

Fast Maximal Poisson-Disk Sampling by Randomized Tiling

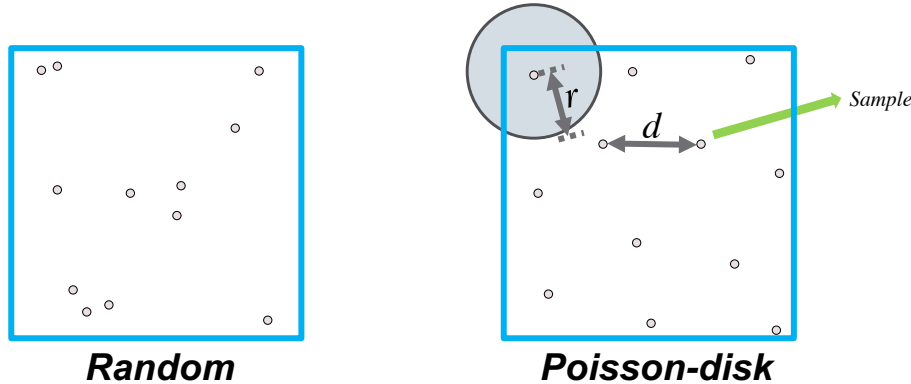
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Maximal Poisson Disk Sampling

Poisson-disk sampling

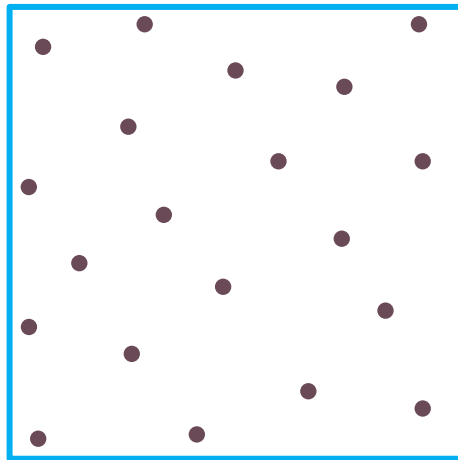
- Definition: Poisson-disk sampling pattern is a group of samples with no two of them within a specified distance r .
 - Considered a good property in many applications.



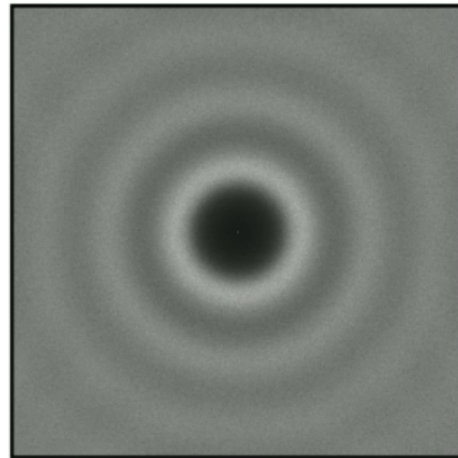
- Essentials in many computer graphics applications.
 - Texture generation, Object placement, Rendering and anti-aliasing, Image stippling, etc.

Blue noise property

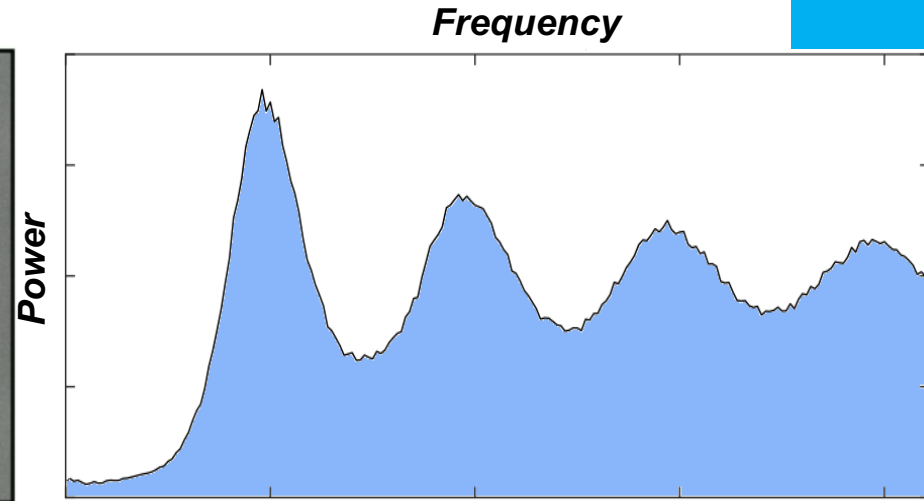
- One reason that Poisson-disk sampling is good for many applications is because of its blue noise spectral properties [1].



Samples



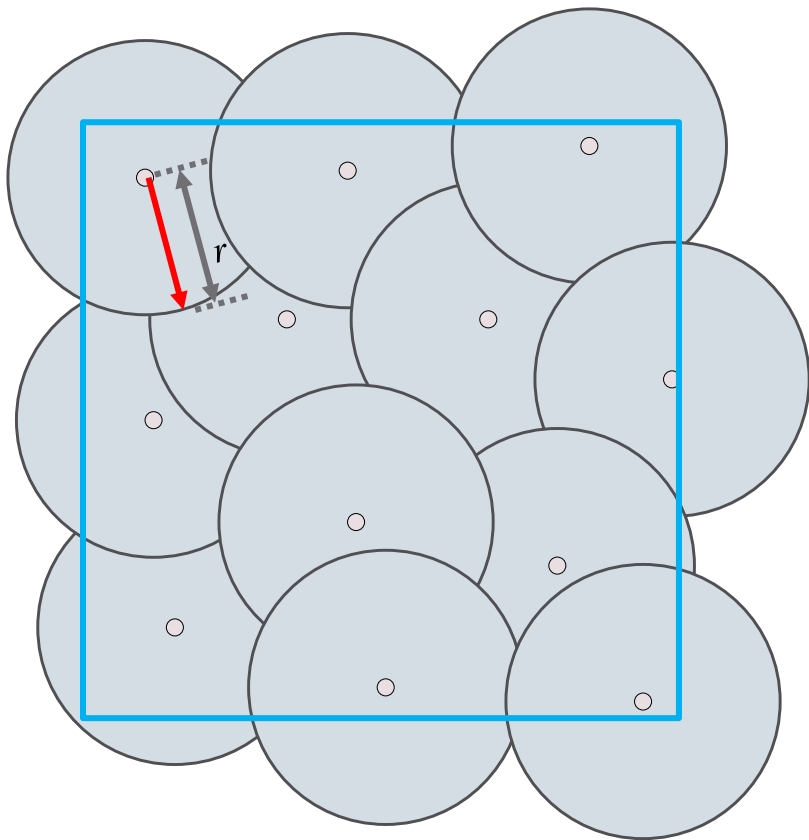
Power Spectrum



Radial Mean

[1] Gamito M N, Maddock S C. Accurate multidimensional Poisson-disk sampling[J]. ACM Transactions on Graphics (TOG), 2009, 29(1): 8.

Maximal Poisson-disk samples (MPS)



- A Poisson-disk sample set is maximal coverage *iff*.

$$G = \{j \in D \mid \forall i \in X, \|i - j\| \geq r\} = \emptyset$$

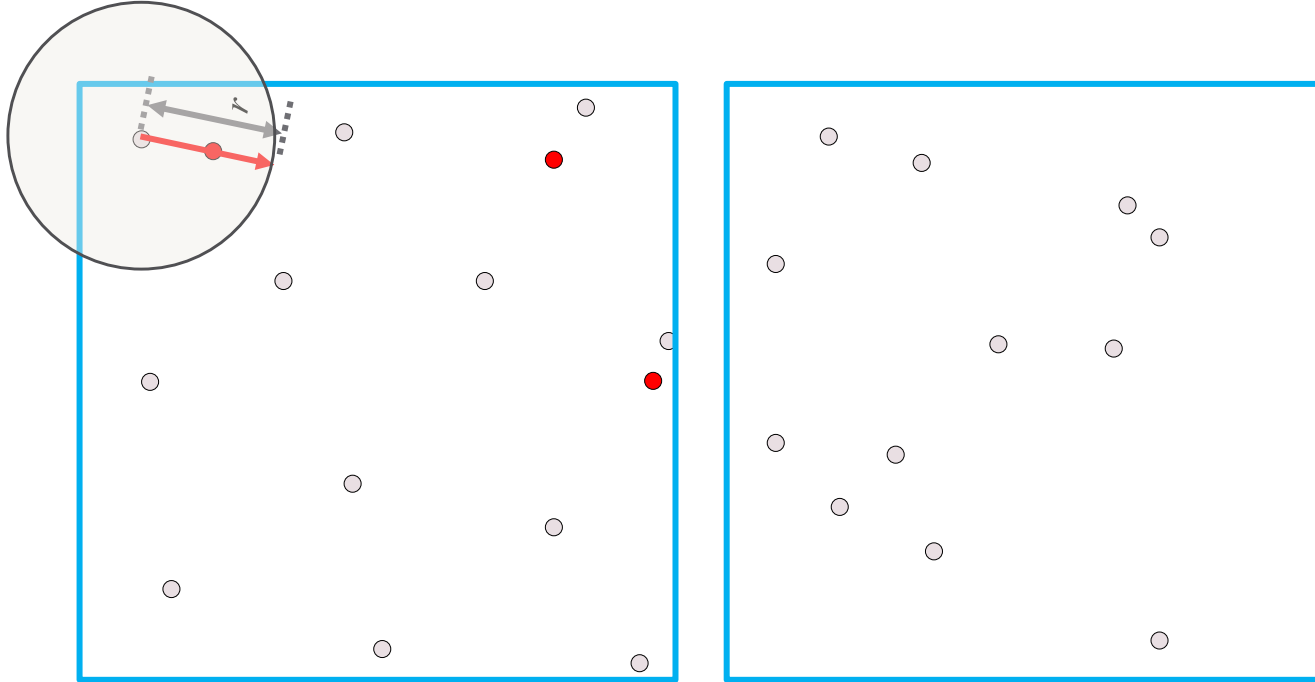
For sample set as X in domain D .

