# **Exploring the Laplacian** in Computer Graphics

Crane He Chen The Johns Hopkins University

Week 6



**2023 Fall** 

## **Review questions**

## Where could a function live on triangle meshes?



![](_page_1_Picture_4.jpeg)

![](_page_2_Picture_0.jpeg)

## vertices

# edges

## faces

![](_page_2_Picture_4.jpeg)

![](_page_2_Picture_5.jpeg)

## **Review questions**

## What is the Laplacian?

![](_page_3_Picture_3.jpeg)

![](_page_4_Picture_0.jpeg)

### three dimensional (geometry processing)

### scalar function living on vertices:

Laplacian:

![](_page_4_Picture_4.jpeg)

## beads helps us understand how each bead is different from its neighboring beads

"quality inspector" of beads distribution

![](_page_4_Picture_7.jpeg)

![](_page_4_Picture_8.jpeg)

![](_page_4_Picture_9.jpeg)

knit (the shape)

![](_page_4_Picture_12.jpeg)

![](_page_4_Picture_13.jpeg)

![](_page_5_Picture_0.jpeg)

• Deviation from local average

#### • Sum of second derivatives

#### • Divergence of gradient

Figure stolen from Keenan Crane slides

![](_page_5_Figure_5.jpeg)

![](_page_5_Figure_6.jpeg)

![](_page_5_Figure_7.jpeg)

![](_page_5_Picture_9.jpeg)

## What is the other name of "the Laplacian"? How are they slightly different from each other?

![](_page_6_Picture_3.jpeg)

![](_page_7_Picture_0.jpeg)

![](_page_7_Picture_1.jpeg)

![](_page_7_Picture_2.jpeg)

- "The Laplacian"
- (Euclidean domain)

#### "Laplace-Beltrami Operator"

(curved domain)

![](_page_7_Picture_10.jpeg)

![](_page_8_Picture_0.jpeg)

#### High school: Euclidean space

![](_page_8_Picture_2.jpeg)

Euclid's postulate 5:

![](_page_8_Figure_4.jpeg)

When two straight lines intersect with a line segment, if the sum of the interior angles alpha and beta is less than 180, the two straight lines meet on that side.

![](_page_8_Picture_6.jpeg)

![](_page_8_Figure_7.jpeg)

![](_page_8_Figure_8.jpeg)

![](_page_8_Picture_10.jpeg)

## **Review questions**

# What is Dirichlet energy?

![](_page_9_Picture_3.jpeg)

![](_page_10_Picture_0.jpeg)

Dirichlet energy 
$$\int_{\Omega} \|\nabla g(p)\|^2 dx$$

#### Minimizing Dirichlet energy (as smooth as possible)

![](_page_10_Figure_3.jpeg)

Figure stolen from Keenan Crane slides

## dp

![](_page_10_Figure_6.jpeg)

![](_page_10_Picture_8.jpeg)

## Our Goal Today

## Calculate the Laplacian on **Triangle Meshes**

![](_page_11_Picture_3.jpeg)

## Discrete Laplacian

## function f on vertices

an operator

![](_page_12_Picture_3.jpeg)

![](_page_12_Picture_5.jpeg)

## Discrete Laplacian

## **Options 1 to think about it (weights on vertices)**

![](_page_13_Picture_2.jpeg)

![](_page_13_Picture_3.jpeg)

![](_page_13_Picture_4.jpeg)

#### values (function living on vertices)

![](_page_13_Picture_6.jpeg)

#### weights (the Laplacian)

![](_page_13_Picture_8.jpeg)

![](_page_13_Picture_9.jpeg)

new values (function living on vertices)

![](_page_13_Figure_12.jpeg)

![](_page_13_Picture_13.jpeg)

## **Options 1 to think about it (weights on vertices)**

If there are N vertices on a triangle mesh, the Laplacian can be represented by a NxN table ("matrix") L

 $L_{ii}$  is row i, column j of this table

Applying the Laplacian on function f, we get another function g, where

$$g_j = \sum_{v_j \in V} L_{ij} f_j$$

![](_page_14_Picture_8.jpeg)

## Discrete Laplacian

## **Options 2 to think about it (weights on edges)**

![](_page_15_Picture_2.jpeg)

![](_page_15_Picture_3.jpeg)

