# Plane-probing algorithms for the analysis of digital surfaces

#### Tristan Roussillon

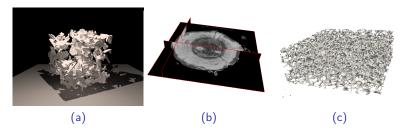
Université de Lyon, INSA Lyon, LIRIS, France

DGDVC, 30/03/2021



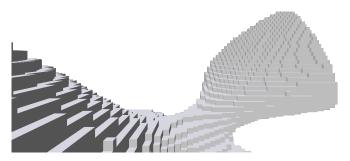
PARADIS (ANR-18-CE23-0007-01) research grant

## Data



voxel sets in 3d digital images

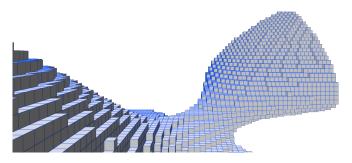
# Digital surfaces



## pros/cons

- + efficient spatial data structures
- + set operations (union, intersection, ...)
- + integer-only, exact computations
- + ...
- poor geometry

# Digital surfaces

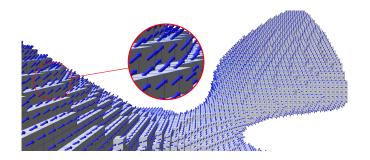


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## Analysis of digital surfaces

- enhance the geometry by estimating normal vectors
- $\Rightarrow$  applications: measurements, deformation for simulation or tracking, surface fairing, rendering...



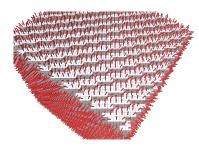
## A lot of methods

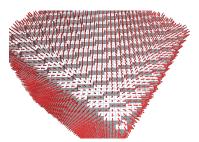
- ▶ fitting,
- ▶ Voronoi diagram,
- ▶ integral invariants,
- convolution,
- energy minimization,
- probabilistic approaches,
- **.**..

#### Flaw

## Existing methods are not quite satisfactory

- ightharpoonup parameter required ( $\approx$  width of a neighborhood)
- ▶ that parameter is hard to pick
  - get decent estimates in flat/smooth parts
  - preserve sharp features





# Challenge

#### Desiderata

- parameter-free method
- theoretical guarantees
  - exact on flat parts
  - converge on smooth parts as resolution increases

## Key idea

- bound neighborhoods by their thickness instead of their width
- digitized planes have a thickness bounded by a small constant

## Plane-probing algorithms

#### Definition

Given a digitized plane P and a starting point  $p \in P$ , a plane-probing algorithm computes the normal vector of P by sparsely probing it with the predicate "is  $x \in P$ ?".

H and R



[LPR2017] J-O. L., X. P., T. R. Two Plane-Probing Algorithms for the Computation of the Normal Vector to a Digital Plane. *J. Math. Imaging Vis.*, 59(1):23–39, 2017.

 $R^1$ 



[LR2019] T. R., J-O. L., An efficient and quasi linear worst-case time algorithm for digital plane recognition, DGCl'19, LNCS, vol. 11414, p.380–393, 2019.

PH, PR, PR<sup>1</sup>



[LMR2020] J-O. L., J. M., T. R. An Optimized Framework for Plane-Probing Algorithms, J. Math. Imaging Vis., 62(5):718–736, 2020.

Implemented in DGtal (dgtal.org)

## Outline

Context and motivation

Plane-probing algorithms
Generalized Euclidean algorithm

Delaunay triangulation Generalization

Application to digital surfaces

# One of the oldest algorithms

#### Euclidean algorithm

Given a couple of integers,

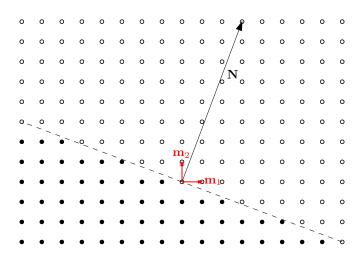
- subtract the smaller from the larger one, and repeat
- until both numbers are equal.

