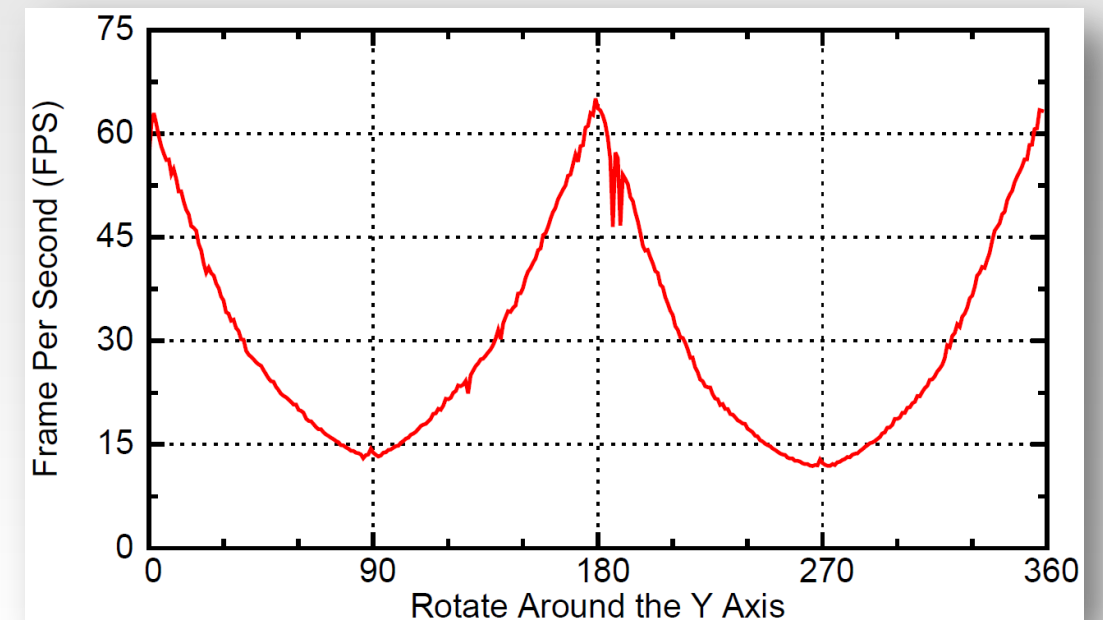
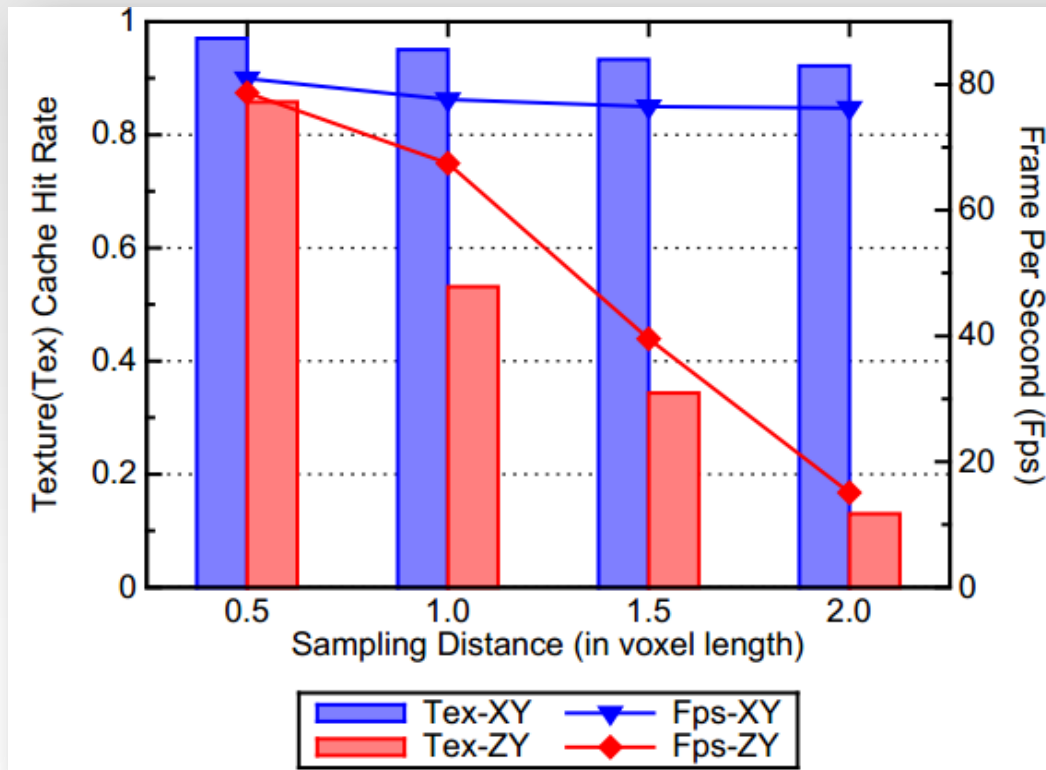


GPU: GTX GeForce Titan  
Volume size: 1024x1024x1024 x 8bit  
Rendered image size: 512x512

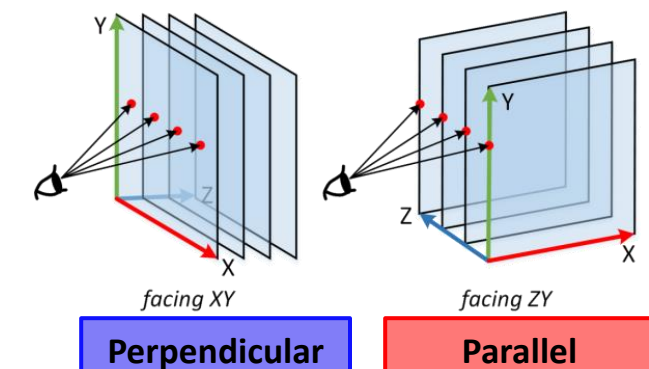


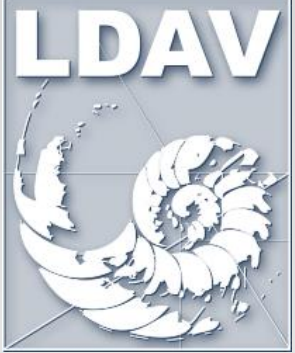


# Motivation



GPU: GTX GeForce Titan  
Volume size: 1024x1024x1024 x 8bit  
Rendered image size: 512x512





# Related Work

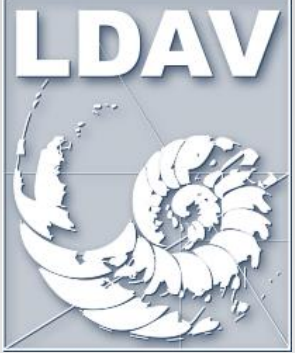
Motivation

Related Work

Contribution

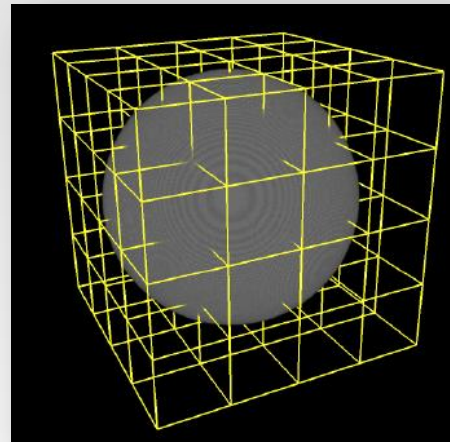
Result

Application

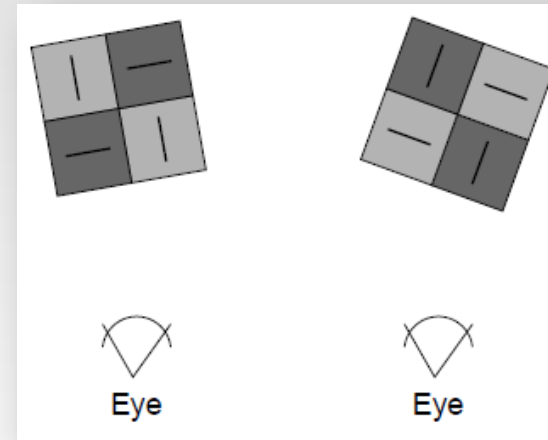


# Related Work

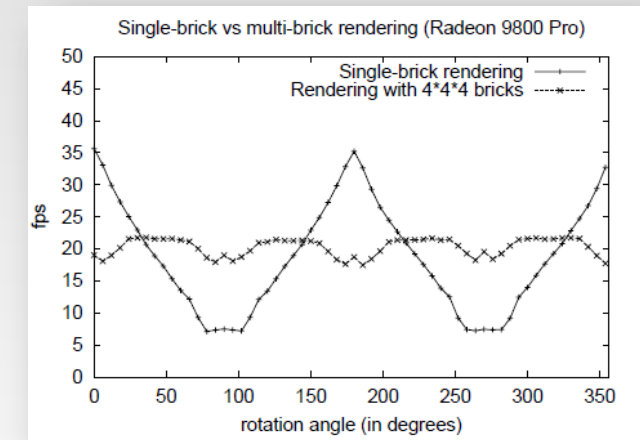
[Weiskopf04]



Partitioning a volume  
into small bricks

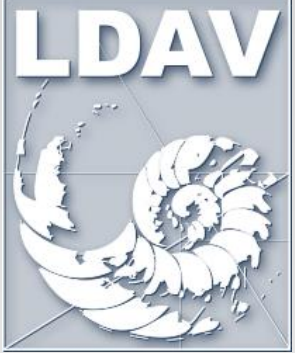


For any direction, 2 bricks are  
parallel and two bricks are  
perpendicular to the view



Achieve a roughly constant  
frame rate when rotating  
around the Y axis





# Related Work

Motivation

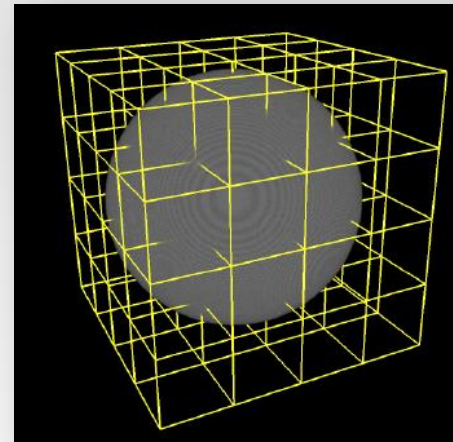
Related Work

Contribution

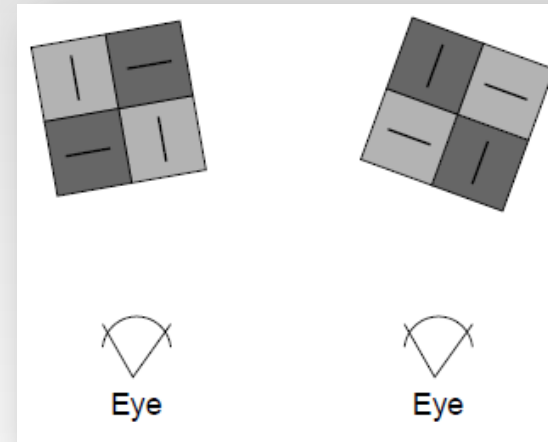
Result

Application

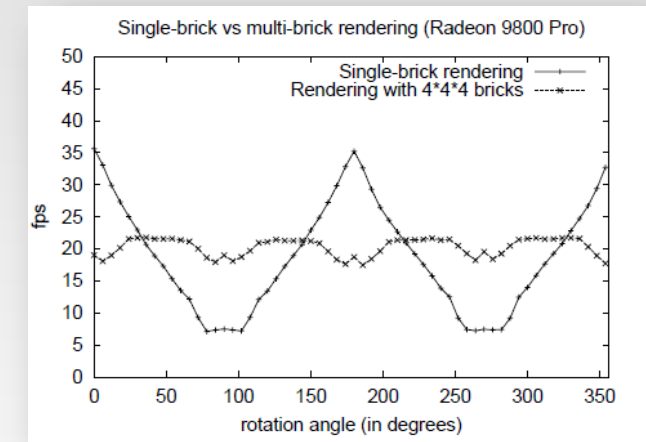
[Weiskopf04]



Partitioning a volume into small bricks

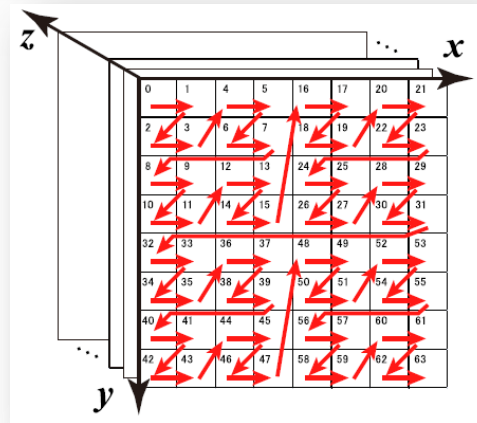


For any direction, 2 bricks are parallel and two bricks are perpendicular to the view



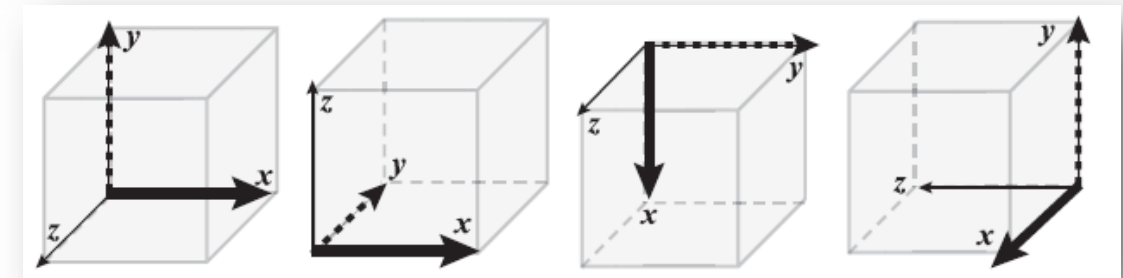
Achieve a roughly constant frame rate when rotating around the Y axis

[Sugimoto2012]  
[Sugimoto2014]

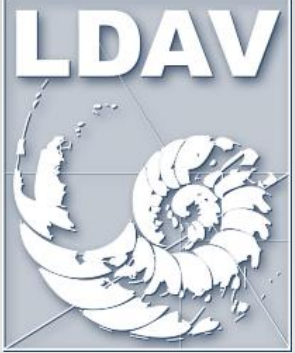


Memory stride ratio of the 3D texture along X, Y and Z axis is **1:2:6**

GPU  
WARP



A warp of GPU threads should always take samples along the direction with smaller stride, so that higher cache locality could be achieved



# Contribution

We are trying to improve the texture cache performance by minimizing the memory stride inside a **WARP** of GPU threads

Motivation

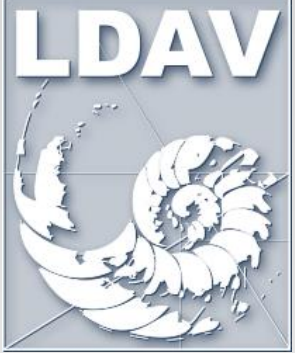
Related Work

Contribution

Result

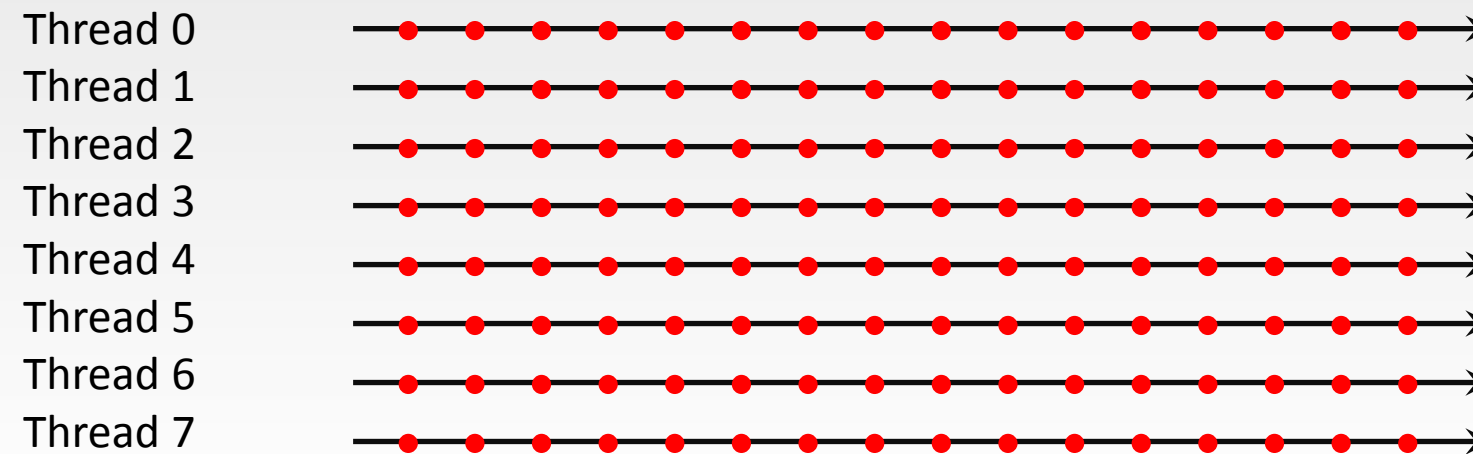
Application

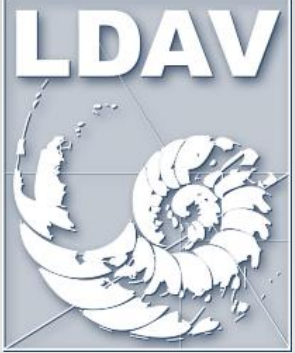




# Contribution

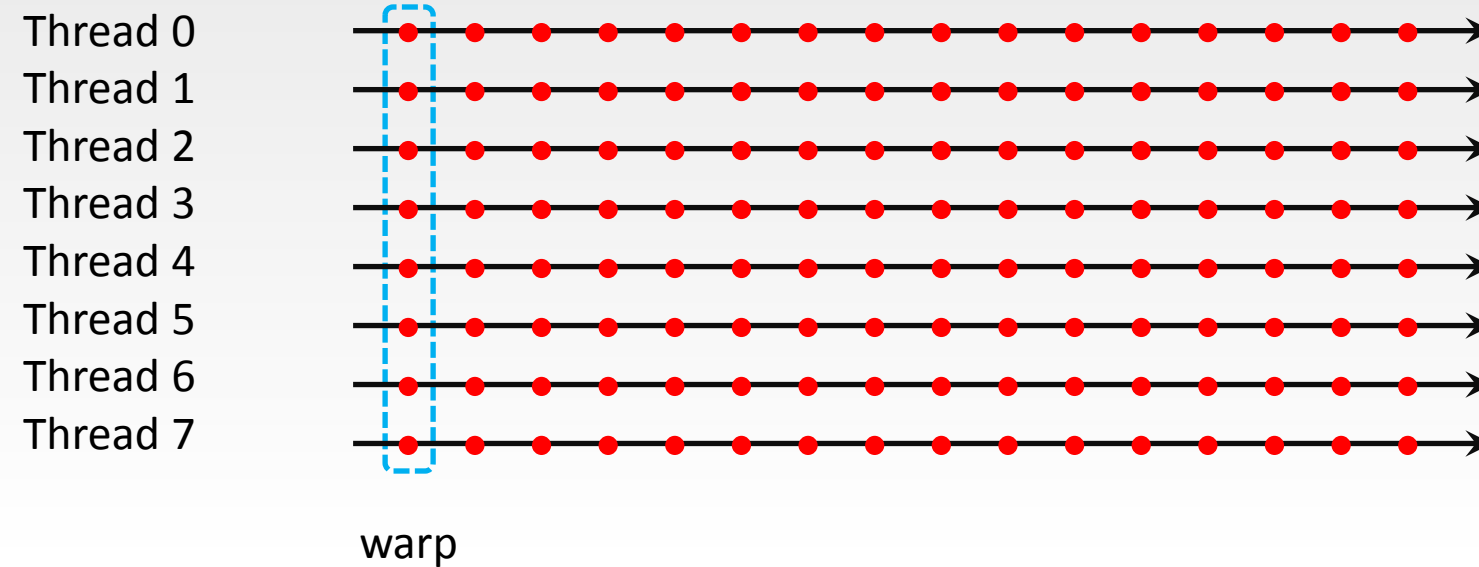
Map one thread to one ray (warp size = 8)

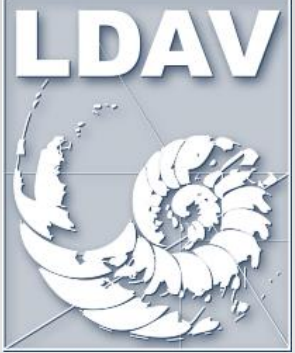




# Contribution

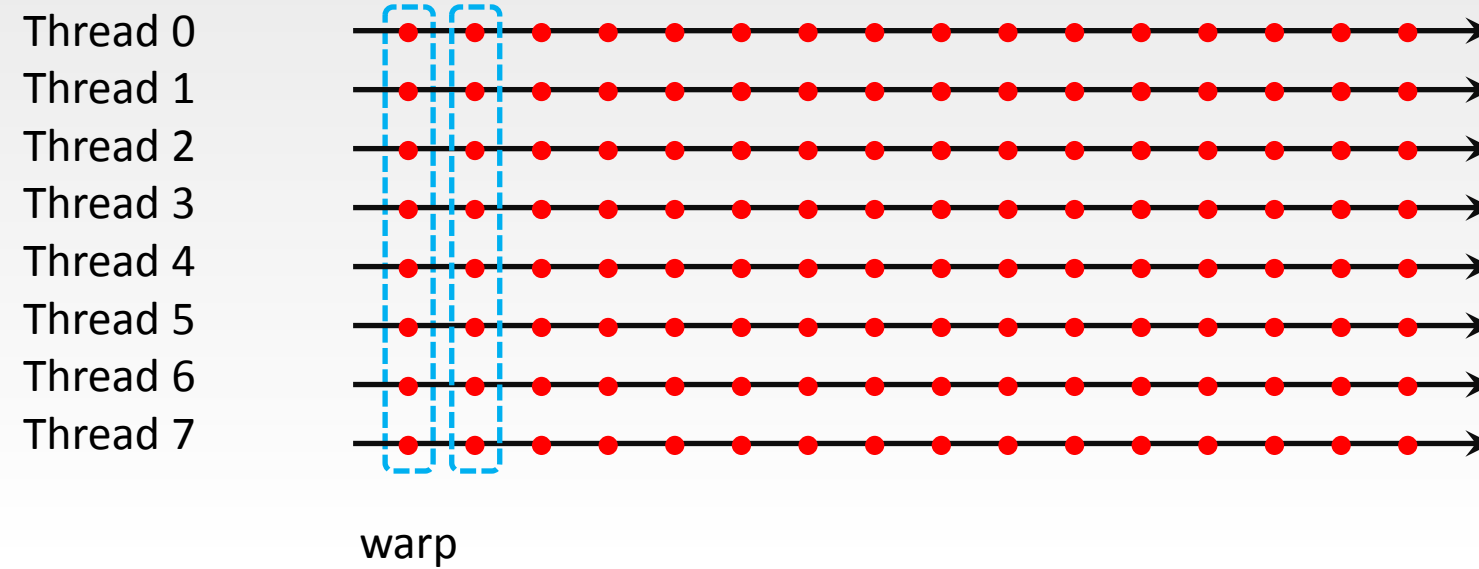
Map one thread to one ray (warp size = 8)

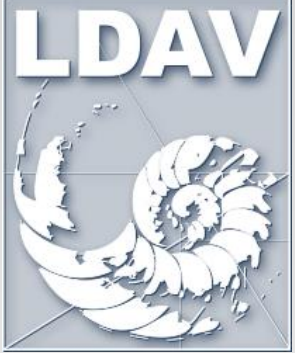




# Contribution

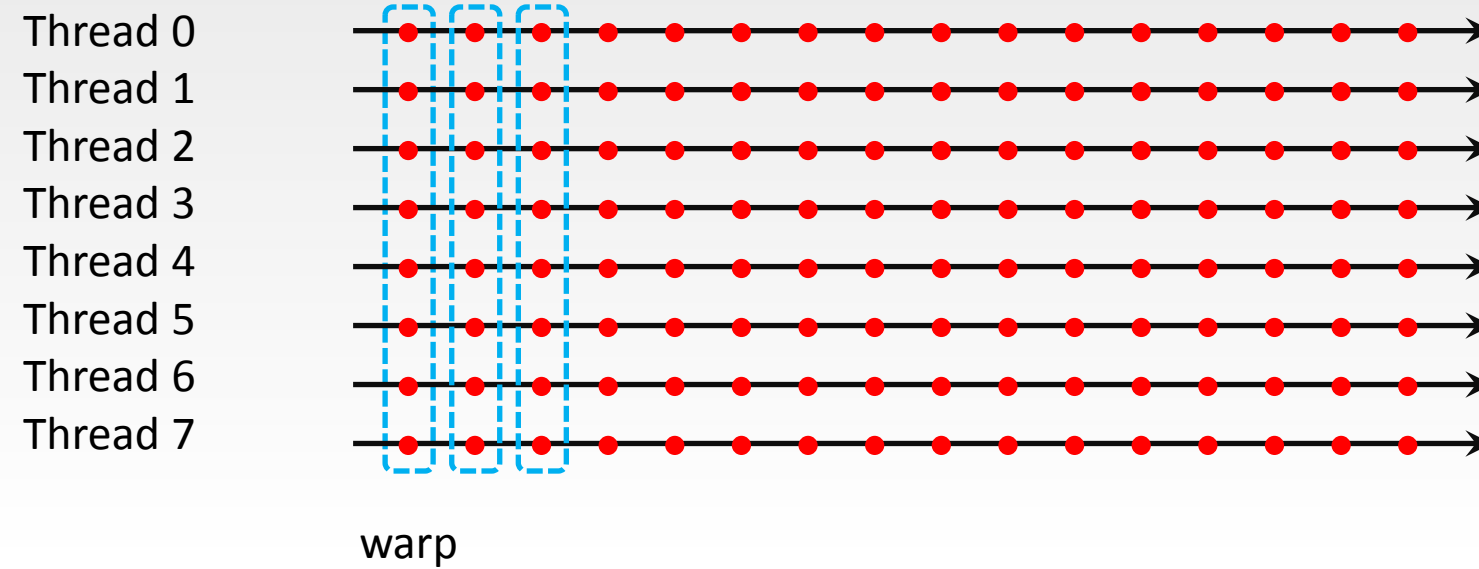
Map one thread to one ray (warp size = 8)

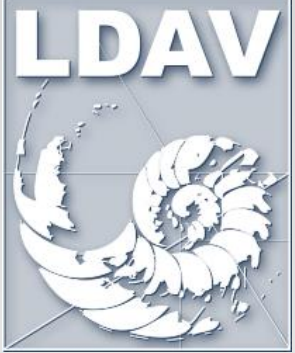




# Contribution

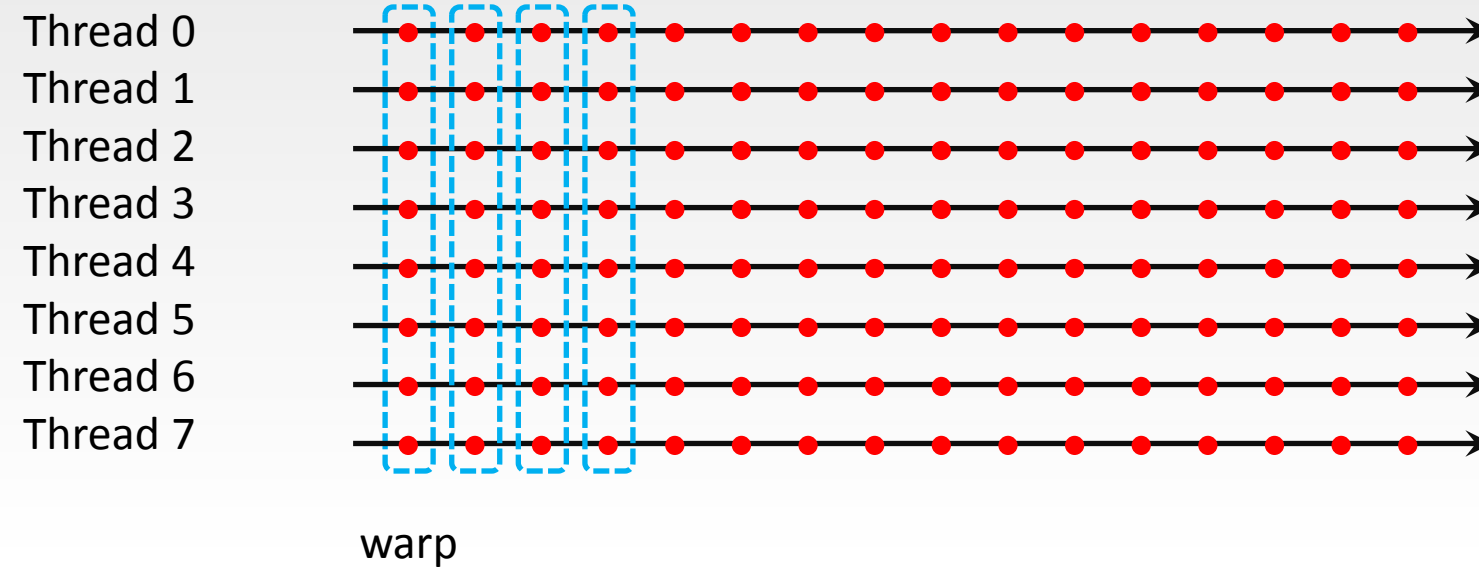
Map one thread to one ray (warp size = 8)