![](_page_15_Picture_4.jpeg)

#### weights (the Laplacian)

![](_page_15_Figure_7.jpeg)

![](_page_15_Picture_8.jpeg)

## How to calculate the Laplacian?

## **Options 2 to think about it (weights on edges)**

Applying the Laplacian on function f, we get another function g, where

$$g_j = \sum_{v_j \in Nbr(v_i)} L_{ij}(f_j - f_i)$$

![](_page_16_Figure_4.jpeg)

weights (the Laplacian)

![](_page_16_Picture_7.jpeg)

## **Brainstorm:** What are possible ways to define these edge weights? hint: graph theory

![](_page_16_Picture_11.jpeg)

## How to calculate the Laplacian?

## **Options 2 to think about it (weights on edges)**

Applying the Laplacian on function f, we get another function g, where

 $g_j = \sum L_{ij}(f_j - f_i)$  $v_i \in Nbr(v_i)$ 

Tutte Laplacian:  $L_{ii} = 1$ 

![](_page_17_Figure_5.jpeg)

weights (the Laplacian)

Figure stolen from Misha Kazhdan slides

![](_page_17_Picture_8.jpeg)

![](_page_17_Picture_10.jpeg)

 $L_{ii} = 1$ /valence

![](_page_17_Picture_12.jpeg)

![](_page_17_Picture_13.jpeg)

![](_page_17_Picture_14.jpeg)

## How to calculate the Laplacian?

## **Options 2 to think about it (weights on edges)**

Cotangent Laplacian (most widely used)

$$L_{ij} = \begin{cases} \frac{1}{2} \left( \cot(\alpha_{ij}) + \cot(\beta_{ij}) \right) & \text{if } i \neq j \text{ and } v_j \in \mathbb{N} \\ -\sum_{v_k \in \operatorname{Nbr}(v_i)} L_{ik} & \text{if } i = j \\ 0 & \text{otherwise} \end{cases}$$

Figure stolen from Misha Kazhdan slides

![](_page_18_Picture_5.jpeg)

 $Nbr(v_i)$ 

![](_page_18_Picture_7.jpeg)

![](_page_18_Picture_9.jpeg)

## **Continuous case**

![](_page_19_Picture_2.jpeg)

pinching the rubber sheet

https://cacm.acm.org/news/163925-a-touchscreen-you-can-pinch-poke-and-stretch/fulltext?mobile=false

2.

3.

4.

Pinching introduces a deformation There is a local difference of the height map (the Laplacian of height function) Some local grid squares are stretched, others are compressed, in other words, the change of area (gradient of area) They are both describing the deformation and has a connection

![](_page_19_Picture_7.jpeg)

### **Continuous case**

![](_page_20_Picture_2.jpeg)

If the value of the function at vertex v is the position of *v*, then the Laplacian of the function at *v* should be the area gradient.

### pinching the rubber sheet

https://cacm.acm.org/news/163925-a-touchscreen-you-can-pinch-poke-and-stretch/fulltext?mobile=false

![](_page_20_Picture_7.jpeg)

### **Discrete case**

Desirable properties for the discrete Laplacian

- Sparsity (only neighbors, no effect from distant vertices)
- Positivity (when averaging neighboring values, we want non-negative weights) • Symmetry (this inherits from continuous setting)
- Linear Precision (If the mesh lives in a plane and the function values are obtained by sampling a linear function, the Laplacian of the function should be zero.)

![](_page_21_Picture_10.jpeg)

### **Discrete case**

#### Given a triangle (o, p, q), what direction should we move o, in order to maximally increase the area?

![](_page_22_Figure_3.jpeg)

Stolen from Misha Kazhdan slides

![](_page_22_Picture_6.jpeg)

![](_page_22_Picture_8.jpeg)

### **Discrete case**

Given a triangle (o, p, q), what direction should we move o, in order to maximally increase the area?

The area of triangle is half base times height. If we set pq as the base, we would want o to move in the direction perpendicular to pq.

