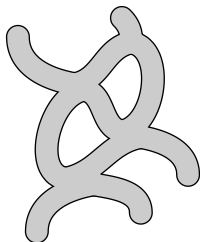


Reeb graph

Definition

Given:

- ▶ a manifold \mathcal{M} ;

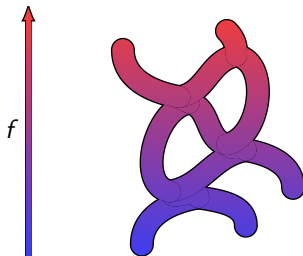


Reeb graph

Definition

Given:

- ▶ a manifold \mathcal{M} ;
- ▶ a Morse function $f: \mathcal{M} \rightarrow \mathbb{R}$ with distinct critical values;



Reeb graph

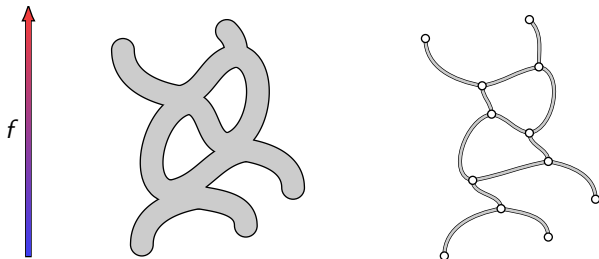
Definition

Given:

- ▶ a manifold \mathcal{M} ;
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the **Reeb graph** of f is the 1-dimensional simplicial complex

$$\mathcal{R}(f) = \mathcal{M}/\sim.$$



Reeb graph

Definition

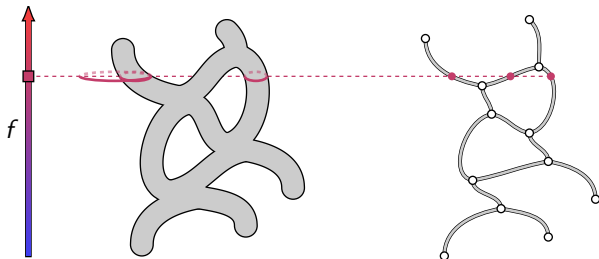
Given:

- ▶ a manifold \mathcal{M} ;
- ▶ a Morse function $f: \mathcal{M} \rightarrow \mathbb{R}$ with distinct critical values;

the **Reeb graph** of f is the 1-dimensional simplicial complex

$$\mathcal{R}(f) = \mathcal{M} / \sim,$$

$x \sim y$ if $f(x) = f(y)$ and they belong to the same connected component of $f^{-1}(f(x))$



Reeb graph

Definition

Given:

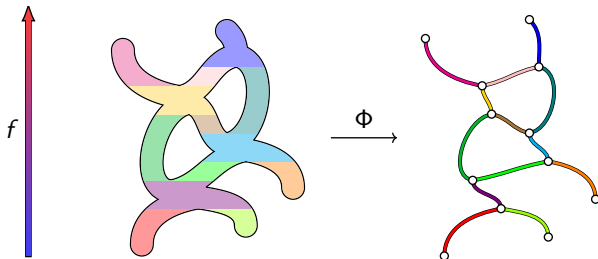
- ▶ a manifold \mathcal{M} ;
- ▶ a Morse function $f: \mathcal{M} \rightarrow \mathbb{R}$ with distinct critical values;

the **Reeb graph** of f is the 1-dimensional simplicial complex

$$\mathcal{R}(f) = \mathcal{M}/\sim.$$

The **segmentation map** is the quotient map

$$\Phi: \mathcal{M} \longrightarrow \mathcal{R}(f).$$

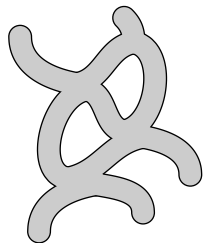


Reeb graph

Desired algorithm

Input:

- ▶ a PL manifold \mathcal{M}

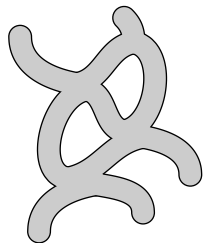


Reeb graph

Desired algorithm

Input:

- ▶ a PL manifold \mathcal{M}
 \rightsquigarrow a triangulated mesh \mathcal{M} ;

