

Full convexity for polyhedral models in digital spaces

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Université de Strasbourg

Full convexity for polyhedral models in digital spaces

Context and objectives

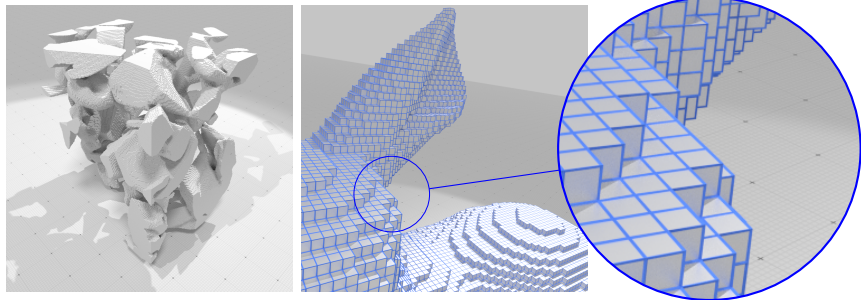
What is full convexity ?

Fully convex envelope

An envelope relative to a fully convex set

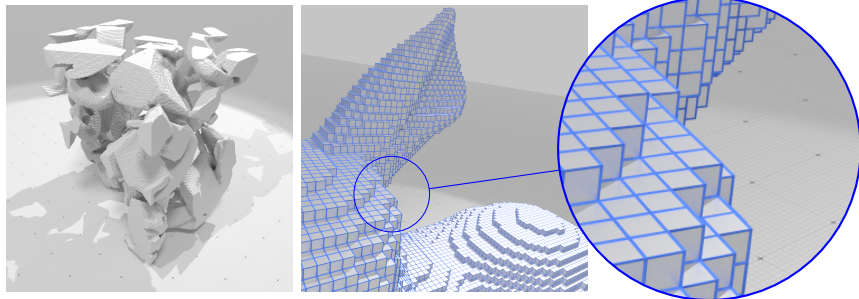
Polyhedral models

Why digital convexity ?



- ▶ no (infinitesimal) differential geometry for digital shapes
- ▶ convexity: a fundamental tool to analyze the geometry of shapes
- ▶ identifies convex/concave/flat/saddle regions
- ▶ gives locally its piecewise linear geometry
- ▶ facets give normal estimations

Why digital convexity ?

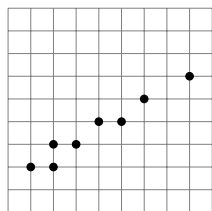


- ▶ no (infinitesimal) differential geometry for digital shapes
 - ▶ convexity: a fundamental tool to analyze the geometry of shapes
 - ▶ identifies convex/concave/flat/saddle regions
 - ▶ gives locally its piecewise linear geometry
 - ▶ facets give normal estimations
- ▶ convexity = foundation of convex analysis, linear programming
- ▶ digital convexity = foundation of digital convex analysis, integer linear programming ?

Natural digital convexity is not satisfactory

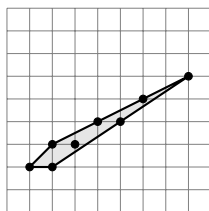
Definition (Natural digital convexity (or H -convexity))

$X \subset \mathbb{Z}^d$ is digitally convex iff $\text{Cvxh}(X) \cap \mathbb{Z}^d = X$



X

=



$\text{Cvxh}(X) \cap \mathbb{Z}^d$

\Rightarrow convex !

Digital convexity does not imply digital connectedness !

Summary of digital convexity properties

properties	H -convexity
simple, generic	+ (indeed, $X = \text{Cvxh}(X) \cap \mathbb{Z}^d$)
classical convex objects	\approx (but weird sets are convex)
connectedness	- (many convex sets are disconnected)
simple connectedness	- (of course no)
intersection property	+
fast convexity test	+ (quickhull+lattice enumeration)

Usual digital convexity adds connectedness

properties	H -convexity	H -convexity + connectedness
simple, generic	+	-
classical convex objects	\approx	\approx
connectedness	-	\approx (slices unconnected)
simple connectedness	-	- (unclear)
intersection property	+	-
fast convexity test	+	+

[Minsky, Papert 88], [Kim 82], [Kim, Rosenfeld 82], [Hübler, Klette, Voss89], [Ronse 89], [Eckhardt 01] ...