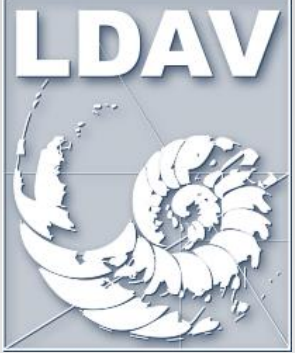




# Contribution

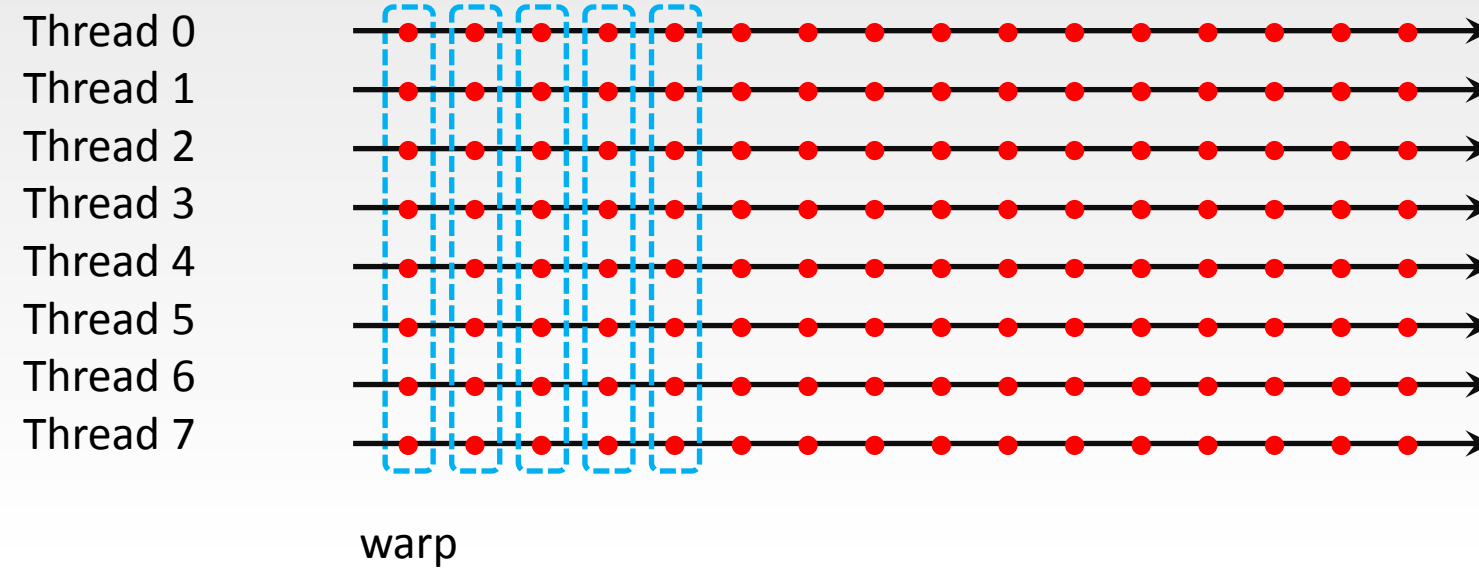
Map one thread to one ray (warp size = 8)

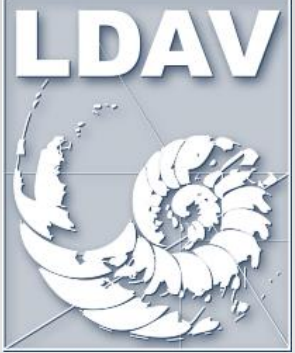




# Contribution

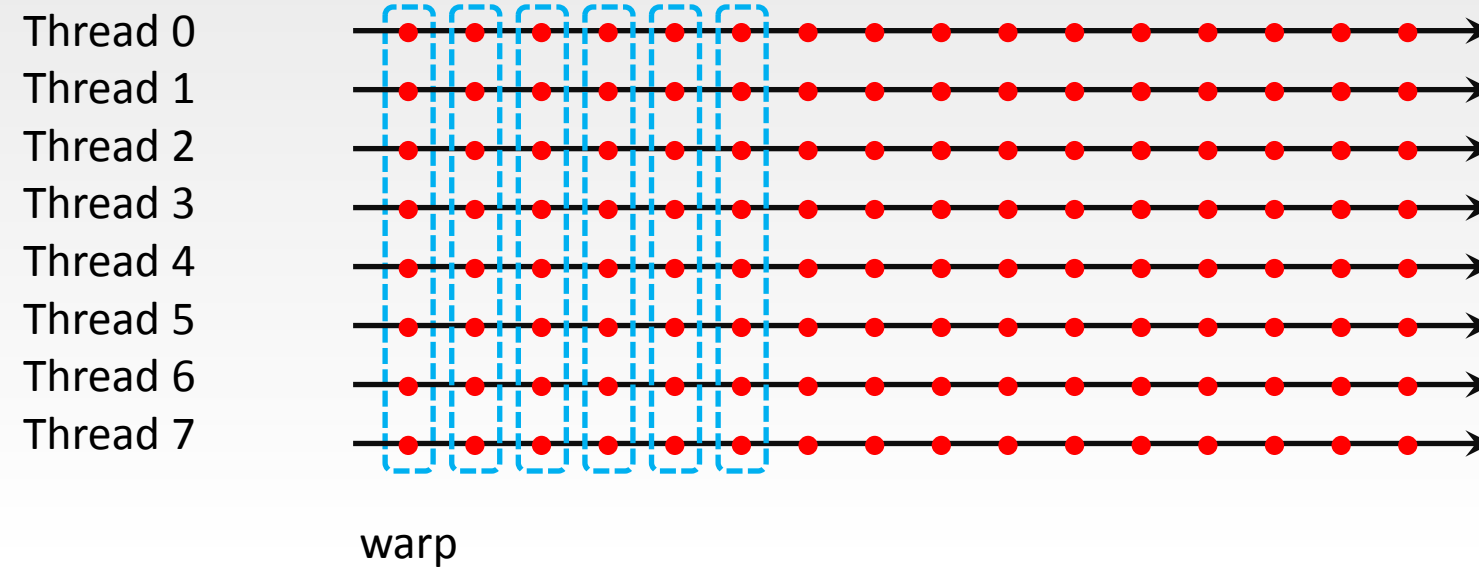
Map one thread to one ray (warp size = 8)

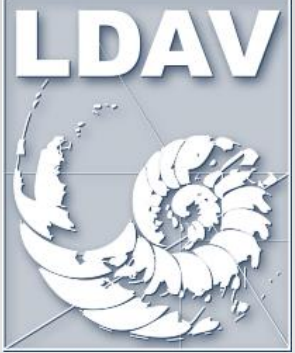




# Contribution

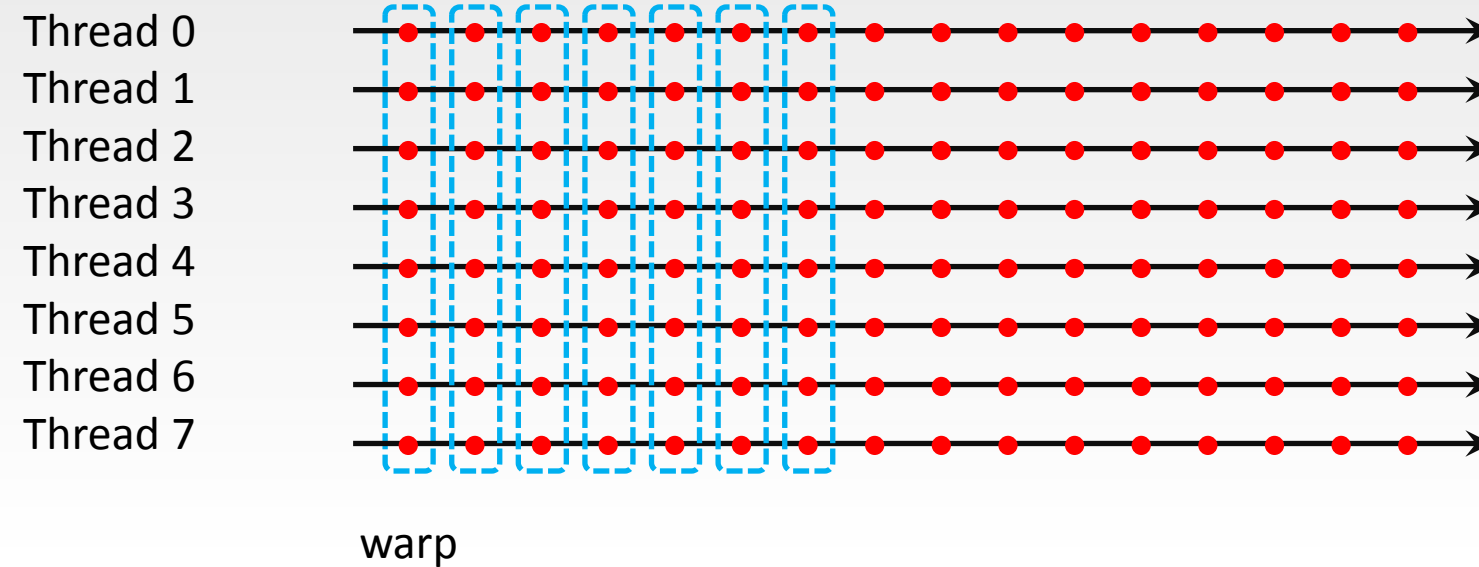
Map one thread to one ray (warp size = 8)



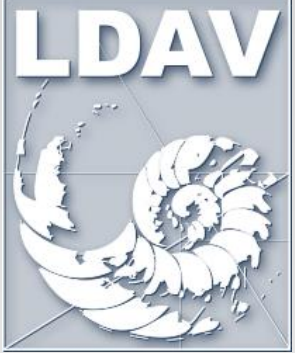


# Contribution

Map one thread to one ray (warp size = 8)

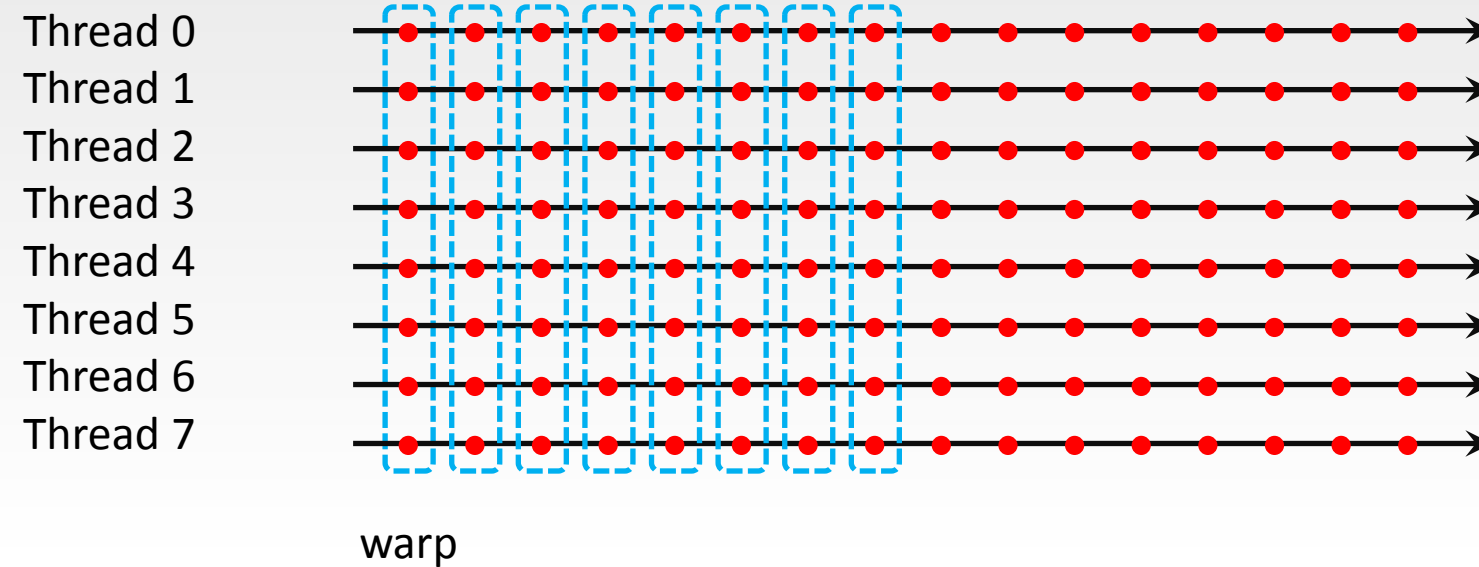


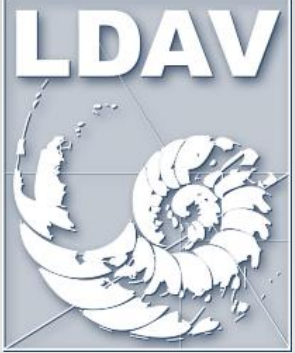




# Contribution

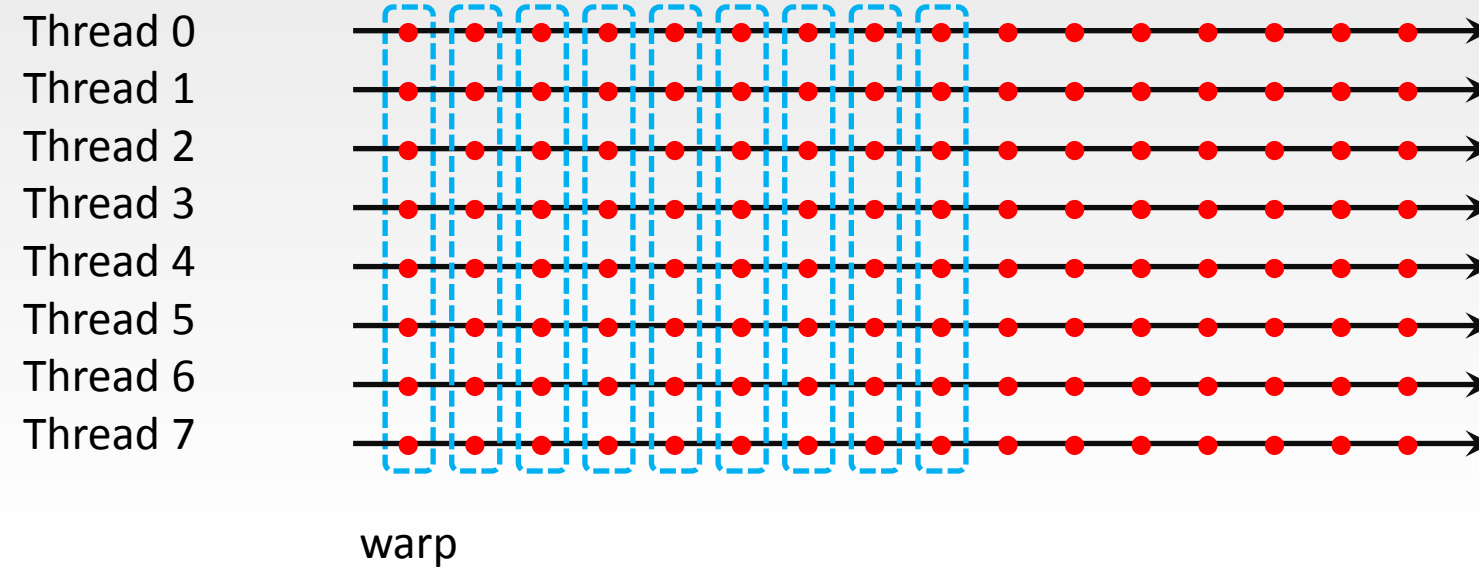
Map one thread to one ray (warp size = 8)

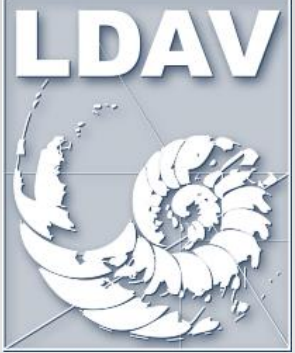




# Contribution

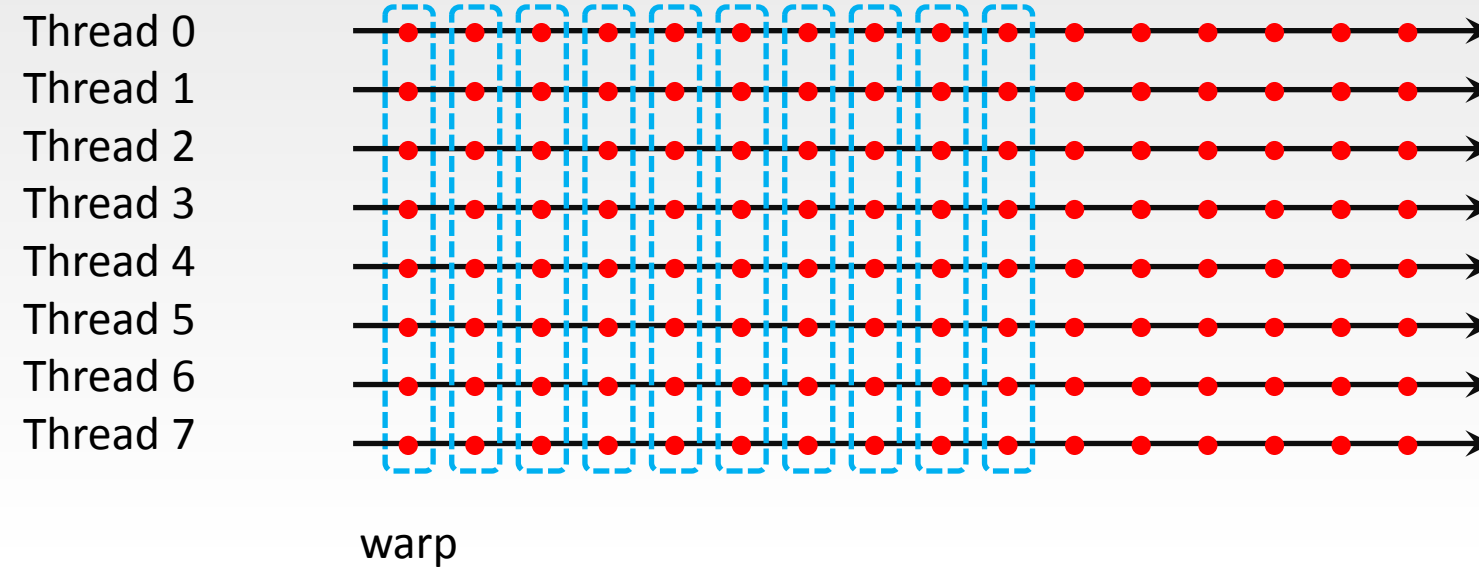
Map one thread to one ray (warp size = 8)

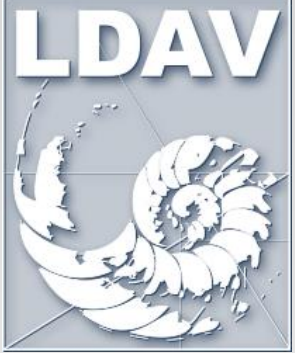




# Contribution

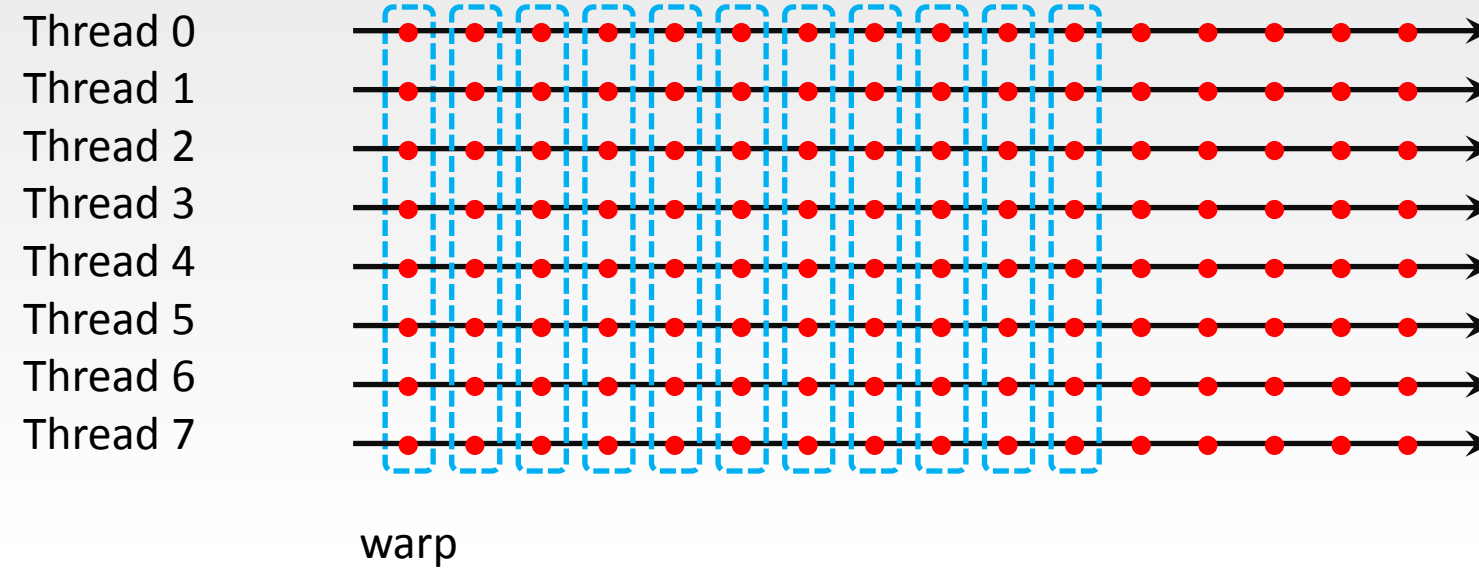
Map one thread to one ray (warp size = 8)

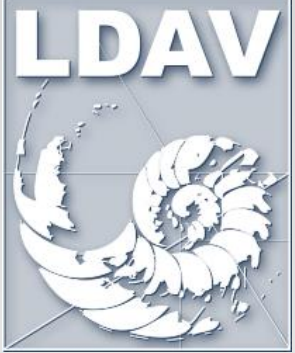




# Contribution

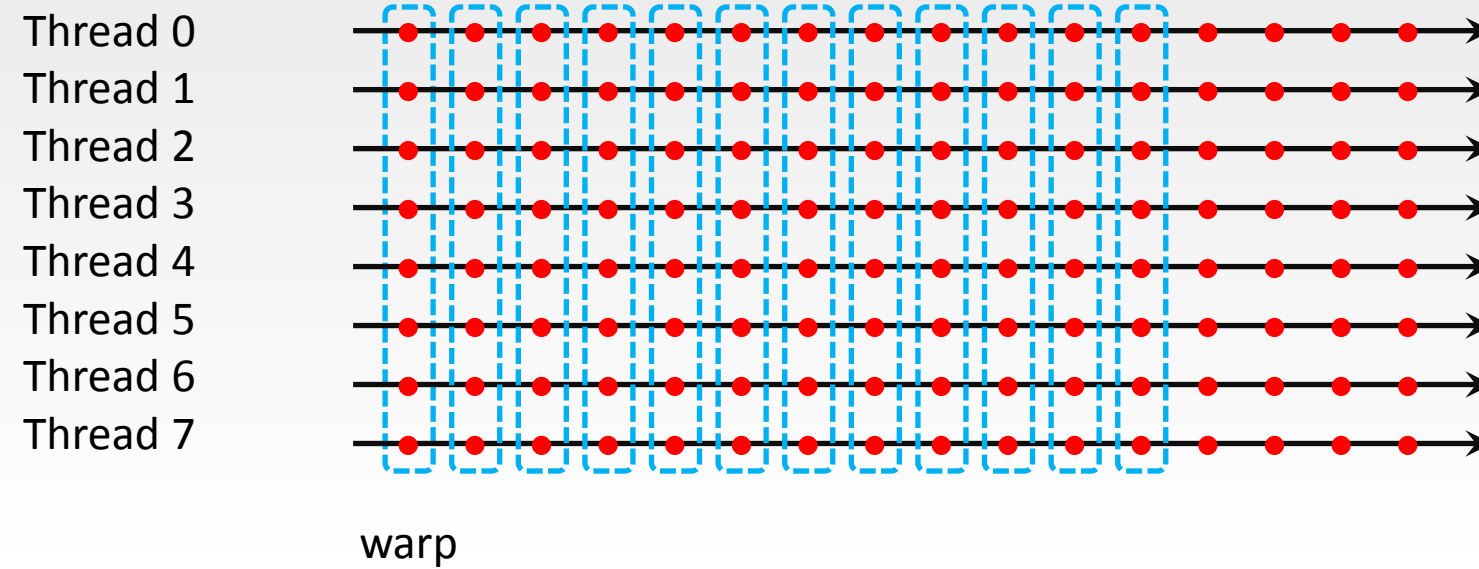
Map one thread to one ray (warp size = 8)

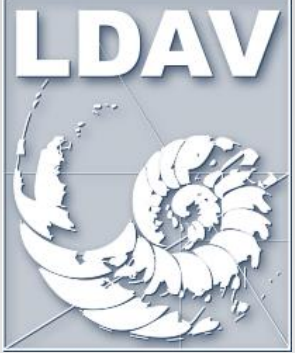




# Contribution

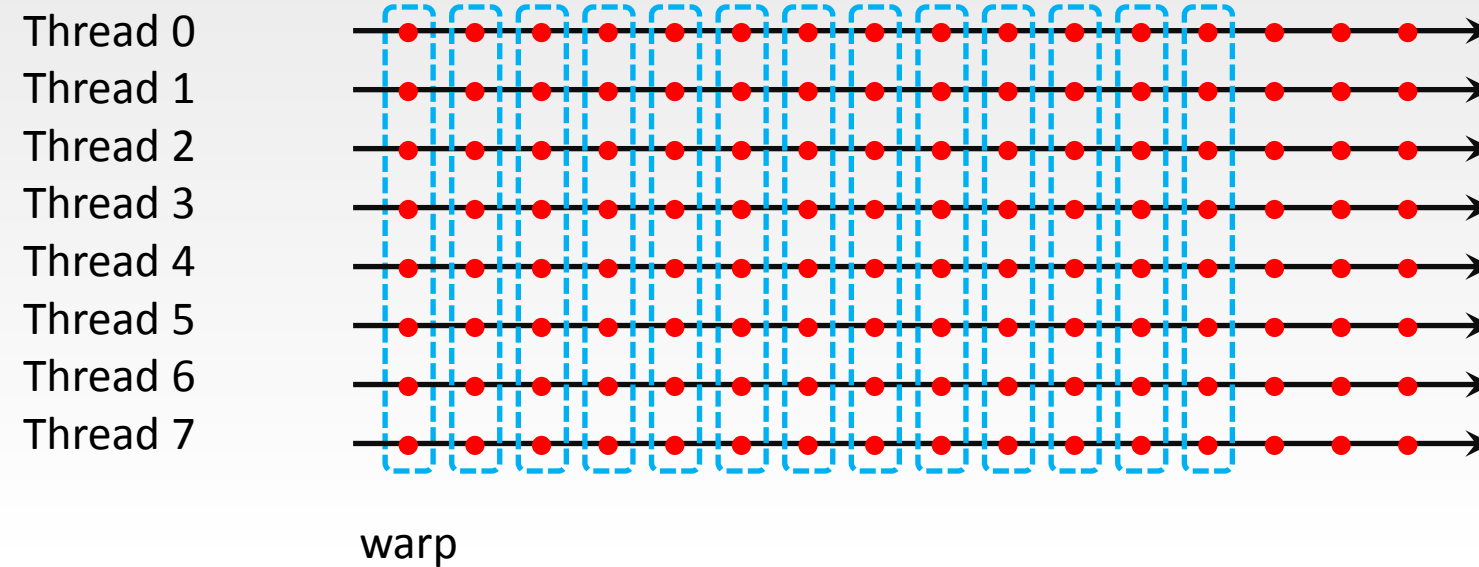
Map one thread to one ray (warp size = 8)