0

Stolen from Misha Kazhdan slides

![](_page_23_Picture_7.jpeg)

![](_page_23_Picture_9.jpeg)

### **Discrete case**

#### If we take a step size eps in that direction, how will the area change?

![](_page_24_Figure_3.jpeg)

Stolen from Misha Kazhdan slides

![](_page_24_Picture_6.jpeg)

![](_page_24_Picture_8.jpeg)

### **Discrete case**

#### If we take a step size $\epsilon$ in that direction, how will the area change?

 $\epsilon |p-q|/2$ 

![](_page_25_Figure_4.jpeg)

Stolen from Misha Kazhdan slides

![](_page_25_Picture_7.jpeg)

![](_page_25_Picture_9.jpeg)

### **Discrete case**

#### Therefore, the gradient is the vector perpendicular to pq, with the length |p-q|/2.

0

Stolen from Misha Kazhdan slides

![](_page_26_Picture_5.jpeg)

![](_page_26_Picture_6.jpeg)

![](_page_26_Picture_8.jpeg)

### **Discrete case**

The area of triangle is half base times height. If we set pq as the base, we would want o to move in the direction perpendicular to pq.

0

Stolen from Misha Kazhdan slides

![](_page_27_Picture_5.jpeg)

![](_page_27_Picture_7.jpeg)

### **Discrete case**

 $\frac{1}{2}(\cot(\beta)p + \cot(\gamma)q)$ 

![](_page_28_Figure_3.jpeg)

Stolen from Misha Kazhdan slides

What's the vector perpendicular to p-q and with length |p-q|/2?After derivations (details given at the "Other Resources"), we have

![](_page_28_Picture_8.jpeg)

### **Discrete case**

#### This leads to the cotangent Laplacian:

$$L_{ij} = \begin{cases} \frac{1}{2} (\cot(\alpha_{ij}) + \cot(\beta)_{ij}) & \text{if } i \neq 0\\ -\sum L_{ik} & \text{if } i = 0\\ 0 & \text{otherwise} \end{cases}$$

Stolen from Misha Kazhdan slides

 $\neq j, v_j \in Nbr(v_i)$ = jerwise

![](_page_29_Picture_8.jpeg)

## Take-aways from Today's Lecture

- You learned Tutte Laplacian, Graph Laplacian
- You learned cotangent Laplacian

## • You learned two options to understand Laplacian as "weights"

![](_page_30_Picture_9.jpeg)

## **Pair-Coding**

# More gears for art contest!

#### decimation

![](_page_31_Figure_3.jpeg)

#### cubic stylization

![](_page_31_Picture_5.jpeg)

https://www.dgp.toronto.edu/projects/swept-volumes/ https://www.dgp.toronto.edu/projects/cubic-stylization/

https://github.com/HeCraneChen/curvature-qslim-mesh-decimation

swept volume

![](_page_31_Picture_9.jpeg)

![](_page_31_Picture_11.jpeg)

![](_page_32_Picture_0.jpeg)

# Now, your turn!

We'll wok on coloring the bunny together!

Go to the course Github page to download code!

![](_page_32_Picture_6.jpeg)

## **Pair-Coding**

```
int main(int argc, char *argv[])
{
 using namespace Eigen;
 using namespace std;
```

```
// variable definition
Eigen::MatrixXd V, PD1, PD2, PV1, PV2;
Eigen::MatrixXi F;
Eigen::VectorXd total_curvature, total_curvature_vis;
// calculate total curvature
igl::read_triangle_mesh("../data/BigBuckBunny.ply",V,F);
igl::principal_curvature(V, F, PD1, PD2, PV1, PV2);
total_curvature = PV1.array().square() + PV2.array().square();
total_curvature_vis = total_curvature.array().pow(0.01);
// visualization
polyscope::init();
polyscope::options::groundPlaneMode = polyscope::GroundPlaneMode::ShadowOnly;
auto psMesh = polyscope::registerSurfaceMesh("bunny", V, F);
auto TotalCurvature = polyscope::getSurfaceMesh("bunny");
auto ScalarQuantity1 = TotalCurvature->addVertexScalarQuantity("TotalCurvature", total_curvature_vis);
ScalarQuantity1->setColorMap("jet");
```

```
ScalarQuantity1->setEnabled(true);
polyscope::options::shadowDarkness = 0.1;
polyscope::show();
```

![](_page_33_Picture_8.jpeg)

# Are There Any Questions?

![](_page_34_Picture_1.jpeg)

![](_page_34_Picture_2.jpeg)