Proposal: full convexity

properties	H -convexity	H -convexity + connect.	Full convexity
simple, generic	+	-	+
classical convex objects	\approx	\approx	+
connectedness	-	\approx	+
simple connectedness	-	-	+
intersection property	+	-	- (but...)
fast convexity test	+	+	+

Proposal: full convexity

properties	H -convexity	H -convexity + connect.	Full convexity
simple, generic	+	-	+
classical convex objects	≈	≈	+
connectedness	-	≈	+
simple connectedness	-	-	+
intersection property	+	-	- (but...)
fast convexity test	+	+	+

Focus of this work

Can we define a fully convex hull operator ?

Can we use it to define polyhedral models ?

Full convexity for polyhedral models in digital spaces

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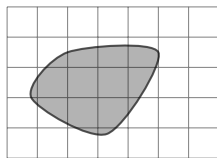
An envelope relative to a fully convex set

Polyhedral models

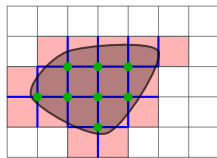
Cubical grid, intersection complex

- ▶ cubical grid complex \mathcal{C}^d
 - ▶ \mathcal{C}_0^d vertices or 0-cells = \mathbb{Z}^d
 - ▶ \mathcal{C}_1^d edges or 1-cells = open unit segment joining 0-cells
 - ▶ \mathcal{C}_2^d faces or 2-cells = open unit square joining 1-cells
 - ▶ ...
- ▶ *intersection complex* of $Y \subset \mathbb{R}^d$

$$\bar{\mathcal{C}}_k^d[Y] := \{c \in \mathcal{C}_k^d, \bar{c} \cap Y \neq \emptyset\}$$



Y



cells $\bar{\mathcal{C}}_0^d[Y]$, $\bar{\mathcal{C}}_1^d[Y]$, $\bar{\mathcal{C}}_2^d[Y]$

What is full convexity ?

Definition (Full convexity [L. 2021])

A non empty subset $X \subset \mathbb{Z}^d$ is *digitally k -convex* for $0 \leq k \leq d$ whenever

$$\bar{C}_k^d[X] = \bar{C}_k^d[\text{Cvxh}(X)]. \quad (1)$$

Subset X is *fully convex* if it is digitally k -convex for all $k, 0 \leq k \leq d$.

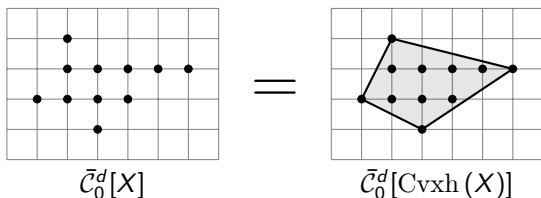
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X is digitally 0-convex

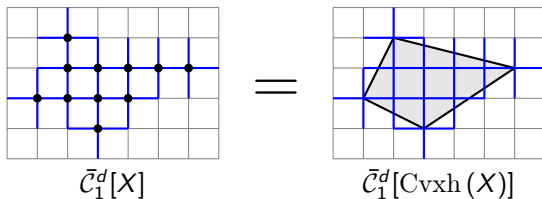
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X is digitally 0-convex, and 1-convex

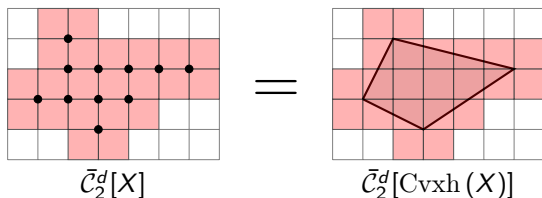
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Subset X is *fully convex* if it is digitally k -convex for all $k, 0 \leq k \leq d$.



X is digitally 0-convex, and 1-convex, and 2-convex, hence fully convex.