## Example

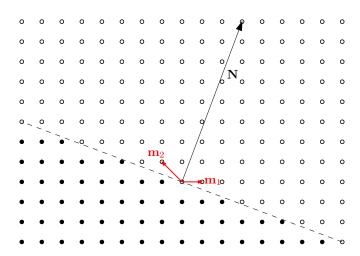
step	0	1	2	3	4
а	3	3	3	1	1
Ь	8	5	2	2	1

we focus on the sequence of subtractions, assume gcd(a, b) = 1

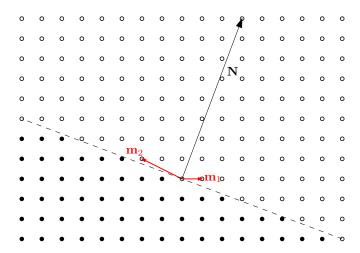
$$\mathbf{m}_1 = (1,0), \quad \mathbf{m}_1 \cdot \mathbf{N} = a = 3$$
  
 $\mathbf{m}_2 = (0,1), \quad \mathbf{m}_2 \cdot \mathbf{N} = b = 8$ 



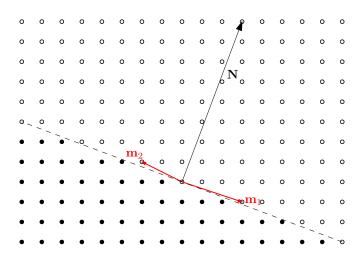
$$\mathbf{m}_1 = (1,0), \quad \mathbf{m}_1 \cdot \mathbf{N} = a = 3$$
  
 $\mathbf{m}_2 = (-1,1), \quad \mathbf{m}_2 \cdot \mathbf{N} = b = 5$ 



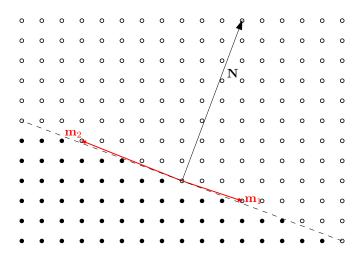
$$\mathbf{m}_1 = (1,0), \quad \mathbf{m}_1 \cdot \mathbf{N} = a = 3$$
  
 $\mathbf{m}_2 = (-2,1), \quad \mathbf{m}_2 \cdot \mathbf{N} = b = 2$ 

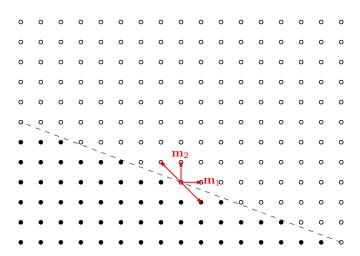


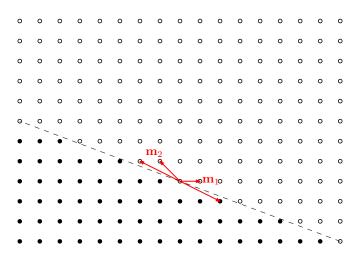
$$egin{aligned} \mathbf{m}_1 &= (3,-1), & \mathbf{m}_1 \cdot \mathbf{N} &= a = 1 \\ \mathbf{m}_2 &= (-2,1), & \mathbf{m}_2 \cdot \mathbf{N} &= b = 2 \end{aligned}$$

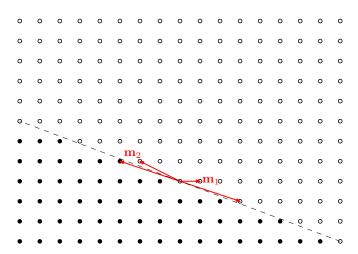


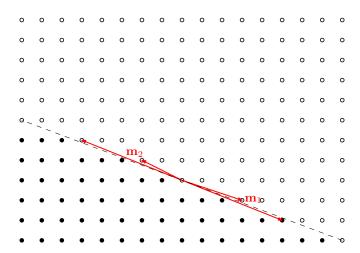
$$\mathbf{m}_1 = (3, -1), \quad \mathbf{m}_1 \cdot \mathbf{N} = a = 1$$
  