- Guaranteed the quality of samples.
 - No big gaps and clusters.
 - Evenly distributed sampling density.

Generate Poisson-disk samples

- Dart throw

- Relaxation

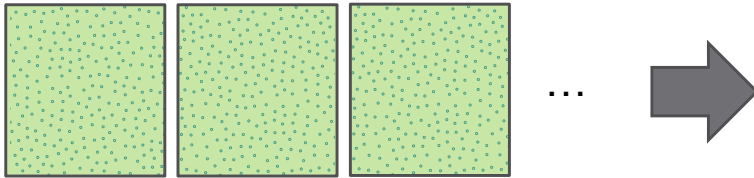


- Often need many iterations to reach maximal coverage.

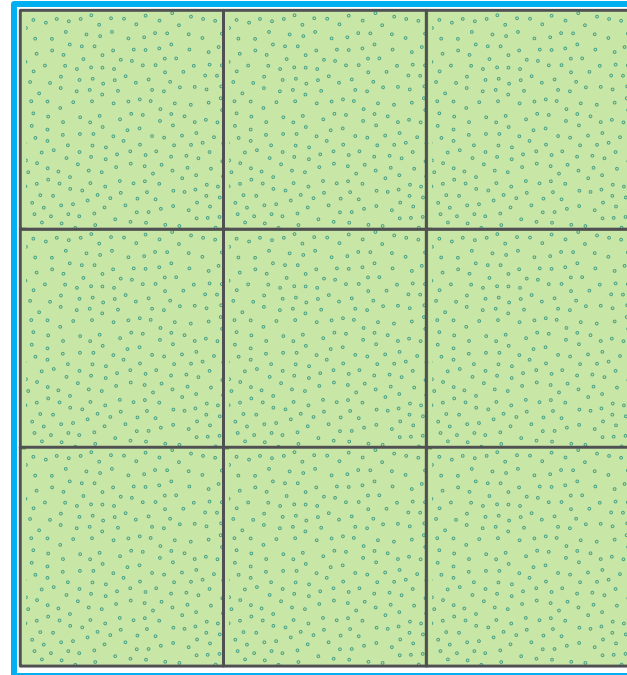
Tile based method

Sample Plane

Tile Set



- Preprocessing.
 - Generate tile set, etc.
- Choose a tile from tile set.
- Tile on the plane.

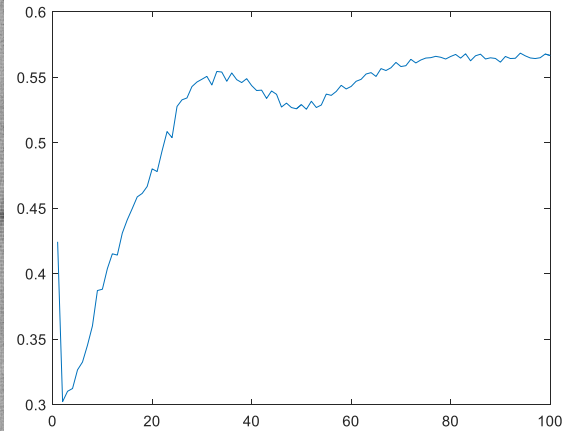
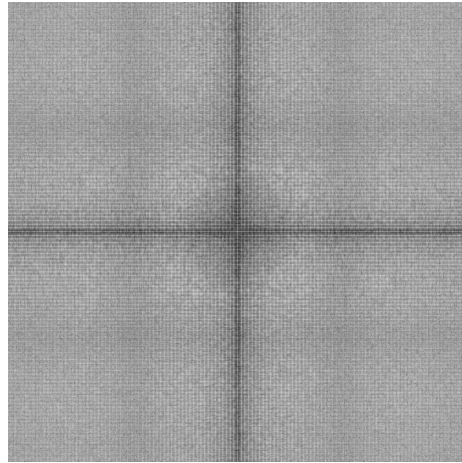
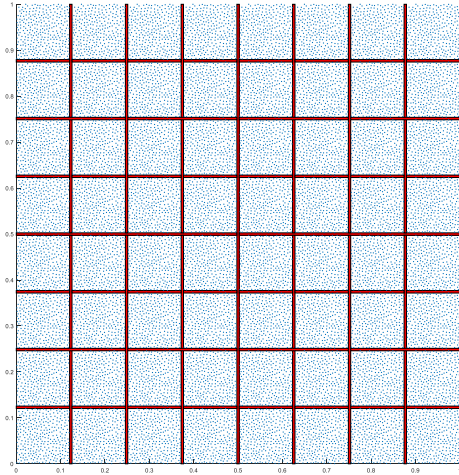


Tile based method

- Extremely fast to fill the sample plane.

But

- Preprocessing takes a long time.
- Regular artifacts are not desirable in many applications.



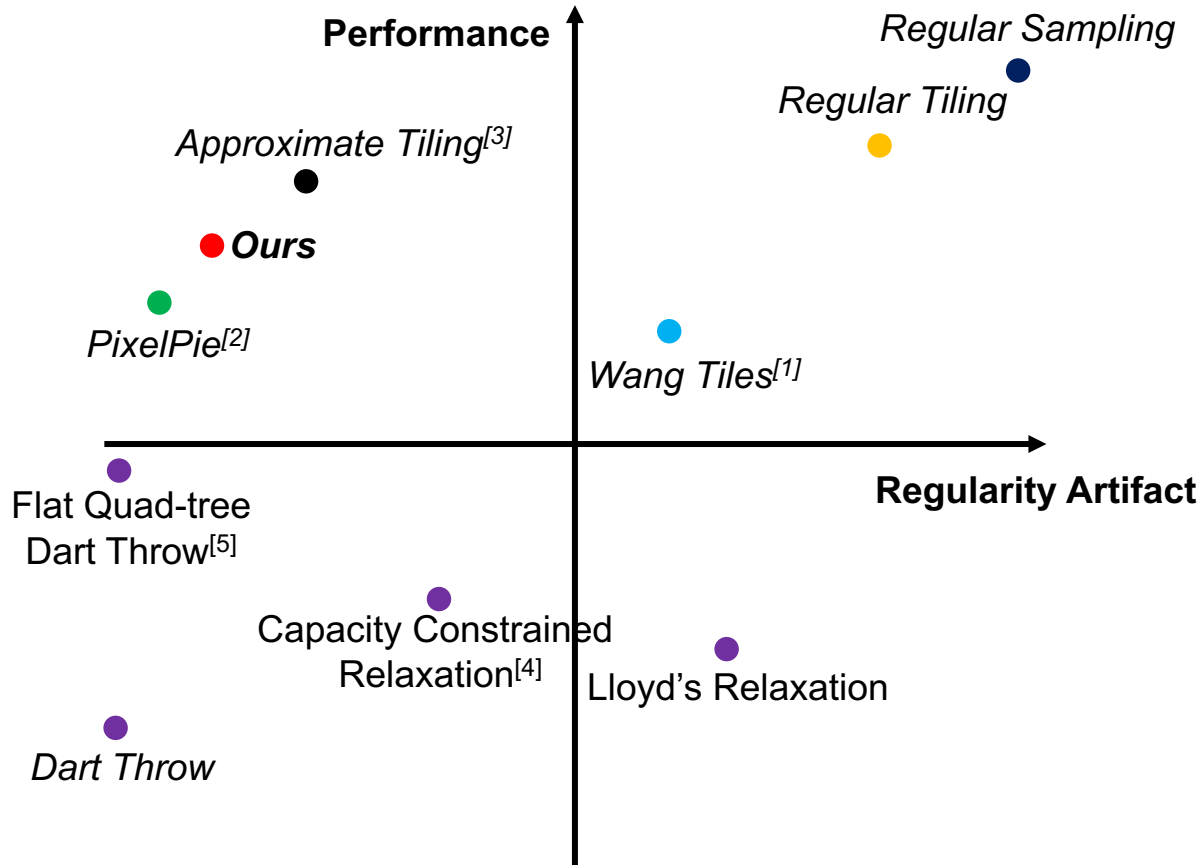
Add more randomness in tiling

- Design the tile sets and tiling techniques: [1][2].
 - Affect preprocessing and tiling performance.
- Transform and rotate tiles to make tiles non-periodic: [3].
 - But [3] didn't deal with sample conflicts, which is not acceptable in many applications.
- Randomly subdivide the space and fetch tiles on-the-fly.
 - Our method.

- [1]. Kopf J, Cohen-Or D, Deussen O, et al. Recursive Wang tiles for real-time blue noise[M]. ACM, 2006.
- [2]. Wachtel F, Pilleboue A, Coeurjolly D, et al. Fast tile-based adaptive sampling with user-specified Fourier spectra[J]. ACM Transactions on Graphics (TOG), 2014, 33(4): 56.
- [3]. Kalantari N K, Sen P. Fast generation of approximate blue noise point sets[C]//Computer Graphics Forum. Blackwell Publishing Ltd, 2012, 31(4): 1529-1535. Transactions on Graphics (TOG), 2012, 31(6): 171.