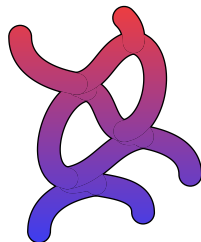


Reeb graph

Desired algorithm

Input:

- ▶ a PL manifold \mathcal{M}
 \rightsquigarrow a triangulated mesh \mathcal{M} ;
- ▶ a non-degenerate PL scalar field f on \mathcal{M}



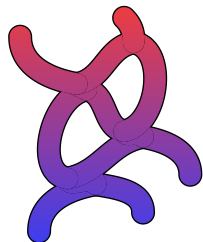
Reeb graph

Desired algorithm

Input:

- ▶ a PL manifold \mathcal{M}
 \rightsquigarrow a triangulated mesh \mathcal{M} ;
- ▶ a non-degenerate PL scalar field f on \mathcal{M}
 \rightsquigarrow a scalar value $f(v)$ for each vertex v of \mathcal{M} .

pairwise different, in order to ensure non-degeneracy; this can be achieved by random perturbations



Reeb graph

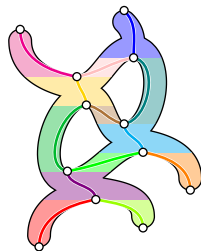
Desired algorithm

Input:

- ▶ a PL manifold \mathcal{M}
 \rightsquigarrow a triangulated mesh \mathcal{M} ;
- ▶ a non-degenerate PL scalar field f on \mathcal{M}
 \rightsquigarrow a scalar value $f(v)$ for each vertex v of \mathcal{M} .

Output:

- ▶ the **augmented** Reeb graph $\mathcal{R}(f)$.
 ↘ graph + segmentation map

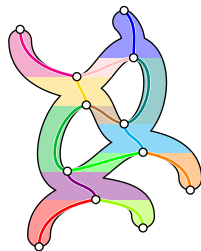


Reeb graph

Desired algorithm

Input:

- ▶ a PL manifold \mathcal{M}
 \rightsquigarrow a triangulated mesh \mathcal{M} ;
- ▶ a non-degenerate PL scalar field f on \mathcal{M}
 \rightsquigarrow a scalar value $f(v)$ for each vertex v of \mathcal{M} .



Output:

- ▶ the augmented Reeb graph $\mathcal{R}(f)$.

Time complexity:

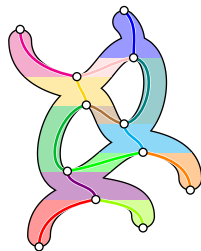
- ▶ $O(m \cdot \log m)$, where m is the size of the 2-skeleton of \mathcal{M} .
 #vertices + #edges + #triangles

Reeb graph

Desired algorithm

Input:

- ▶ a PL manifold \mathcal{M}
 \rightsquigarrow a triangulated mesh \mathcal{M} ;
- ▶ a non-degenerate PL scalar field f on \mathcal{M}
 \rightsquigarrow a scalar value $f(v)$ for each vertex v of \mathcal{M} .



Output:

- ▶ the augmented Reeb graph $\mathcal{R}(f)$.

Time complexity:

- ▶ $O(m \cdot \log m)$, where m is the size of the 2-skeleton of \mathcal{M} .

Parallel.

Reeb graph

Geometry of critical points

There are three kinds of critical points:

Reeb graph

Geometry of critical points

There are three kinds of critical points:

- ▶ (local) **maxima**



Reeb graph

Geometry of critical points

There are three kinds of critical points:

► (local) **maxima**



► (local) **minima**



Reeb graph

Geometry of critical points

There are three kinds of critical points:

▶ (local) **maxima**



▶ (local) **minima**



▶ **saddles**



Reeb graph

Geometry of critical points

There are three kinds of critical points:

► (local) **maxima**



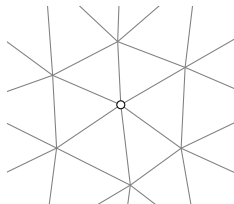
► (local) **minima**



► **saddles**



How to detect them on a PL manifold?



Reeb graph

Geometry of critical points

There are three kinds of critical points:

► (local) **maxima**



► (local) **minima**

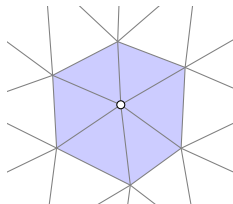


► **saddles**



How to detect them on a PL manifold?