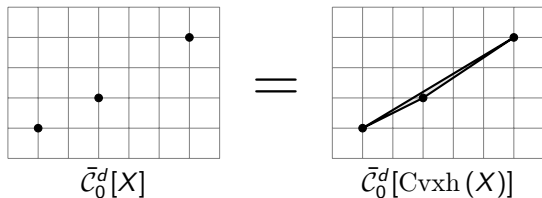
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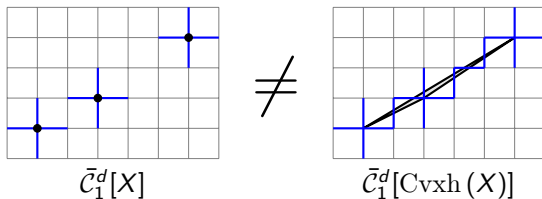
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X is digitally 0-convex, but neither 1-convex

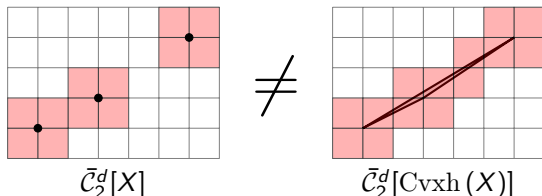
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What is full convexity ?

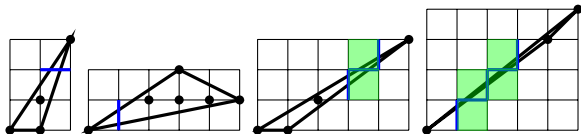
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Subset X is *fully convex* if it is digitally k -convex for all $k, 0 \leq k \leq d$.

Full convexity eliminates too thin digital convex sets in arbitrary dimension.



Some properties of full convexity

Theorem

If the digital set $X \subset \mathbb{Z}^d$ is fully convex, then X is d -connected.

Theorem

*If the digital set $X \subset \mathbb{Z}^d$ is fully convex, then the body of its intersection complex is **simply** connected.*

Theorem

Verifying if a digital set is fully convex requires one convex hull computation and one lattice polytope enumeration.

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Polyhedral models

What about a 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 a digital convex hull ?

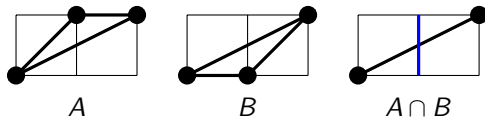
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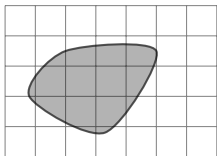
How can we build fully convex sets from arbitrary $A \subset \mathbb{Z}^d$?

Fully convex hull through intersections ?

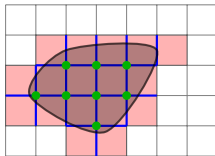
- ▶ half-spaces are fully convex
- ▶ can we intersect support half-spaces to get fully convex hull ?
- ▶ intersections of fully convex sets are not fully convex in general



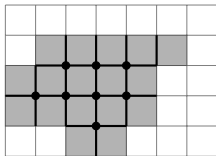
Local operators Star (\cdot), Skeleton (\cdot), Extrema (\cdot)



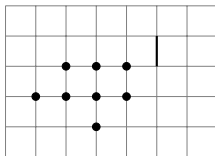
Y



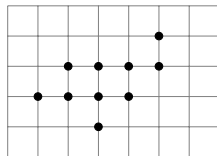
$$\text{Star}(Y) = \bar{C}_0^d[Y] \cup \bar{C}_1^d[Y] \cup \bar{C}_2^d[Y]$$



K



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

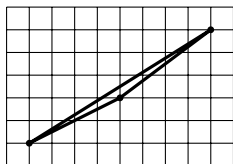


$\text{Extrema}(K')$

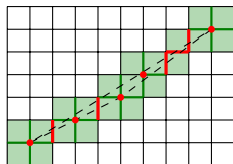
- ▶ For any $Y \subset \mathbb{R}^d$, let $\text{Star}(Y) := \bar{C}^d[Y]$
(coincides with the usual star of combinatorial topology)
- ▶ For any complex $K \subset \mathcal{C}^d$, let $\text{Skeleton}(K) := \bigcap_{K' \subset K \subset \text{Star}(K')} K'$
- ▶ For any complex $K \subset \mathcal{C}^d$,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

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

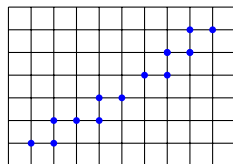
- ▶ Iterative method for computing a fully convex envelope
- ▶ Let $FC(X) := \text{Extrema}(\text{Skeleton}(\text{Star}(\text{Cvxh}(X))))$
- ▶ Iterative composition $FC^n(X) := \underbrace{FC \circ \dots \circ FC(X)}_{n \text{ times}}$
- ▶ *Fully convex envelope* of X is $FC^*(X) := \lim_{n \rightarrow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