Performance and Regularity

- For Poisson-disk sample generation:



- [1]. [Kopf J, Cohen-Or D, Deussen O, et al. Recursive Wang tiles for real-time blue noise[M]. ACM, 2006.
- [2]. Ip C Y, Yalçın M A, Luebke D, et al. PixelPie: Maximal poisson-disk sampling with rasterization[C]//Proceedings of the 5th High-Performance Graphics Conference. ACM, 2013: 17-26.
- [3]. Kalantari N K, Sen P. Fast generation of approximate blue noise point sets[C]//Computer Graphics Forum. Blackwell Publishing Ltd, 2012, 31(4): 1529-1535. Transactions on Graphics (TOG), 2012, 31(6): 171.
- [4]. Balzer M, Schlömer T, Deussen O. Capacity-constrained point distributions: a variant of Lloyd's method[M]. ACM, 2009.
- [5]. Ebeida M S, Mitchell S A, Patney A, et al. A Simple Algorithm for Maximal Poisson-Disk Sampling in High Dimensions[C]//Computer Graphics Forum. Blackwell Publishing Ltd, 2012, 31(2pt4): 785-794.

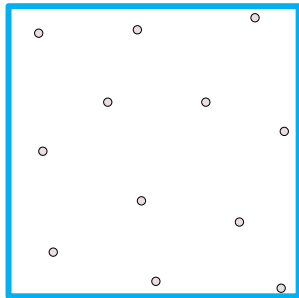
Our algorithm

Algorithm Outline

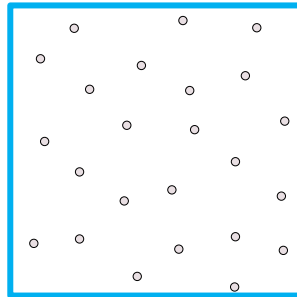
- Prepare a pre-generated MPS pattern.
- KD-tree based randomized tiling (KDRT) is divide-and-conquer based.
 - Divide: Subdivide the sampling plane using KD-tree.
 - Each leaf node square (2d case) is called a building block of the entire sampling plane.
 - Tile: Fill each building block with points clipped from a pre-generated MPS pattern.
 - Conquer: Eliminate conflicts on the edge, and insert new samples in the gap to ensure maximal coverage property.
- Divide and clipping from MPS pattern are randomized, no regular artifacts.
- Conquering process is determined and easy to convergence.

Prepare pre-generated pattern

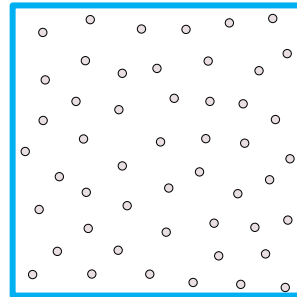
- Use any unbiased Poisson-disk sampling method to generate a pattern.
 - Here we use algorithm described in [1] to generate a pattern.
- Define a scale factor *ratio* as how many times samples that the final sampling plane contains compared with the pattern.
 - The final sample set size is controlled by manipulate this parameter.



Pattern

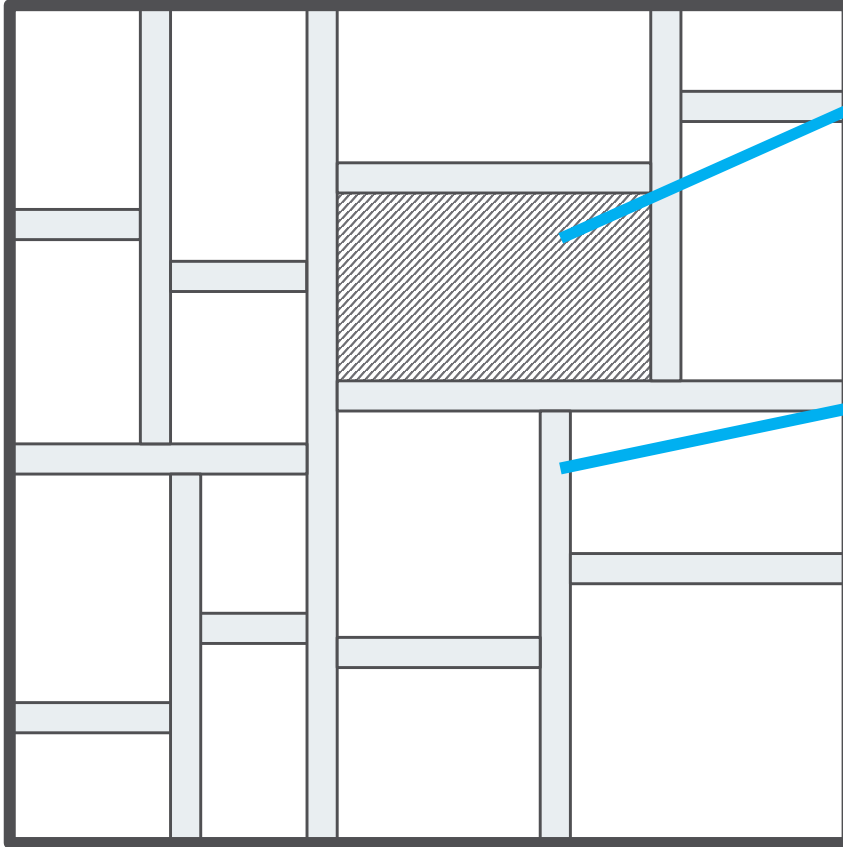


***Result
Ratio=2***



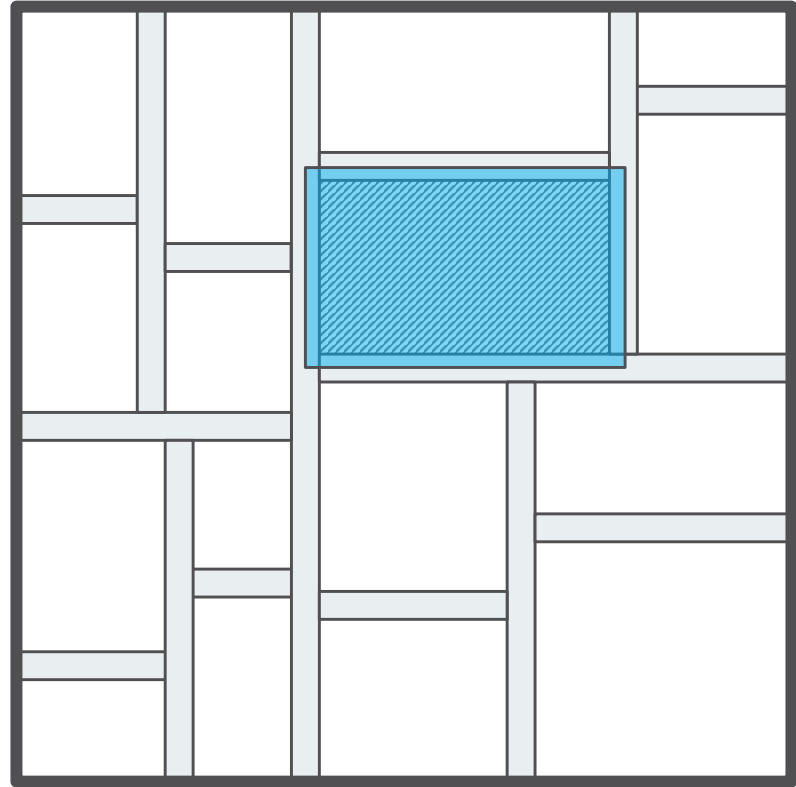
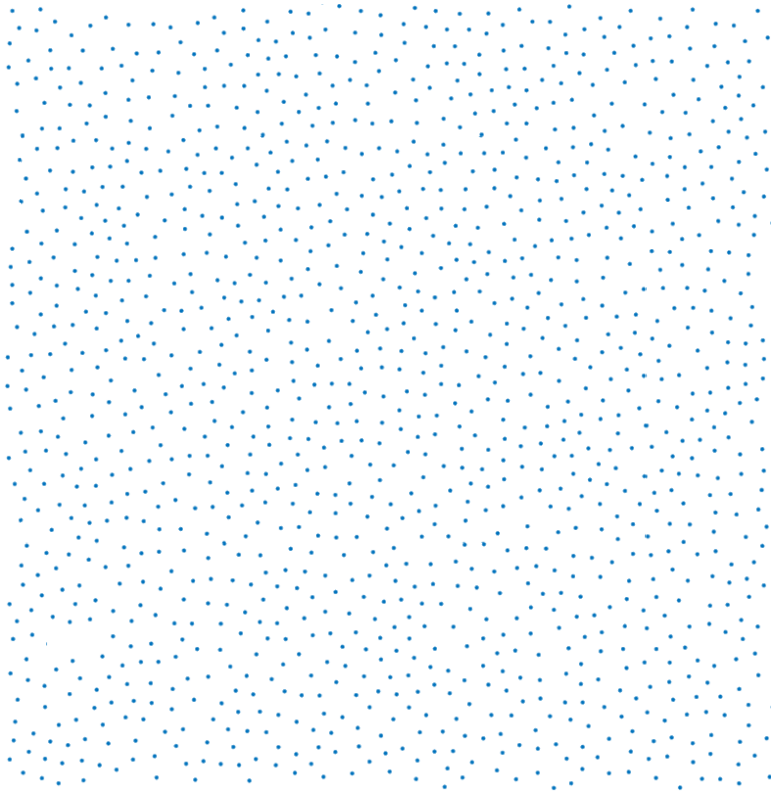
***Result
Ratio=4***