Given a vertex v , the **star** of v is the union of all simplices containing v .



Reeb graph

Geometry of critical points

There are three kinds of critical points:

► (local) **maxima**



► (local) **minima**



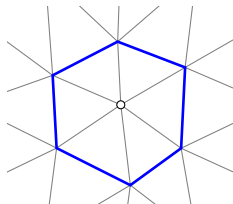
► **saddles**



How to detect them on a PL manifold?

Given a vertex v , the **star** of v is the union of all simplices containing v .

The **link** of v is the boundary of its star.



Reeb graph

Geometry of critical points

There are three kinds of critical points:

► (local) **maxima**



► (local) **minima**



► **saddles**



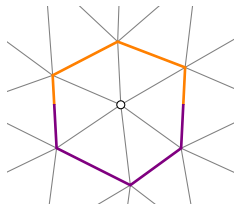
How to detect them on a PL manifold?

Given a vertex v , the **star** of v is the union of all simplices containing v .

The **link** of v is the boundary of its star.

$$\text{Link}^+(v) = \{x \in \text{Link}(v) : f(x) > f(v)\}$$

$$\text{Link}^-(v) = \{x \in \text{Link}(v) : f(x) < f(v)\}$$



Reeb graph

Geometry of critical points

There are three kinds of critical points:

- ▶ (local) **maxima**
 $\rightsquigarrow \text{Link}^+$ empty;
- ▶ (local) **minima**
- ▶ **saddles**



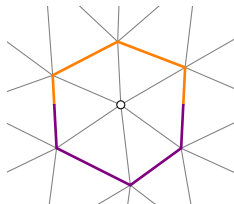
How to detect them on a PL manifold?

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Reeb graph

Geometry of critical points

There are three kinds of critical points:

- ▶ (local) **maxima**
 $\rightsquigarrow \text{Link}^+$ empty;
- ▶ (local) **minima**
 $\rightsquigarrow \text{Link}^-$ empty;
- ▶ **saddles**



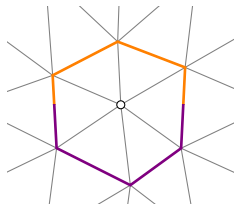
How to detect them on a PL manifold?

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Reeb graph

Geometry of critical points

There are three kinds of critical points:

- ▶ (local) **maxima**

\rightsquigarrow Link^+ empty;



- ▶ (local) **minima**

\rightsquigarrow Link^- empty;



- ▶ **saddles**

\rightsquigarrow Link^+ or Link^- disconnected.



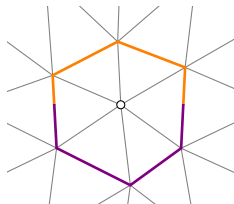
How to detect them on a PL manifold?

Given a vertex v , the **star** of v is the union of all simplices containing v .

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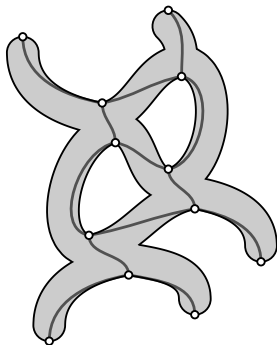
$$\text{Link}^-(v) = \{x \in \text{Link}(v) : f(x) < f(v)\}$$



Reeb graph

Significance of critical points

The critical points of f are closely related to the topology of the Reeb graph $\mathcal{R}(f)$.

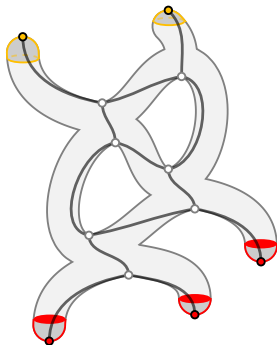


Reeb graph

Significance of critical points

The critical points of f are closely related to the topology of the Reeb graph $\mathcal{R}(f)$.

- **Maxima** and **minima** \rightsquigarrow nodes of valence 1 (leaves).

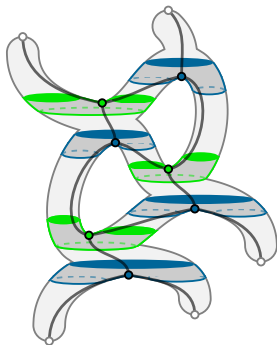


Reeb graph

Significance of critical points

The critical points of f are closely related to the topology of the Reeb graph $\mathcal{R}(f)$.