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



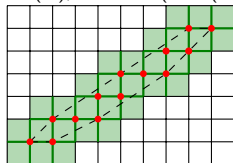
$\text{Star}(Y)$, $\text{Skeleton}(\text{Star}(Y))$



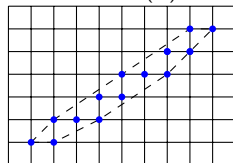
$X' = FC(X)$



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 $\text{FC}^n(X)$.*

Envelope $FC^*(\cdot)$ acts as a fully convex hull operator

Lemma

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

Proof.

$$\begin{aligned} FC(X) &= \text{Extrema}(\text{Skeleton}(\text{Star}(\text{Cvxh}(X)))) \\ &= \text{Extrema}(\text{Skeleton}(\text{Star}(X))) && (X \text{ is assumed fully convex}) \\ &= \text{Extrema}(X) && (\text{Skeleton inverse of star}) \\ &= X && (X \subset \mathbb{Z}^d) \quad \square \end{aligned}$$

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

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

Theorem

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

Envelope $FC^*(\cdot)$ acts as a fully convex hull operator

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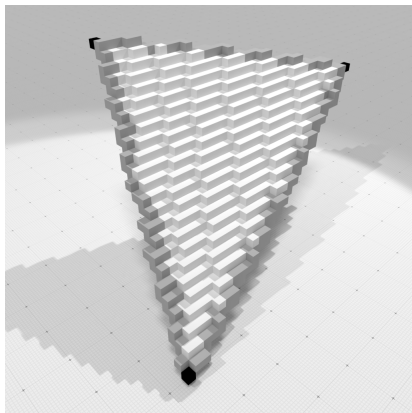
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Theorem

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

A 3D digital triangle

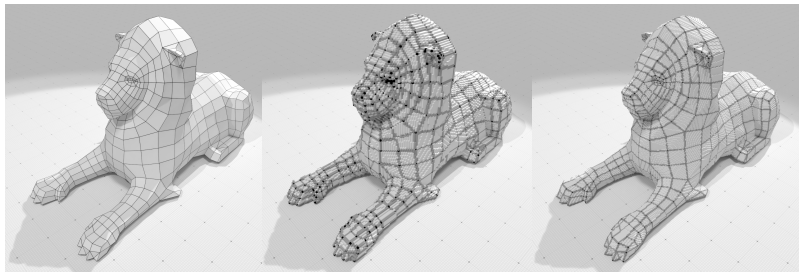


vertices $A = (8, 4, 18)$, $B = (-22, -2, 4)$, $C = (18, -20, -8)$
(black),

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

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

A generic digital polyhedral model



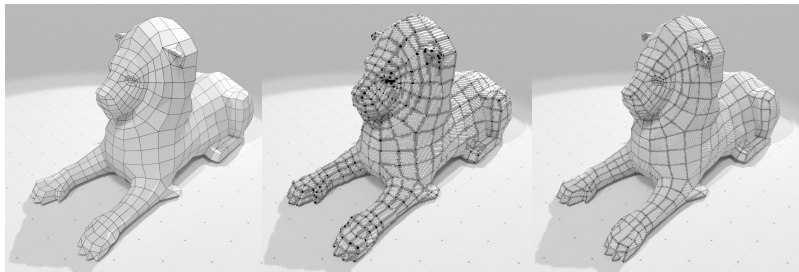
Quad-mesh \mathcal{Q} , non planar faces

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

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

- ▶ combinatorial polyhedron \mathcal{P} made of k -cells (facets, edges, vertices), with incidence relations
- ▶ vertices have integer coordinates
- ▶ a digital k -cell σ with vertices V_σ is $\text{FC}^*(V_\sigma)$

A generic digital polyhedral model



Quad-mesh Q , non planar faces

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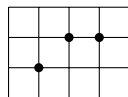
But no control on the thickness of digital facets.

Is the fully convex envelope a hull operator ?

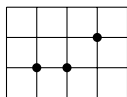
properties	fully convex envelope
$FC^*(A)$ convex	+
$FC^*(A) = A$ (for A fully cvx)	+
idempotence	+
fast computation	\approx (# iterations)
increasing	-

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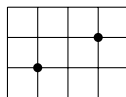
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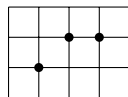
A



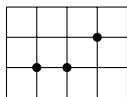
B



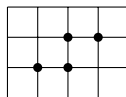
C



$FC^*(A)$



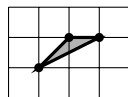
$FC^*(B)$



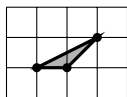
$FC^*(C)$

Is the fully convex envelope a hull operator ?