Divide: Subdivide the sampling plane



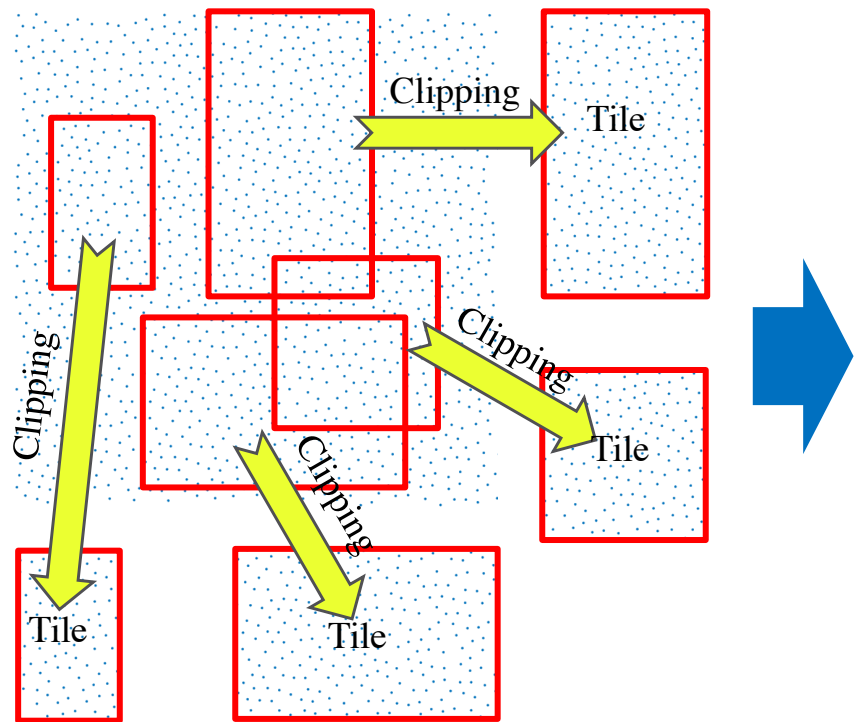
- Building blocks of the sampling plane.
- Conflict area that will be processed in conquering.

Tiling: Filling building block with samples



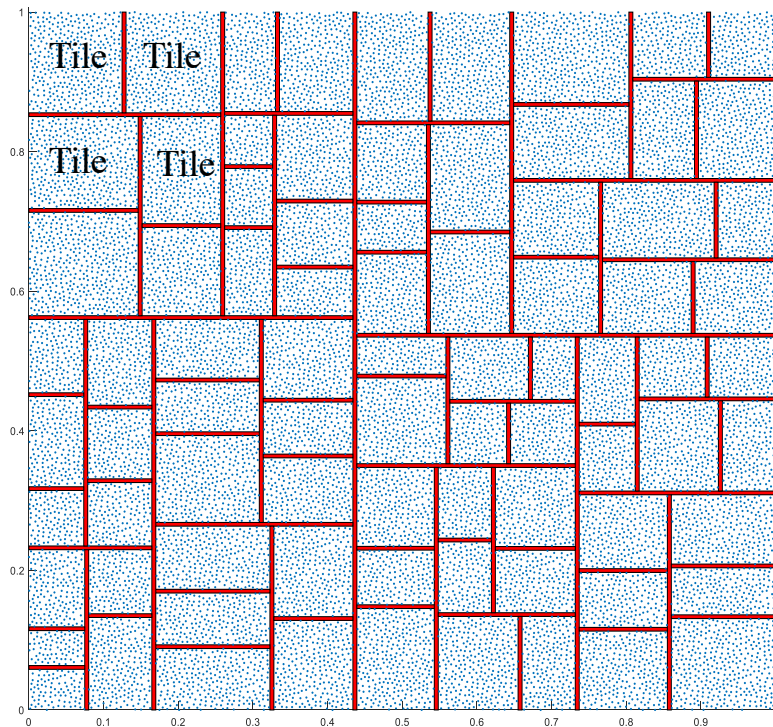
Tiling: Filling building block with samples

MPS Pattern



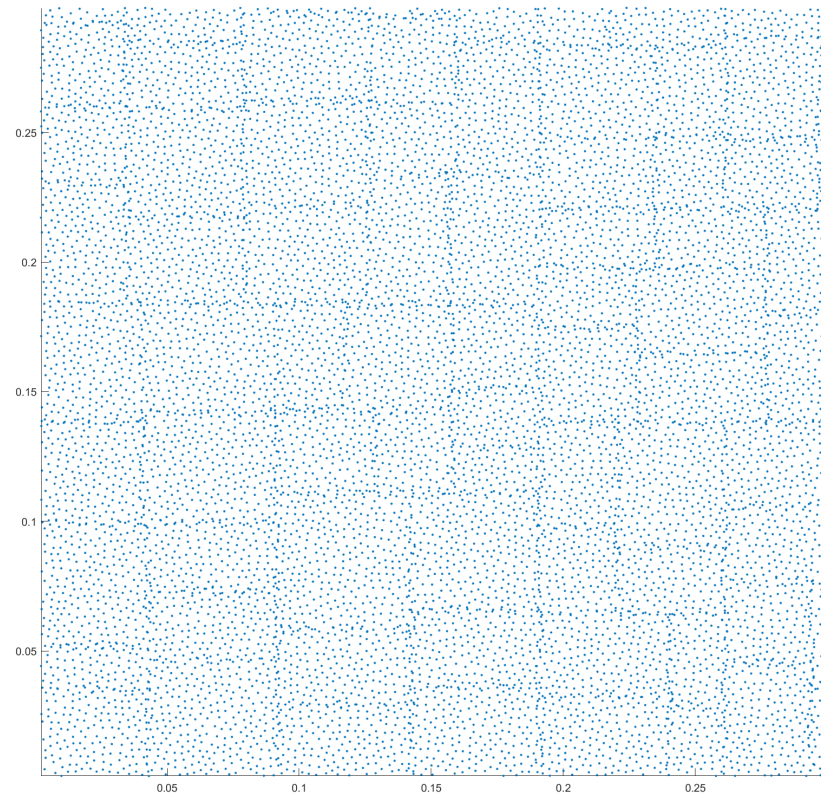
(a)

Tiled Sampling Domain

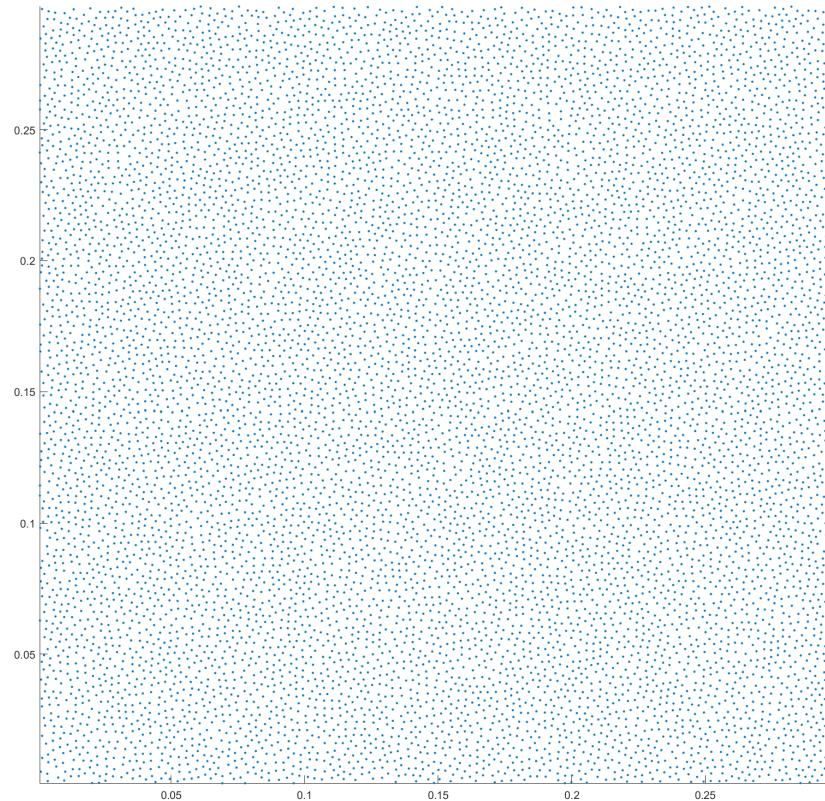


(b)