- ▶ **Maxima** and **minima** \rightsquigarrow nodes of valence 1 (leaves).
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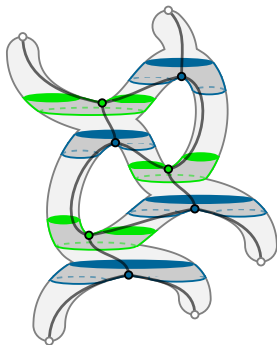


Reeb graph

Significance of critical points

The critical points of f are closely related to the topology of the Reeb graph $\mathcal{R}(f)$.

- ▶ **Maxima** and **minima** \rightsquigarrow nodes of valence 1 (leaves).
- ▶ **Saddles** \rightsquigarrow nodes of valence ≥ 2 .
 - ▶ **Join saddles**: multiple components below.
 - ▶ **Split saddles**: multiple components above.

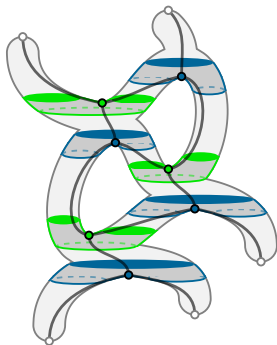


Reeb graph

Significance of critical points

The critical points of f are closely related to the topology of the Reeb graph $\mathcal{R}(f)$.

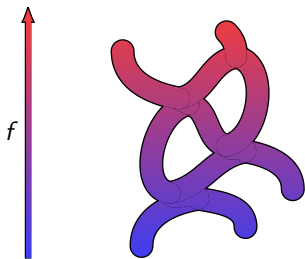
- ▶ **Maxima** and **minima** \rightsquigarrow nodes of valence 1 (leaves).
 - ▶ **Saddles** \rightsquigarrow nodes of valence ≥ 2 .
 - ▶ **Join saddles**: multiple components below.
 - ▶ **Split saddles**: multiple components above.
- } non-mutually exclusive
in dimension ≥ 3



Sequential algorithm

Informal description

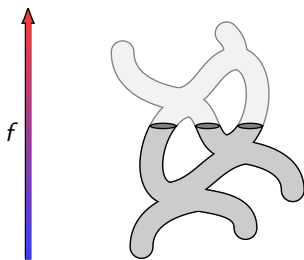
- Process the vertices of the mesh by **increasing** value of f .



Sequential algorithm

Informal description

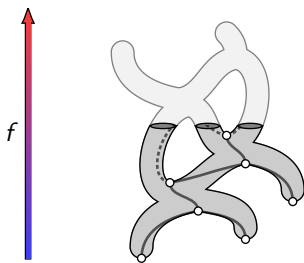
- ▶ Process the vertices of the mesh by **increasing** value of f .
- ▶ Construct the Reeb graph $\mathcal{R}(f)$ incrementally.



Sequential algorithm

Informal description

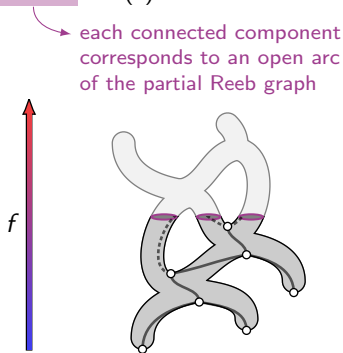
- ▶ Process the vertices of the mesh by **increasing** value of f .
- ▶ Construct the Reeb graph $\mathcal{R}(f)$ incrementally.
- ▶ While sweeping upwards, keep:
 - ▶ the **partial Reeb graph** constructed so far;



Sequential algorithm

Informal description

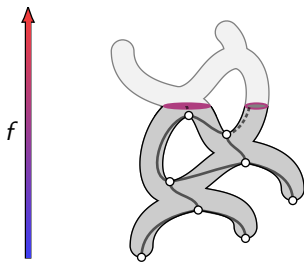
- ▶ Process the vertices of the mesh by **increasing** value of f .
- ▶ Construct the Reeb graph $\mathcal{R}(f)$ incrementally.
- ▶ While sweeping upwards, keep:
 - ▶ the **partial Reeb graph** constructed so far;
 - ▶ the current **level set** $f^{-1}(r)$.



