

An alternative definition for digital convexity

Context and objectives

Full convexity

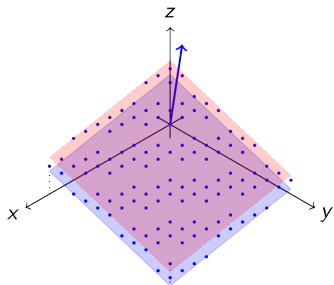
Some applications of full convexity

Fully convex envelope and polyhedral models

Some applications of full convexity

- ▶ full convexity of digital planes
- ▶ stability by intersection and local shape analysis
- ▶ tangency, tangential cover
- ▶ digital surface reconstruction
- ▶ shortest paths

Thick enough arithmetic planes are full convex

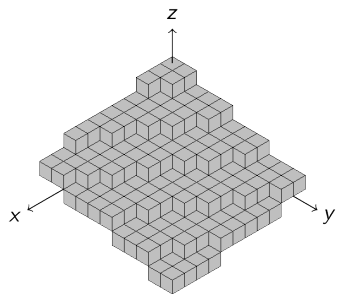


Arithmetic plane

- ▶ irreducible normal vector $N \in \mathbb{Z}^d$
- ▶ intercept $\mu \in \mathbb{Z}$
- ▶ positive thickness $\omega \in \mathbb{Z}, \omega > 0$

$$P(\mu, N, \omega) := \{x \in \mathbb{Z}^d, \mu \leq x \cdot N < \mu + \omega\}$$

Thick enough arithmetic planes are full convex

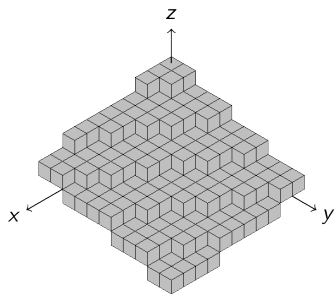


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Arithmetic plane

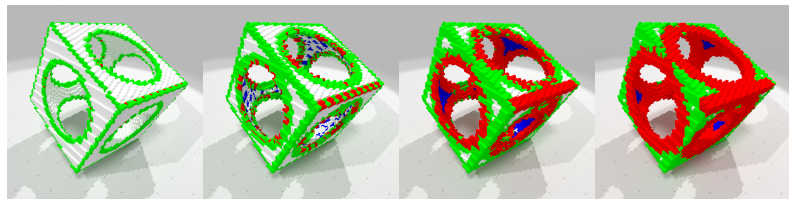
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Theorem

Arithmetic planes are fully convex for thickness $\omega \geq \|N\|_\infty$.

Local analysis of shape X



$k = 1$

$k = 2$

$k = 3$

$k = 4$

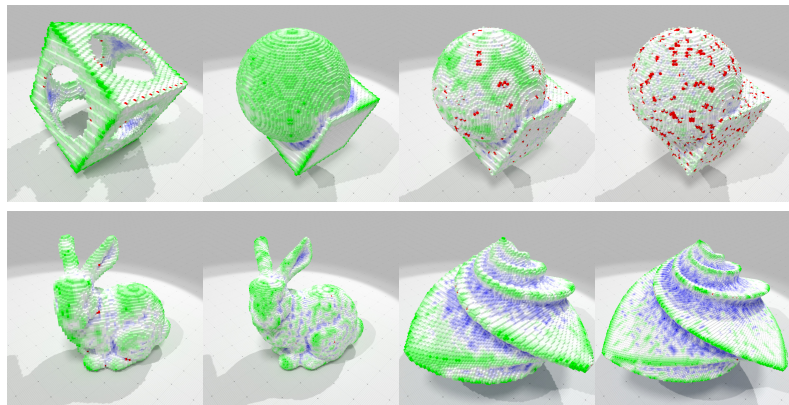
- ▶ Let $N_k(z)$ be the $(2k + 1)^d$ -neighborhood around z

$$X_k(z) := N_k(z) \cap X$$

$$\bar{X}_k(z) := N_k(z) \cap (\mathbb{Z}^d \setminus X)$$

- ▶ X is j -convex at z iff $X_j(z)$ is fully convex
- ▶ X is j -concave at z iff $\bar{X}_j(z)$ is fully convex
- ▶ X is j -planar at z iff it is j -convex and j -concave at z
- ▶ otherwise X is j -atypical at z