Tiling: Filling building block with samples

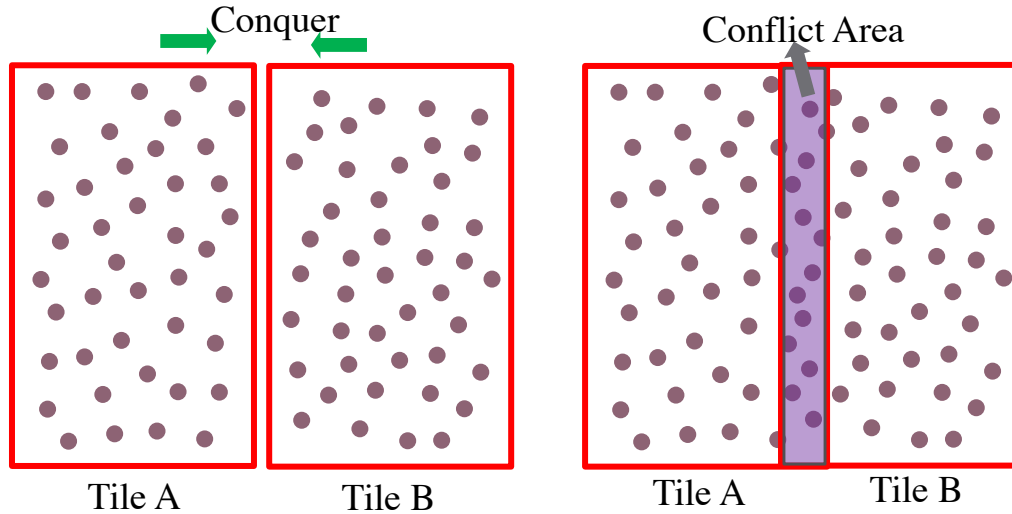


(a)

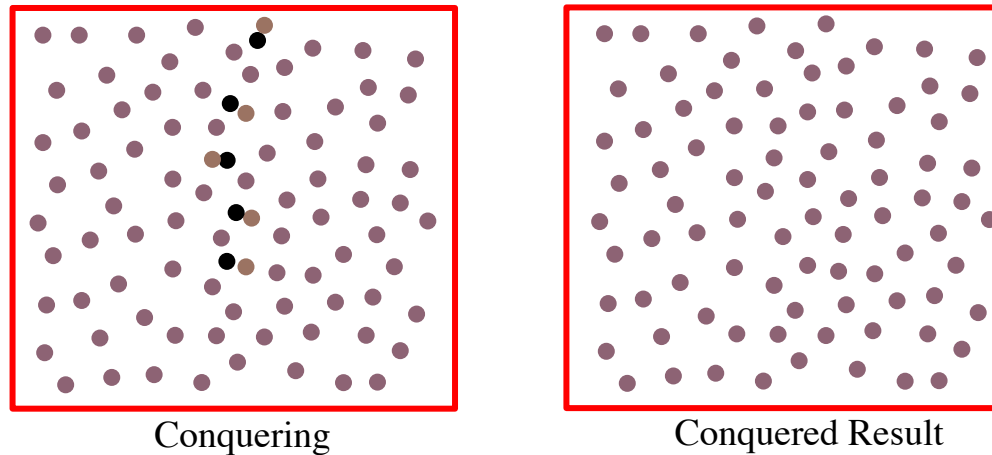


(b)

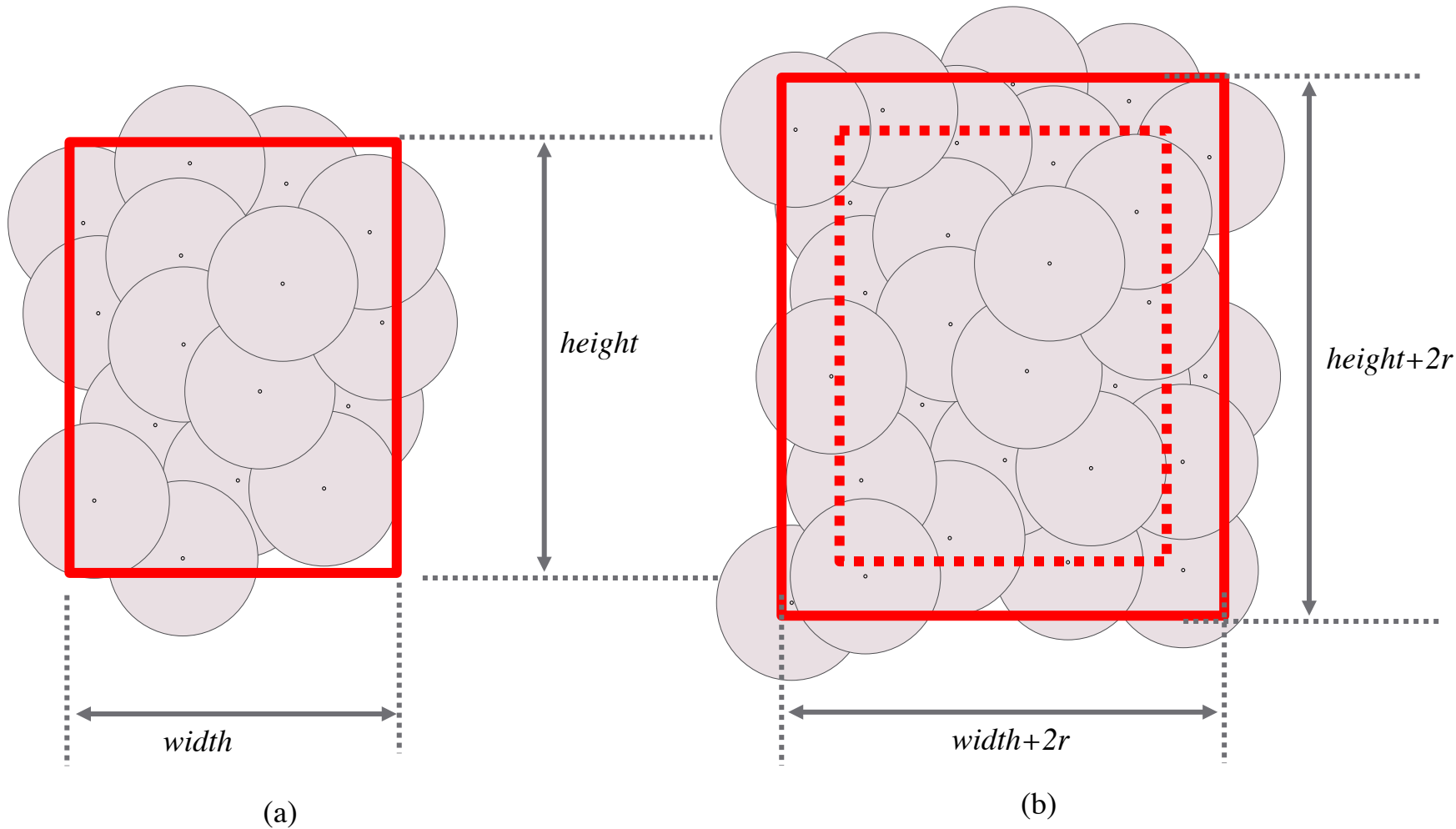
Conquering: Outline



●: Eliminated ●: Inserted

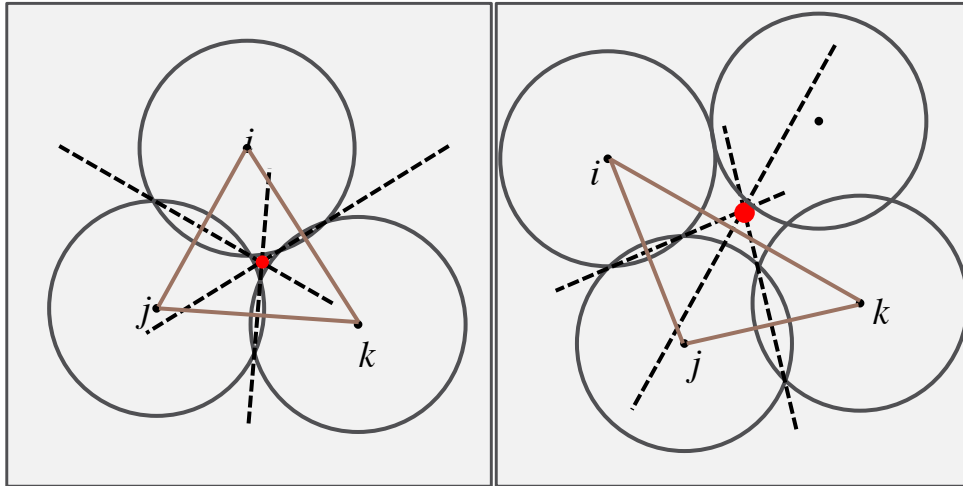


Conquering: Necessary Redundant

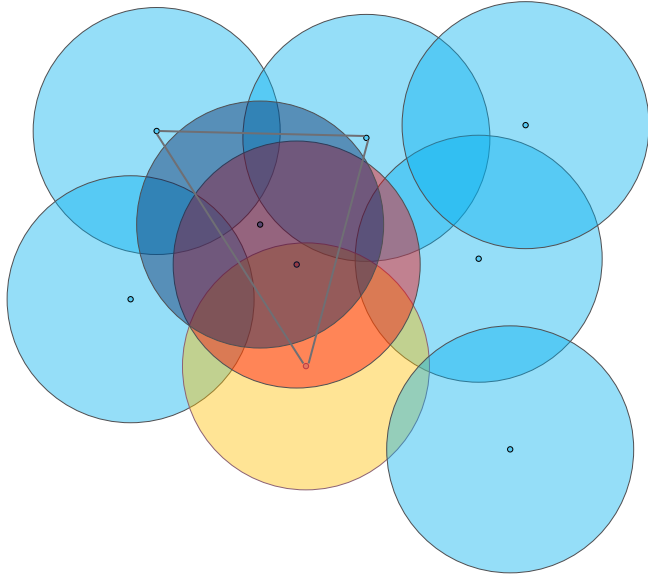


Conquering: Gap detection

- Gap detection^[1]: A gap exist among three disks centered at i, j, k ($i, j, k \in \mathbb{C}$), if the circumcenter c of the triangle i, j, k is not covered by any disks.