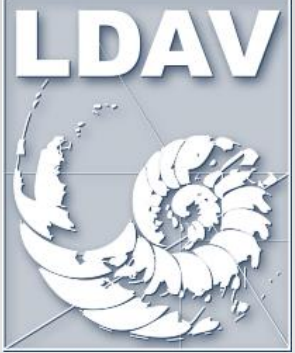




# Contribution

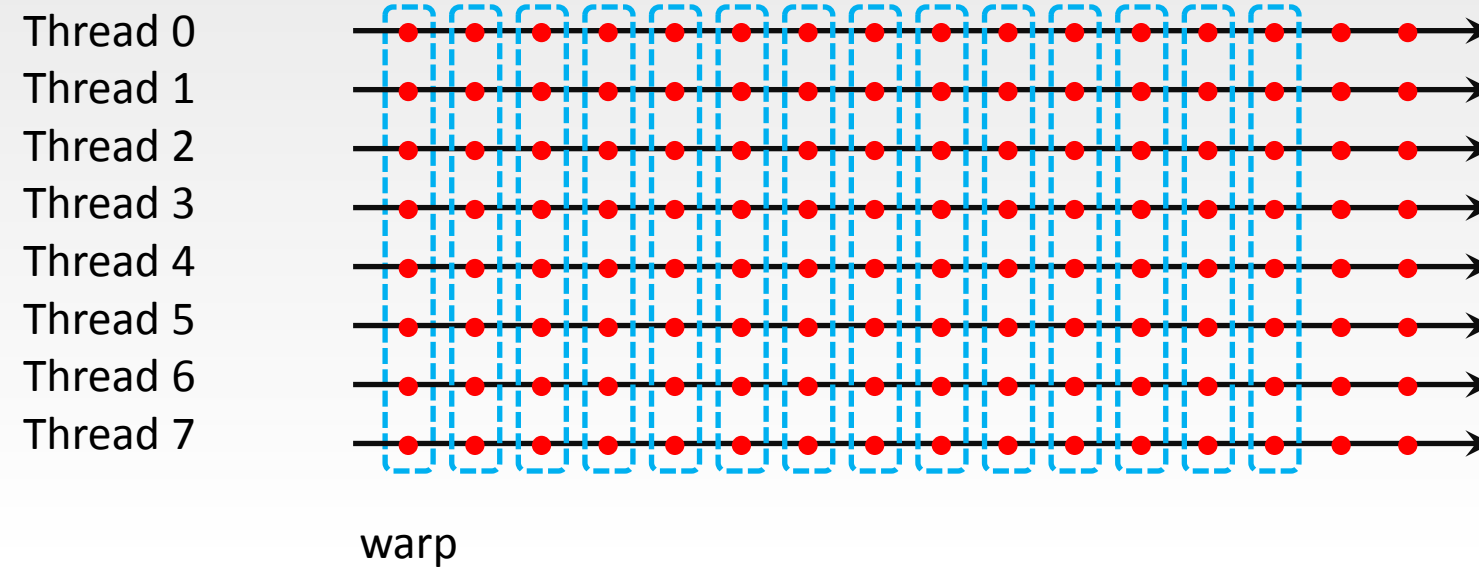
Map one thread to one ray (warp size = 8)

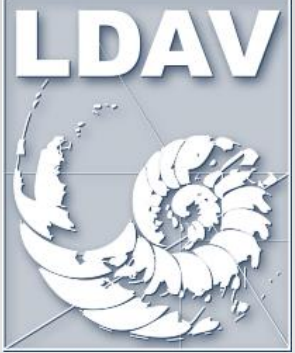




# Contribution

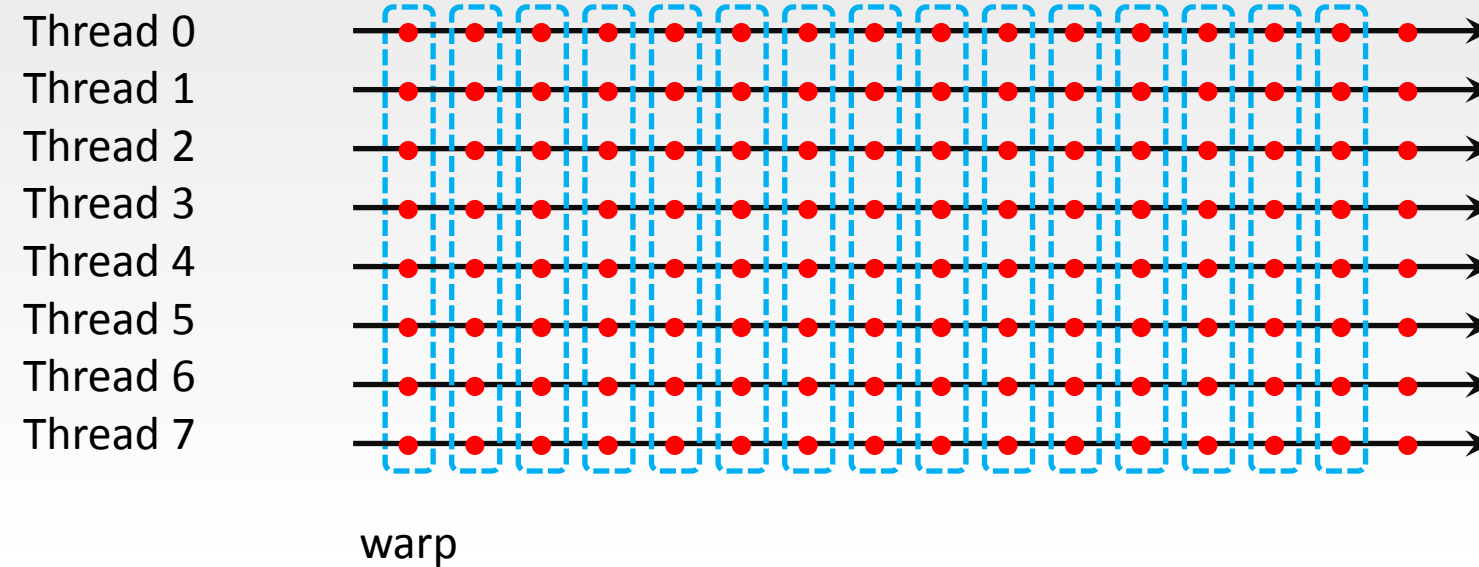
Map one thread to one ray (warp size = 8)



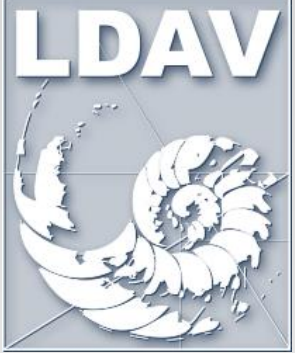


# Contribution

Map one thread to one ray (warp size = 8)

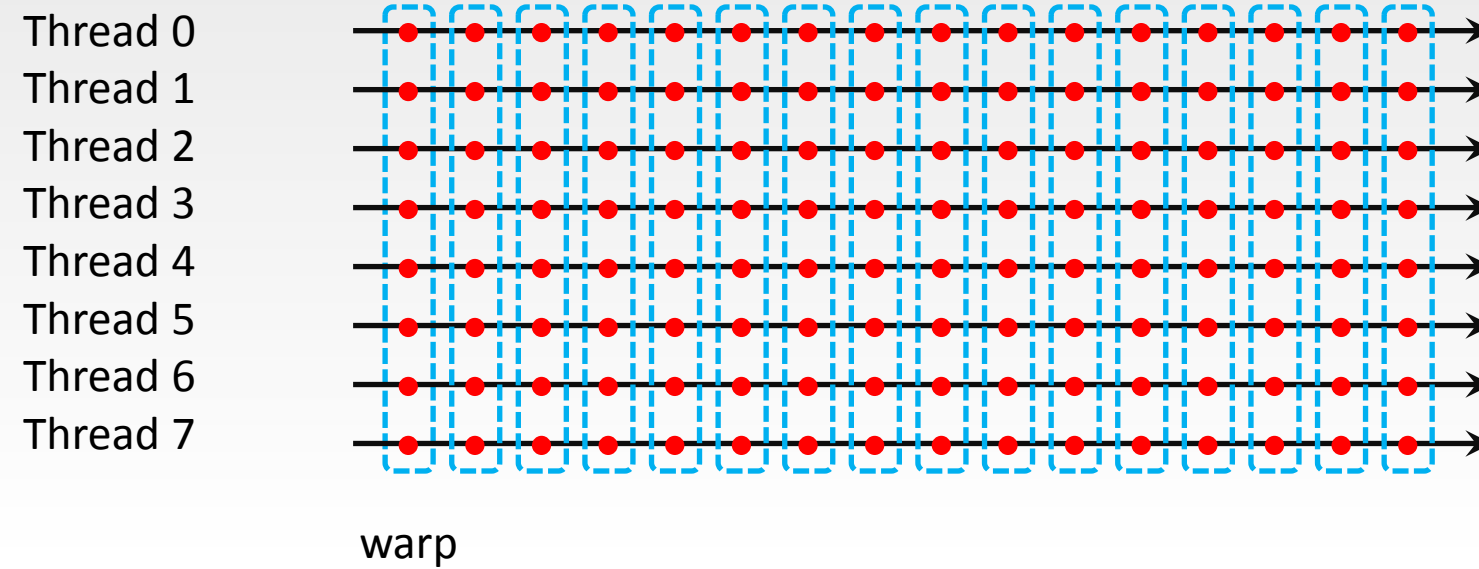


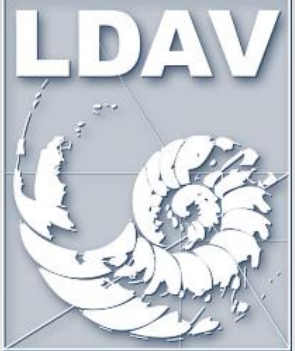




# Contribution

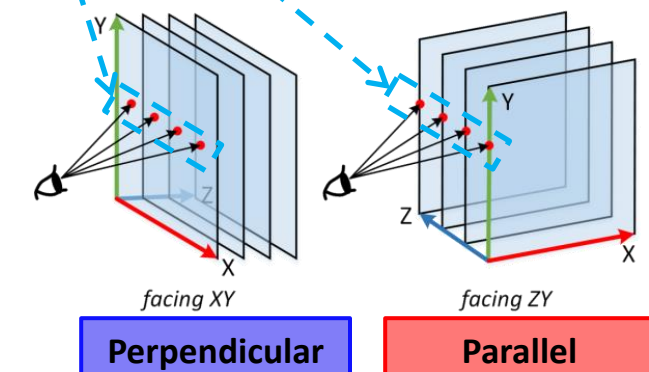
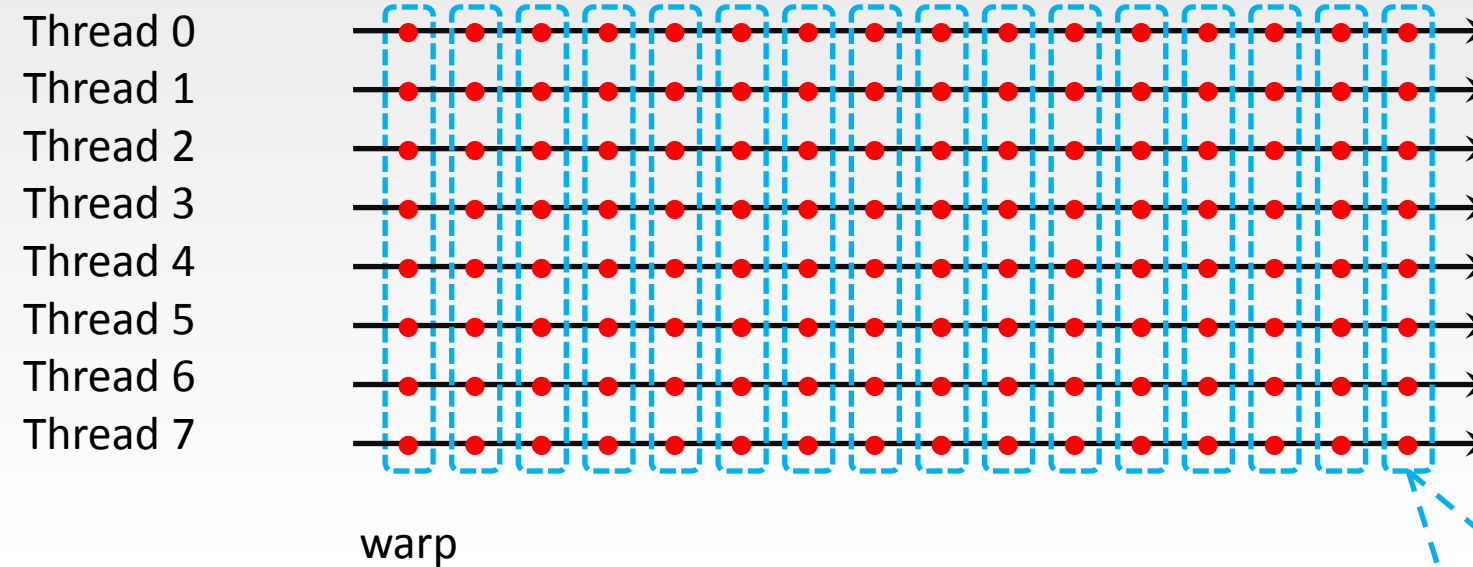
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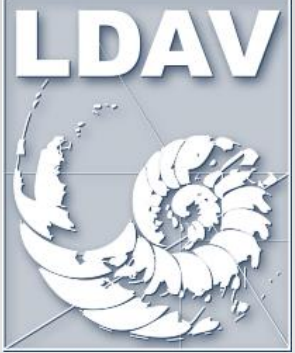




# Contribution

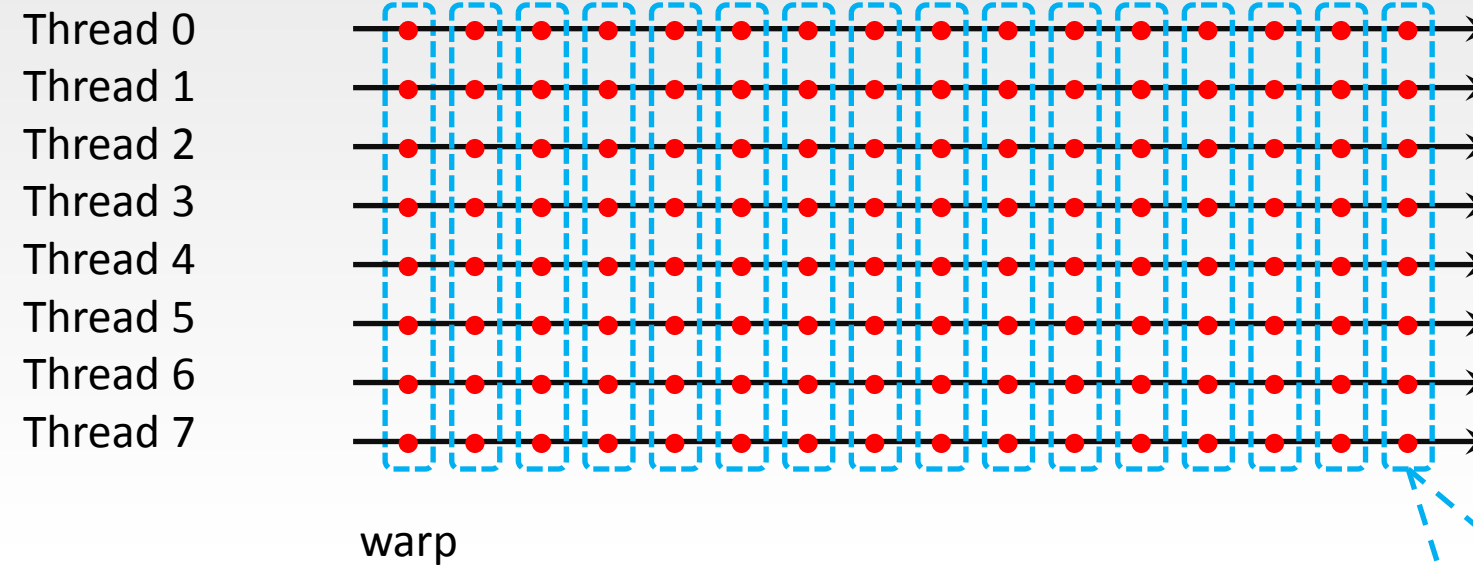
Map one thread to one ray (warp size = 8)



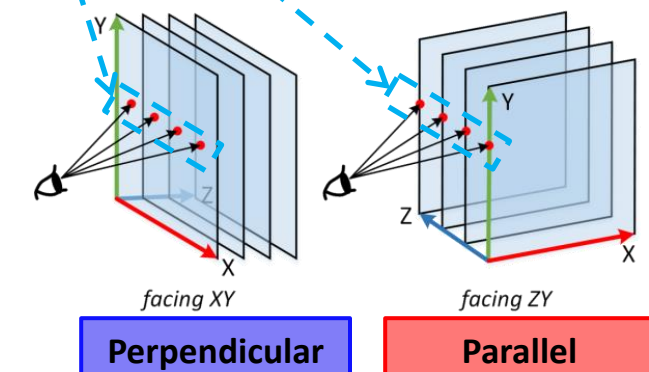


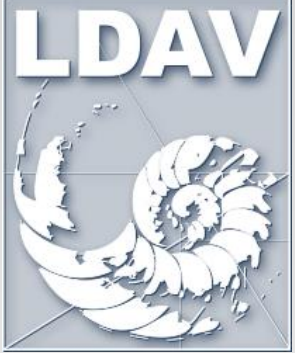
# Contribution

Map one thread to one ray (warp size = 8)



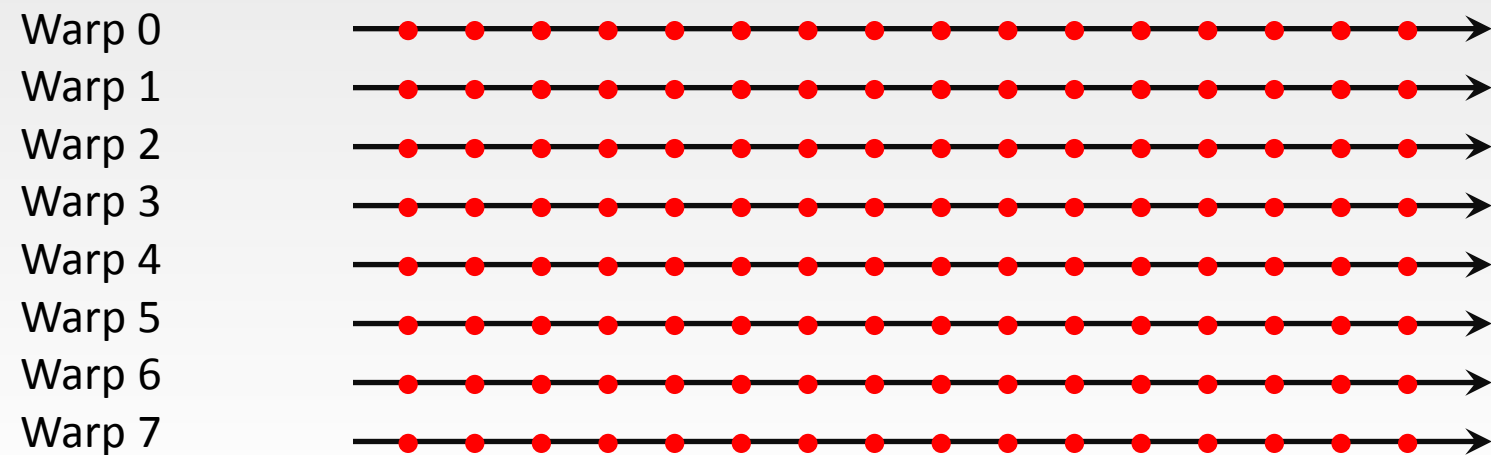
**The  
Standard**

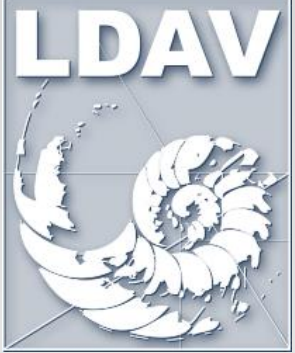




# Contribution

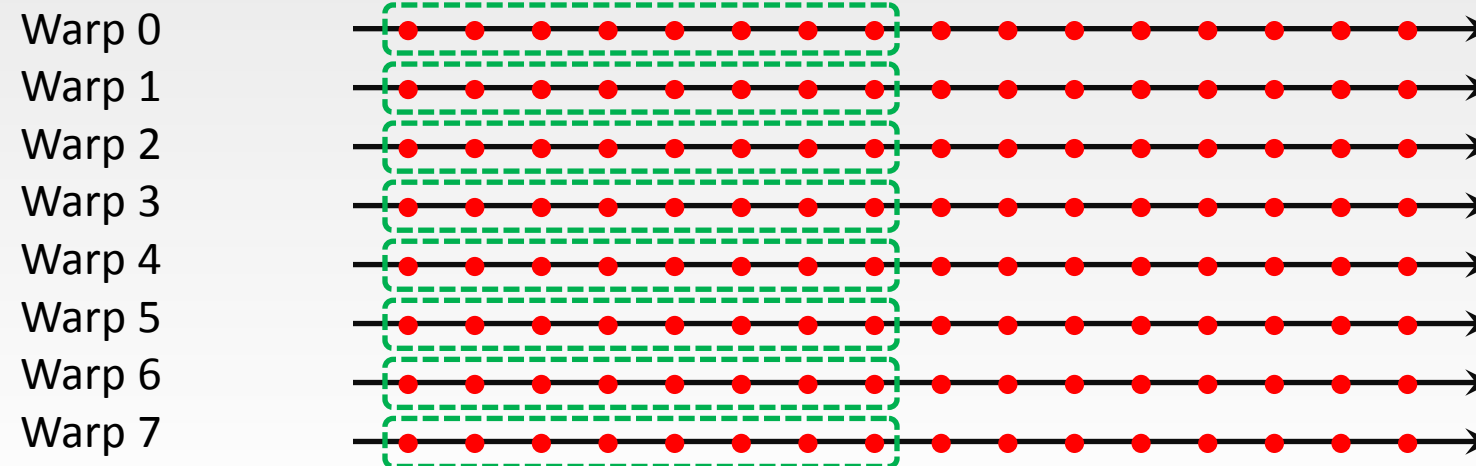
Map one warp of threads to one ray

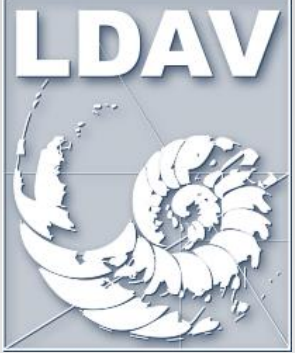




# Contribution

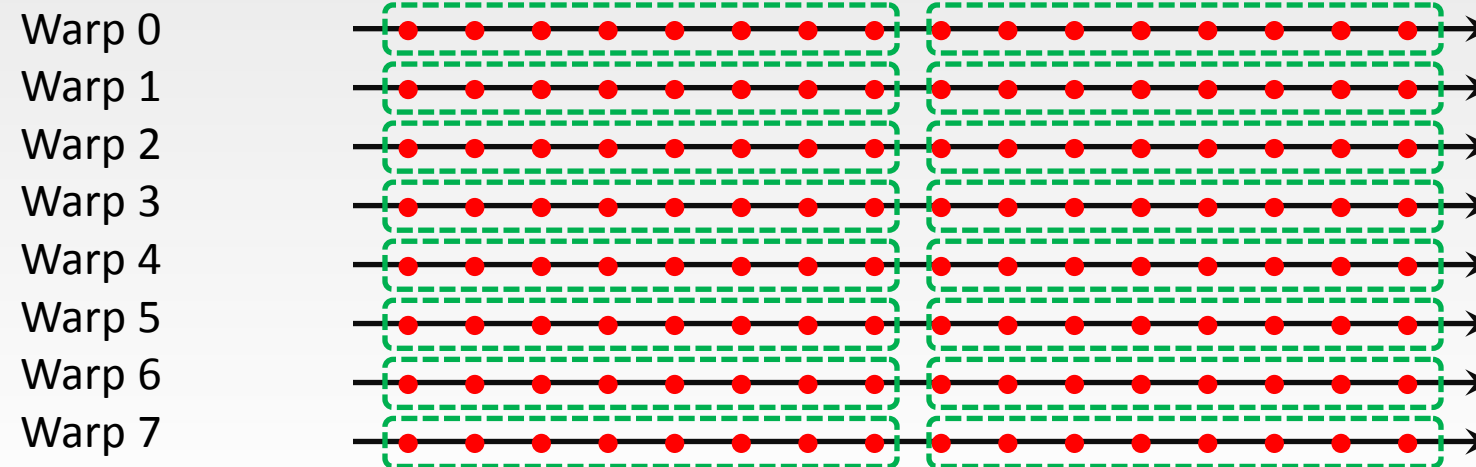
Map one warp of threads to one ray





# Contribution

Map one warp of threads to one ray



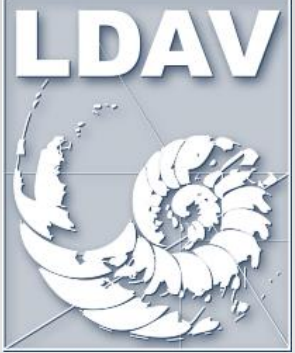
Motivation

Related Work

Contribution

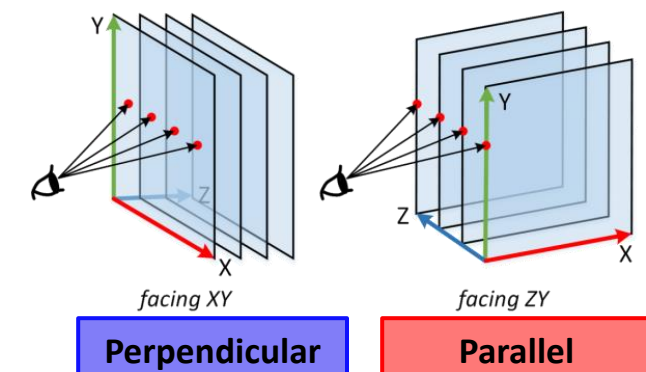
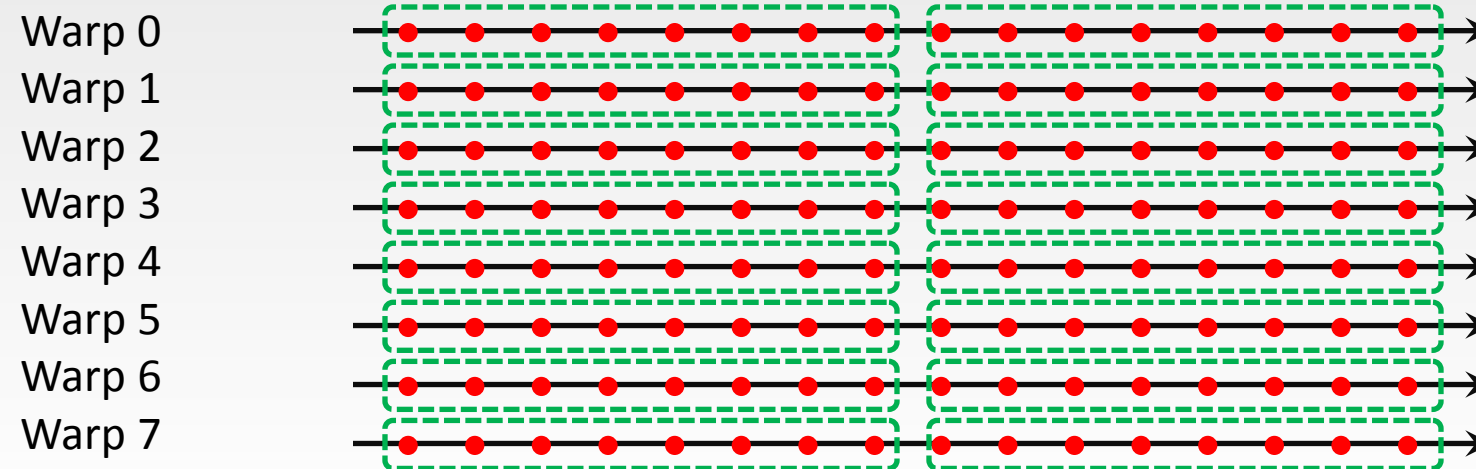
Result