 $\mathbf{m}_2 = (-5, 2), \quad \mathbf{m}_2 \cdot \mathbf{N} = b = 1$ 

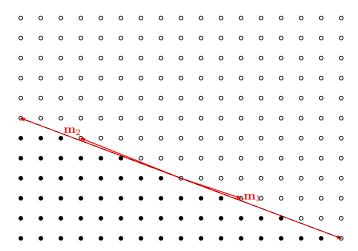












#### Extension to 3d

No unique extension to the Euclidean algorithm!

Assuming  $0 \le a \le b \le c$ :

- ▶ *Brun*:  $(a, b, c) \rightarrow (a, b, c b)$ ;
- ► Selmer:  $(a, b, c) \rightarrow (a, b, c a)$ ;
- ightharpoonup Farey: (a,b,c) o (a,b-a,c);
- ► Fully-Subtractive:  $(a, b, c) \rightarrow (a, b a, c a)$ ;
- Poincaré:  $(a, b, c) \rightarrow (a, b a, c b)$ .

Note: the same operation is done at each step

# A class of generalized Euclidean algorithms

Given three positive numbers (a, b, c), with gcd(a, b, c) = 1,

- while they are not all equal to 1,
- ▶ subtract from a number  $x \in \{a, b, c\}$  a strictly smaller number  $y \in \{a, b, c\}$ , y < x.

## Example

$$\mathbf{m}_1 = (1,0,0), \quad \mathbf{m}_1 \cdot \mathbf{N} = a = 1$$
  
 $\mathbf{m}_2 = (0,1,0), \quad \mathbf{m}_2 \cdot \mathbf{N} = b = 2$   
 $\mathbf{m}_3 = (0,0,1), \quad \mathbf{m}_3 \cdot \mathbf{N} = c = 3$ 

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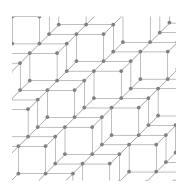
## Example

$$egin{aligned} \mathbf{m}_1 &= (1,0,0), & \mathbf{m}_1 \cdot \mathbf{N} &= a = 1 \\ \mathbf{m}_2 &= (-1,1,0), & \mathbf{m}_2 \cdot \mathbf{N} &= b = 1 \\ \mathbf{m}_3 &= (0,-1,1), & \mathbf{m}_3 \cdot \mathbf{N} &= c = 1 \end{aligned}$$

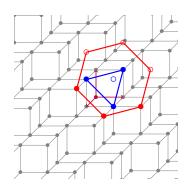
## Digital plane

Let  $\mathbf{N} \in \mathbb{Z}^3$  whose components (a,b,c) are coprime integers s.t.  $0 < a \le b \le c$ ,

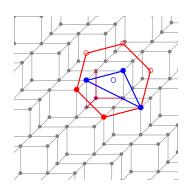
$$\textbf{P}_{\textbf{N}} := \{\textbf{x} \in \mathbb{Z}^3 \mid 0 \leq \textbf{x} \cdot \textbf{N} < \|\textbf{N}\|_1\}$$



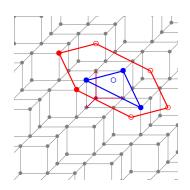
- ho  $(m_1, m_2, m_3) := (e_1, e_2, e_3), q := (1, 1, 1) \notin P_N$
- $\Rightarrow$  triangle  $(q m_1, q m_2, q m_3)$
- $\Rightarrow$  hexagon  $\{\mathbf{q} + \mathbf{m}_i \mathbf{m}_j \mid i, j \in \{1, 2, 3\}, i \neq j\}$