Sequential algorithm

Informal description

- ▶ Process the vertices of the mesh by **increasing** value of f .
- ▶ Construct the Reeb graph $\mathcal{R}(f)$ incrementally.
- ▶ While sweeping upwards, keep:
 - ▶ the **partial Reeb graph** constructed so far;
 - ▶ the current **level set** $f^{-1}(r)$.
- ▶ When processing a vertex, **update** the level set and the Reeb graph accordingly.



Sequential algorithm

The preimage graph

The level set $f^{-1}(r)$ can be represented by an abstract **graph** G_r :

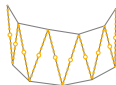


Sequential algorithm

The preimage graph

The level set $f^{-1}(r)$ can be represented by an abstract **graph** G_r :

► **nodes** \rightsquigarrow edges of the mesh \mathcal{M} ;



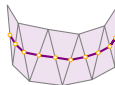
Sequential algorithm

The preimage graph

The level set $f^{-1}(r)$ can be represented by an abstract **graph** G_r :

- ▶ **nodes** \rightsquigarrow edges of the mesh \mathcal{M} ;
- ▶ **arcs** \rightsquigarrow **triangles** of \mathcal{M} intersecting $f^{-1}(r)$.

→ a triangle connects its two
sides intersecting $f^{-1}(r)$

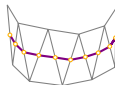


Sequential algorithm

The preimage graph

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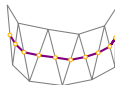
Updating G_r

Sequential algorithm

The preimage graph

The level set $f^{-1}(r)$ can be represented by an abstract **graph** G_r :

- ▶ **nodes** \rightsquigarrow edges of the mesh \mathcal{M} ;
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Updating G_r

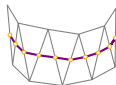
- ▶ **Trigger:** **update** when processing a vertex v .
 \rightarrow from $r = f(v) - \epsilon$ to $r = f(v) + \epsilon$

Sequential algorithm

The preimage graph

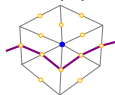
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Updating G_r

- ▶ **Trigger**: update when processing a vertex v .
- ▶ **Action**: process each triangle \mathcal{T} of $\text{Star}(v)$ separately.

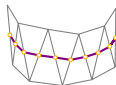


Sequential algorithm

The preimage graph

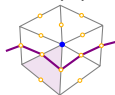
The level set $f^{-1}(r)$ can be represented by an abstract **graph** G_r :

- ▶ **nodes** \rightsquigarrow edges of the mesh \mathcal{M} ;
- ▶ **arcs** \rightsquigarrow triangles of \mathcal{M} intersecting $f^{-1}(r)$.



Updating G_r

- ▶ **Trigger**: update when processing a vertex v .
- ▶ **Action**: process each triangle \mathcal{T} of $\text{Star}(v)$ separately.
 1. v is the upper vertex of \mathcal{T} .

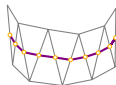


Sequential algorithm

The preimage graph

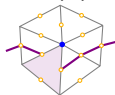
The level set $f^{-1}(r)$ can be represented by an abstract **graph** G_r :

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Updating G_r

- ▶ **Trigger**: update when processing a vertex v .
- ▶ **Action**: process each triangle \mathcal{T} of $\text{Star}(v)$ separately.
 1. v is the upper vertex of \mathcal{T} .

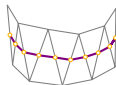


Sequential algorithm

The preimage graph

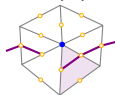
The level set $f^{-1}(r)$ can be represented by an abstract **graph** G_r :

- ▶ **nodes** \rightsquigarrow edges of the mesh \mathcal{M} ;
- ▶ **arcs** \rightsquigarrow triangles of \mathcal{M} intersecting $f^{-1}(r)$.



Updating G_r

- ▶ **Trigger**: update when processing a vertex v .
- ▶ **Action**: process each triangle \mathcal{T} of $\text{Star}(v)$ separately.
 1. v is the upper vertex of \mathcal{T} .

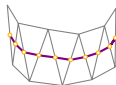


Sequential algorithm

The preimage graph

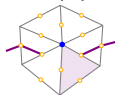
The level set $f^{-1}(r)$ can be represented by an abstract **graph** G_r :

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Updating G_r

- ▶ **Trigger**: update when processing a vertex v .
- ▶ **Action**: process each triangle \mathcal{T} of $\text{Star}(v)$ separately.
 1. v is the upper vertex of \mathcal{T} .