Conquering: Elimination



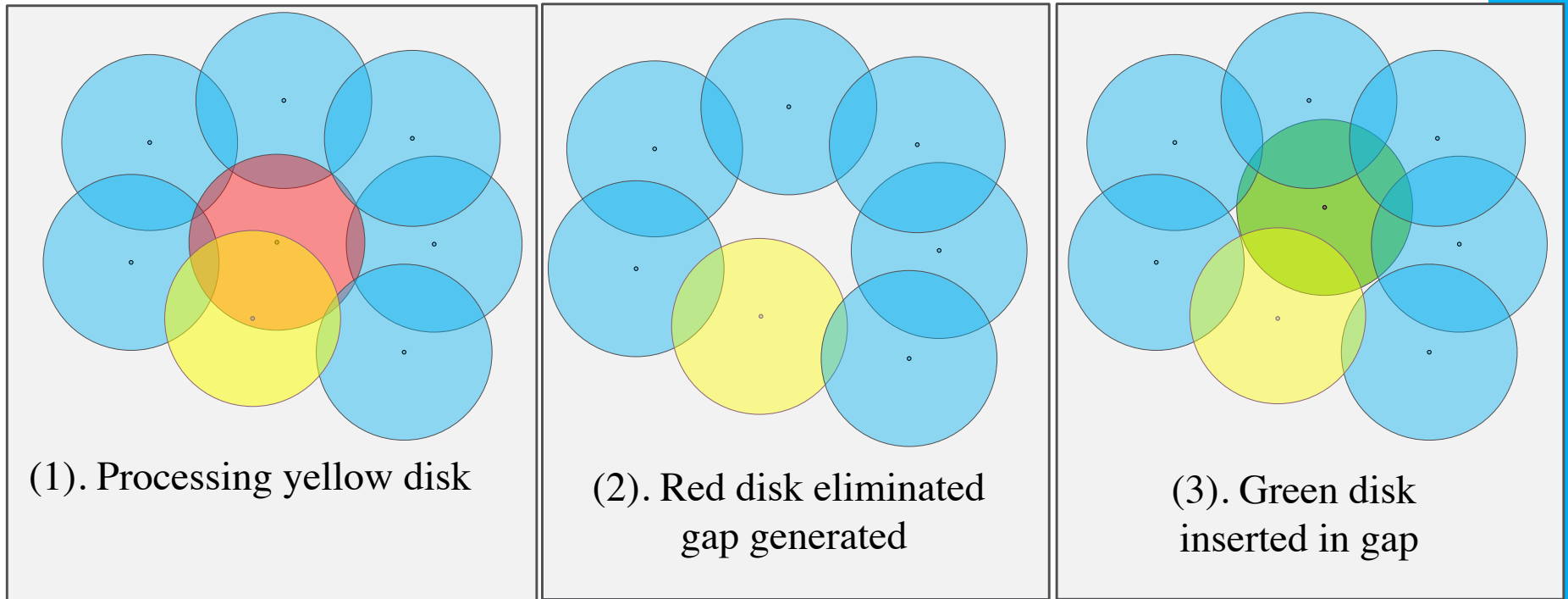
- Processing yellow point.
- Eliminate red point to avoid conflicts.
- Insert blue point to ensure maximal coverage.

Algorithm 3: Pseudocode of Gap Detection and Insertion

```
1 Function GapDetectionAndInsertion(TestBuffer,i,C);  
   Input : Sample Point  $i$ , TestBuffer,  $C$   
   Output:  $C$  with conflicts removed and new samples inserted  
2 forall every two samples  $m, n$  in TestBuffer do  
3   |  $center \leftarrow$  Circumcenter( $i, m, n$ );  
4   | if center in a gap then  
5   |   | Insert( $center, C$ );  
6   | else  
7   |   | continue;  
8   | end  
9 end
```

Conquering: Insertion

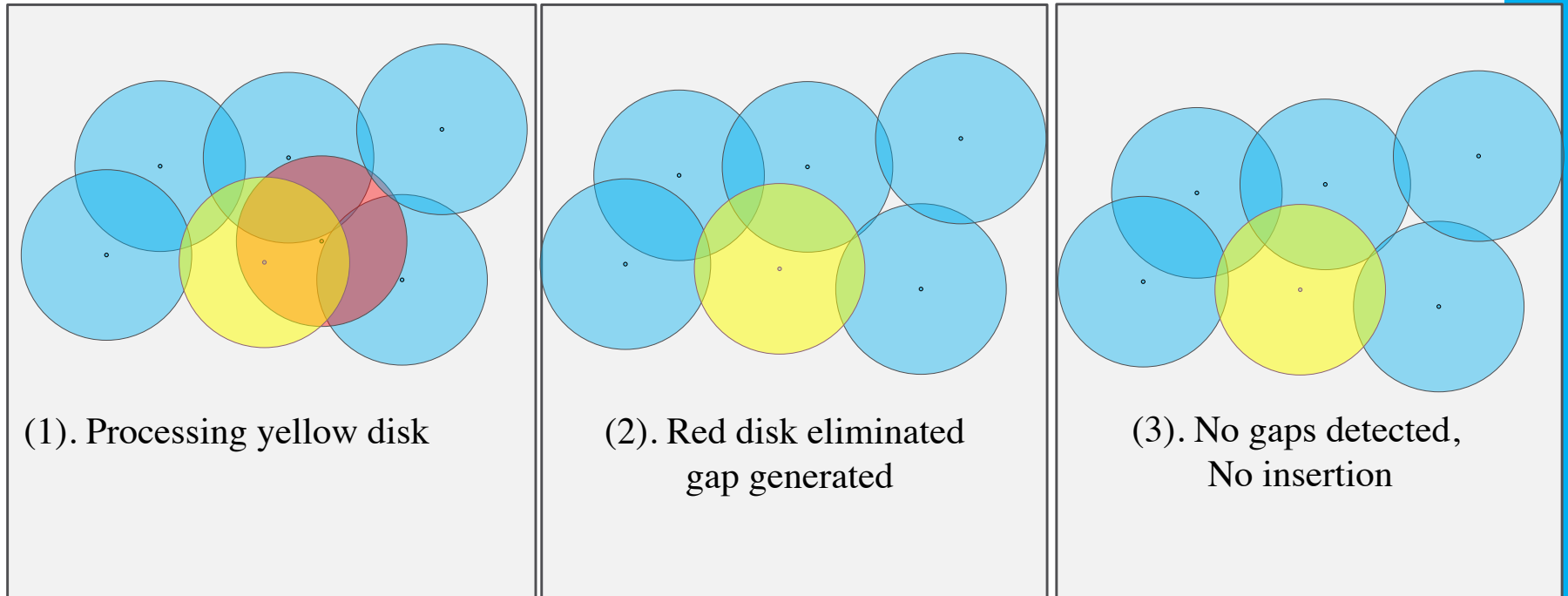
- Notice that there are circumstances that if GapDetectionAndInsertion being applied on all sample points $p \in C$, it is not guaranteed that all gaps could be covered.



(a) Gaps that cannot be covered by single insertion

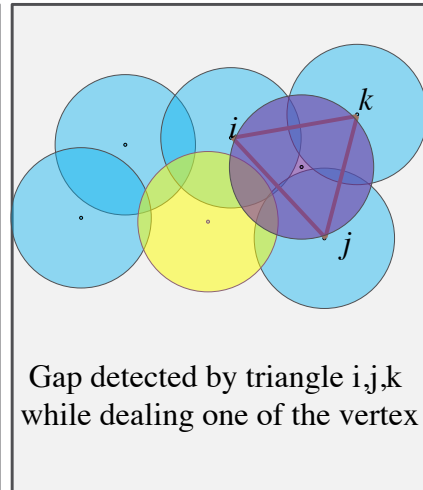
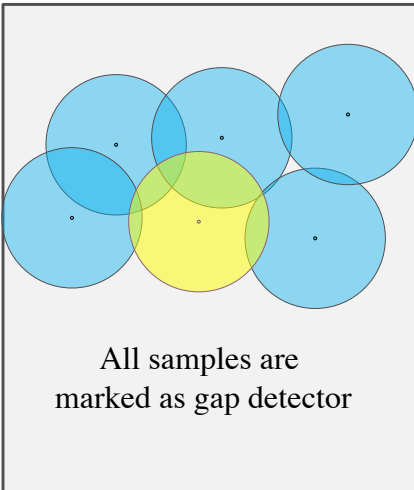
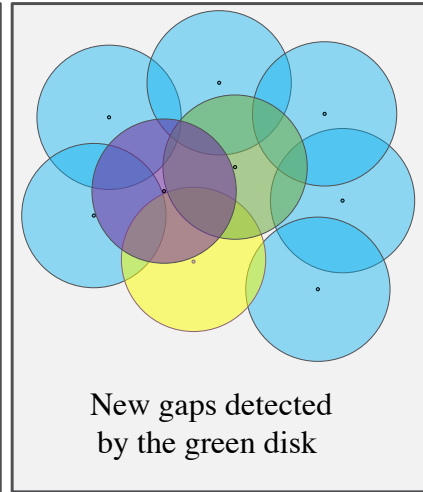
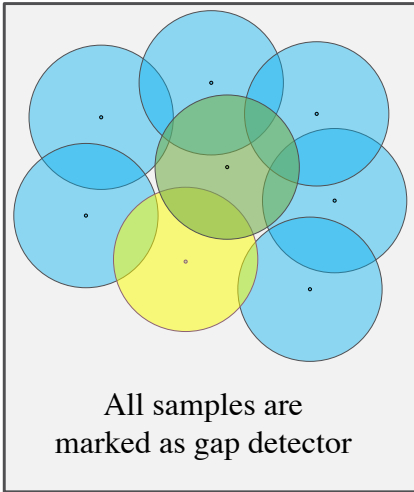
Conquering: Insertion

- Notice that there are circumstances that if GapDetectionAndInsertion being applied on all sample points $p \in C$, it is not guaranteed that all gaps could be covered.