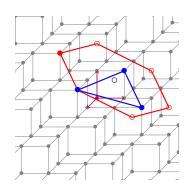
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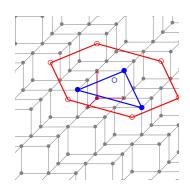
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- $\Rightarrow \text{ triangle } \left(\textbf{q}-\textbf{m}_1,\textbf{q}-\textbf{m}_2,\textbf{q}-\textbf{m}_3\right)$
- $\Rightarrow$  hexagon  $\{\mathbf{q} + \mathbf{m}_i \mathbf{m}_j \mid i, j \in \{1, 2, 3\}, i \neq j\}$



⇒ a plane-probing algorithm

$$\Pi := \{ \textbf{P}_{\textbf{N}} \mid \textbf{N} \in \mathbb{Z}^3 \setminus \textbf{0} \}$$

## Input

- ▶  $P \in \Pi$  described by the predicate InPlane: "is  $x \in P$ ?"
- **a** a starting point **p** s.t. InPlane(**p**),  $\mathbf{q} := \mathbf{p} + (1, 1, 1)$

#### Main trick

- Assume  $\mathbf{p} \cdot \mathbf{N} = 0 \ (\Rightarrow \mathbf{q} \cdot \mathbf{N} = ||\mathbf{N}||_1)$ , where  $\mathbf{N}$ , the normal of  $\mathbf{P}$
- ► InPlane( $\mathbf{x}$ )  $\Leftrightarrow$  ( $\mathbf{x} \mathbf{q}$ )  $\cdot$   $\mathbf{N}$  < 0.

# Properties of generalized Euclidean algorithms

#### At each step

- P1 **p** and **q** both project into triangle  $(\mathbf{q} \mathbf{m}_1, \mathbf{q} \mathbf{m}_2, \mathbf{q} \mathbf{m}_3)$  along (1, 1, 1)
- P2 matrix  $\mathbf{M}:=[\mathbf{m}_1,\mathbf{m}_2,\mathbf{m}_3]$  is unimodular, i.e.  $\det{(\mathbf{M})}=1$

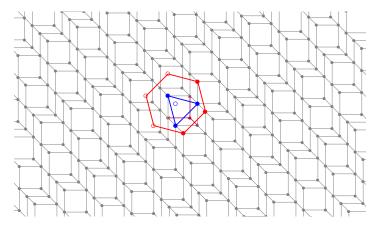
#### **Termination**

- ▶ number of steps  $\leq \|\mathbf{N}\|_1 3$  (6 calls to InPlane per step)
- ▶ at the end, if  $\mathbf{p} \cdot \mathbf{N} = 0$  ( $\Rightarrow \mathbf{q} \cdot \mathbf{N} = ||\mathbf{N}||_1$ )  $\forall k \in \{1, 2, 3\}, \ \mathbf{m}_k \cdot \mathbf{N} = 1$  $\Rightarrow$  the normal of triangle ( $\mathbf{q} - \mathbf{m}_1, \mathbf{q} - \mathbf{m}_2, \mathbf{q} - \mathbf{m}_3$ ) is  $\mathbf{N}$