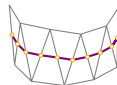


Sequential algorithm

The preimage graph

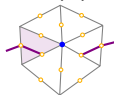
The level set $f^{-1}(r)$ can be represented by an abstract **graph** G_r :

- ▶ **nodes** \rightsquigarrow edges of the mesh \mathcal{M} ;
- ▶ **arcs** \rightsquigarrow triangles of \mathcal{M} intersecting $f^{-1}(r)$.



Updating G_r

- ▶ **Trigger:** update when processing a vertex v .
- ▶ **Action:** process each triangle \mathcal{T} of $\text{Star}(v)$ separately.
 1. v is the upper vertex of \mathcal{T} .
 2. v is the middle vertex of \mathcal{T} .

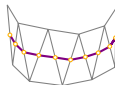


Sequential algorithm

The preimage graph

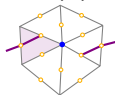
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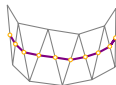


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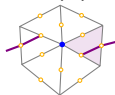
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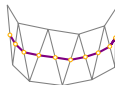


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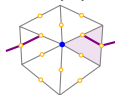
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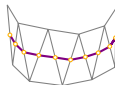


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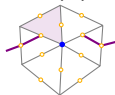
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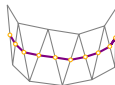


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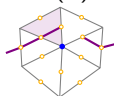
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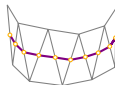


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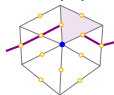
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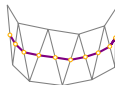


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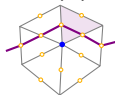
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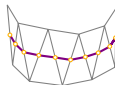


Sequential algorithm

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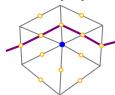
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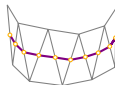


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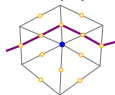
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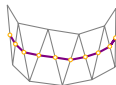


Sequential algorithm

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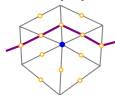
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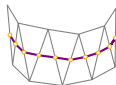


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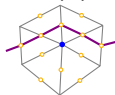
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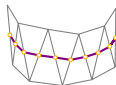
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Sequential algorithm

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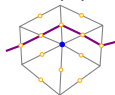
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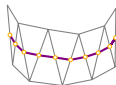
\rightsquigarrow offline dynamic connectivity problem

Sequential algorithm

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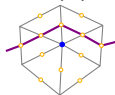
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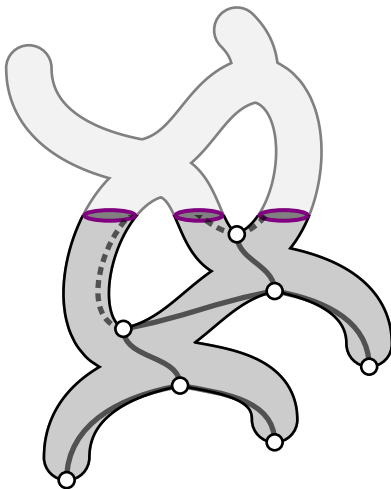
\rightsquigarrow offline dynamic connectivity problem \rightsquigarrow **ST-trees**

support all the operations in $O(\log m)$

Sequential algorithm

The augmented Reeb graph

The partial augmented Reeb graph is represented by a pair (\mathcal{R}, Φ) .

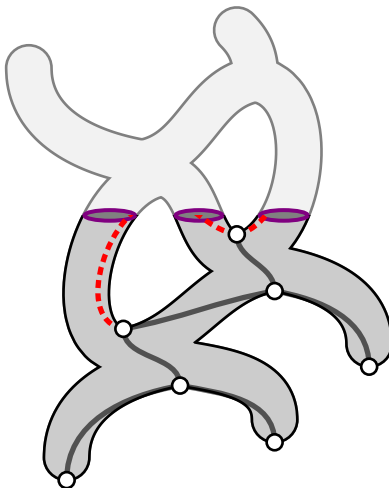


Sequential algorithm

The augmented Reeb graph

Reeb graph constructed so far;
has one **open arc** for each component of G_r

The partial augmented Reeb graph is represented by a pair (\mathcal{R}, Φ) .