Local multiscale analysis of shape X



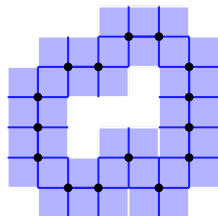
Lemma

- ▶ X $j+1$ -convex at $z \Rightarrow X$ j -convex at z
- ▶ X $j+1$ -concave at $z \Rightarrow X$ j -concave at z
- ▶ X $j+1$ -planar at $z \Rightarrow X$ j -planar at z
- ▶ X j -atypical at $z \Rightarrow X$ $j+1$ -atypical at z

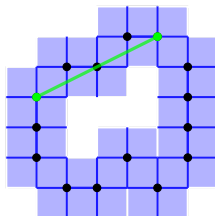
Tangency

Definition

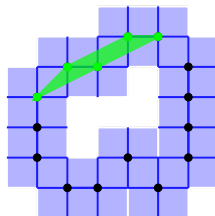
The digital set $A \subset X \subset \mathbb{Z}^d$ is said to be k -tangent to X for $0 \leq k \leq d$ whenever $\bar{C}_k^d[\text{Cvxh}(A)] \subset \bar{C}_k^d[X]$. It is *tangent* to X if the relation holds for all such k .



X and $\bar{C}^d[X]$



tangent

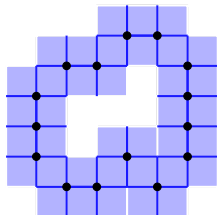


tangent

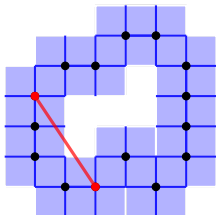
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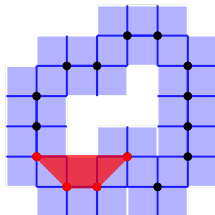
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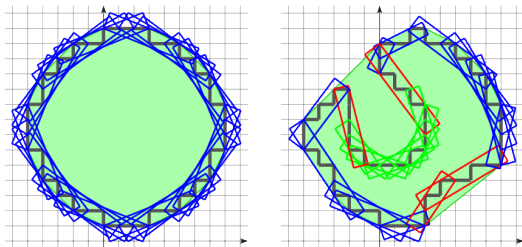


not tangent



not tangent

Side step: 2d tangential cover



Sequence of maximal digital straight segments = tangential cover of
[Feschet, Tougne 99]

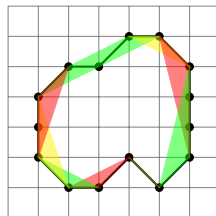
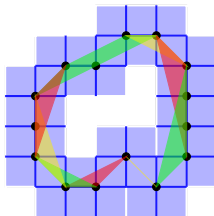
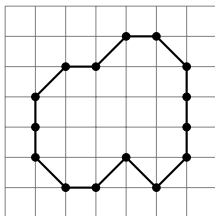
Theorem ([Debled-Rennesson, Reiter-Doerksen 04])

A 4- or 8-connected subset $S \subset \mathbb{Z}^2$ is digitally convex, iff the directions of its maximal digital straight segments are monotonous along $\text{Bd}(S)$.

Tangential cover

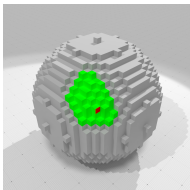
Theorem

In 2D, if C is a simple 2-connected digital contour, then the fully convex subsets of C that are maximal and tangent coincides with the classical tangential cover of [Feschet, Tougne 99].



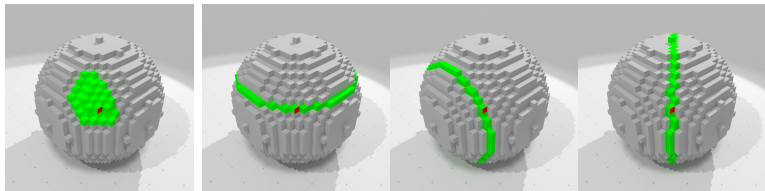
Tangential cover in 3D ? dD ?

- ▶ can we define facets of X as inextensible connected pieces of arithmetic planes along X ?



Tangential cover in 3D ? dD ?