whichever the subtraction we choose

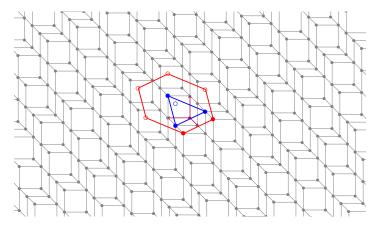
# Example

## Digital plane of normal (5, 2, 3)



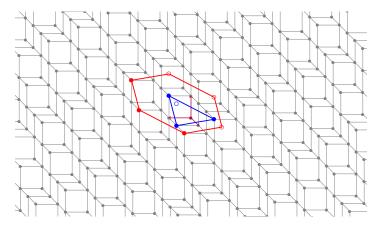
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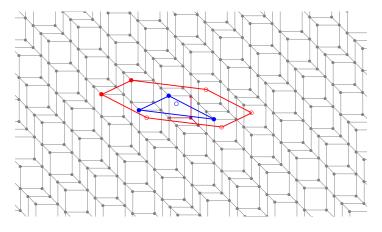
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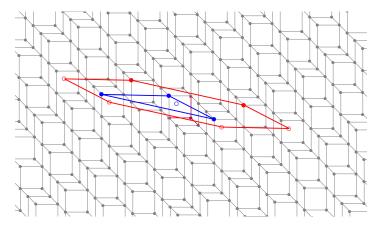


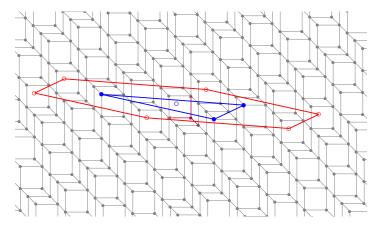
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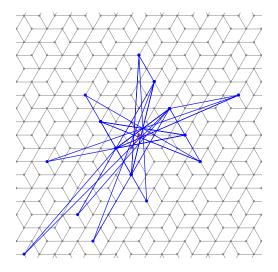






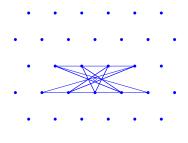


# All possible final triangles



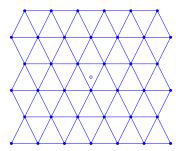
### About final triangles

- ightharpoonup vertices  $\in \Lambda := \{ \mathbf{x} \in \mathbb{Z}^3 \mid \mathbf{x} \cdot \mathbf{N} = \|\mathbf{N}\|_1 1 \}$
- do not contain any other point of Λ (P2)
- ightharpoonup projection of  $m {f p}$  along (1,1,1) (P1)



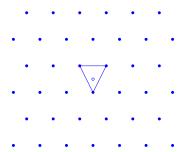
### Towards a selection criterion

- ightharpoonup The Delaunay triangulation of  $\Lambda$  gives acute triangles
- **p** projects into one of them (if no co-circularity)



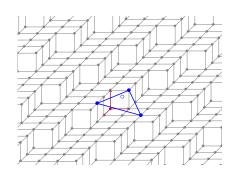
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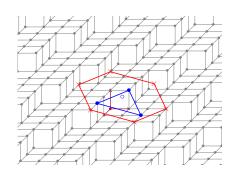
#### At each step:

- consider a candidate set 5
- ► filter 5 through InPlane
- pick a closest point s\*: the circumsphere of T ∪ s\* doesn't contain any other
- ▶ update *T* with this point



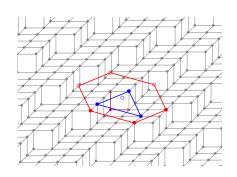
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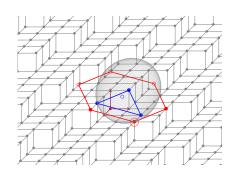
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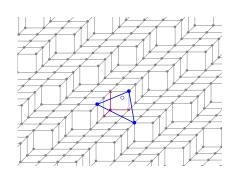
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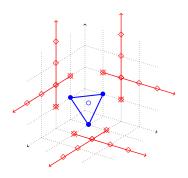


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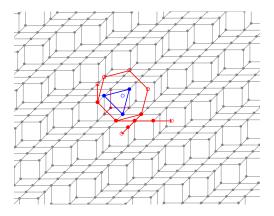
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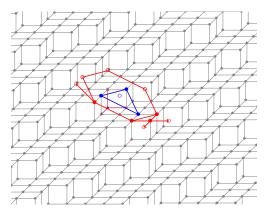