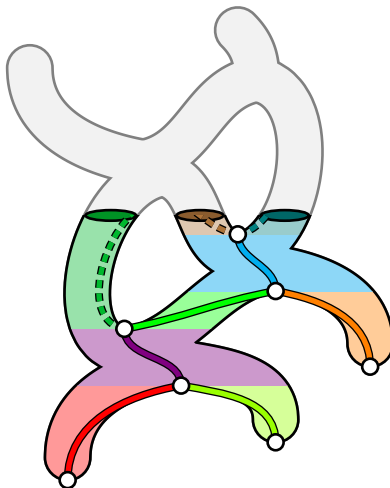


Sequential algorithm

The augmented Reeb graph

The partial augmented Reeb graph is represented by a pair (\mathcal{R}, Φ) .

partial segmentation map;
maps each vertex of the mesh to a node or an arc of \mathcal{R}



Sequential algorithm

The augmented Reeb graph

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Updating (\mathcal{R}, Φ)

When processing a vertex v :

Sequential algorithm


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Updating (\mathcal{R}, Φ)

When processing a vertex v :

1. **Let** $\mathbf{Lc} = \{G_{f(v)-\epsilon}.\text{find}([vv']) : v' \in \text{Link}^-(v)\}.$

 lower components

Sequential algorithm


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Sequential algorithm

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3. **If** $|\mathbf{Lc}| = |\mathbf{Uc}| = 1$ **then**:
 - \mathcal{R} is unchanged;



Sequential algorithm

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 - ▶ \mathcal{R} is unchanged;
 - ▶ $\Phi(v)$ = the **open arc** associated to the lower component.



Sequential algorithm

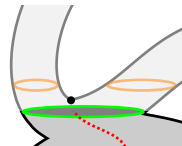
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4. **Otherwise**:



Sequential algorithm

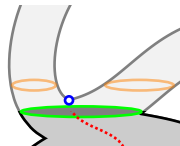
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Sequential algorithm

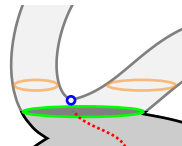
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3. **If** $|\mathbf{Lc}| = |\mathbf{Uc}| = 1$ **then**:
 - ▶ \mathcal{R} is unchanged;
 - ▶ $\Phi(v)$ = the **red arc** associated to the lower component.
4. **Otherwise**:
 - ▶ create a new node w in \mathcal{R} ;
 - ▶ $\Phi(v) = w$;



Sequential algorithm

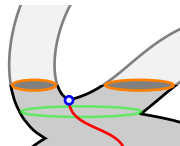
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4. **Otherwise**:
 - ▶ create a new node w in \mathcal{R} ;
 - ▶ $\Phi(v) = w$;
 - ▶ all the open arcs associated to the lower components end at w ;



Sequential algorithm

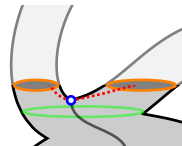
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3. **If** $|\text{Lc}| = |\text{Uc}| = 1$ **then**:
 - ▶ \mathcal{R} is unchanged;
 - ▶ $\Phi(v) =$ the **red arc** associated to the lower component.
4. **Otherwise**:
 - ▶ create a new node w in \mathcal{R} ;
 - ▶ $\Phi(v) = w$;
 - ▶ all the open arcs associated to the lower components end at w ;
 - ▶ open a **new arc** in \mathcal{R} starting at w for each upper component.



Sequential algorithm

Full implementation

input : a triangulated mesh \mathcal{M}
a scalar field f on \mathcal{M}
output : the augmented Reeb graph (\mathcal{R}, Φ)

```
1 begin
2    $\mathcal{R}, \Phi \leftarrow \emptyset$  [graph],  $\emptyset$  [function]
3    $G_r \leftarrow \emptyset$  [ST-tree]
4   sort the vertices of  $\mathcal{M}$  by increasing value of  $f$ 
5   foreach  $v$  vertex of  $\mathcal{M}$  do
6      $L_c \leftarrow \text{GetLowerComponents}(v)$ 
7      $\text{UpdatePreimageGraph}()$ 
8      $U_c \leftarrow \text{GetUpperComponents}(v)$ 
9     if  $|L_c| = |U_c| = 1$  then update  $\Phi(v)$ 
10    else  $\text{UpdateReebGraph}(v, L_c, U_c)$ 
11  end
12  return  $(\mathcal{R}, \Phi)$ 
13 end
```

Parallel algorithm

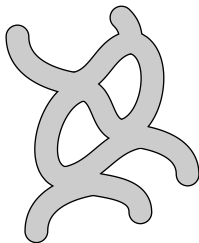
Core ideas

- ▶ **Sequential:** single procedure sweeping all the vertices sequentially.