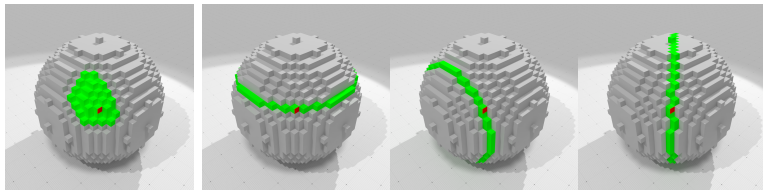
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 - ▶ there are a lot of inextensible DPS
 - ▶ most of them are meaningless

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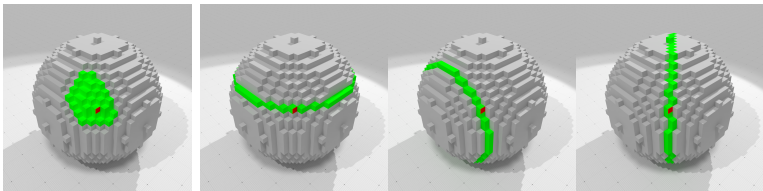
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- ▶ greedy methods to isolate meaningful ones:
[Klette, Sun, Coeurjolly, Sivignon, Kenmochi, Provot, Debled-Rennesson, Charrier, L., ...]

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Tangency extends to dD !

Tangent subsets in our sense are indeed tangent to X since their convex hull must lie close to X .

Piecewise linear reversible reconstruction in dD

Let $\text{Del}(X)$ be the Delaunay complex of X .

Definition

The *tangent Delaunay complex* $\text{Del}_T(X)$ to X is the complex made of the cells τ of $\text{Del}(X)$ such that the vertices of τ are tangent to X .

- ▶ its boundary is the convex hull when X is fully convex,

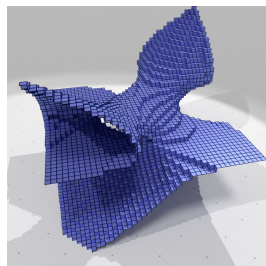
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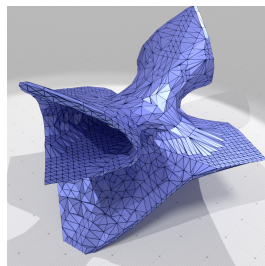
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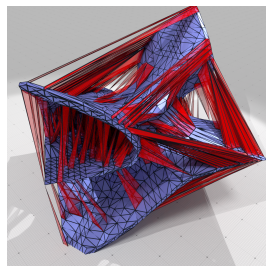
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Input digital shape X



Reconstruction $\text{Del}_T(X)$

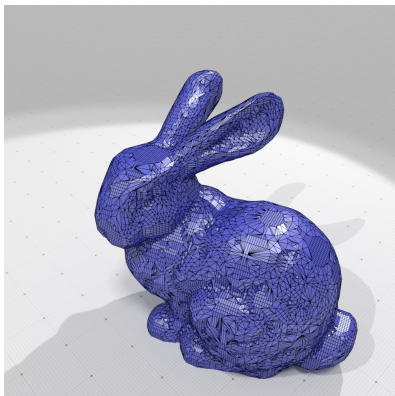
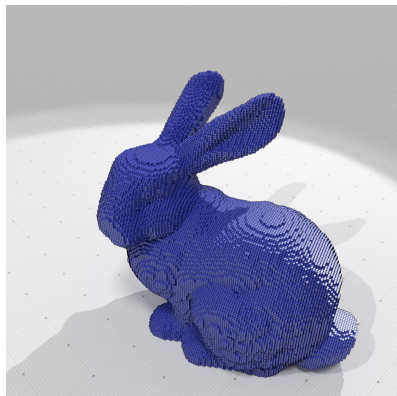


Bad simplices of $\text{Del}(X)$

Theorem

The body of $\text{Del}_T(X)$ is at Hausdorff L_∞ -distance 1 to X . $\text{Del}_T(X)$ is a reversible polyhedrization, i.e. $\|\text{Del}_T(X)\| \cap \mathbb{Z}^d = X$.

Piecewise linear reversible reconstruction in dD



Path

Definition (path)

Let $\gamma = (x_i)_{i=0, \dots, n}$, $n \geq 0$, be a sequence of points in some digital set X . The sequence γ is a *path from point a to point b in X* , if and only if, $x_0 = a$, $x_n = b$, and every two consecutive points of γ are co-tangent in X .

Its *embedding* $\bar{\gamma}$ is the embedding of the straight segments joining consecutive points.