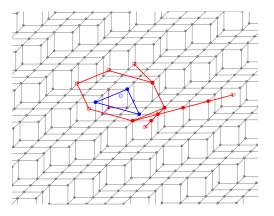
# Algorithm R (candidates along rays)

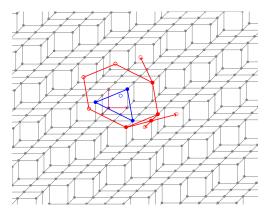


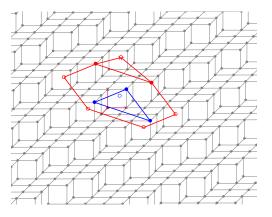
- ▶ same algorithm as before, only *S* differs
- ▶ 5 is infinite but the filtering by InPlane gives a finite point set
- $ightharpoonup O(\|\mathbf{N}\|_1)$  steps,  $O(\log(\|\mathbf{N}\|_1))$  calls to InPlane per step
- the last triangle is always acute

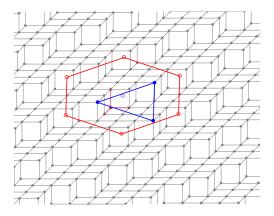












# Algorithm R<sup>1</sup>

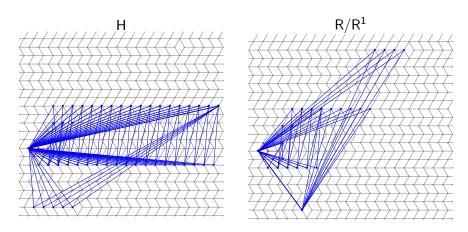
#### **Features**

- ▶ has the same output as R
- ▶ but  $O(\|\mathbf{N}\|_1)$  calls to InPlane instead of  $O(\|\mathbf{N}\|_1 \log \|\mathbf{N}\|_1)$

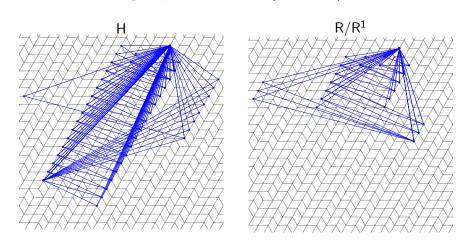
#### How?

- 1. local probing: 6 rays  $\rightarrow$  at most 2 rays and 1 point
- 2. geometrical study: 2 rays  $\rightarrow$  1 ray and 1 point
- 3. efficient algorithm: 1 ray and 1 point  $\rightarrow$  a *closest* point

### Digital plane of normal (67, 1, 91)



### Digital plane of normal (1,73,100)



### Recap

#### Main features

- **N** from a point **p** s.t.  $\mathbf{p} \cdot \mathbf{N} = 0$
- by sparse and local computations:
  - **p** projects into all triangles
  - ▶ with R and R¹, the current triangle is acute every two steps, always acute at the end
- $O(\|\mathbf{N}\|_1)$  calls to InPlane with H and R<sup>1</sup>,  $O(\|\mathbf{N}\|_1 \log (\|\mathbf{N}\|_1))$  with R

#### **Drawbacks**

- 1. do not retrieve **N** from any point
- 2. do not retrieve all triangles of the lattice  $\Lambda$

# Problem #1: starting from any point

### Input

- P of normal N
- ▶ InPlane: "is  $\mathbf{x} \in \mathbf{P}$ ?"

### Equivalence used so far

- ightharpoonup assume  $\mathbf{q} \cdot \mathbf{N} = \|\mathbf{N}\|_1$
- ▶ InPlane( $\mathbf{x}$ )  $\Leftrightarrow$  ( $\mathbf{x} \mathbf{q}$ )  $\cdot$  **N** < 0

### Generalized equivalence

- ightharpoonup assume  $\mathbf{q} \cdot \mathbf{N} \geq \|\mathbf{N}\|_1$
- ▶  $\exists I \in \mathbb{N}$  s.t.  $InPlane(\mathbf{q} + I(\mathbf{x} \mathbf{q})) \Leftrightarrow (\mathbf{x} \mathbf{q}) \cdot \mathbf{N} < 0$ .