Parallel algorithm

Core ideas

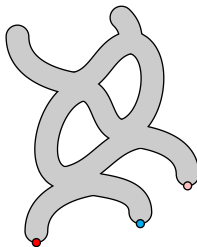
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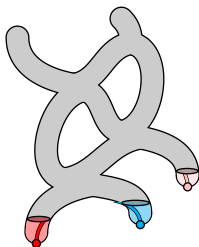
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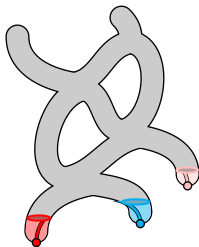
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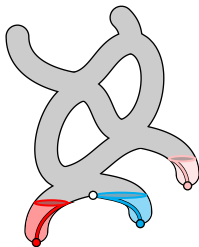
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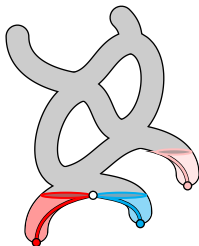
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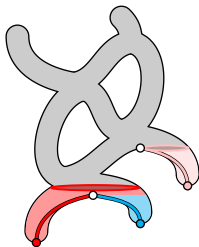
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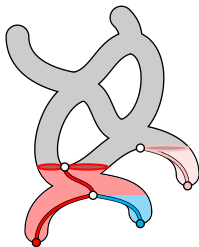
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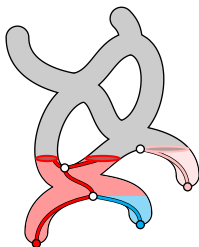
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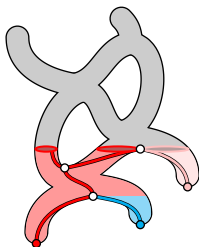
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concretely, update an atomic counter
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 - ▶ join the priority queues (θ) and the preimage graphs (G_r) of all local growths terminated at v ;

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 - ▶ join the priority queues (θ) and the preimage graphs (G_r) of all local growths terminated at v ;
 - ▶ process v as usual.

Parallel algorithm

Local growth implementation

```
1 procedure LocalGrowth( $v_0, \mathcal{R}, \Phi$ )
2    $\theta, G_r \leftarrow \{v_0\}$  [Fibonacci heap],  $\emptyset$  [ST-tree]
3   while  $\theta \neq \emptyset$  do → add  $|\{w \in \text{Link}^-(v) : w \text{ visited by this local growth}\}|$ 
4      $v \leftarrow$  vertex in  $\theta$  with minimal  $f$  value
5     update visitedLower[ $v$ ]
6     if visitedLower[ $v$ ] <  $|\text{Link}^-(v)|$  then
7       append  $(\theta, G_r)$  to pending[ $v$ ]
8       terminate
9     end
10    foreach  $(\theta', G'_r) \in \text{pending}[v]$  do
11       $\theta.\text{join}(\theta')$ ;  $G_r.\text{join}(G'_r)$ 
12    end
13    process  $v$ , updating  $G_r, \mathcal{R}$  and  $\Phi$ 
14    add vertices in  $\text{Link}^+(v)$  to  $\theta$ 
15  end just as in the sequential algorithm ←
16 end
```

critical section

Parallel algorithm

Full implementation

input : a triangulated mesh \mathcal{M}
a scalar field f on \mathcal{M}
output : the augmented Reeb graph (\mathcal{R}, Φ)

```
1 begin
2    $\mathcal{R}, \Phi \leftarrow \emptyset$  [graph],  $\emptyset$  [function]
3    $V \leftarrow \text{FindMinima}(\mathcal{M}, f)$   $\longrightarrow$  easy to run in parallel
4   foreach  $v_0 \in V$  in parallel do
5     | start procedure LocalGrowth( $v_0, \mathcal{R}, \Phi$ )
6   end
7   return  $(\mathcal{R}, \Phi)$ 
8 end
```