Lemma

$\bar{\gamma} \subset \|\bar{C}^d[\bar{\gamma}]\| \subset \|\bar{C}^d[X]\|$. Hence the L_∞ -distance of any point of $\bar{\gamma}$ to X is smaller than 1.

Shortest path

Definition (path length; shortest path)

The *length of γ* is $\text{length}(\gamma) := \sum_{i=0}^{n-1} \|x_{i+1} - x_i\|$. The path γ from a to b is a *shortest path* from a to b if there exists no other path from a to b with a smaller length.

Definition (digital distance)

The *digital distance* d_X in $X \subset \mathbb{Z}^d$ is

$$\forall x, y \in X, d_X(x, y) := \begin{cases} +\infty & \text{if } \mathcal{P}_X(x, y) \text{ is empty,} \\ \inf_{\gamma \in \mathcal{P}_X(x, y)} \text{length}(\gamma) & \text{otherwise.} \end{cases}$$

where $\mathcal{P}_X(x, y)$ is the set of path from x to y .

Lemma

If X is d -connected then the infimum above is a minimum, i.e.
 $d_X(a, b) = \text{length}(\gamma)$ with γ any shortest path of $\mathcal{P}_X(a, b)$.

Shortest paths and metric space

Theorem

If $X \subset \mathbb{Z}^d$ is d -connected and non-empty, then (X, d_X) is a metric space.

Theorem

If X is a fully convex set, then for any pair of points $x, y \in X$, (x, y) is the shortest path between x and y and $d_X = \|x - y\|$.

Computing shortest paths

Lemma

If γ is a path in X between a and b , then there exists a d -connected path P of points in X between a and b such that $P \subset \text{Cl}(\|\bar{C}^d[\bar{\gamma}]\|)$ (it stays close to γ), and P visits the digital points of γ in the same order.

- ▶ we can find shortest paths by visiting direct neighbors.

Computing shortest path; Dijkstra algorithm (variant)

Procedure ShortestPath(In X , In a , Out A , Out D)

In X : subset of \mathbb{Z}^d ; // Any non-empty subset of \mathbb{Z}^d

In a : Point ; // source point in X

Out A : map<Point,Point> ; // ancestor in the geodesic

Out D : map<Point,Real> ; // distance to a

Type Node = tuple<Point,Point,Real>

Var V : set<Point> ; // visited points

Var Q : priority_queue<Node>

begin

foreach $p \in X$ **do** $D[p] \leftarrow +\infty$;

$Q.push((a, a, 0.0))$; // Starting point

while $\neg Q.empty()$ **do**

$(q, r, d) \leftarrow Q.pop()$; // pop top node

if $d > D[q]$ **then continue** ;

$A[q] \leftarrow r$, $D[q] \leftarrow d$, $V.insert(q)$;

$N \leftarrow \text{CotangentPoints}(X, q, V)$;

foreach $p \in N$ **do**

$d' \leftarrow D[q] + \|p - q\|$;

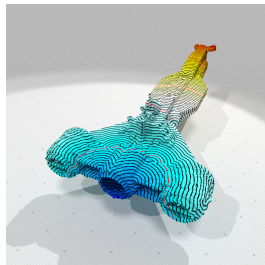
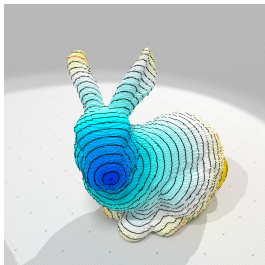
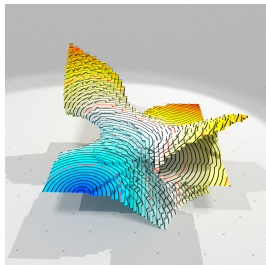
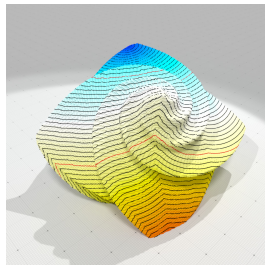
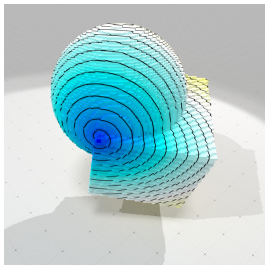
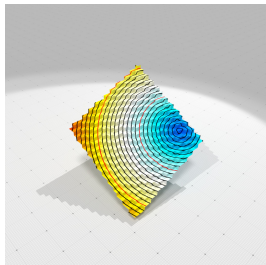
if $d' < D[p]$ **then** $d' \leftarrow D[p]$, $Q.push((p, q, d'))$; ;

end

end

end

Results



An alternative definition for digital convexity

Context and objectives

Full convexity

Some applications of full convexity

Fully convex envelope and polyhedral models



With Fabien Feschet
Université d'Auvergne

What about digital convex hull ?