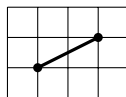
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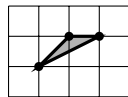
A



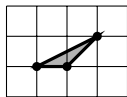
B



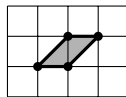
C



$FC^*(A)$



$FC^*(B)$



$FC^*(C)$

Full convexity for polyhedral models in digital spaces

Context and objectives

What is full convexity ?

Fully convex envelope

An envelope relative to a fully convex set

Polyhedral models

A relative fully convex envelope

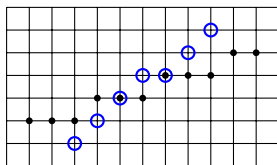
- ▶ For $X \subset Y$, let $\text{FC}_{|Y}(X) := \text{FC}(X) \cap Y$
- ▶ $\text{FC}_{|Y}^n(X) := \text{FC}_{|Y} \circ \dots \circ \text{FC}_{|Y}(X)$, composed n times
- ▶ *Fully convex envelope of X relative to Y is*
 $\text{FC}_{|Y}^*(X) := \lim_{n \rightarrow \infty} \text{FC}_{|Y}^n(X)$
- ▶ we have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

Theorem

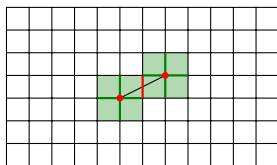
Let $X \subset \mathbb{Z}^d$ and $Y \subset \mathbb{Z}^d$ fully convex.

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

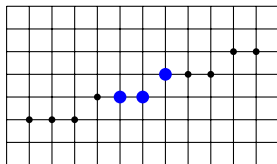
Intersections of fully convex sets



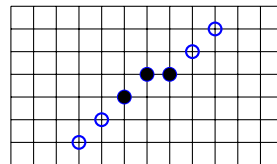
X, Y



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



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



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

Full convexity for polyhedral models in digital spaces

Context and objectives

What is full convexity ?

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Polyhedral models

Polyhedral models (here 3D)

- ▶ combinatorial polyhedron \mathcal{P} made of k -cells (facets, edges, vertices), vertices are simply digital points.
- ▶ thick enough arithmetic planes are fully convex
- ▶ use relative full convexity for facets
- ▶ $T \subset \mathbb{Z}^3$ made of coplanar points,
 $P_1(T)$ (resp. $P_\infty(T)$) is its median standard (resp. naive) plane.

Definition (standard digital polyhedron)

\mathcal{P}_1^* is the collection of digital cells that are 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 $\sigma_1^* := \text{FC}_{|P_1}^*(V(\sigma))$.
- if τ is an edge, then it has as many geometric realizations as incident facets σ : $(\tau, \sigma)_1^* := \text{FC}_{|\sigma_1^*}^*(V(\tau))$.

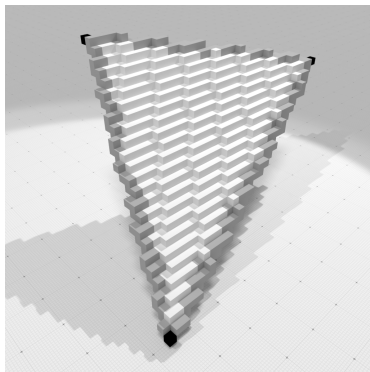
Definition (naive digital polyhedron)

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

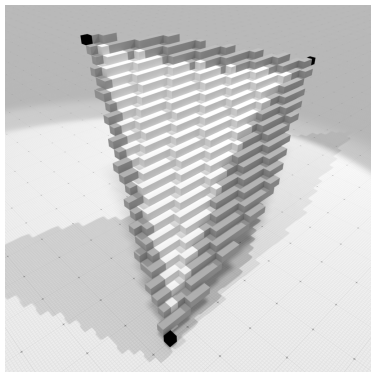
Standard and naive 3D triangle

Theorem

All digital cells are fully convex.