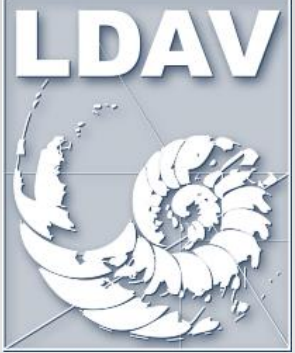
Application



# Contribution

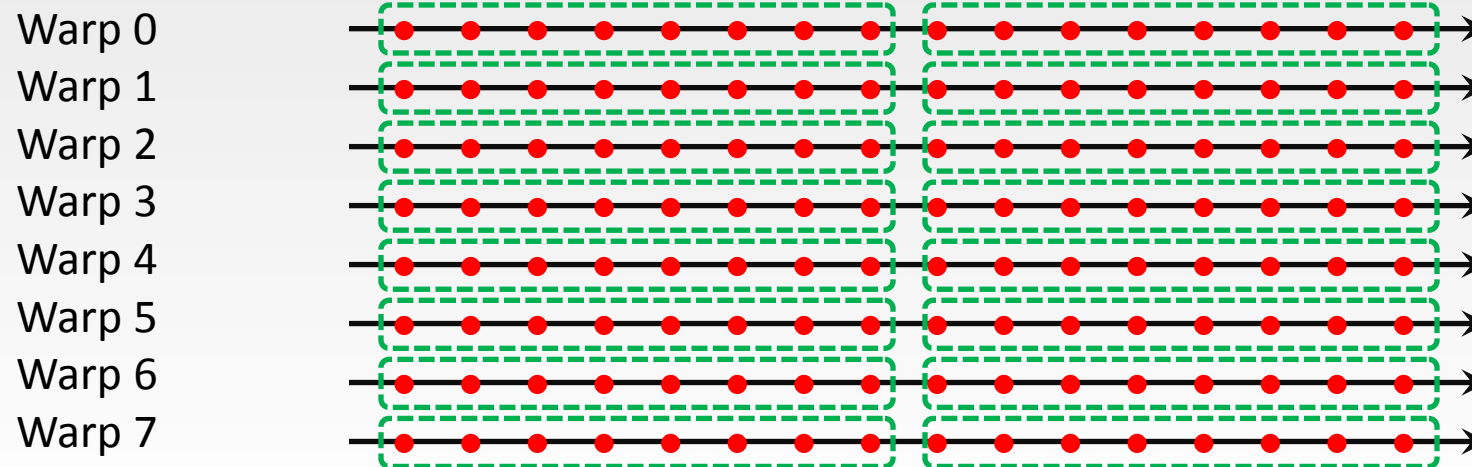
Map one warp of threads to one ray



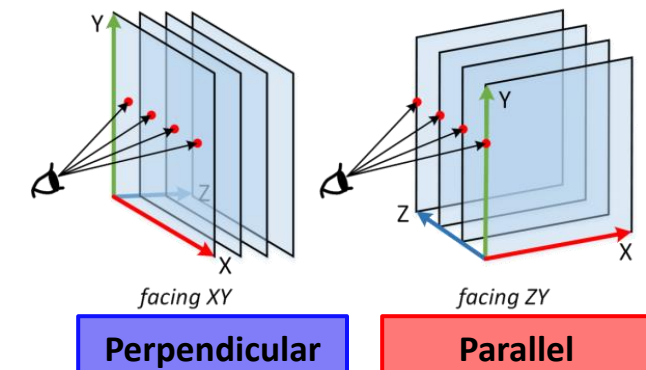


# Contribution

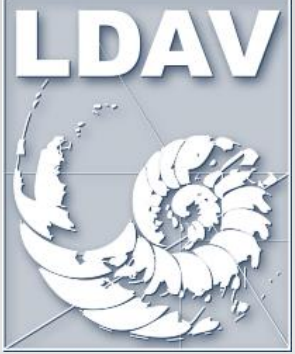
Map one warp of threads to one ray



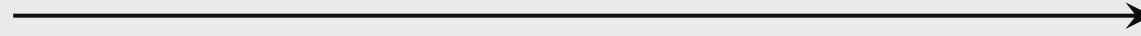
Warp  
Marching







# Single Buffer Warp Marching



- *sample*
- *buffer*
- *intermediate result*

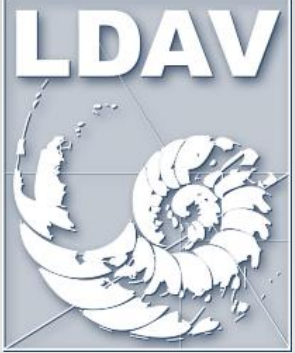
Motivation

Related Work

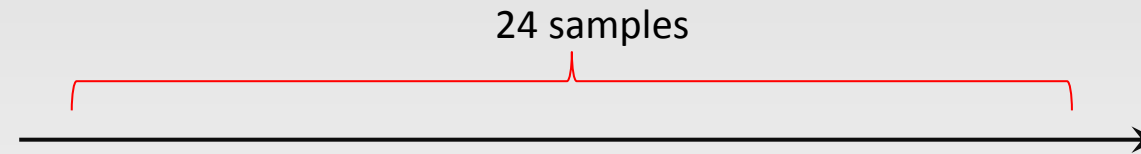
Contribution

Result

Application



# Single Buffer Warp Marching



- *sample*
- *buffer*
- *intermediate result*

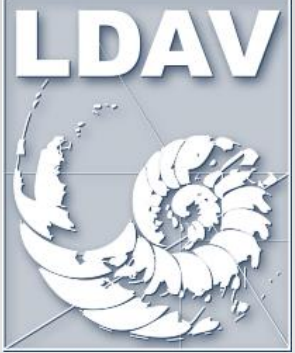
Motivation

Related Work

Contribution

Result

Application



# Single Buffer Warp Marching

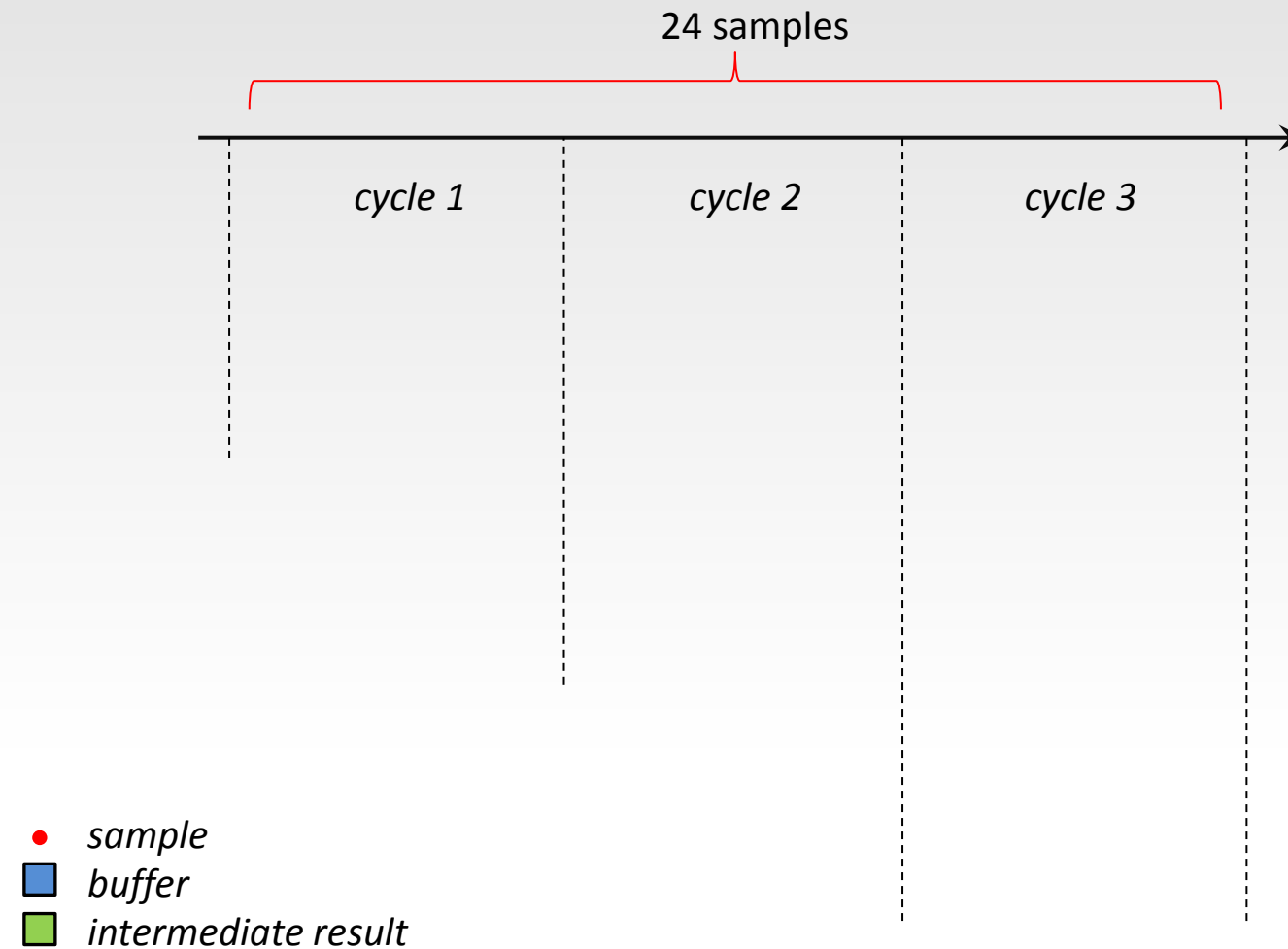
Motivation

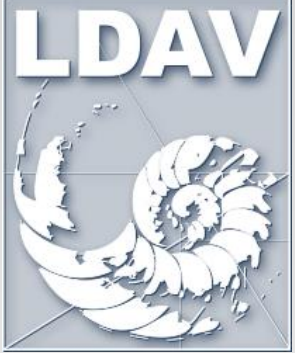
Related Work

Contribution

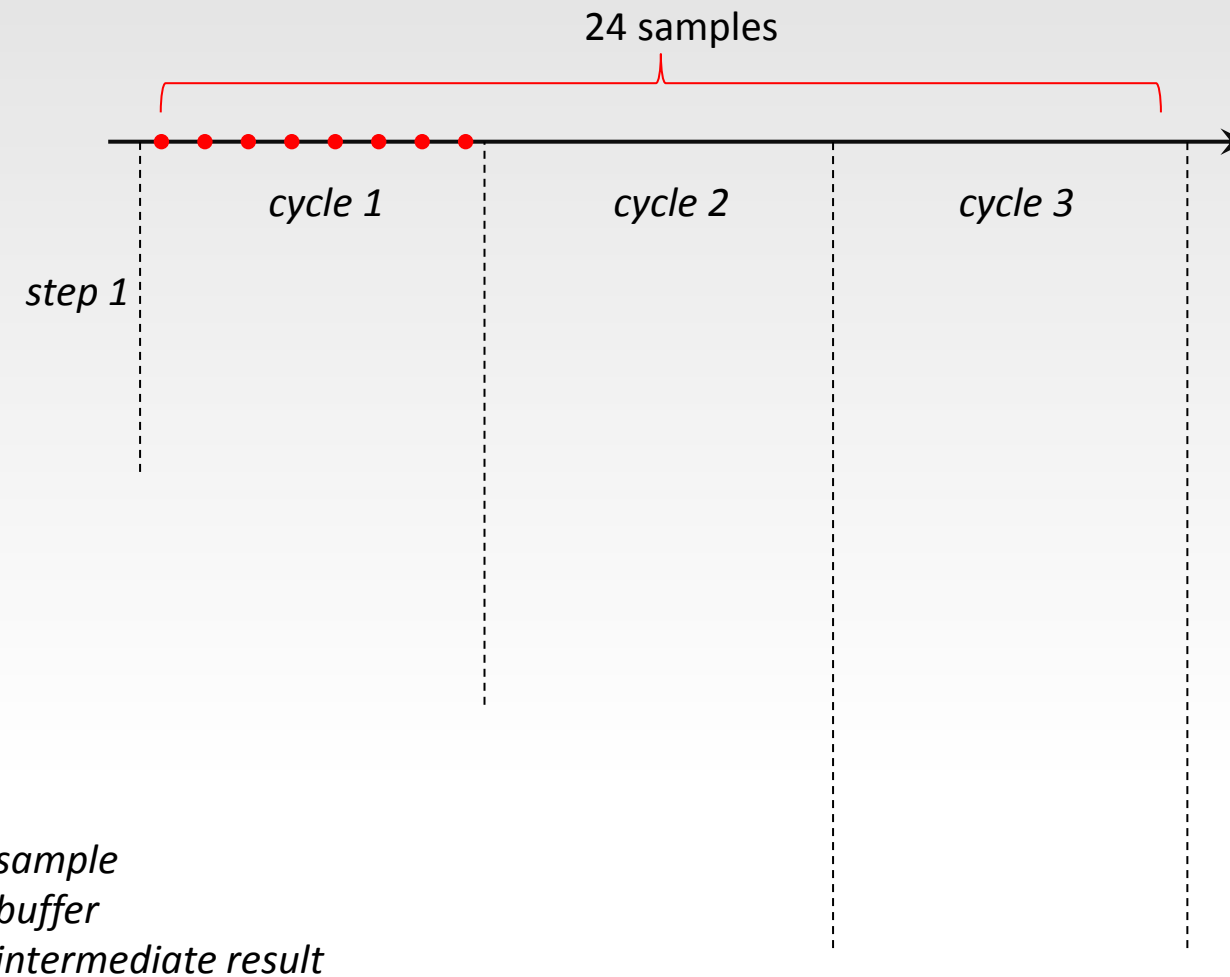
Result

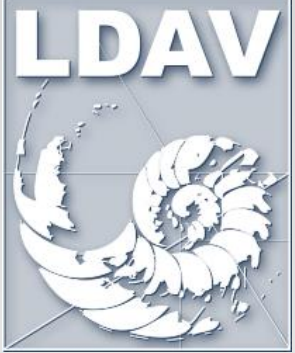
Application





# Single Buffer Warp Marching





# Single Buffer Warp Marching

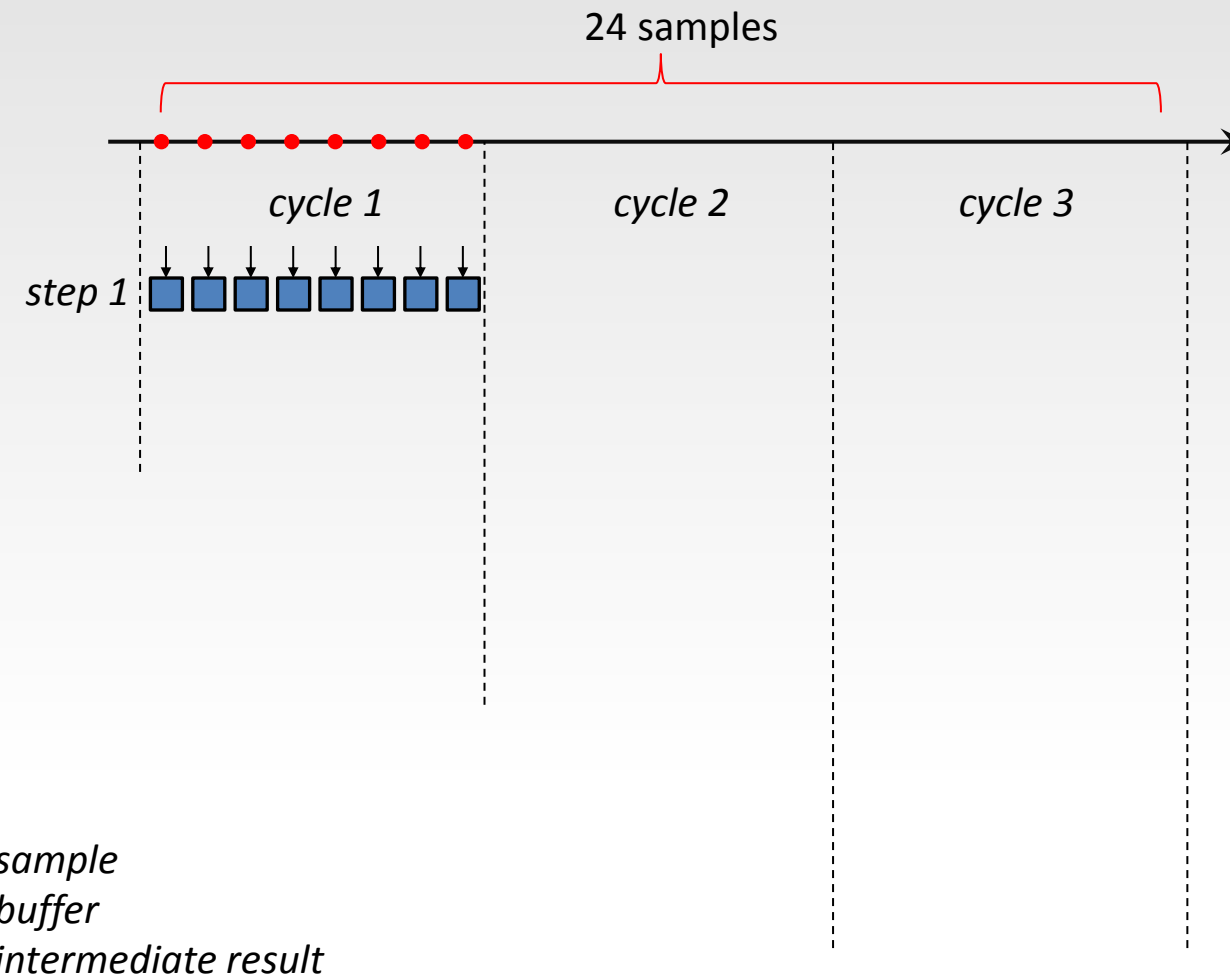
Motivation

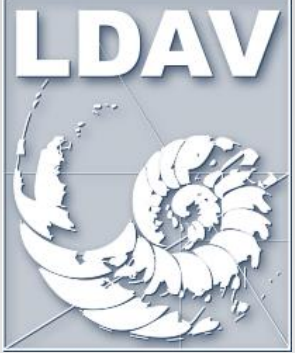