- ▶ digital convex hull $\text{Cvxh}_{\mathbb{Z}^d}(A) := \text{Cvxh}(A) \cap \mathbb{Z}^d$

properties	H -convexity	H -convexity + connect.
$\text{Cvxh}_{\mathbb{Z}^d}(A)$ convex	+	-
$\text{Cvxh}_{\mathbb{Z}^d}(A) = A$ (for A cvx)	+	+
idempotence	+	+
fast computation	+	+
increasing	+	+

What about digital convex hull ?

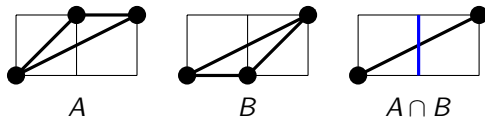
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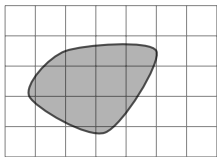
How can we build fully convex sets from arbitrary $A \subset \mathbb{Z}^d$?

Fully convex hull through intersections ?

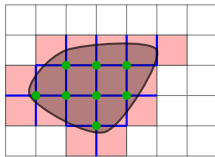
- ▶ half-spaces are fully convex
- ▶ can we intersect support half-spaces to get fully convex hull ?
- ▶ intersections of fully convex sets are not fully convex in general



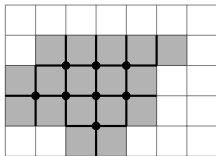
Local operators Star (\cdot), Skeleton (\cdot), Extrema (\cdot)



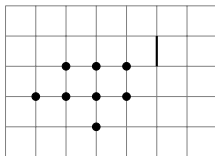
Y



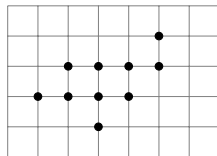
$$\text{Star}(Y) = \bar{C}_0^d[Y] \cup \bar{C}_1^d[Y] \cup \bar{C}_2^d[Y]$$



K



$K' = \text{Skeleton}(K)$

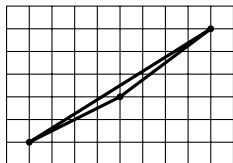


$\text{Extrema}(K')$

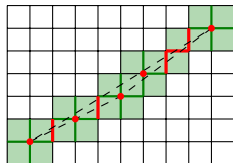
- ▶ For any $Y \subset \mathbb{R}^d$, let $\text{Star}(Y) := \bar{C}^d[Y]$
(coincides with the usual star of combinatorial topology)
- ▶ For any complex $K \subset \mathcal{C}^d$, let $\text{Skeleton}(K) := \bigcap_{K' \subset K \subset \text{Star}(K')} K'$
- ▶ For any complex $K \subset \mathcal{C}^d$, let $\text{Extrema}(K) := \text{Cl}(K) \cap \mathbb{Z}^d$

Operator $FC(\cdot)$ and fully convex envelope $FC^*(\cdot)$

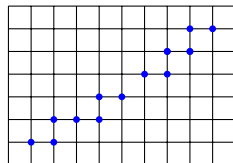
- ▶ Iterative method for computing a fully convex envelope
- ▶ Let $FC(X) := \text{Extrema}(\text{Skeleton}(\text{Star}(\text{Cvxh}(X))))$
- ▶ Iterative composition $FC^n(X) := \underbrace{FC \circ \dots \circ FC(X)}_{n \text{ times}}$
- ▶ *Fully convex envelope* of X is $FC^*(X) := \lim_{n \rightarrow \infty} FC^n(X)$.



input X , $Y := \text{Cvxh}(X)$



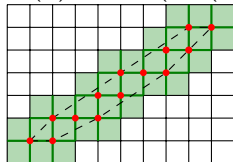
$\text{Star}(Y)$, $\text{Skeleton}(\text{Star}(Y))$



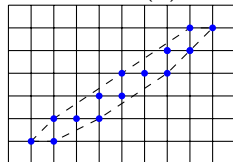
$X' = FC(X)$



input X' , $Y' := \text{Cvxh}(X')$



$\text{Star}(Y')$, $\text{Skeleton}(\text{Star}(Y'))$



$X'' = FC(X') = FC^2(X)$

The fully convex envelope is well defined

Lemma

For any $X \subset \mathbb{Z}^d$, $X \subset \text{FC}(X)$.