(b) Gaps that cannot be detected by current processing sample

Conquering: Insertion



Algorithm 4: Pseudocode of Gap Detection and Insertion

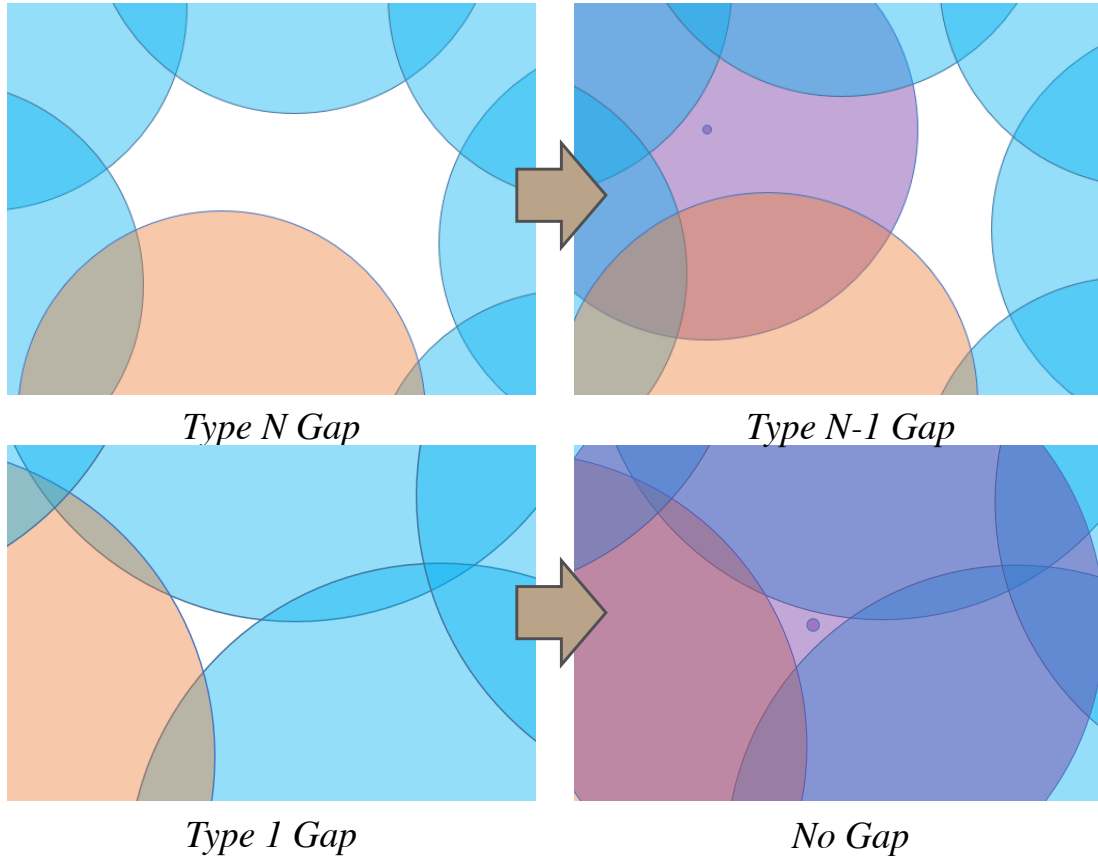
```

1 Function EliminateAndInsert  $C$ ;
   Input : Clipping and Tiling result  $C$ 
   Output: Maximal Poisson Disk Sample Set  $\mathcal{S}$ 
2 forall Sample  $p$  in conflict area of  $C$  do
3   Mark  $p$  as GapDetector;
4   ConflictBuffer  $\leftarrow$  RadiusSearch( $p, r$ );
5   forall conflictPoint in ConflictBuffer do
6     Eliminate conflictPoint from  $C$ ;
7     TestBuffer  $\leftarrow$  RadiusSearch(conflictPoint,  $2r$ );
8     Mark all samples in TestBuffer as GapDetector;
9     GapDetectionAndInsertion(TestBuffer,  $p, C$ );
10  end
11 end
12 Mark all inserted samples as GapDetector;
13 while True do
14   GapDetectorArray  $\leftarrow$  StreamCompaction( $C$ ,
     isGapDetector());
15   forall Sample  $p$  in GapDetectorArray do
16     TestBuffer  $\leftarrow$  RadiusSearch(conflictPoint,  $4r$ );
17     GapDetectionAndInsertion(TestBuffer,  $p, C$ );
18     Mark all inserted samples as GapDetector
19   end
20   if No new sample point inserted then
21     break;
22   else
23     continue;
24   end
25 end

```

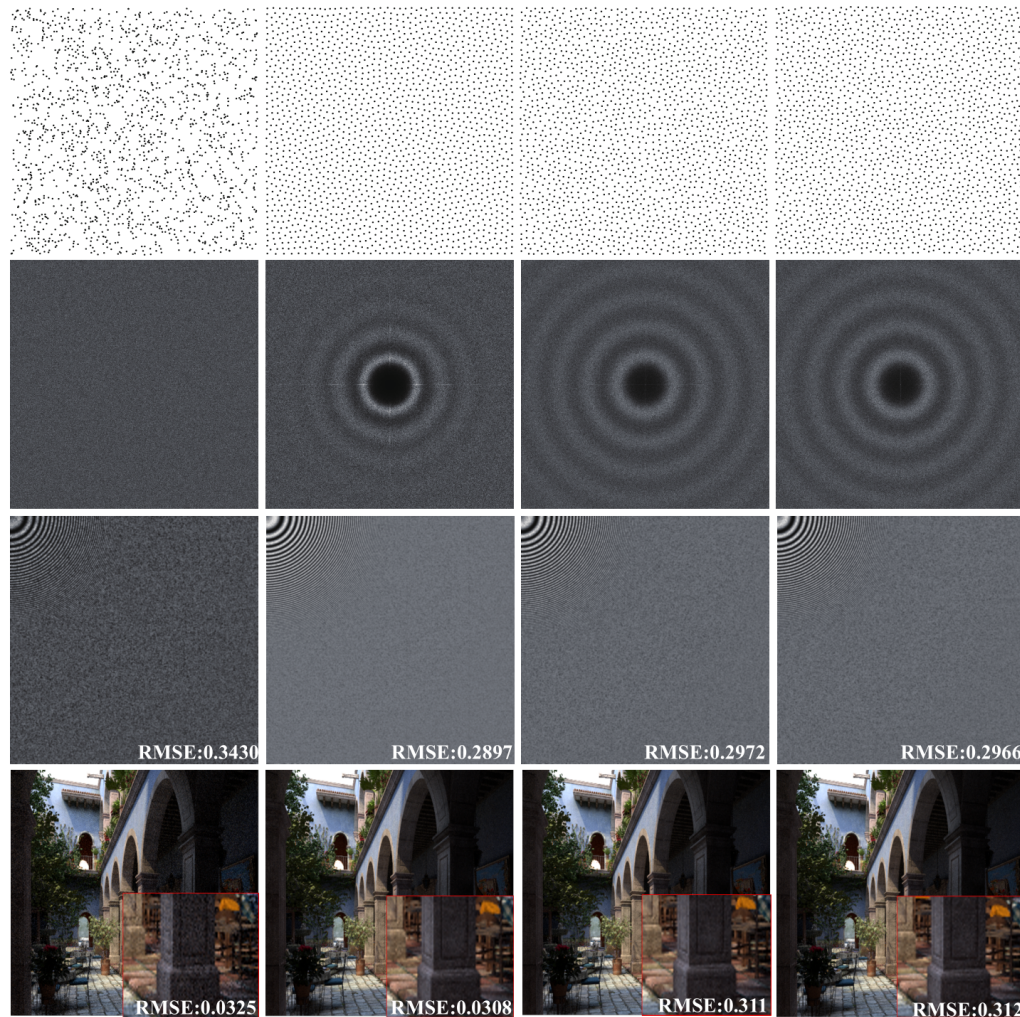
Conquering: Insertion

- All gaps can be detected this way.