Related Work

Contribution

Result

Application





# Single Buffer Warp Marching

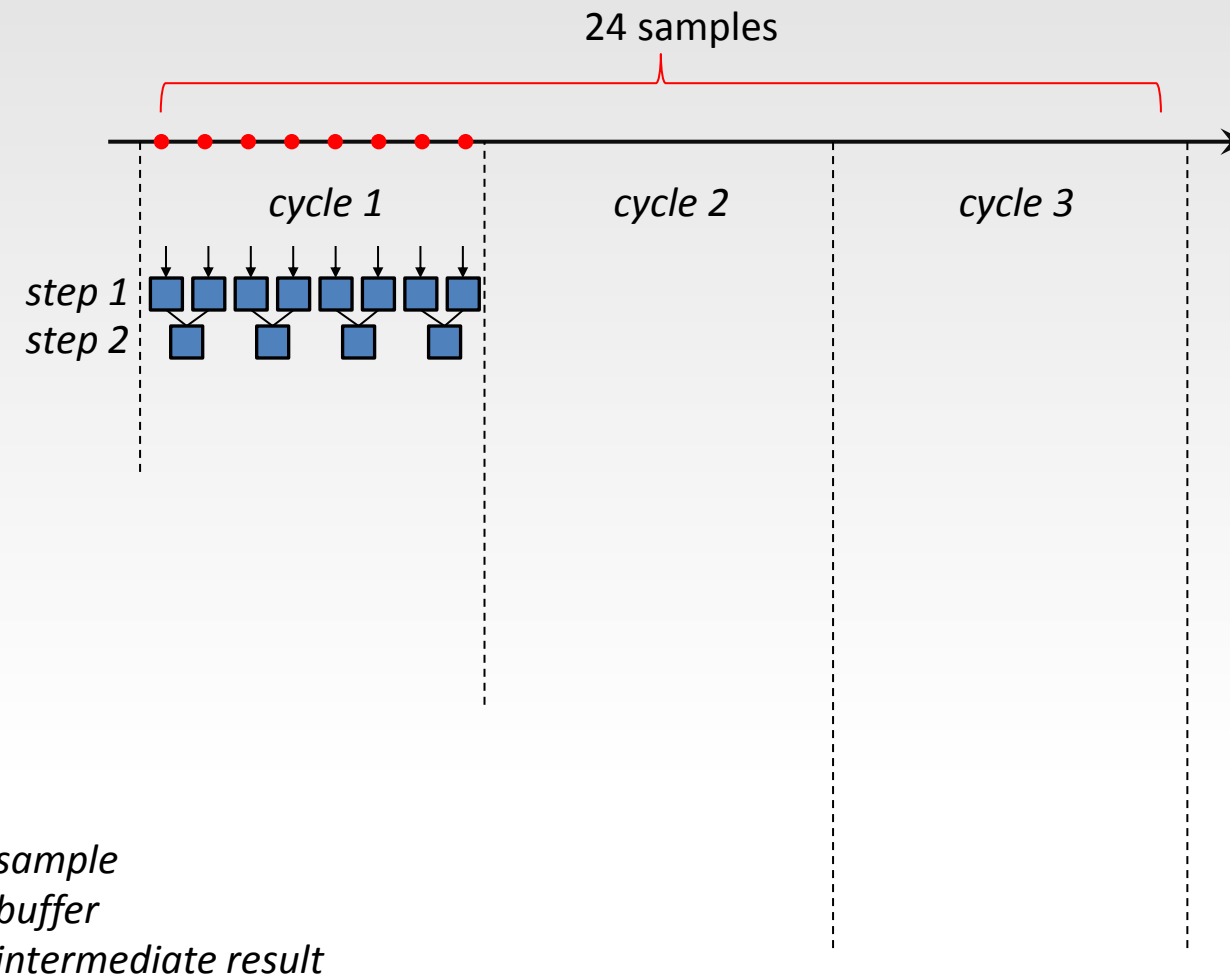
Motivation

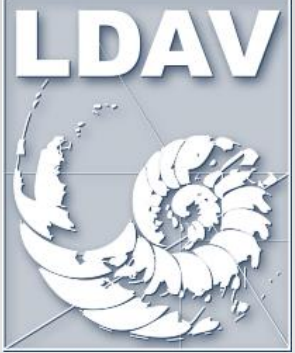
Related Work

Contribution

Result

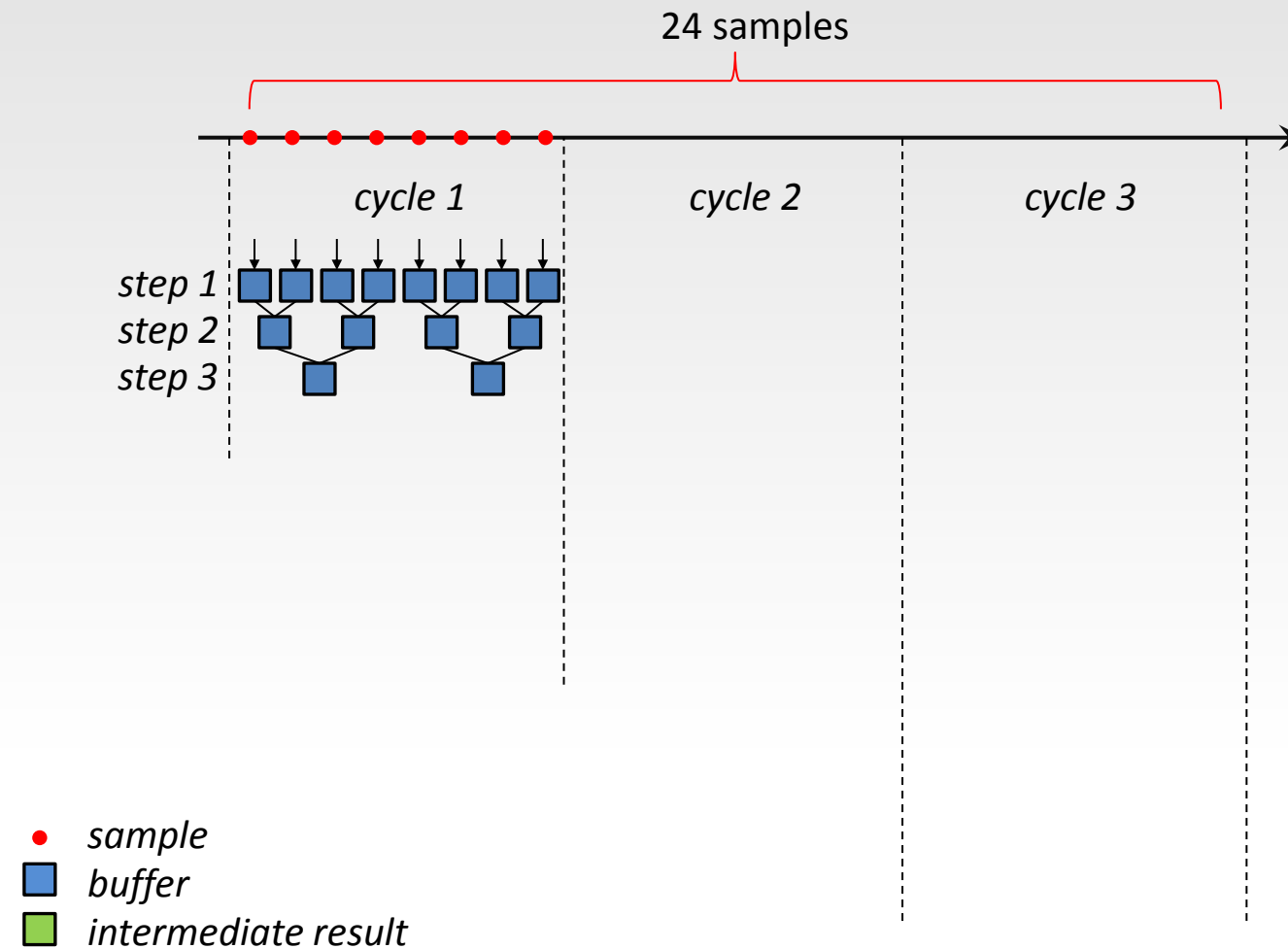
Application

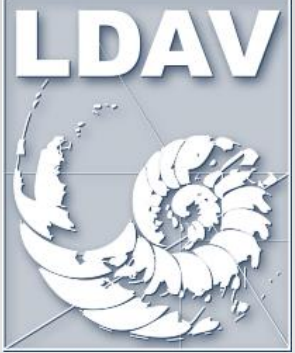




# Single Buffer Warp Marching

Motivation
Related Work
Contribution
Result
Application





# Single Buffer Warp Marching

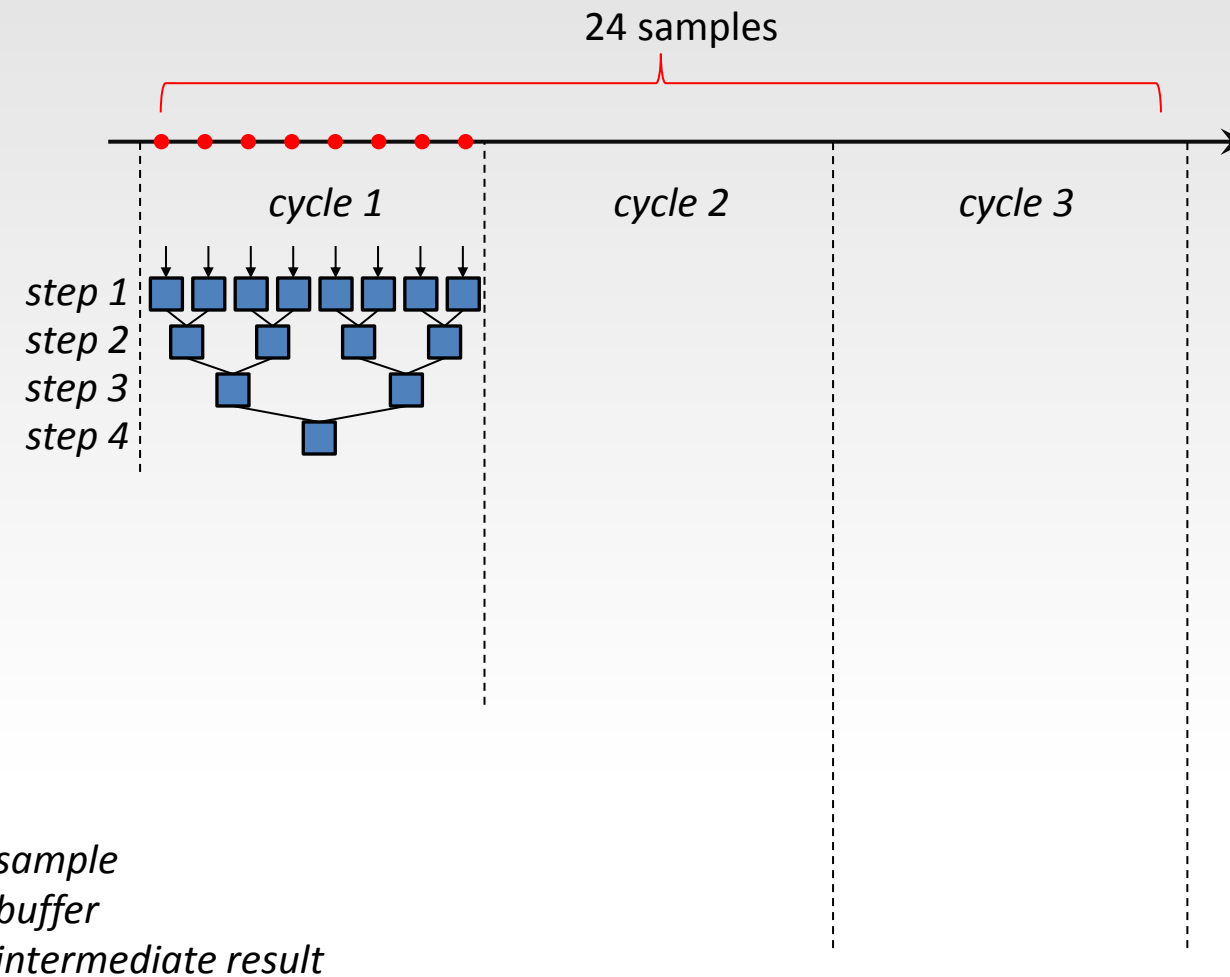
Motivation

Related Work

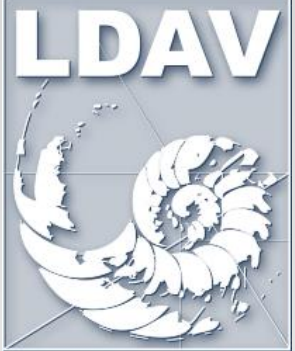
Contribution

Result

Application







# Single Buffer Warp Marching

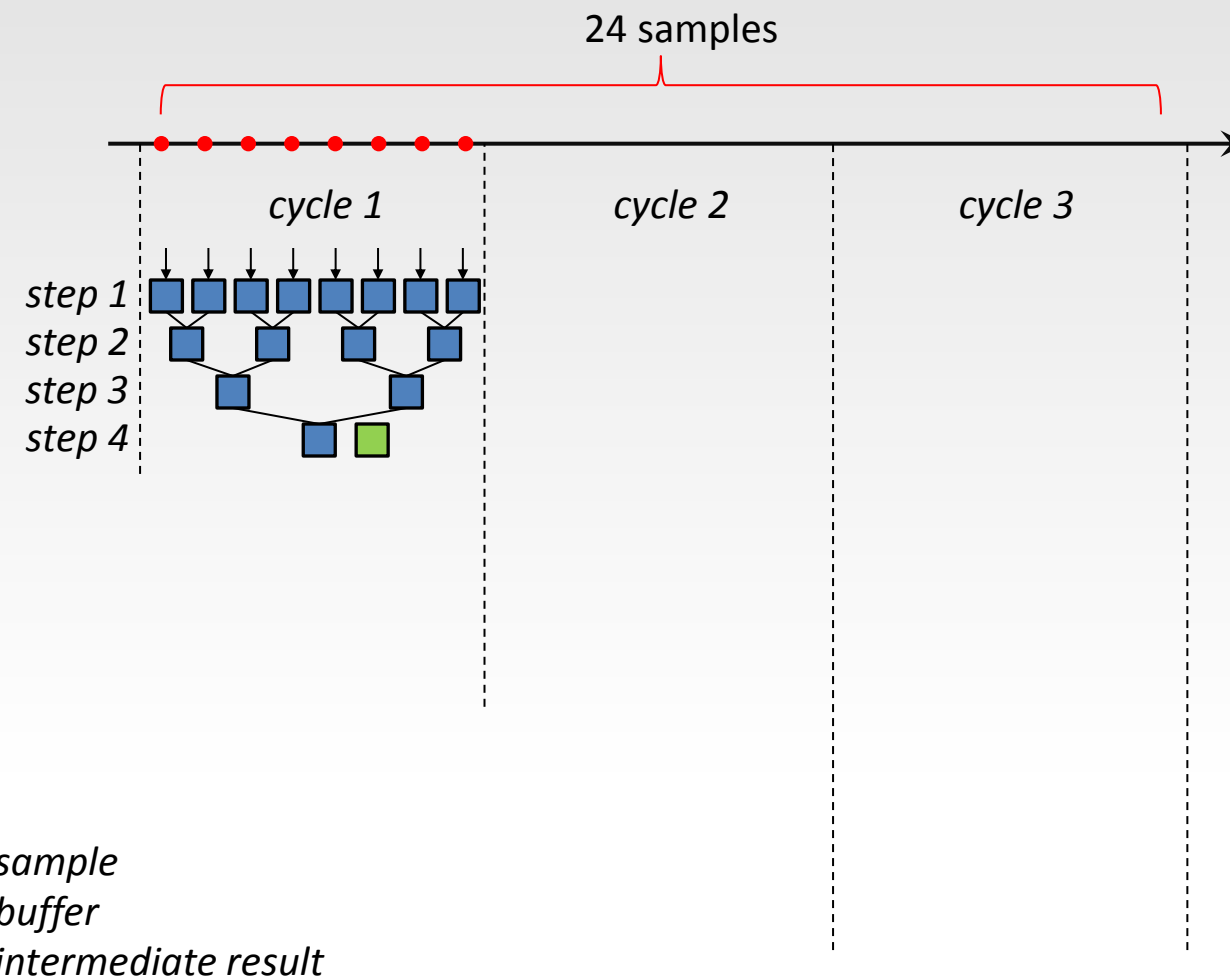
Motivation

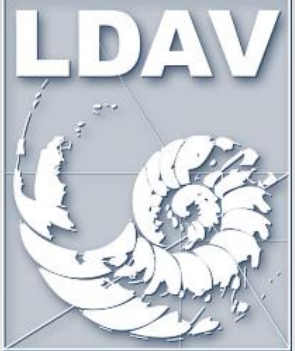
Related Work

Contribution

Result

Application





# Single Buffer Warp Marching

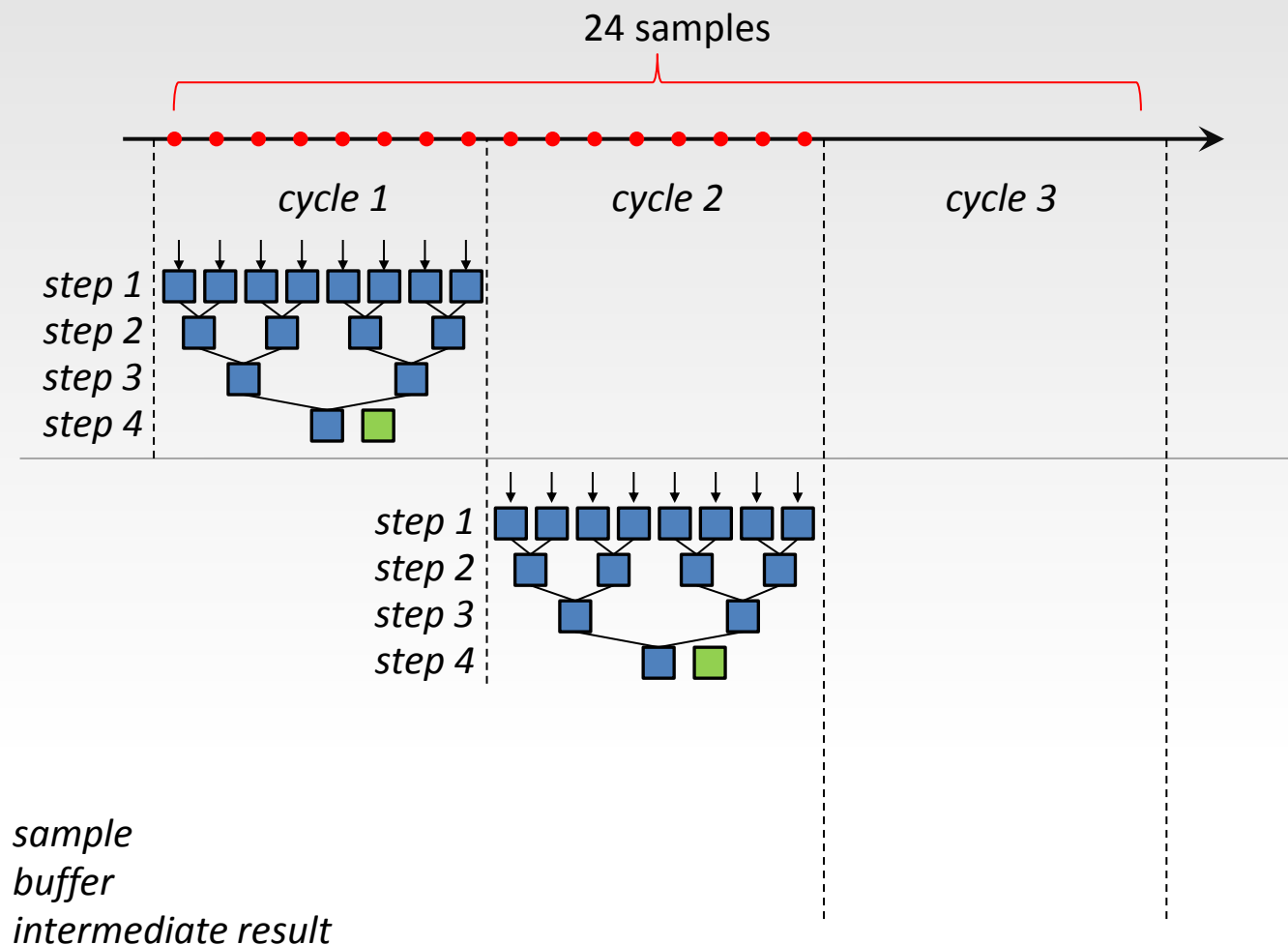
Motivation

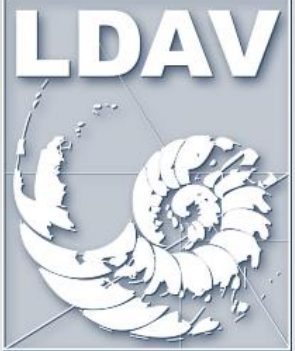
Related Work

Contribution

Result

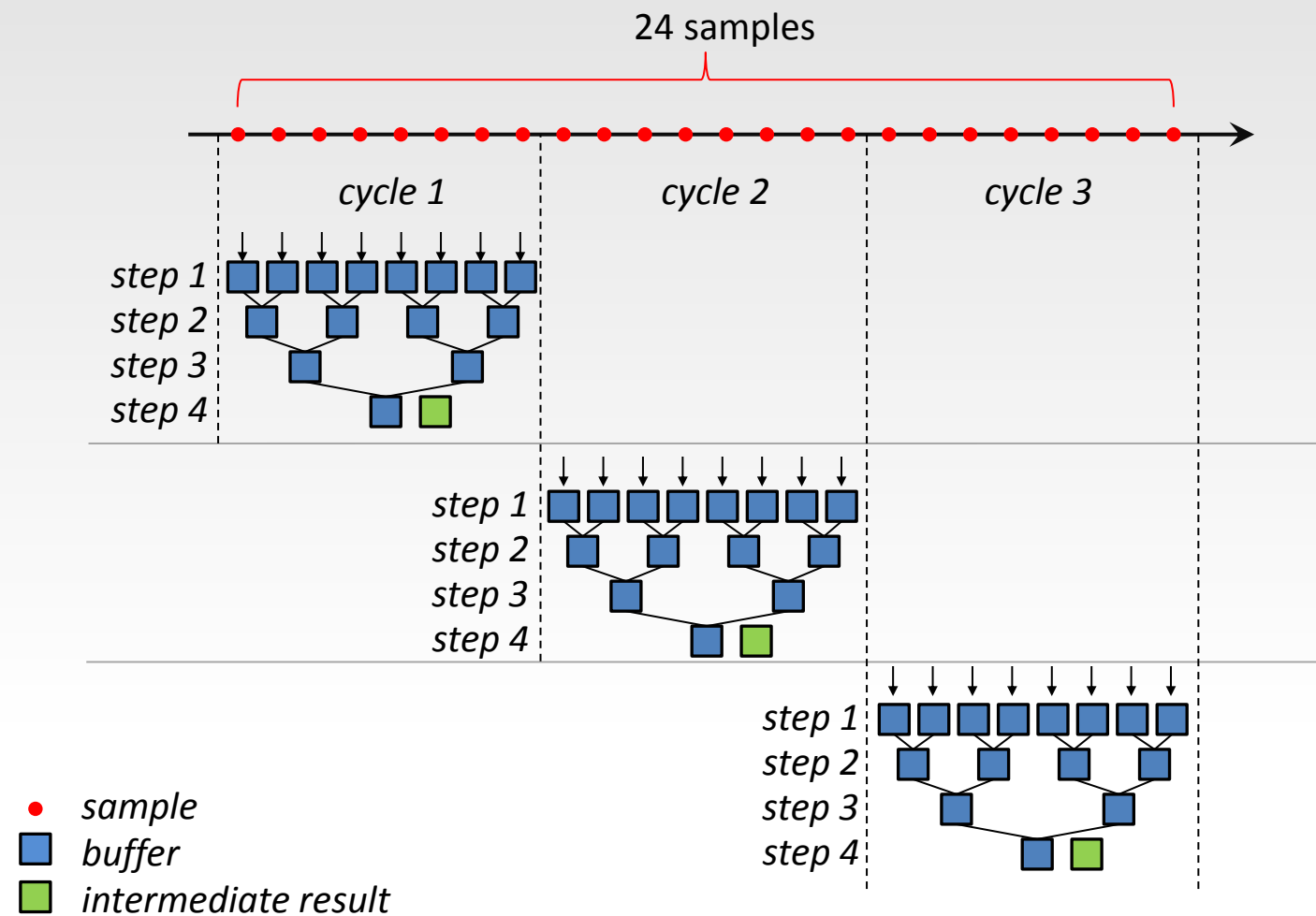
Application

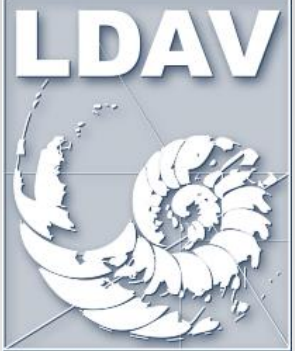




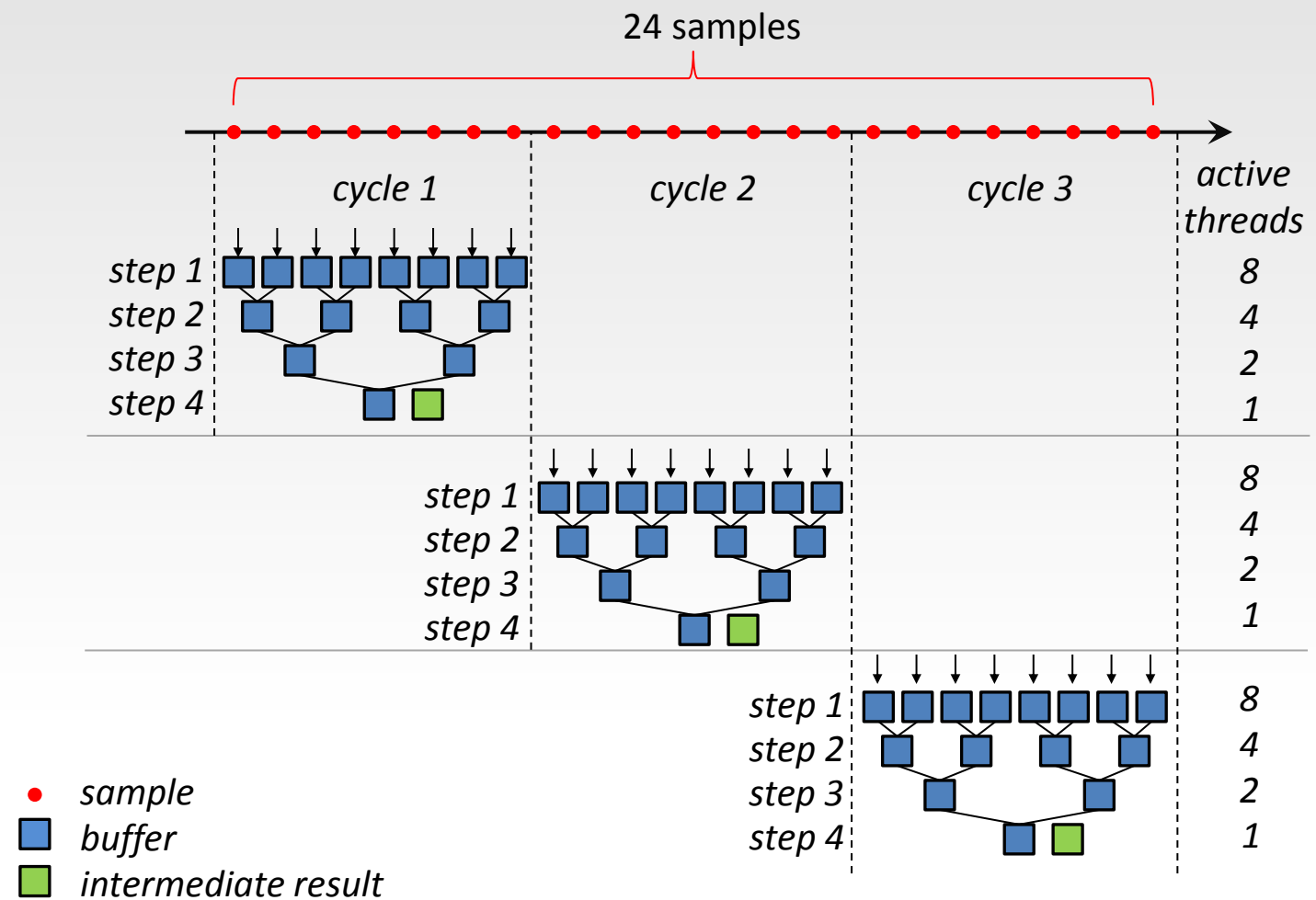
# Single Buffer Warp Marching

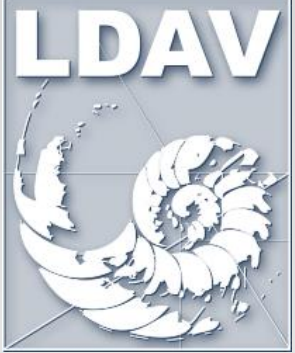
Motivation
Related Work
Contribution
Result
Application