Lemma

For any finite $X \subset \mathbb{Z}^d$, X and $\text{FC}(X)$ have the same bounding box.

Theorem

For any finite digital set $X \subset \mathbb{Z}^d$, there exists a finite n such that $\text{FC}^n(X) = \text{FC}^{n+1}(X)$, hence $\text{FC}^(X)$ exists and is equal to $\text{FC}^n(X)$.*

Consistency and idempotence of fully convex envelope

The fully convex envelope acts as a fully convex hull operator

Lemma

If $X \subset \mathbb{Z}^d$ is fully convex, then $FC(X) = X$. So $FC^(X) = X$.*

Lemma

If $X \subset \mathbb{Z}^d$ is not fully convex, then $X \subsetneq FC(X)$

Theorem

$X \subset \mathbb{Z}^d$ is fully convex if and only if $X = FC(X)$.

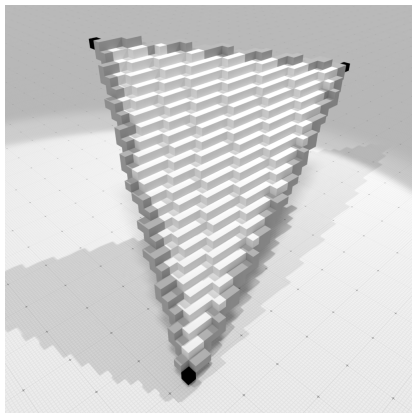
Theorem

For any finite $X \subset \mathbb{Z}^d$, $FC^(X)$ is fully convex.*

Theorem

Computation of $FC(\cdot)$ is bounded by $O\left(n^{\lfloor \frac{d}{2} \rfloor}\right)$, with $n = \#(X)$.

A 3D digital triangle



vertices $A = (8, 4, 18)$, $B = (-22, -2, 4)$, $C = (18, -20, -8)$
(black),

edges $FC^*({A, B})$, $FC^*({A, C})$, $FC^*({B, C})$ (grey+black)

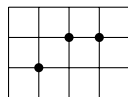
triangle $FC^*({A, B, C})$ (white+grey+black)

Is the fully convex envelope a hull operator ?

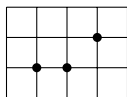
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$FC^*(A)$ convex	+
$FC^*(A) = A$ (for A fully cvx)	+
idempotence	+
fast computation	\approx (# iterations)
increasing	-

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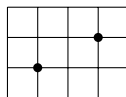
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fast computation	\approx (# iterations)
increasing	-



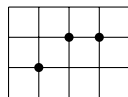
A



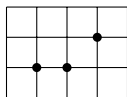
B



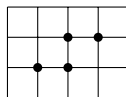
C



$FC^*(A)$



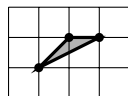
$FC^*(B)$



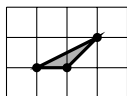
$FC^*(C)$

Is the fully convex envelope a hull operator ?

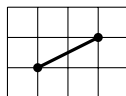
properties	fully convex envelope
$FC^*(A)$ convex	+
$FC^*(A) = A$ (for A fully cvx)	+
idempotence	+
fast computation	\approx (# iterations)
increasing	-



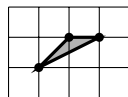
A



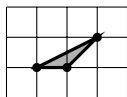
B



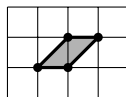
C



$FC^*(A)$



$FC^*(B)$



$FC^*(C)$

A relative fully convex envelope

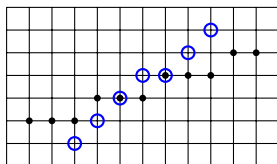
- ▶ For $X \subset Y$, let $\text{FC}_{|Y}(X) := \text{FC}(X) \cap Y$
- ▶ $\text{FC}_{|Y}^n(X) := \text{FC}_{|Y} \circ \dots \circ \text{FC}_{|Y}(X)$, composed n times
- ▶ *Fully convex envelope of X relative to Y is*
 $\text{FC}_{|Y}^*(X) := \lim_{n \rightarrow \infty} \text{FC}_{|Y}^n(X)$
- ▶ we have $\text{FC}^*(X) = \text{FC}_{|\mathbb{Z}^d}^*(X)$

Theorem

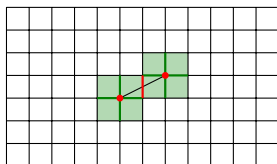
Let $X \subset \mathbb{Z}^d$ and $Y \subset \mathbb{Z}^d$ fully convex.