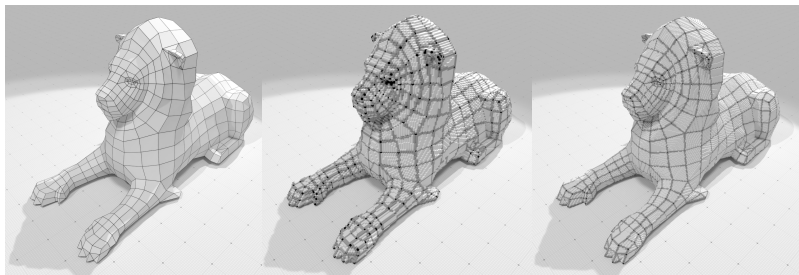
standard triangle \mathcal{T}_1^*
985 points



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

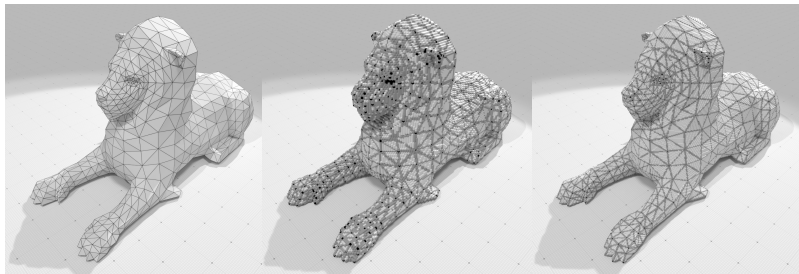


Quad-mesh \mathcal{Q} , non planar faces

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

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

Generic/standard/naive digital polyhedron

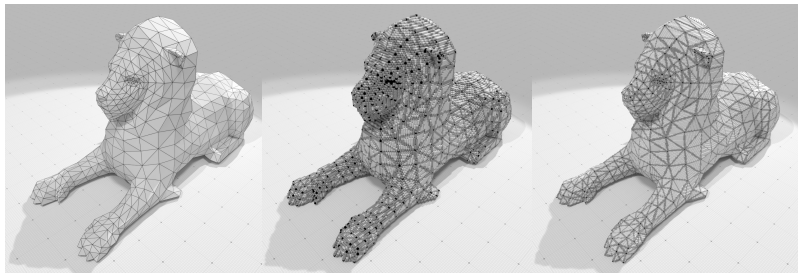


Tri-mesh \mathcal{T} , planar
faces

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

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

Generic/standard/naive digital polyhedron



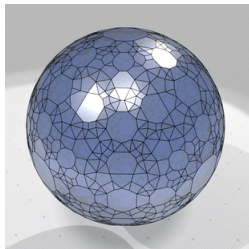
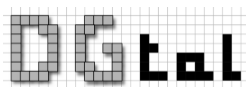
Tri-mesh \mathcal{T} , planar
faces

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

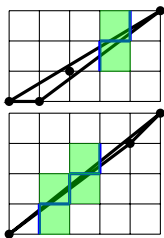
$$\#\mathcal{T}_{\infty}^* = 182451$$

Full convexity packages in DGtal

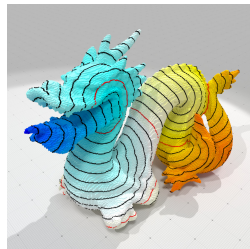
dgtal.org



dD convex hull and Delaunay triangulation



Full convexity in *dD*, tangency, envelope



Local shape analysis, geodesics

- ▶ most of full convexity and applications implemented in DGtal
- ▶ open source library, efficient efficient generic C++
- ▶ a nice tutorial yesterday !

Conclusion

- ▶ an envelope operator for building fully convex set
- ▶ a new characterization of full convexity $X = FC^*(X)$
- ▶ a relative envelope operator
 - ▶ induces asymmetric intersections of fully convex sets
 - ▶ allows fully convex sets within planes
- ▶ polyhedral models with facets that are pieces of planes

Future works

Theoretical side

- ▶ increasingness of envelope still under study
- ▶ redefine intersection of fully convex digital sets
- ▶ new characterization of full convexity
- ▶ arithmetic planes without arithmetic ?

Algorithmic and implementation side

- ▶ fast cell and lattice point enumeration within polytopes
- ▶ faster full convexity tests
- ▶ bound number of iterations of $FC^*(\cdot)$

Explore its natural applications

- ▶ we know how to pass from a polyhedron to a digital polyhedron
- ▶ how can we do the other way around ? Optimal decomposition into fully convex facets ?