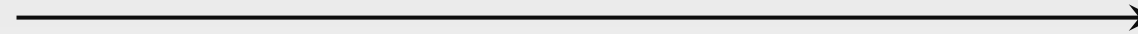


# Single Buffer Warp Marching





# Double Buffer Warp Marching



- *sample*
- *buffer 1*
- *buffer 2*

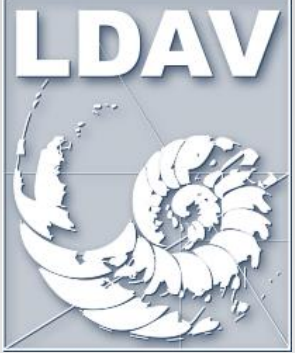
Motivation

Related Work

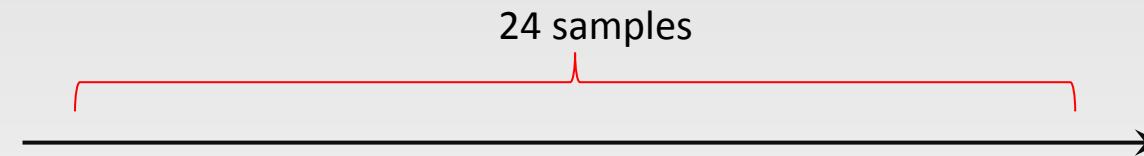
Contribution

Result

Application



# Double Buffer Warp Marching



- *sample*
- *buffer 1*
- *buffer 2*

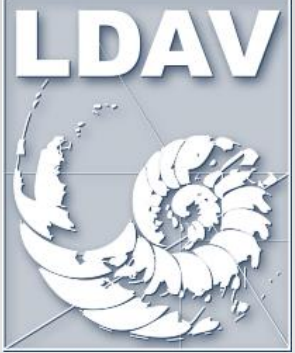
Motivation

Related Work

Contribution

Result

Application



# Double Buffer Warp Marching

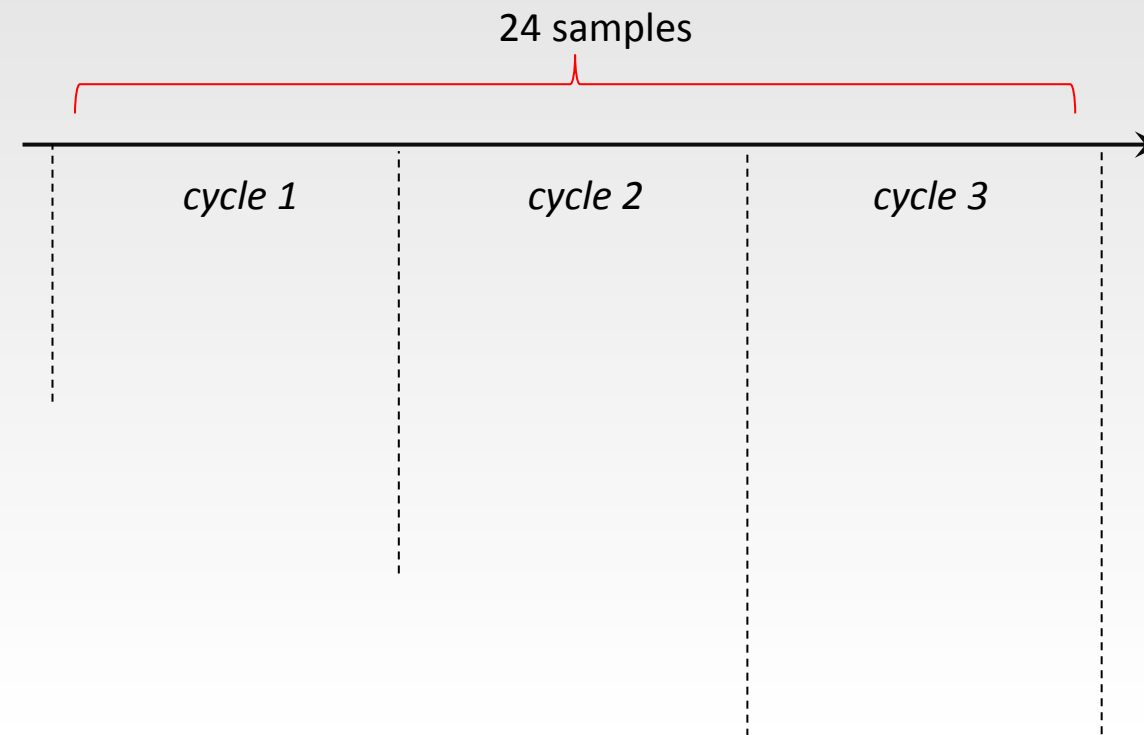
Motivation

Related Work

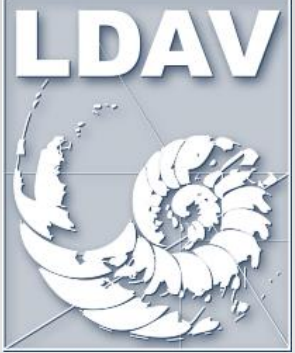
Contribution

Result

Application



- *sample*
- *buffer 1*
- *buffer 2*



# Double Buffer Warp Marching

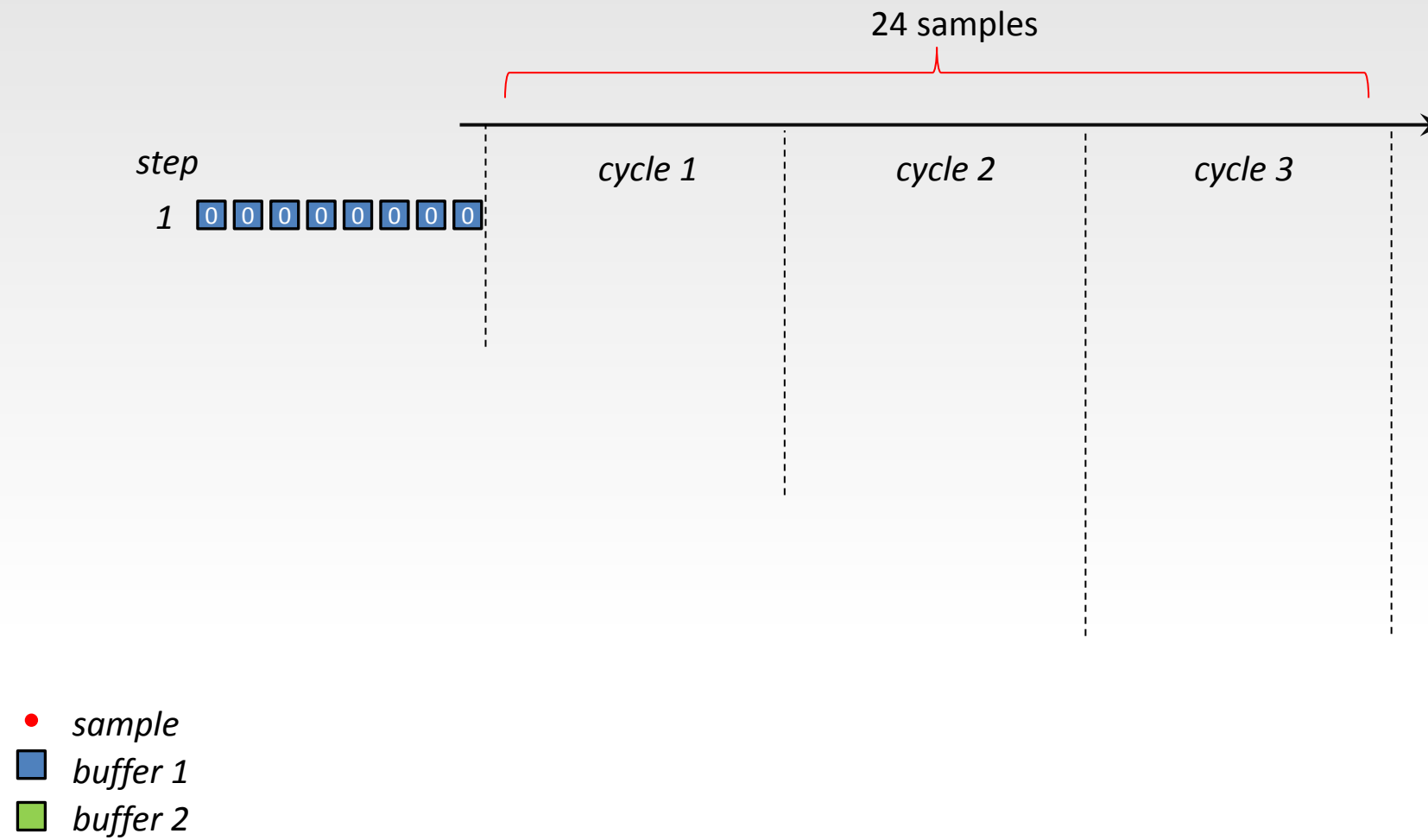
Motivation

Related Work

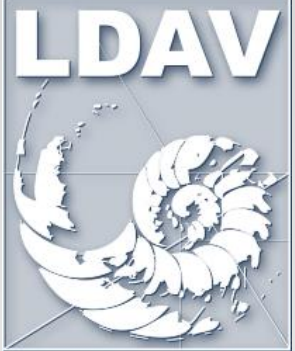
Contribution

Result

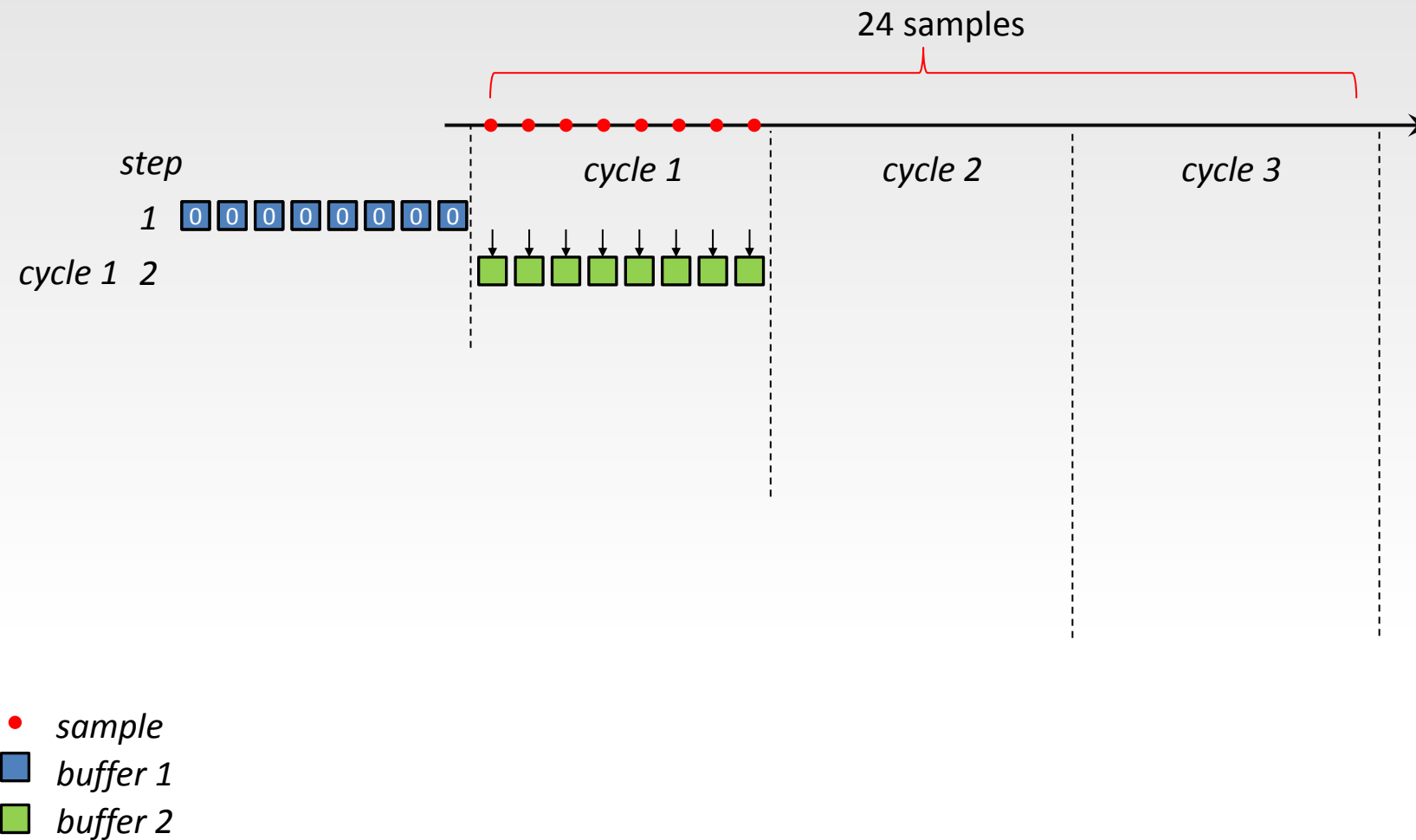
Application

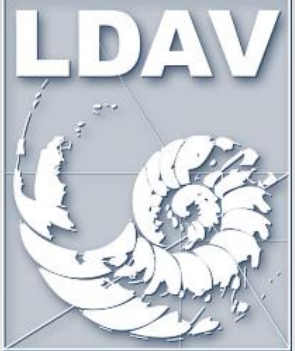




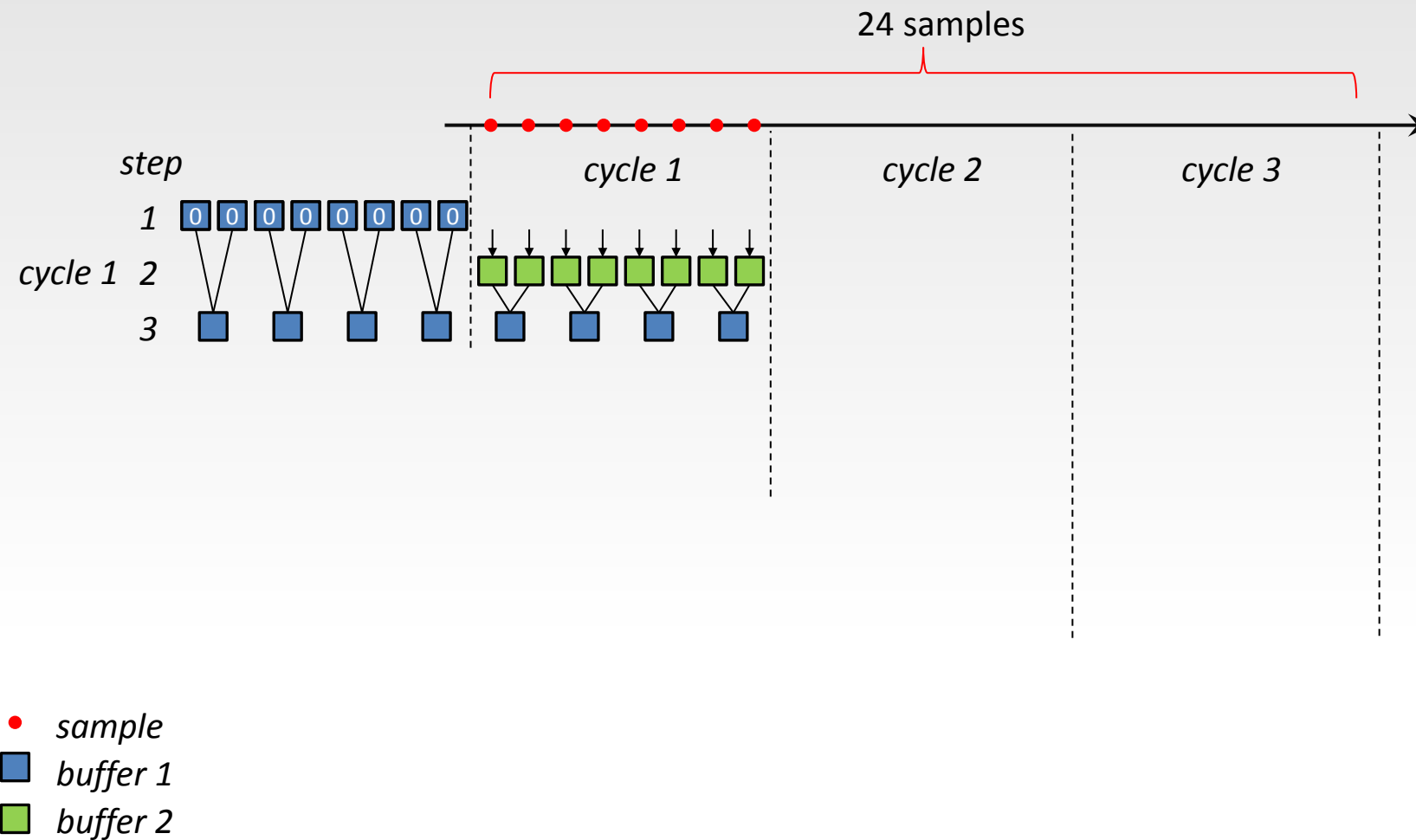


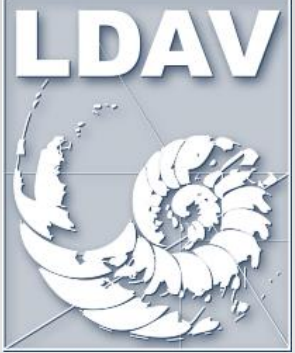
# Double Buffer Warp Marching



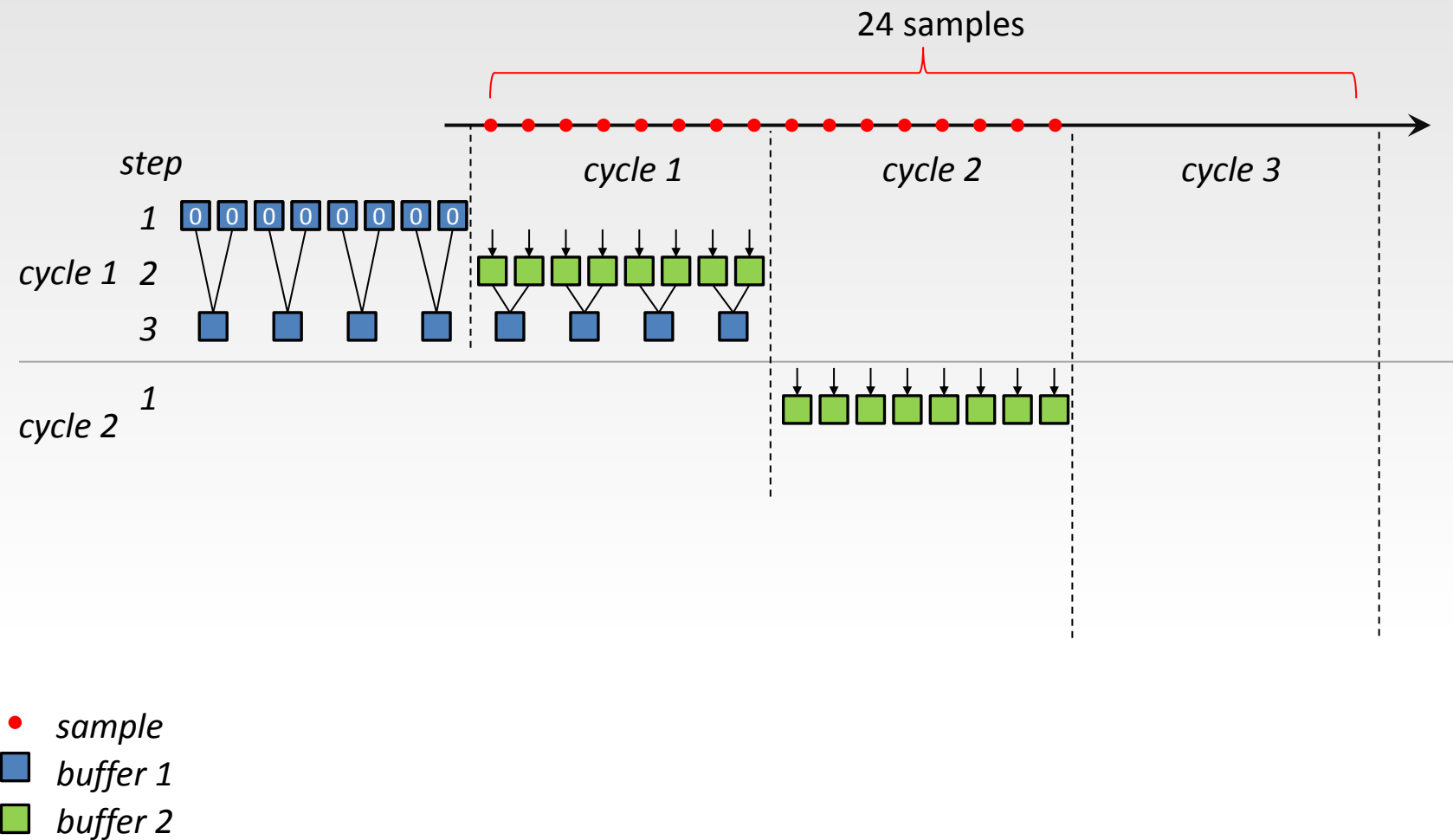


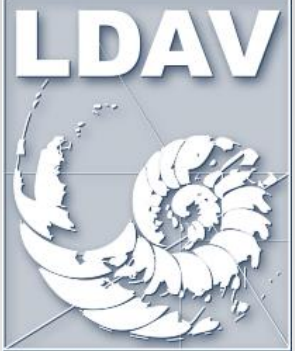
# Double Buffer Warp Marching



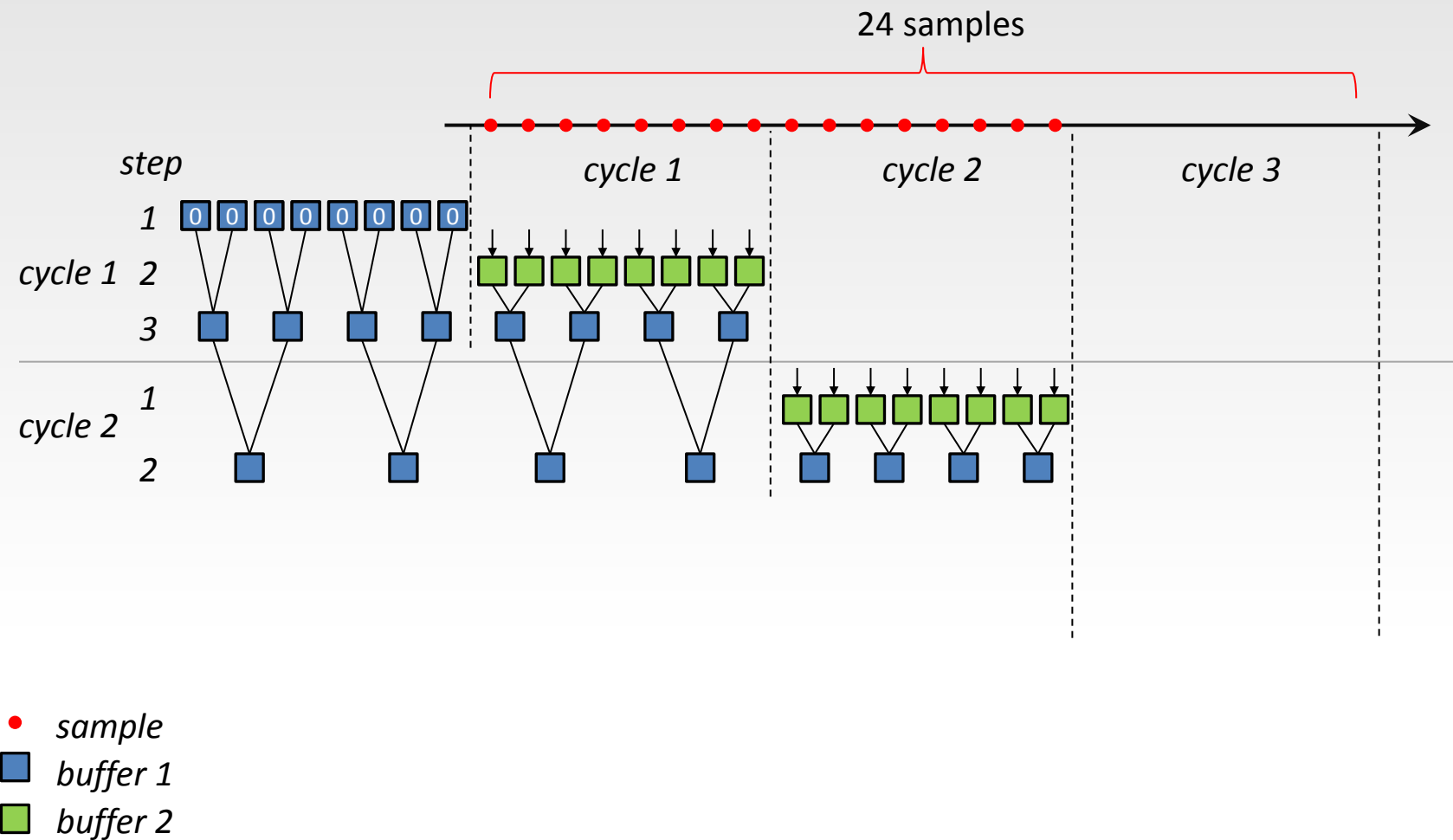


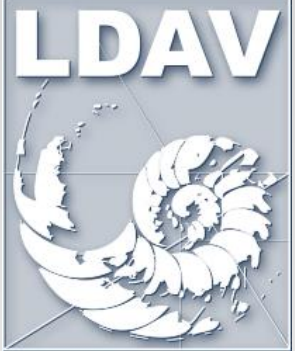
# Double Buffer Warp Marching





# Double Buffer Warp Marching





# Double Buffer Warp Marching

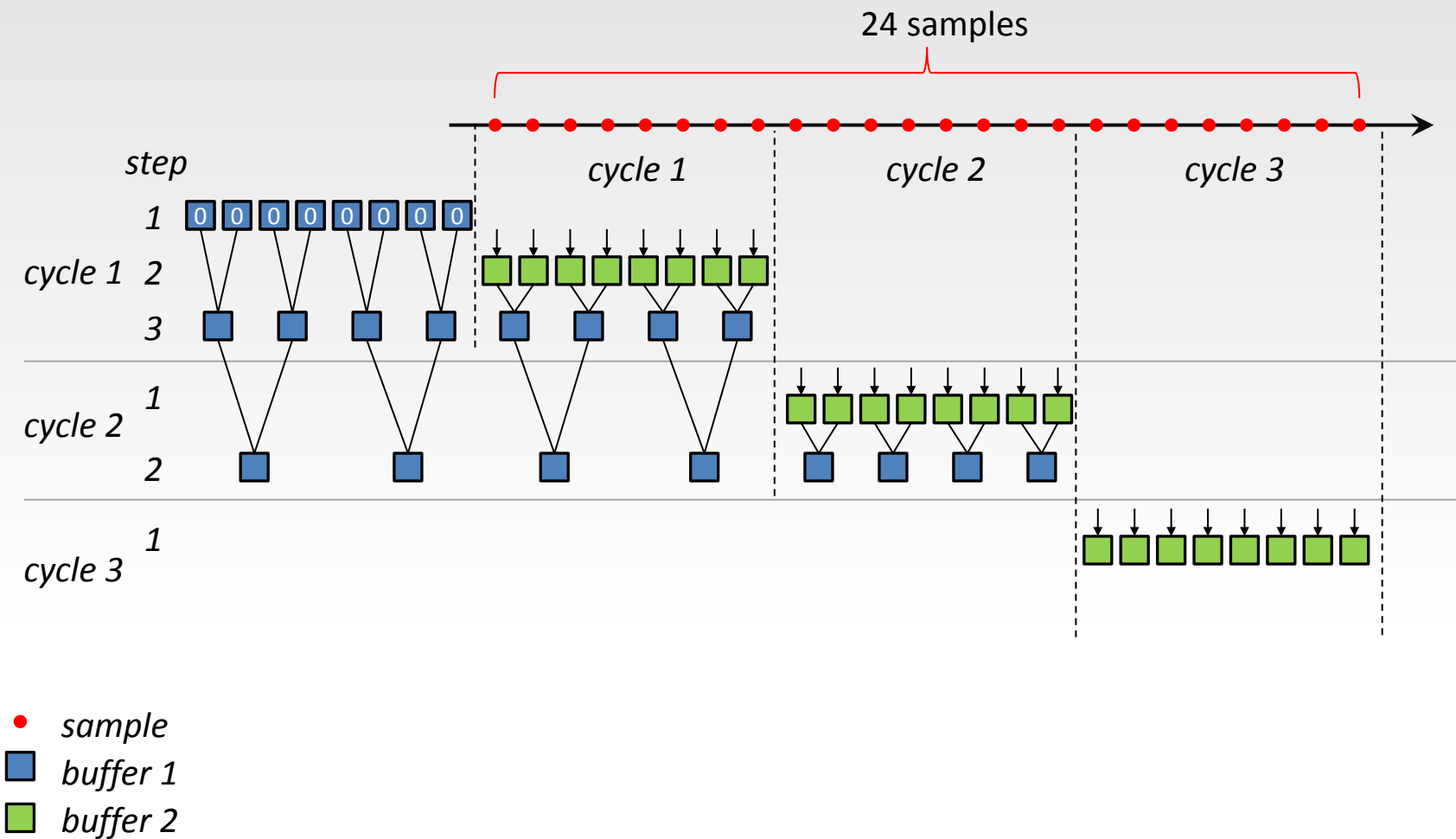
Motivation

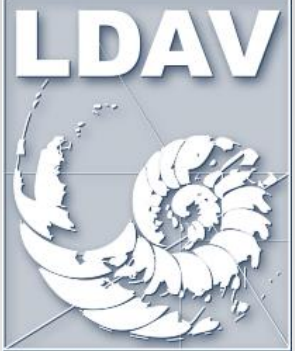
Related Work

Contribution

Result

Application





# Double Buffer Warp Marching

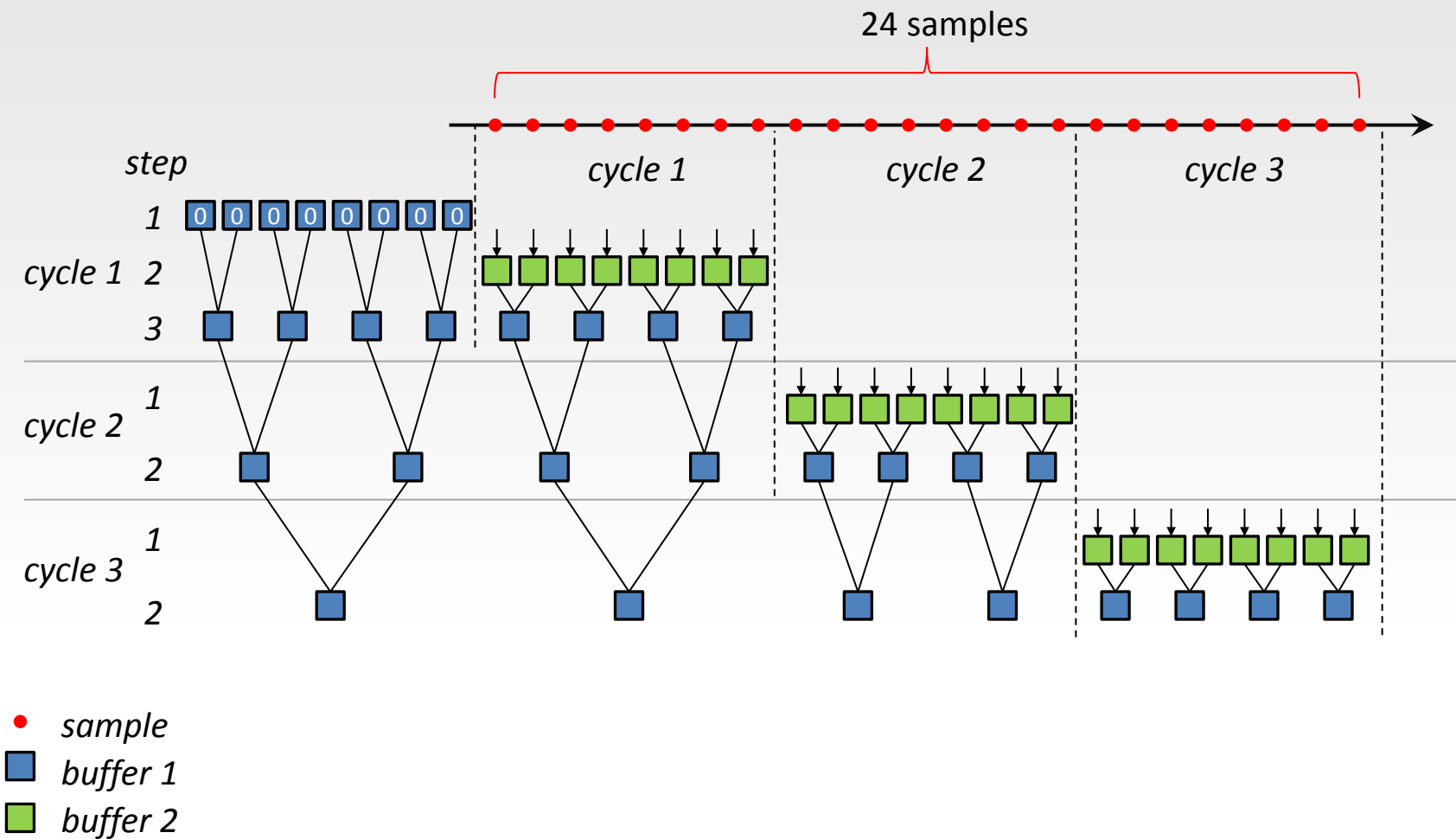
Motivation

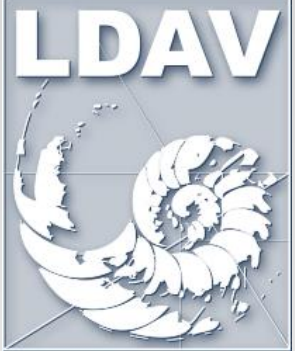