Then $\text{FC}_{|Y}^*(X \cap Y)$ is fully convex and is included in Y .

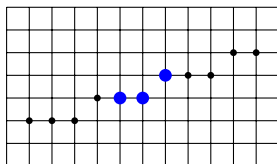
Intersections of fully convex sets



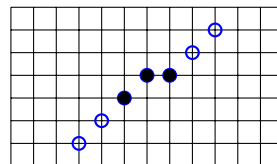
X, Y



$\text{Skeleton}(\text{Star}(\text{Cvxh}(X \cap Y)))$



$\text{FC}_{|Y}^*(X \cap Y)$



$\text{FC}_{|X}^*(X \cap Y)$

Polyhedral models (here 3D)

- ▶ polyhedron \mathcal{P} made of k -cells (facets, edges, vertices), with incidence relations
- ▶ use relative full convexity to define facets that are pieces of arithmetic planes
- ▶ $T \subset \mathbb{Z}^3$ made of coplanar points, $P_1(T)$ is the median standard plane (resp. $P_\infty(T)$ the median naive plane) defined by T .

Definition (standard digital polyhedron)

\mathcal{P}_1^* is the collection of digital cells subsets of \mathbb{Z}^d :

- if σ is a facet of \mathcal{P} with vertices $V(\sigma)$, then σ_1^* is a cell of \mathcal{P}_1^* with $\sigma_1^* := \text{FC}_{|P_1(V(\sigma))}^*(V(\sigma))$.
- if τ is an edge, then it has as many geometric realizations as incident facets σ : $(\tau, \sigma)_1^* := \text{FC}_{|\sigma_1^*}^*(V(\tau))$.
- vertices are simply digital points.

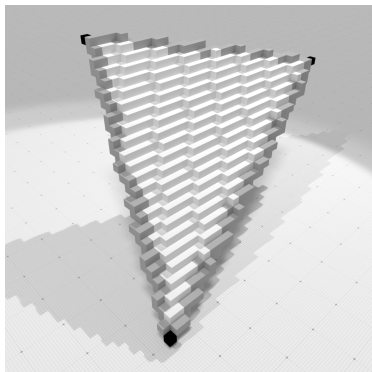
Definition (naive digital polyhedron)

\mathcal{P}_∞^* defined similarly by replacing 1 with ∞ above.

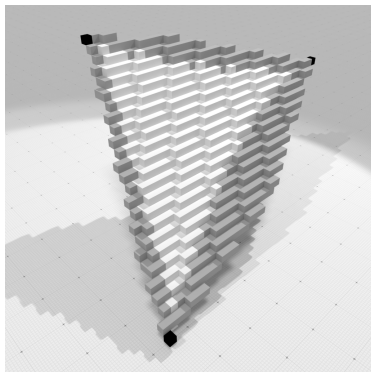
Standard and naive 3D triangle

Theorem

All digital cells are fully convex.



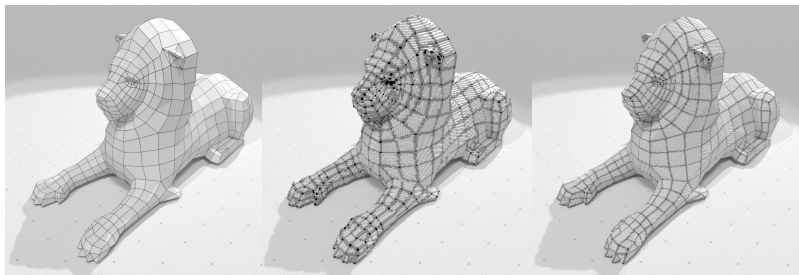
standard triangle \mathcal{T}_1^*
985 points



naive triangle \mathcal{T}_∞^*
567 points

Polyhedron \mathcal{T} with vertices $A = (8, 4, 18)$, $B = (-22, -2, 4)$,
 $C = (18, -20, -8)$, edges $\{(A, B), (A, C), (B, C)\}$ and one facet $\{(A, B, C)\}$.