### Predicate NotAbove

```
Data: InPlane, q and an integer L > 2 \|\mathbf{N}\|_1
   Input: A point \mathbf{x} \in \mathbb{Z}^3 s.t. \mathbf{q} \cdot \mathbf{N} - \|\mathbf{N}\|_1 < \mathbf{x} \cdot \mathbf{N}
  Output: True iff (\mathbf{x} - \mathbf{q}) \cdot \mathbf{N} < 0 in O(\log(L)) calls to InPlane
1 \mathbf{u} \leftarrow \mathbf{x} - \mathbf{q}; // direction
2 l ← 1:
3 while l < L do
        if InPlane(q + lu) then return True;
if InPlane(q - lu) then return False;
       1 \leftarrow 21;
7 return False:
```

 $\mathbf{q}$ 

 $\mathbf{x}$ 

it is enough to use NotAbove instead of InPlane

### Predicate NotAbove

```
Data: InPlane, q and an integer L > 2 \|\mathbf{N}\|_1
   Input: A point \mathbf{x} \in \mathbb{Z}^3 s.t. \mathbf{q} \cdot \mathbf{N} - \|\mathbf{N}\|_1 < \mathbf{x} \cdot \mathbf{N}
  Output: True iff (\mathbf{x} - \mathbf{q}) \cdot \mathbf{N} < 0 in O(\log(L)) calls to InPlane
1 \mathbf{u} \leftarrow \mathbf{x} - \mathbf{q}; // direction
2 l ← 1:
3 while l < L do
        if InPlane(q + lu) then return True;
if InPlane(q - lu) then return False;
       1 \leftarrow 21;
7 return False:
```

 $\mathbf{q}$ 

 $\mathbf{x}$ 

it is enough to use NotAbove instead of InPlane

- ▶ top point **q**
- ightharpoonup upper triangle  $(\mathbf{q} \mathbf{m}_1, \mathbf{q} \mathbf{m}_2, \mathbf{q} \mathbf{m}_3)$
- lower triangle  $(\mathbf{q} \mathbf{m}_2 \mathbf{m}_3, \mathbf{q} \mathbf{m}_3 \mathbf{m}_1, \mathbf{q} \mathbf{m}_1 \mathbf{m}_2)$
- **b** bottom point  $\mathbf{q} \sum_k \mathbf{m}_k$



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### Staying close to the digital plane

### Update rule

- ▶ when the parallelepiped has less than 4 vertices in **P**,
  - ⇒ the lower triangle is updated (top moves, not bottom)
- otherwise
  - ⇒ the upper triangle is updated (bottom moves, not top)
- ▶ invariant: at least one point in **P** (bottom), one not (top)

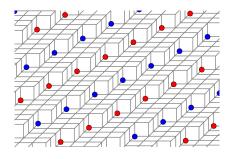
### Generalized versions of H, R and R<sup>1</sup>

For each  $X \in \{H, R, R^1\}$ , PX uses a parallelepiped and the above update rule with NotAbove instead of InPlane.

### Recap

#### Main features

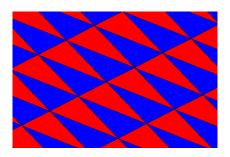
- ▶ **N** from any point **p** such that InPlane(**p**),
- ▶ all triangles of the lattice  $\Lambda = \{\mathbf{x} \in \mathbb{Z}^3 \mid \mathbf{x} \cdot \mathbf{N} = \|\mathbf{N}\|_1 1\}$
- ▶ PH and PR<sup>1</sup> require  $O(\|\mathbf{N}\|_1)$  calls to NotAbove  $\Rightarrow O(\|\mathbf{N}\|_1 \log (\|\mathbf{N}\|_1))$  calls to InPlane.