Related Work

Contribution

Result

Application





# Double Buffer Warp Marching

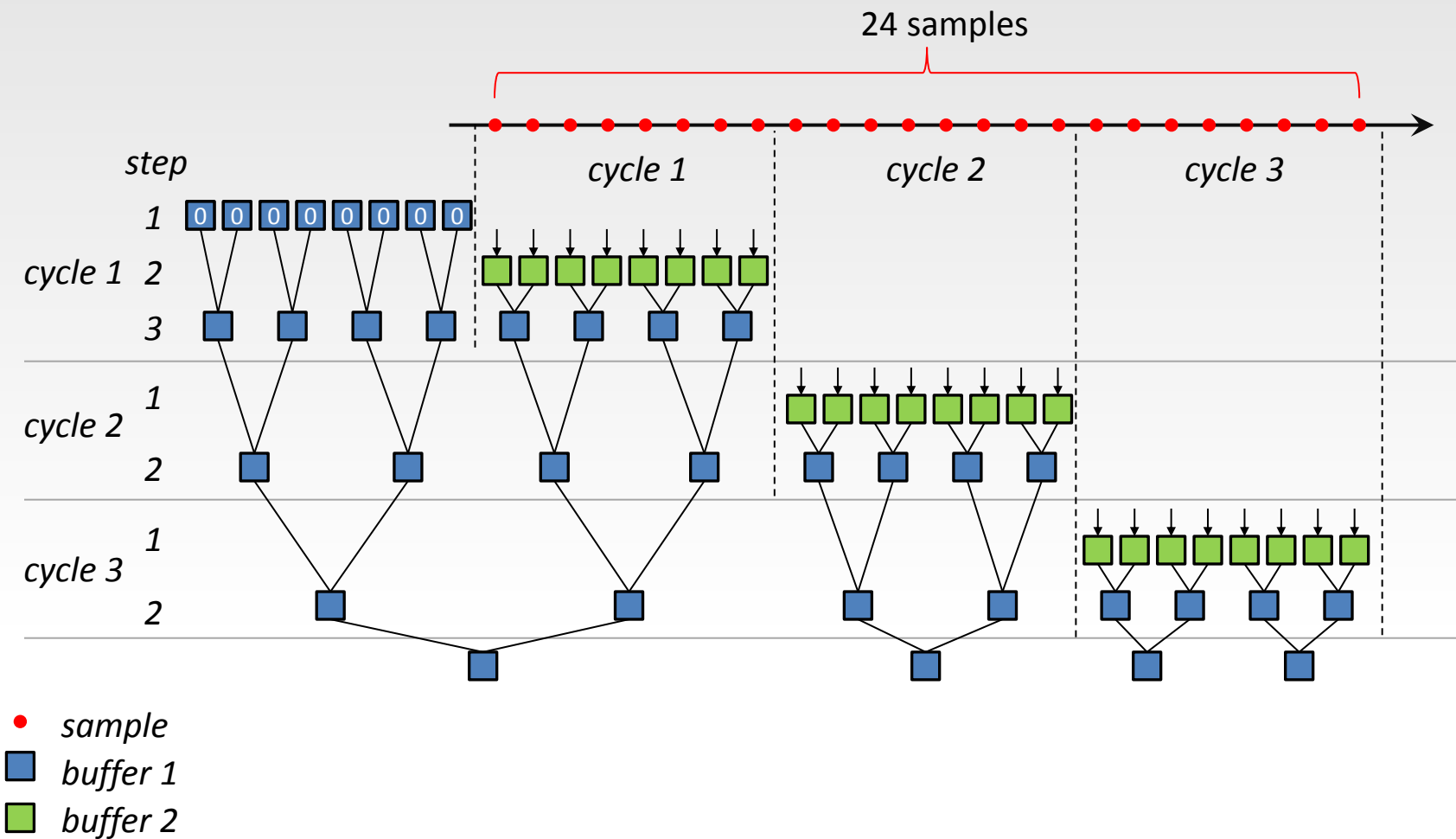
Motivation

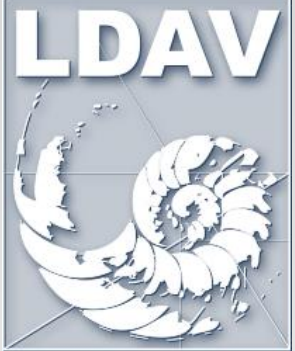
Related Work

Contribution

Result

Application





# Double Buffer Warp Marching

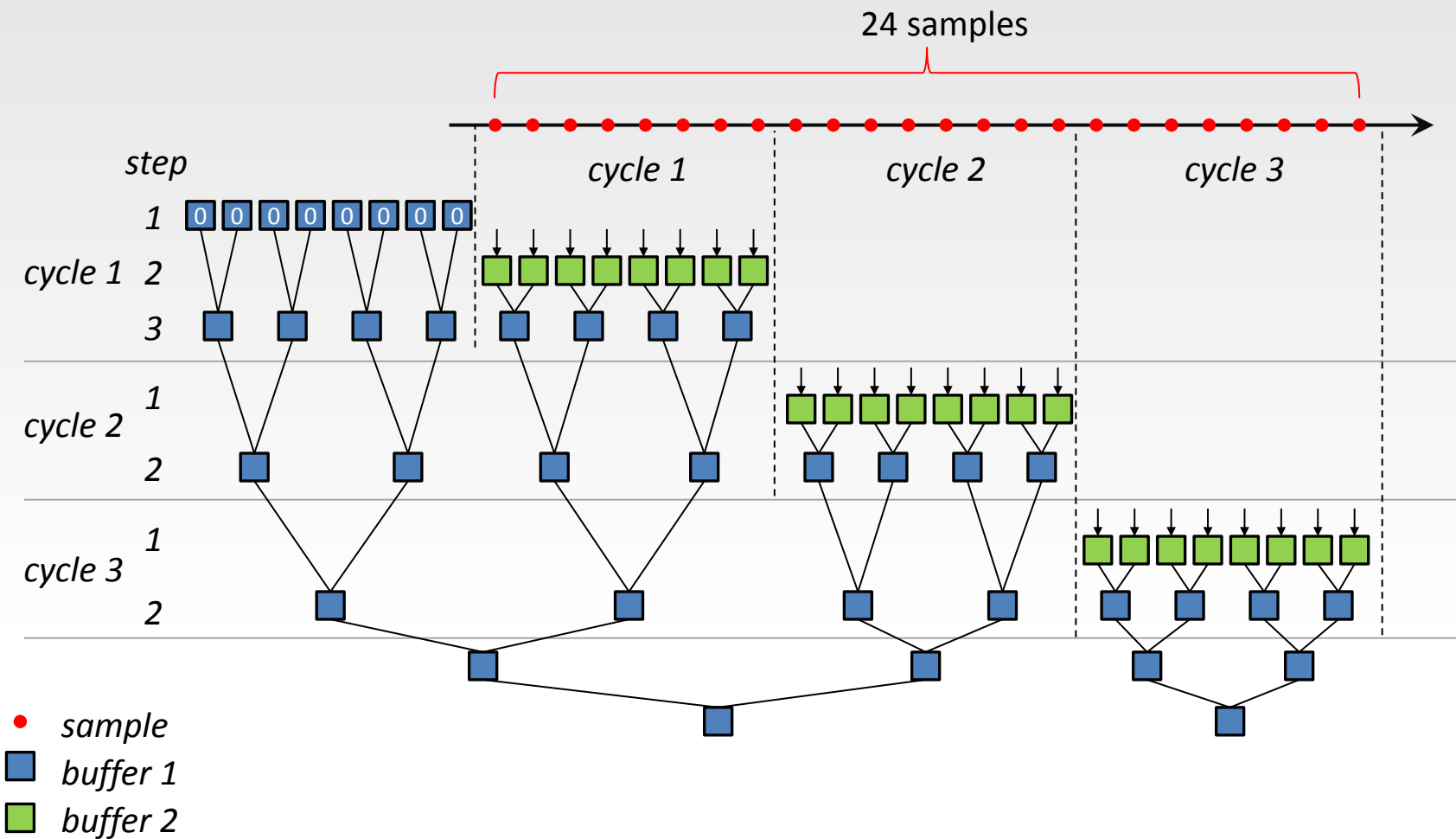
Motivation

Related Work

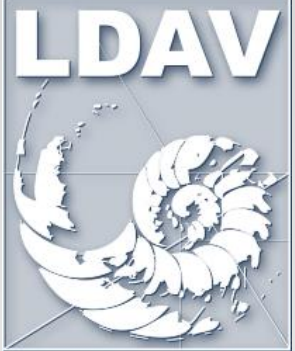
Contribution

Result

Application







# Double Buffer Warp Marching

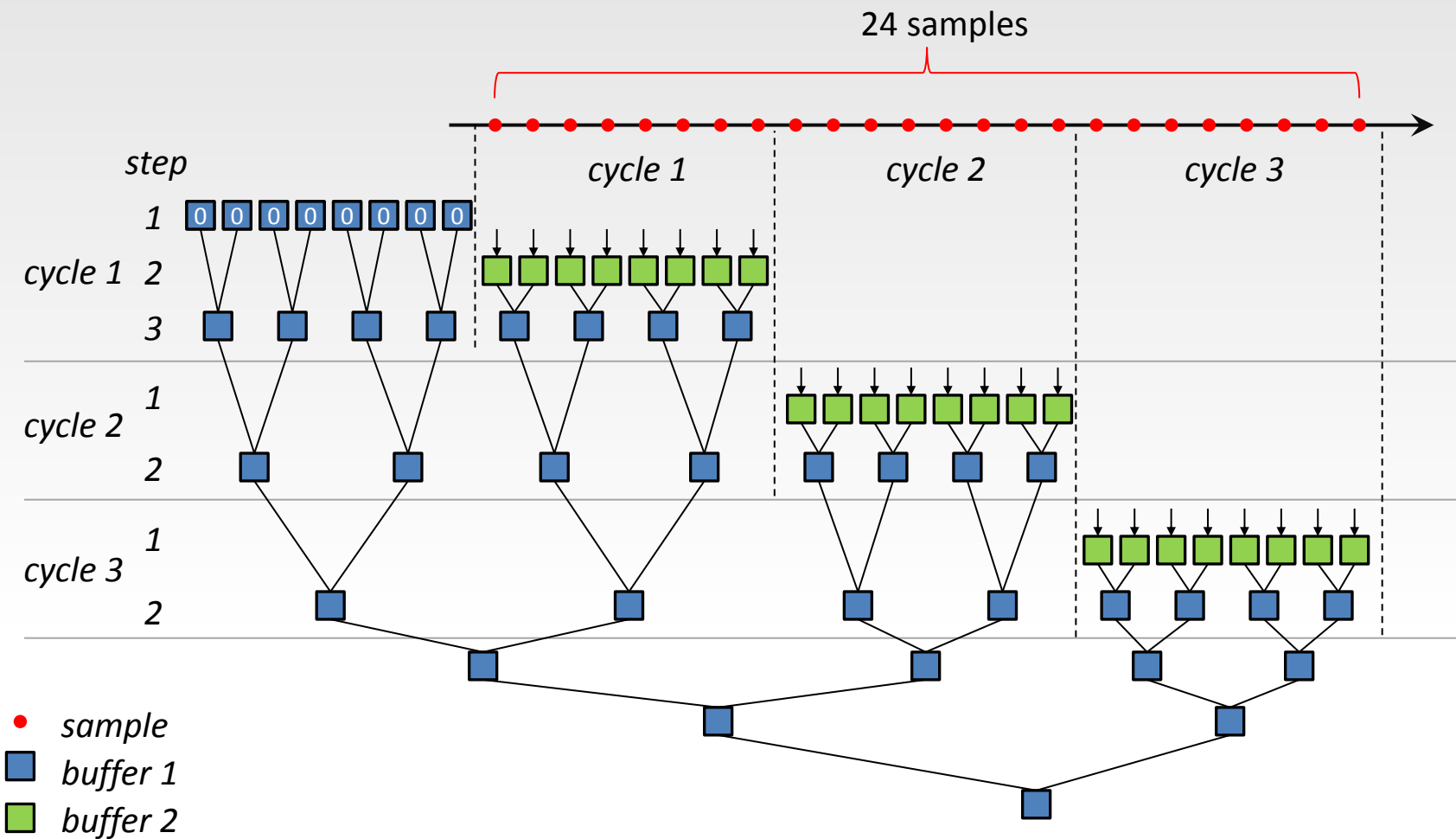
Motivation

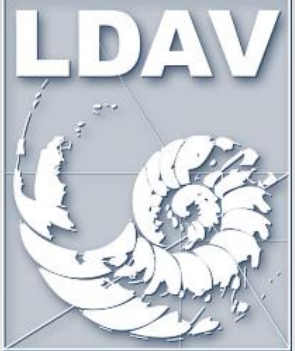
Related Work

Contribution

Result

Application





# Double Buffer Warp Marching

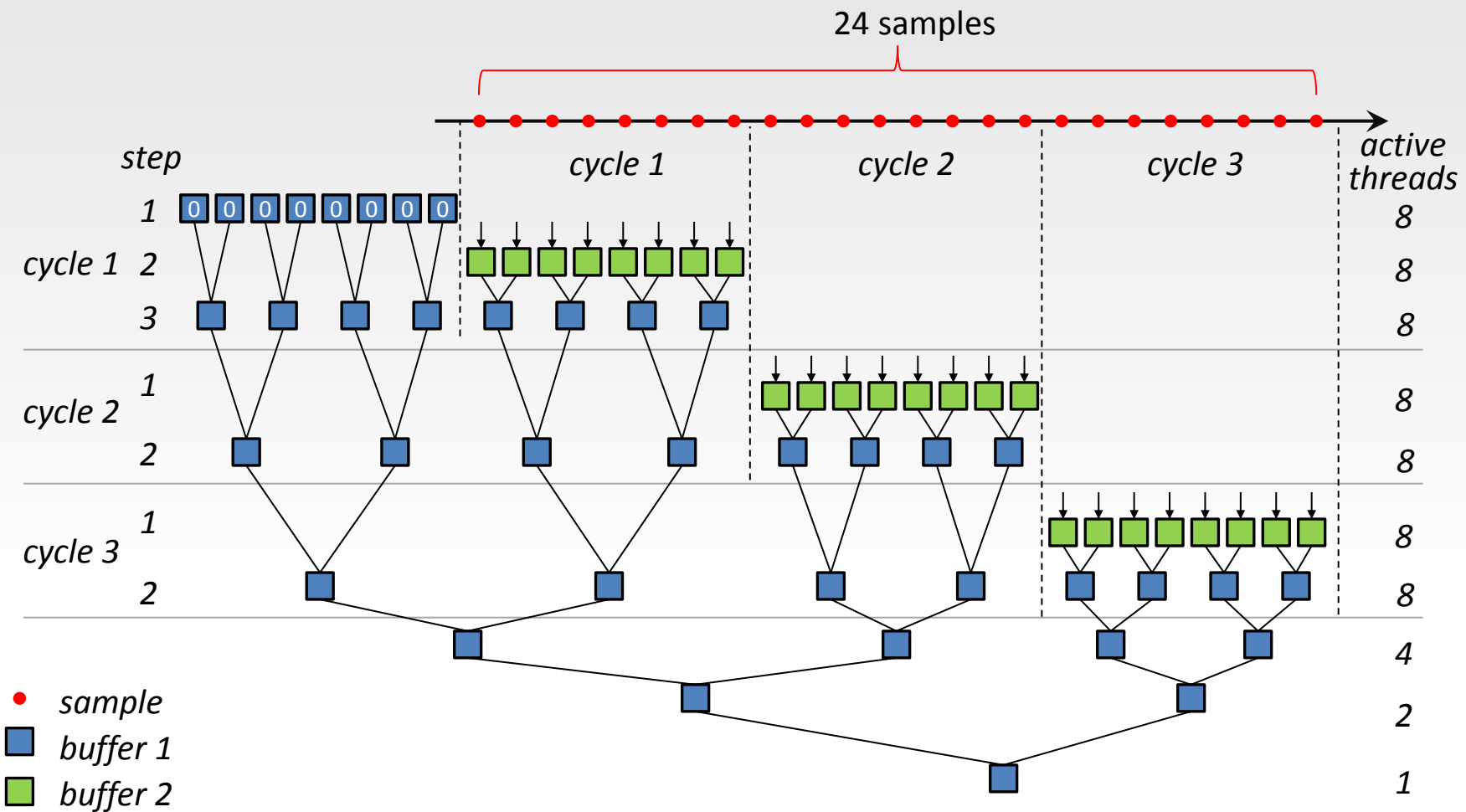
Motivation

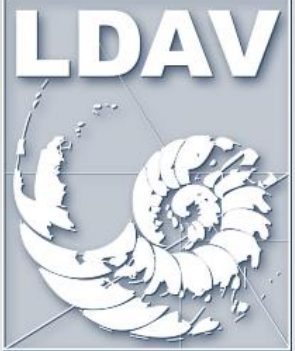
Related Work

Contribution

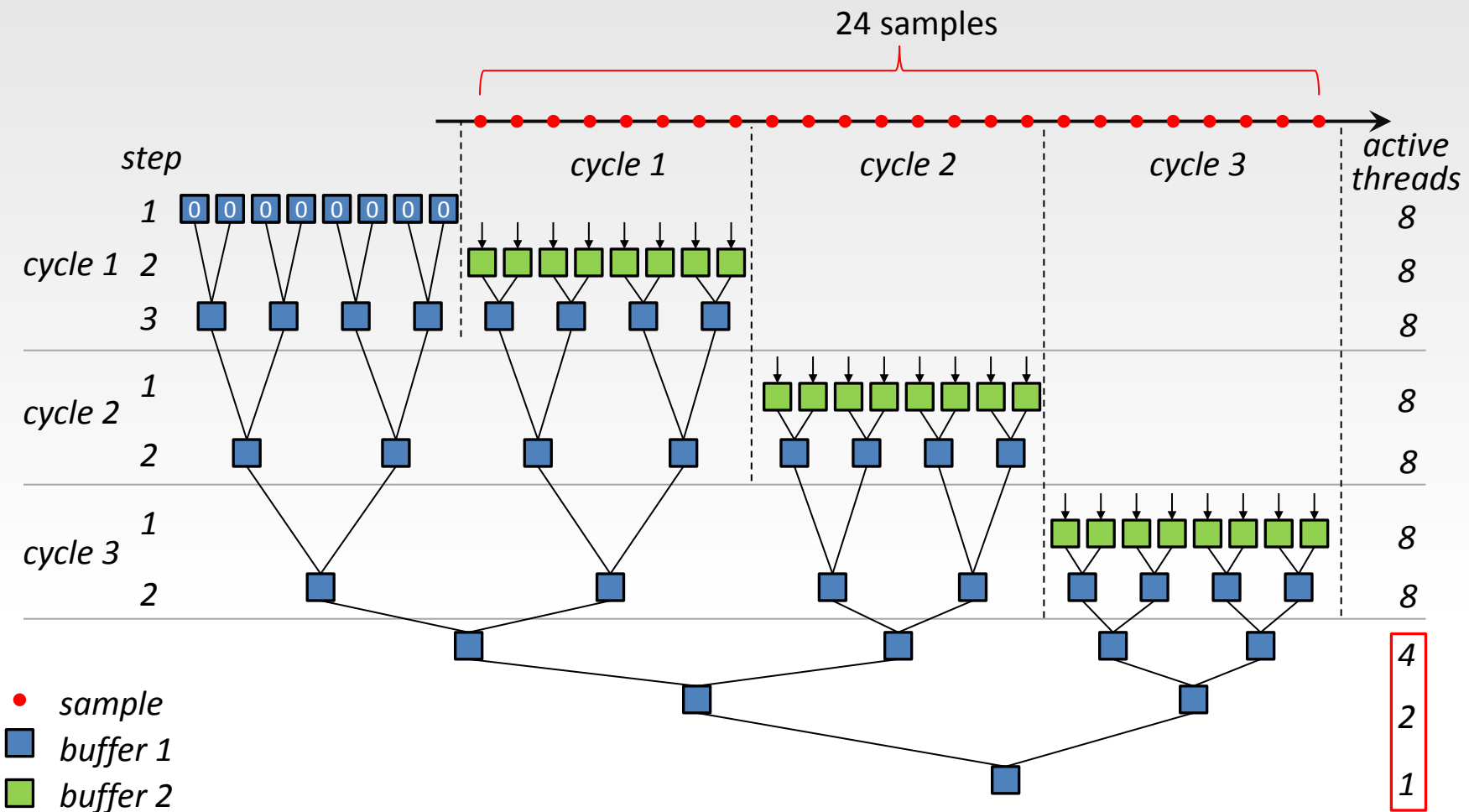
Result

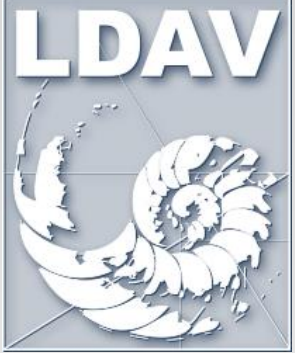
Application



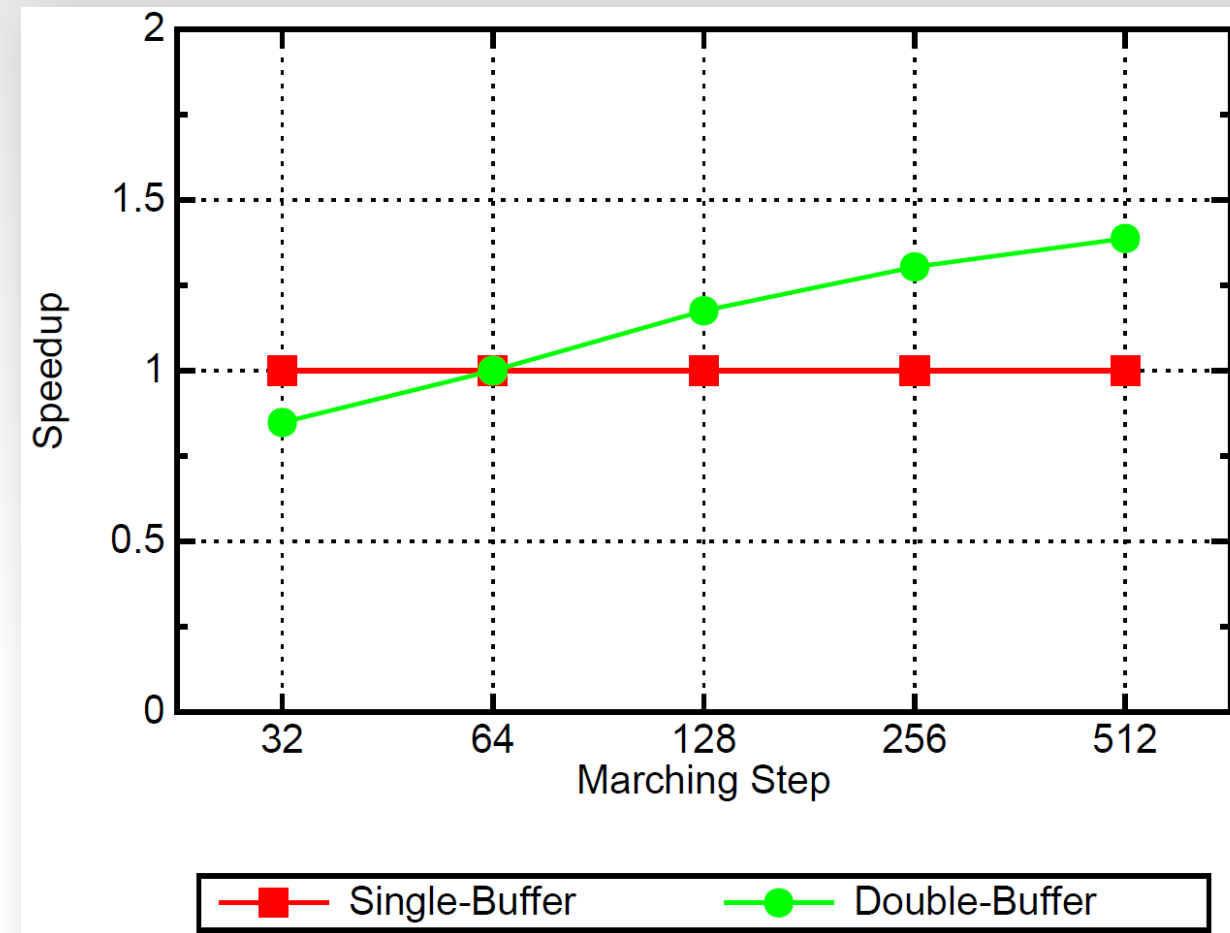


# Double Buffer Warp Marching

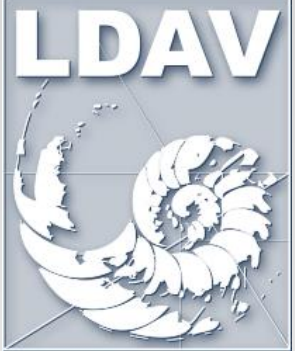




# Optimization Result

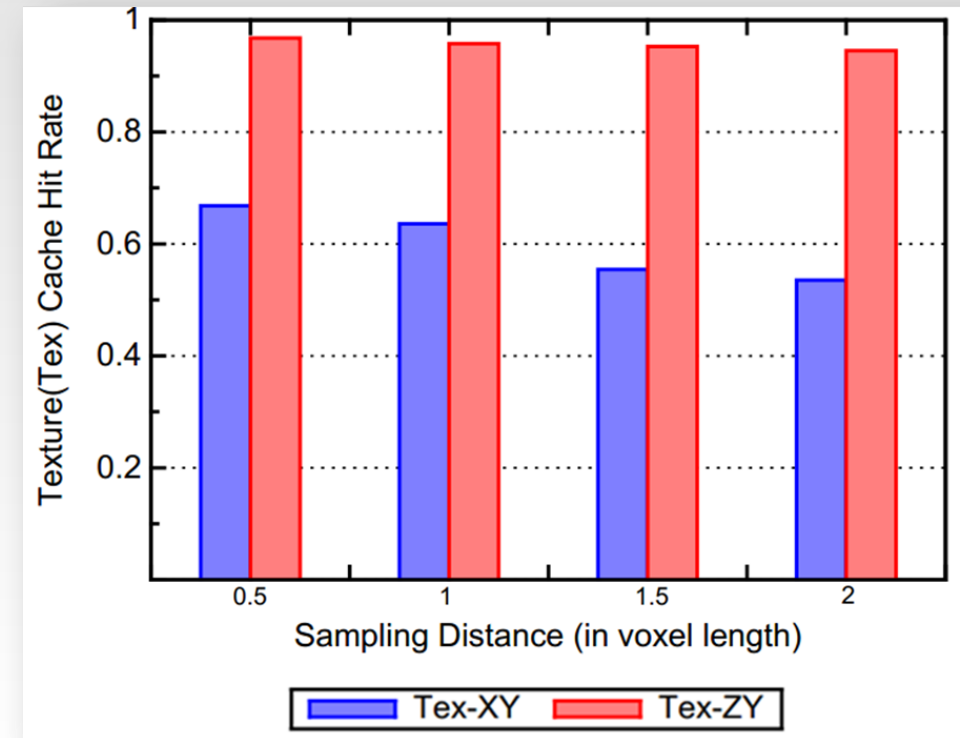


Warp size = 32

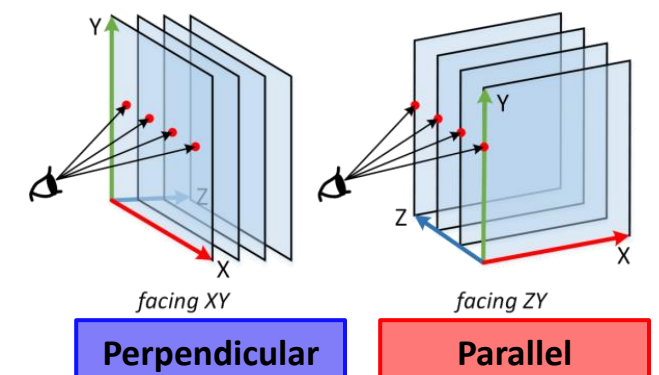


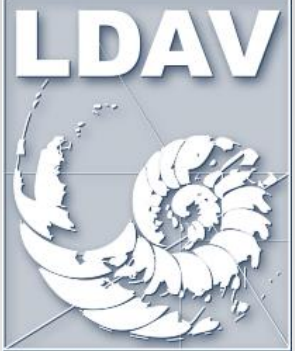
# Texture Cache Performance

Motivation
Related Work
Contribution
Result
Application

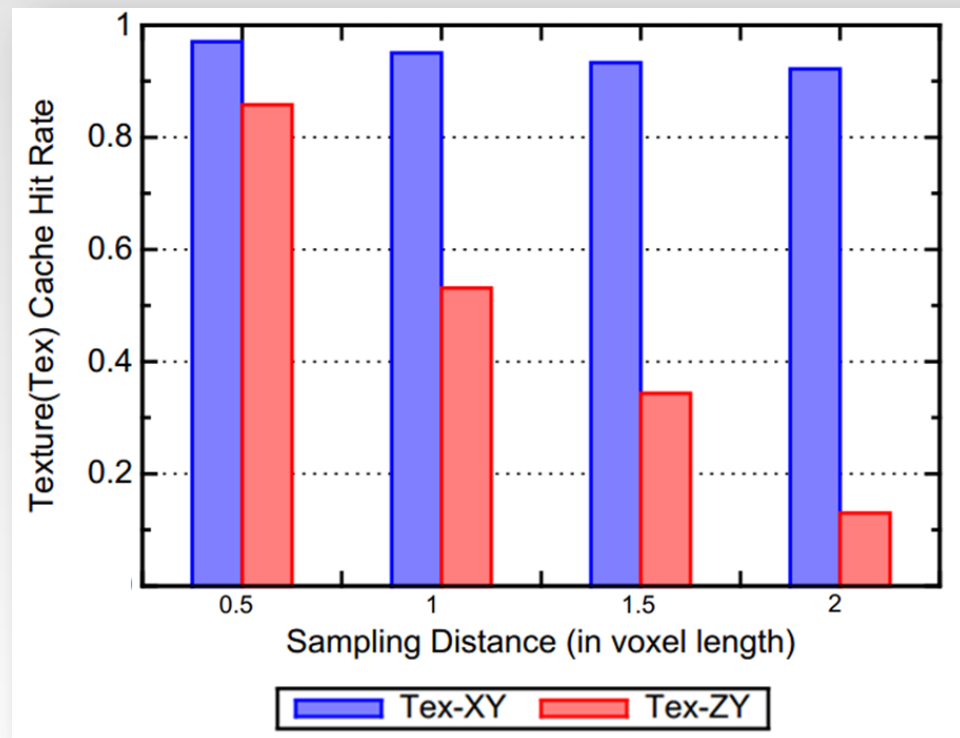


## Warp Marching

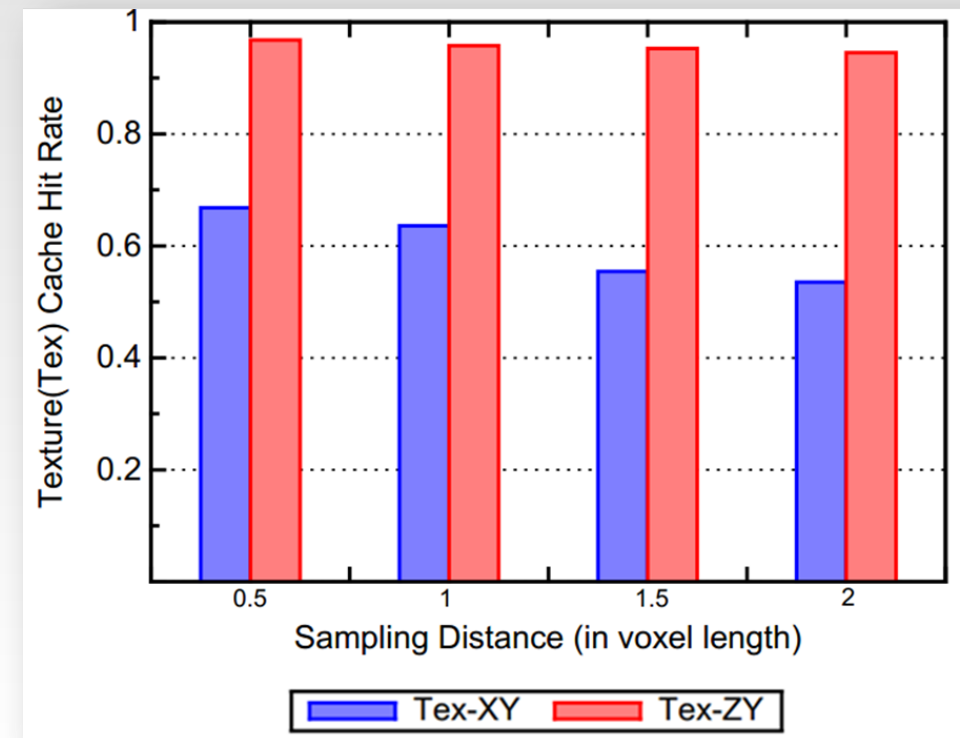




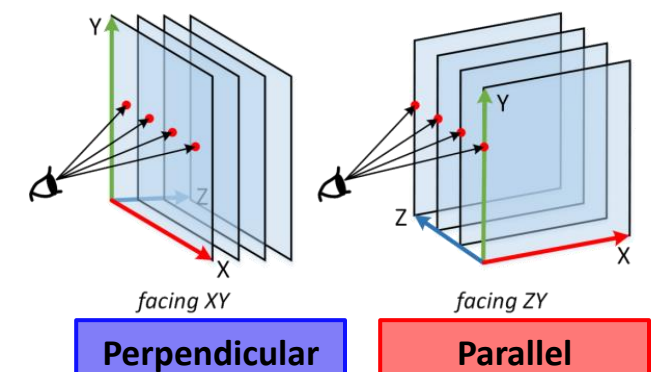
# Texture Cache Performance

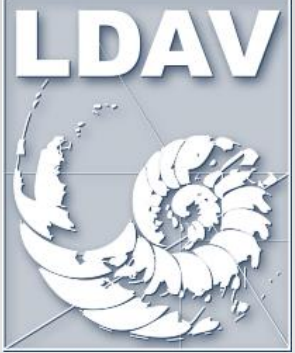


The Standard  
(The Traditional)



Warp Marching





# View Independent?

- Hybrid?
  - Perpendicular, the standard
  - Parallel, warp marching
- How about viewing directions in between?