Generic/standard/naive digital polyhedron

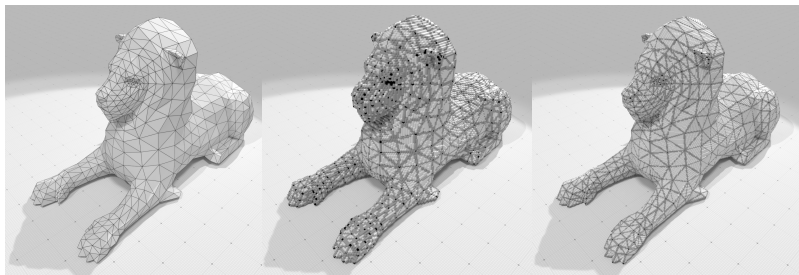


Quad-mesh \mathcal{Q} , non planar faces

$\#\mathcal{Q}^* = 81044$

$\#\mathcal{Q}^* = 373225$

Generic/standard/naive digital polyhedron

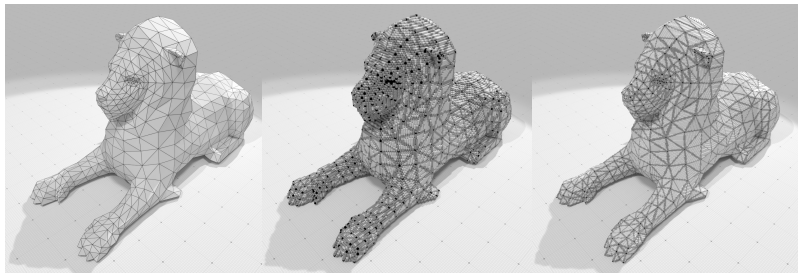


Tri-mesh \mathcal{T} , planar
faces

$\#\mathcal{T}_1^* = 68603$

$\#\mathcal{T}_1^* = 275931$

Generic/standard/naive digital polyhedron



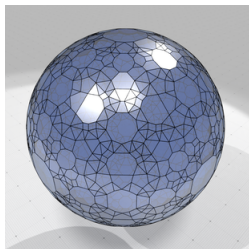
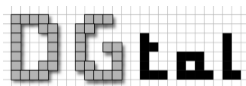
Tri-mesh \mathcal{T} , planar
faces

$$\#\mathcal{T}_{\infty}^* = 46639$$

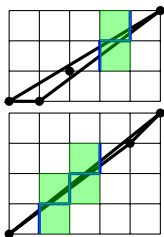
$$\#\mathcal{T}_{\infty}^* = 182451$$

Full convexity packages in DGtal

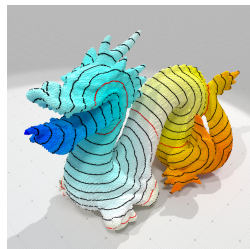
dgtal.org



dD convex hull and Delaunay triangulation



Full convexity tests in dD



Local shape analysis, geodesic shortest paths

- ▶ most of full convexity and applications implemented in DGtal
- ▶ open source library
- ▶ efficient generic C++

Conclusion

Pros of full convexity

- ▶ natural definition in arbitrary dimension that uses $\mathbb{Z}^d \subset \mathbb{C}^d$
- ▶ guarantees connectedness and simple connectedness
- ▶ morphological characterization that allows simple convexity check
- ▶ thick enough arithmetic planes are fully convex
- ▶ entails a consistent definition of tangency
- ▶ simple tight and reversible polyhedrization
- ▶ local shape analysis, shortest paths
- ▶ fully convex envelope, digital polyhedra

Cons of full convexity

- ▶ $(2^d - 1)$ times slower to check convexity

Future works

Theoretical side

- ▶ intersection property and increasingness of envelope still under study
- ▶ convergence of maximal tangent planes for normal estimation ?
- ▶ lattice cells enumeration falls into Ehrhart theory: are polynomials specific ?

Algorithmic side

- ▶ fast lattice point enumeration within polytopes
- ▶ fast computation of maximal tangent planes (link with plane probing)

Explore its natural applications

- ▶ other polyhedrization algorithms using tangency