Results

Results



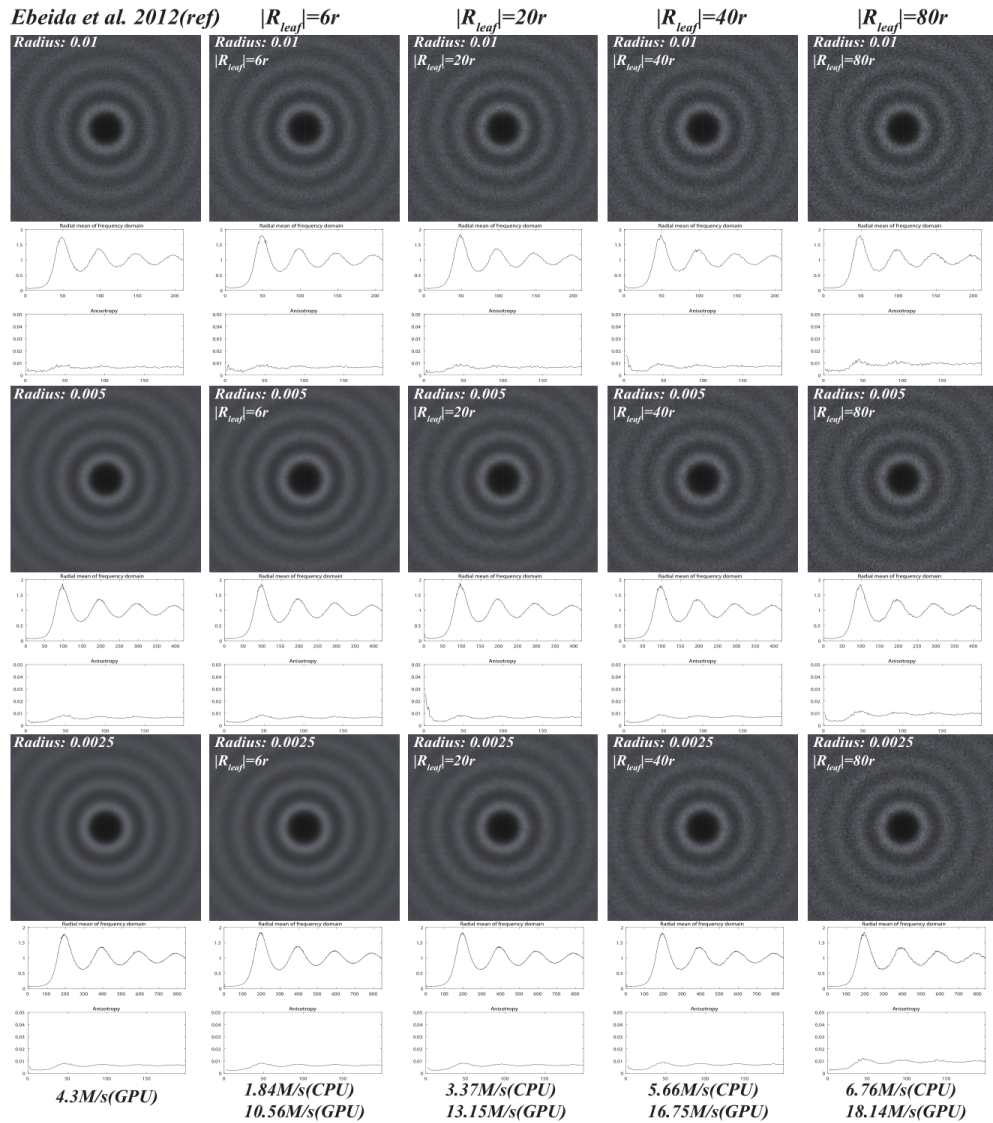
Uniform

De Goes et al, 2012
~20K/s

Ebeida et al. 2012
~4M/s

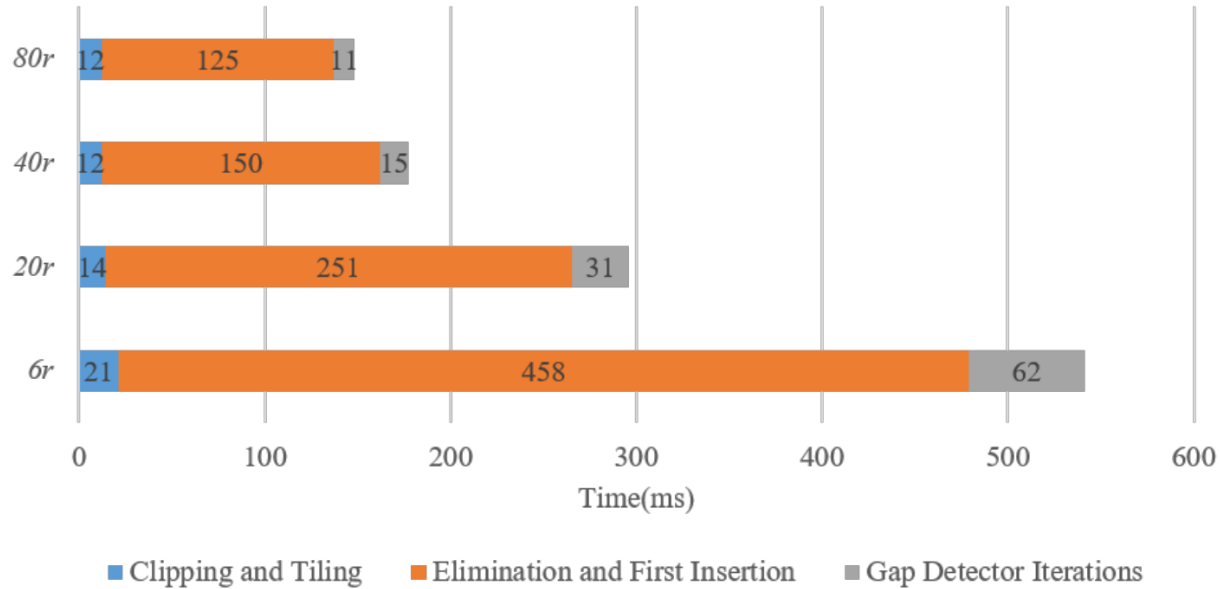
Ours
~16M/s

Results



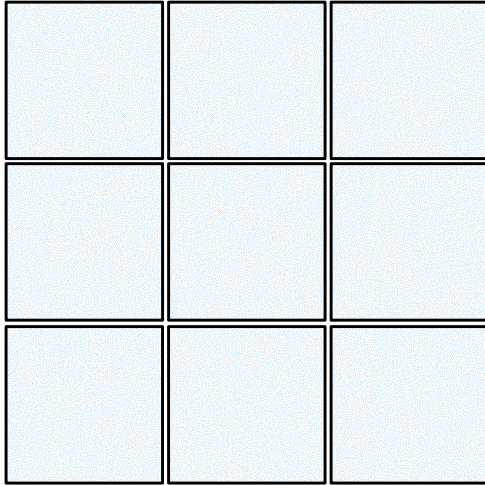
Results

Time taken by each procedure to generate 1 million samples.

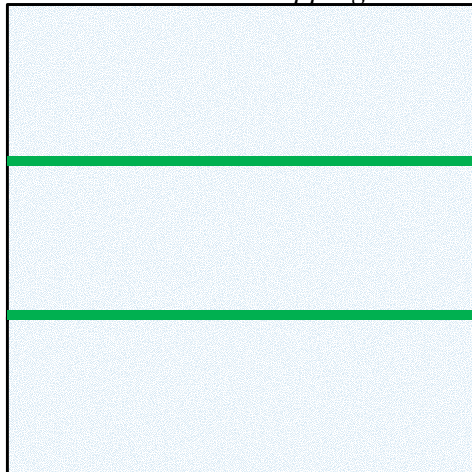


Combining MPS sample sets

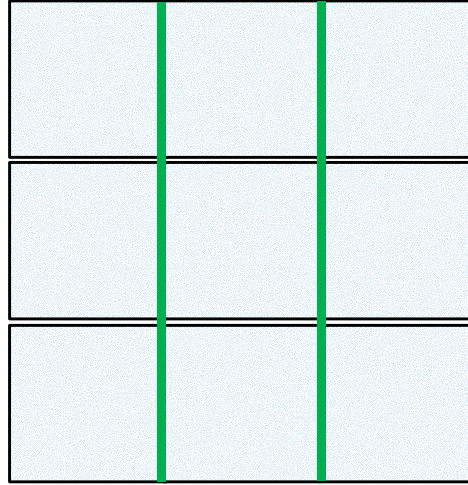
9 MPS set each 1017625 samples



Horizontal Zipping



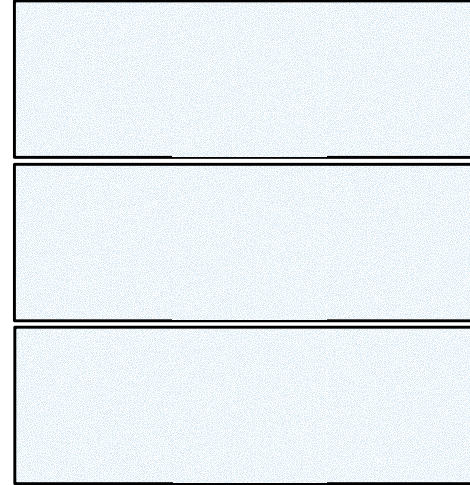
Vertical Zipping



Result with 8795941 samples



Vertical Zipping Result
3 MPS set each 2991817 samples



Combining Size

CPU Time (ms)

3751372

85

4689216

102

5861520

144

7326900

158

9158625

202

Conclusion

- KDST is a tile based method that can generate maximal Poisson-disk samples.
- KDST is a divide and conquer method, including:
 - Divide: Randomly divide the sample plane into building blocks.
 - Tiling: Fill the building blocks with samples clipped from a pre-generated pattern.
 - Conquer: Eliminate conflict points and insert new points in the gap.
- Conquering step can be used to combine MPS sample sets together to form a larger one.
- KDST performs fast on CPU and GPU, and is very easy to implement.

Thank you!

- Thanks for all reviewers for your constructive comments.
- Special thanks to Anjul Patney for his efforts to help the author to get the U.S. visa.