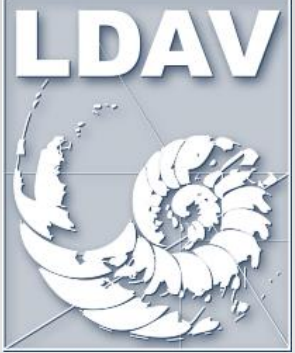
Motivation

Related Work

Contribution

Result

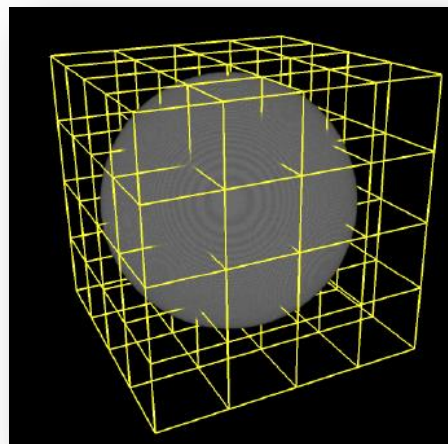
Application



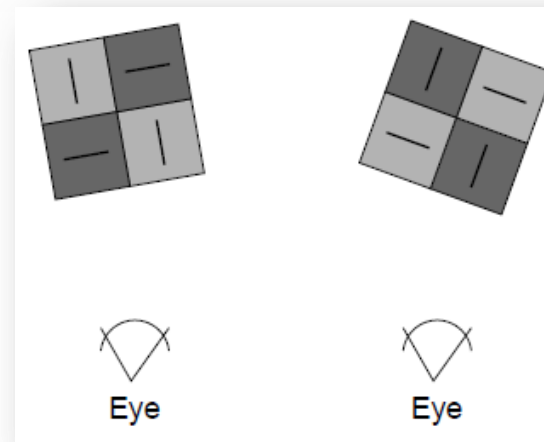
# View Independent?

- Hybrid?
  - Perpendicular, the standard
  - Parallel, warp marching
- How about viewing directions in between?

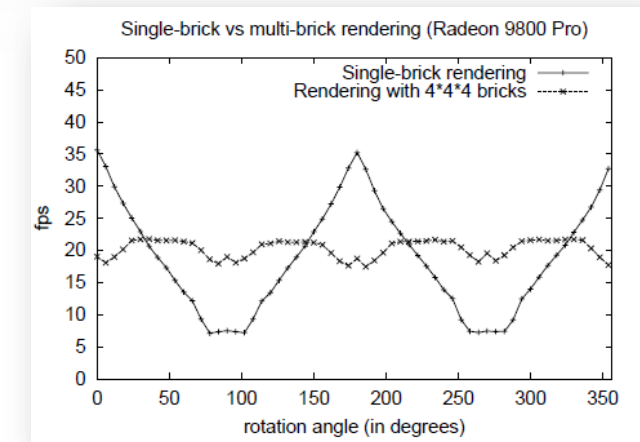
[Weiskopf04]



Partitioning a volume into small bricks

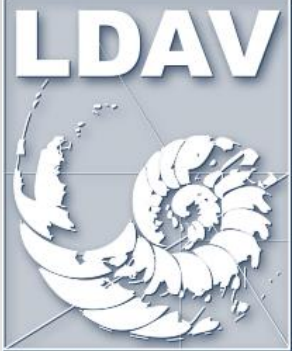


For any direction, 2 bricks are parallel and two bricks are perpendicular to the view



Achieve a roughly constant frame rate when rotating around the Y axis





# Warp Shape

Thread block size 256, warp size 32

The Standard Sampling		Warp Marching	
Block Shape	Warp Shape	Block Shape	Warp Shape
32 x 8	32 x 1		
16 x 16	16 x 2		
8 x 32	8 x 4		
...	...	...	...

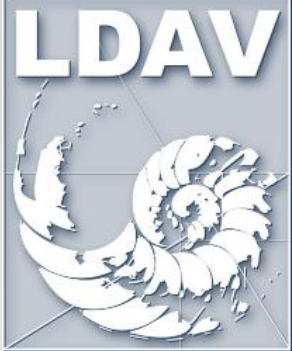
Motivation

Related Work

Contribution

Result

Application



# Warp Shape

Thread block size 256, warp size 32

The Standard Sampling		Warp Marching	
Block Shape	Warp Shape	Block Shape	Warp Shape
32 x 8 x 1	32 x 1		
16 x 16 x 1	16 x 2		
8 x 32 x 1	8 x 4		
...	...	...	...

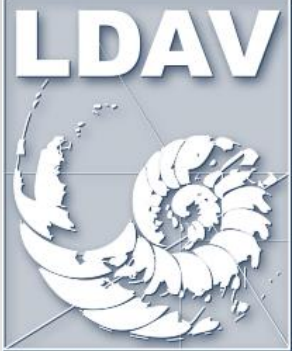
Motivation

Related Work

Contribution

Result

Application



# Warp Shape

Thread block size 256, warp size 32

The Standard Sampling		Warp Marching	
Block Shape	Warp Shape	Block Shape	Warp Shape
32 x 8 x 1	32 x 1 x 1		
16 x 16 x 1	16 x 2 x 1		
8 x 32 x 1	8 x 4 x 1		
...	...	...	...

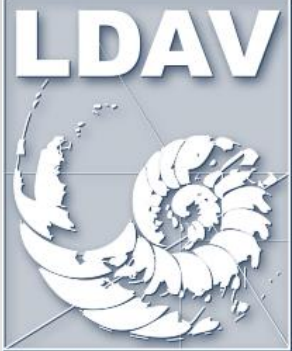
Motivation

Related Work

Contribution

Result

Application



# Warp Shape

Thread block size 256, warp size 32

The Standard Sampling		Warp Marching	
Block Shape	Warp Shape	Block Shape	Warp Shape
32 x 8 x 1	32 x 1 x 1	1x8x32	1 x 1 x 32
16 x 16 x 1	16 x 2 x 1	2x4x32	1 x 1 x 32
8 x 32 x 1	8 x 4 x 1	4x2x32	1 x 1 x 32
...	...	...	...

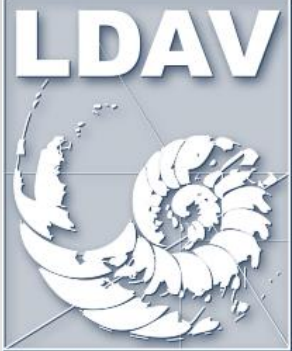
Motivation

Related Work

Contribution

Result

Application



# Warp Shape

Thread block size 256, warp size 32

The Standard Sampling		Warp Marching	
Block Shape	Warp Shape	Block Shape	Warp Shape
32 x 8 x 1	32 x 1 x 1	1x8x32	1 x 1 x 32
16 x 16 x 1	16 x 2 x 1	2x4x32	1 x 1 x 32
8 x 32 x 1	8 x 4 x 1	4x2x32	1 x 1 x 32
...	...	...	...

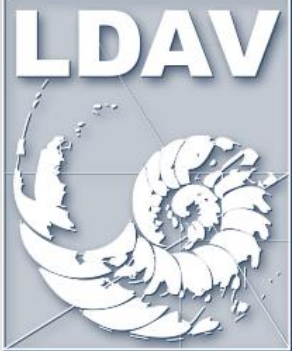
Motivation

Related Work

Contribution

Result

Application



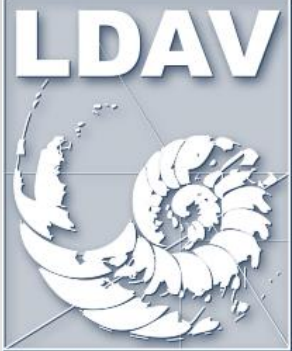
# Warp Shape

Thread block size 256, warp size 32

The Standard Sampling		Warp Marching	
Block Shape	Warp Shape	Block Shape	Warp Shape
32 x 8 x 1	32 x 1 x 1	1x8x32	1 x 1 x 32
16 x 16 x 1	16 x 2 x 1	2x4x32	1 x 1 x 32
8 x 32 x 1	8 x 4 x 1	4x2x32	1 x 1 x 32
...	...	...	...

Combined Approach

Block Shape	Warp Shape
2x16x8	2x2x8
4x16x4	4x2x4
...	...



# Warp Shape

Thread block size 256, warp size 32

1D Warp  
Marching

The Standard Sampling		Warp Marching	
Block Shape	Warp Shape	Block Shape	Warp Shape
32 x 8 x 1	32 x 1 x 1	1x8x32	1 x 1 x 32
16 x 16 x 1	16 x 2 x 1	2x4x32	1 x 1 x 32
8 x 32 x 1	8 x 4 x 1	4x2x32	1 x 1 x 32
...	...	...	...

Diagram showing the transition from standard sampling to a combined approach:

Combined Approach	
Block Shape	Warp Shape
2x16x8	2x2x8
4x16x4	4x2x4
...	...

3D Warp  
Marching

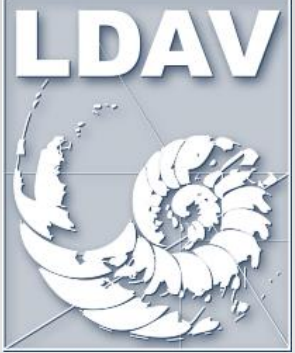
Motivation

Related Work

Contribution

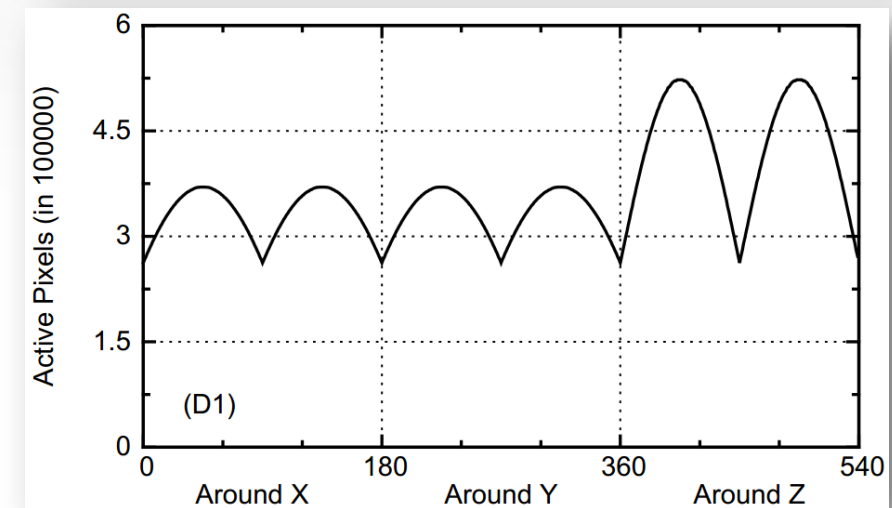
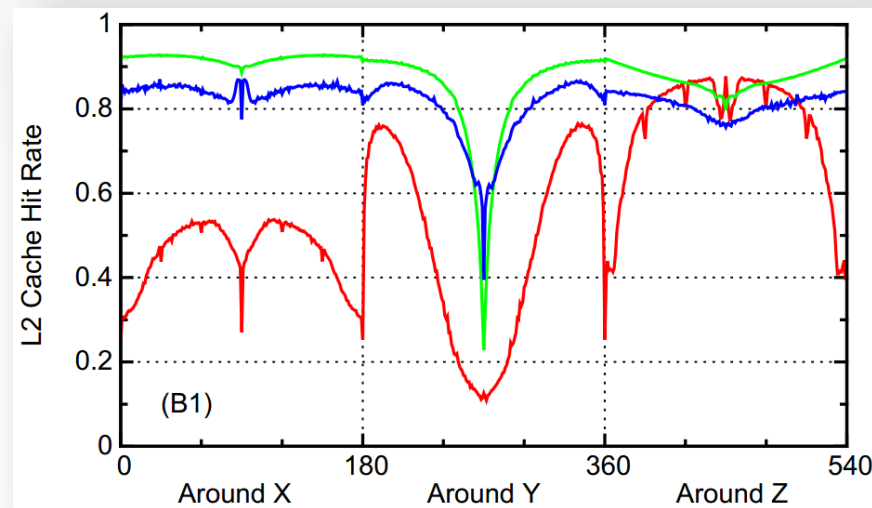
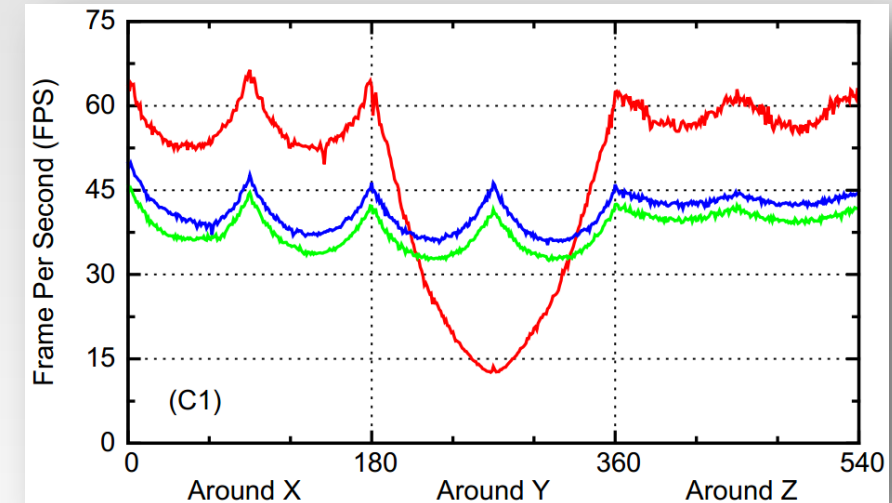
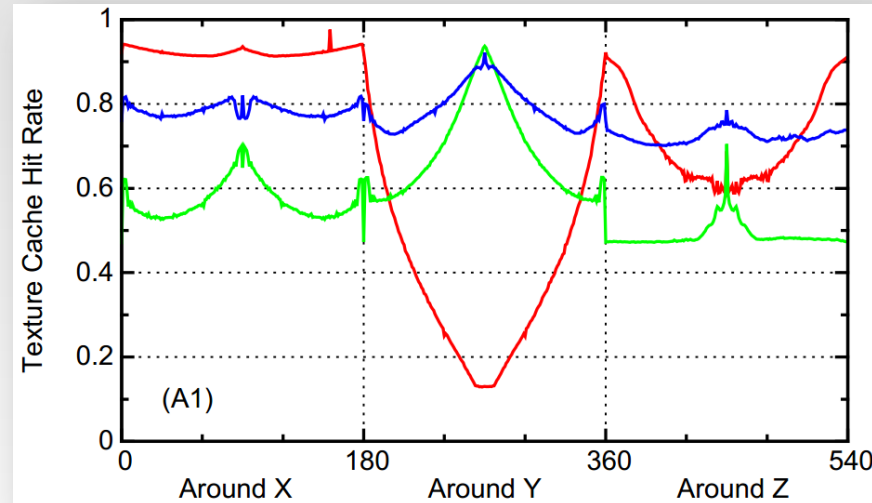
Result

Application



# 3D Warp Marching

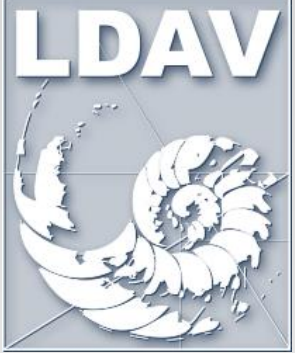
Motivation
Related Work
Contribution
Result
Application



— The Standard    — 1D Warp Marching    — 3D Warp Marching

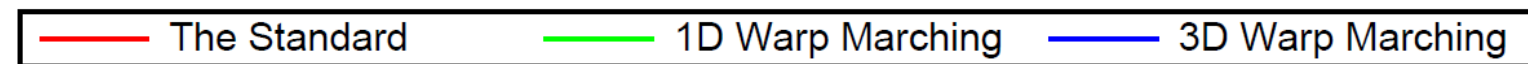
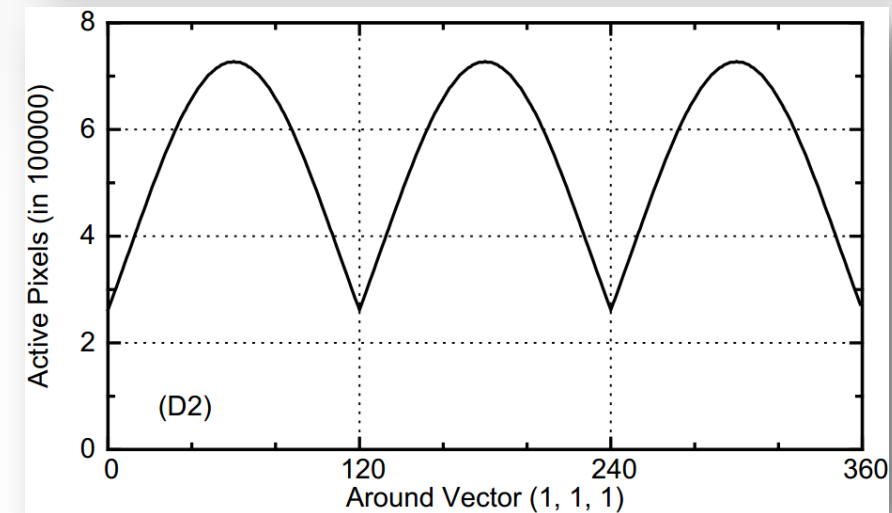
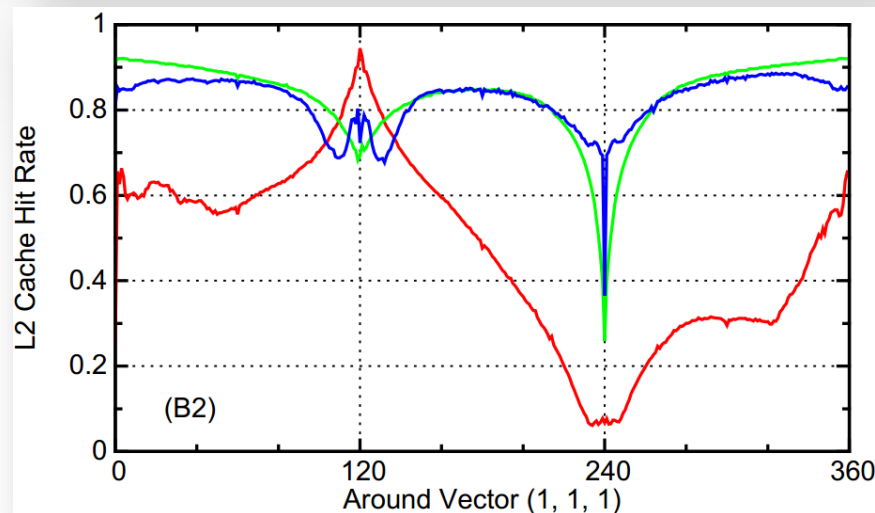
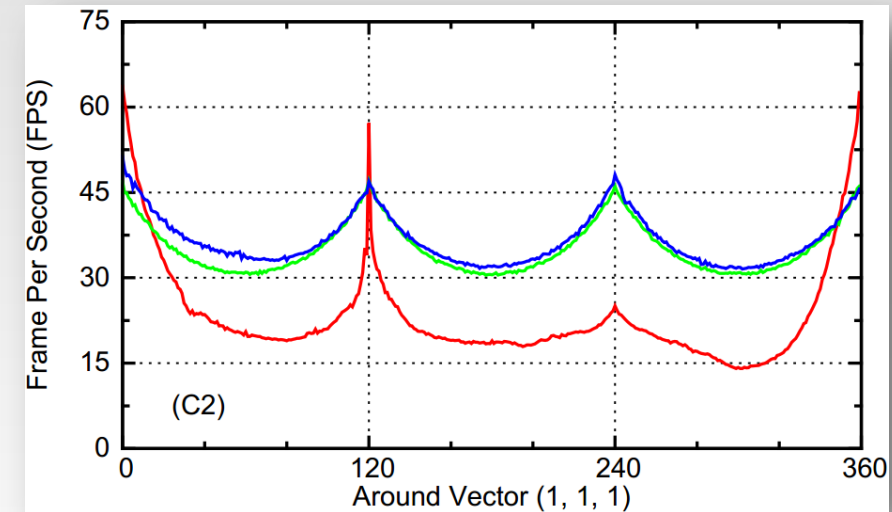
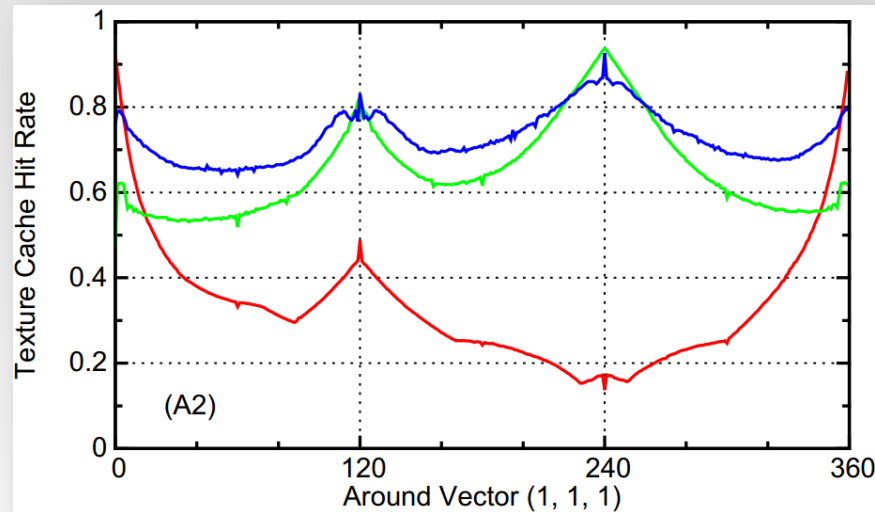
Rotate the volume around X, Y and Z axis 180 degree respectively



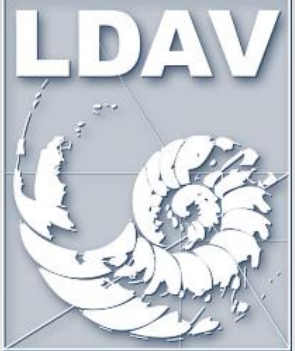


# 3D Warp Marching

Motivation
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Rotate the volume around vector (1,1,1) 360 degree

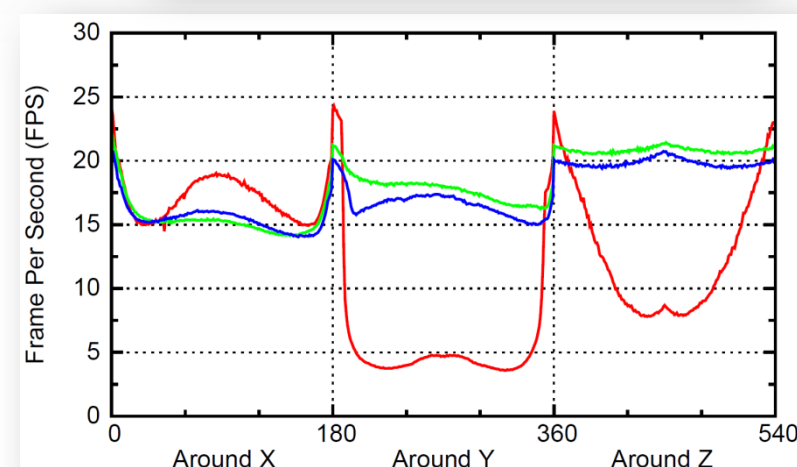
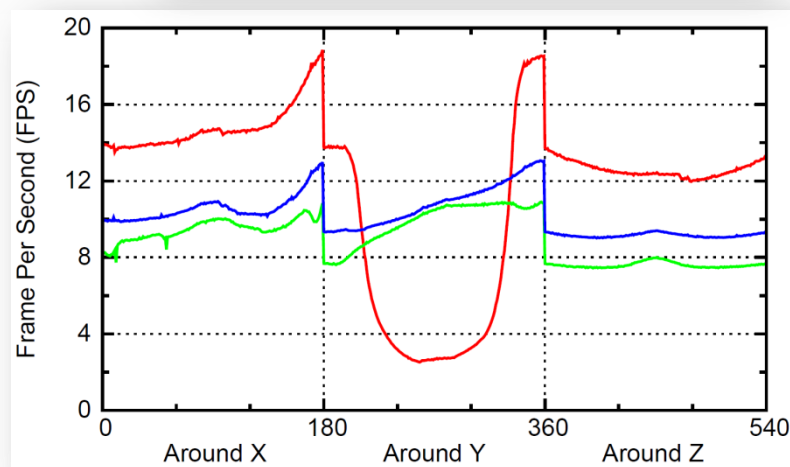
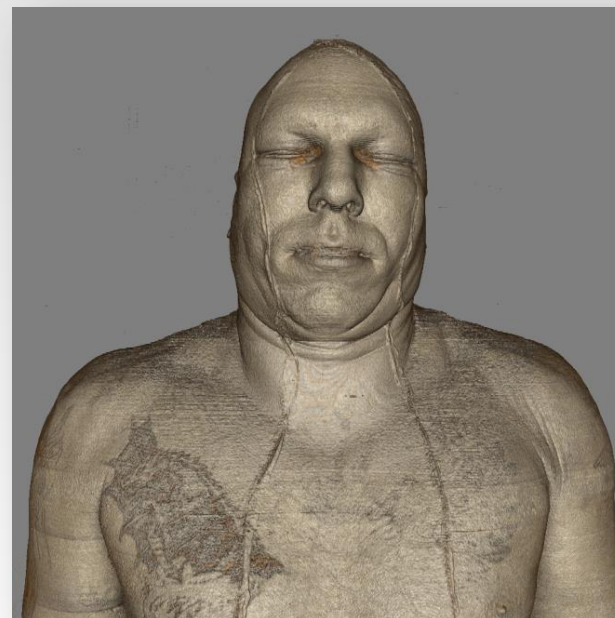


# Application

vhf\_head (8-bit, 2.8GB)

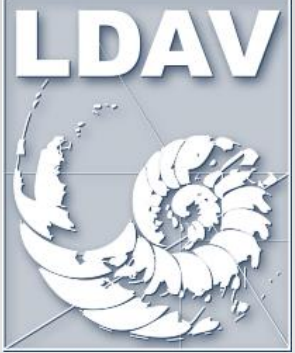


vhm\_body (8-bit, 3.8GB)



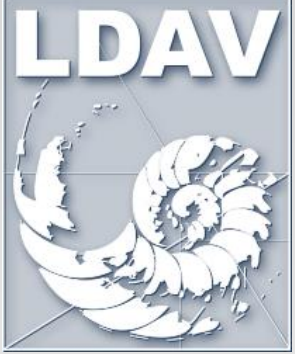
— The Standard — 1D Warp Marching — 3D Warp Marching

[Lum2004]: High-quality lighting and efficient pre-integration for volume rendering.

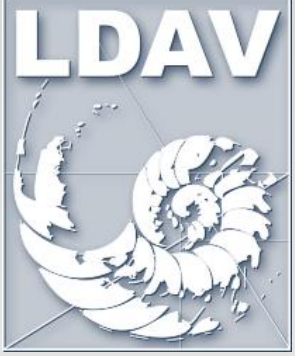


# Conclusion & Future Work

- Conclusion
  - We design a cache-aware sampling strategy, i.e. warp marching, for the ray casting algorithm.
  - The 3D warp marching maintains a roughly constant texture cache hit rate regardless of volume orientation.
- Future Work
  - L2 cache performance
  - Other types of GPUs, varying warp sizes
  - New applications



**Thank you**



# Questions?