### Recap

#### Main features

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### Outline

#### Context and motivation

Plane-probing algorithms

Generalized Euclidean algorithm

Delaunay triangulation

Generalization

Application to digital surfaces

# A similar algorithm for a digital surface S

### Input

- ▶ a predicate InSurface :  $\mathbf{x} \in S$  ?
- $\triangleright$  a starting square face s in S

#### Additional constraints

▶ find an origin and a basis from s



stop if non-planar configurations (parallelepiped/hexagon/rays)



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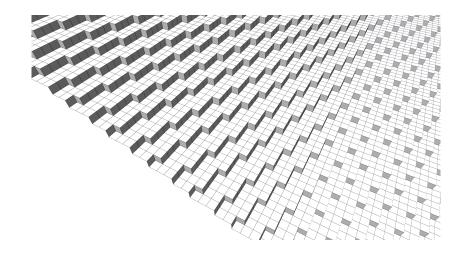
#### Additional constraints

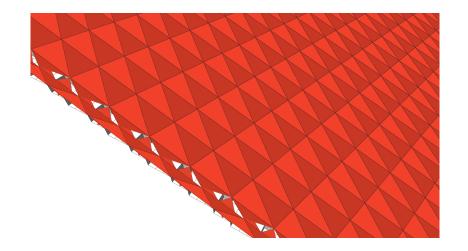
▶ find an origin and a basis from s

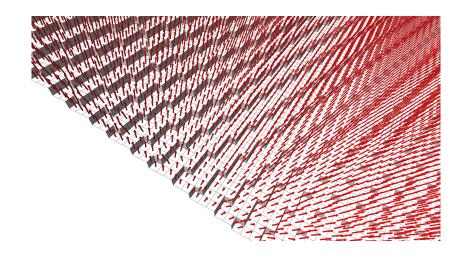


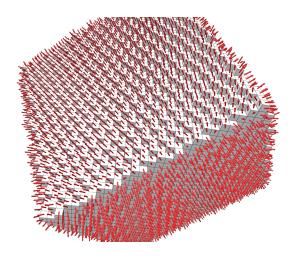
stop if non-planar configurations (parallelepiped/hexagon/rays)



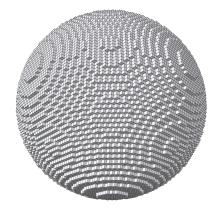




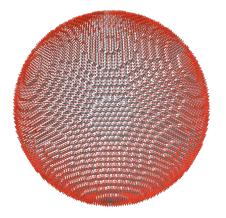




# Example: convex shapes



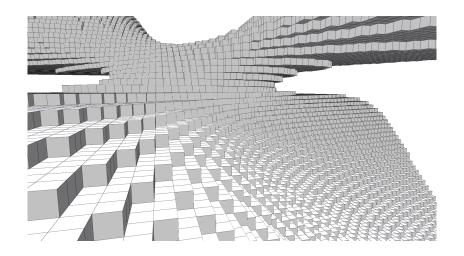
# Example: convex shapes



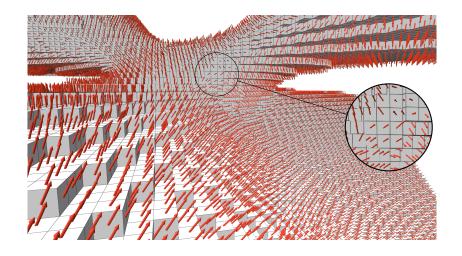
# Example: convex shapes



# Example: not convex shapes



### Example: not convex shapes



### Perspectives

### Digital planes

▶ What piece of digital plane is enough to find **N**?

### Digital surfaces

- try all candidates, obtuse triangles may be interesting
- perform a dense probing to process non-convex parts
- estimator: multigrid convergence, experimental comparison
- reconstruction: find of way of gluing triangles together

### The end

### My first answer:

