

# A Flexible C++ Library for Wavelet Transforms of 3-D Polygon Meshes

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# Abstract

- **Polygon meshes:** modelling 3-D objects by joined planar polygons.
  - **Triangle meshes:** all polygons being triangles.



- **Subdivision:** characterizes a smooth surface by a simple mesh.



subdivision

- **Multiresolution analysis and wavelet transforms:** represent a complicated mesh in multiple levels of detail (resolutions).



wavelet transform

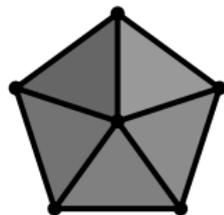
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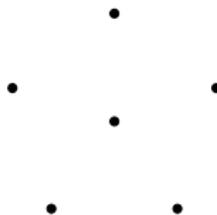
# Polygon Meshes

# Polygon Mesh

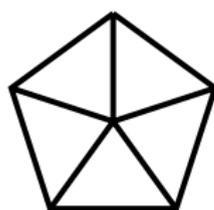
- Primitives: vertices, edges, and faces.



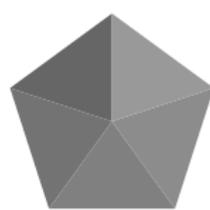
(a) Mesh



(b) Vertices



(c) Edges



(d) Faces

- **Geometry:** positions of vertices.
- **Topology:** adjacency relationships between vertices, edges, and faces.
- **Boundary edge:** has exactly one incident face.
- **Interior edge:** has exactly two incident faces.
- **Boundary vertex:** has exactly two incident boundary edges.
- **Interior vertex:** has incident interior edges only.
- **Closed mesh:** has no boundary edges.

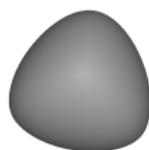
# Subdivision

# Subdivision

- Subdivision algorithmically inserts vertices, edges, and faces to a simple control mesh to yield a refined one.
- A refined mesh can be obtained by several round of subdivision.



(a) Control mesh.



(b) Repetitive subdivision.

(c) Refined mesh.

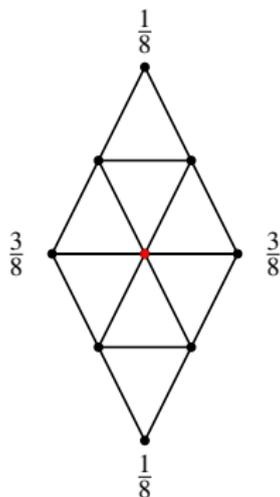
- Subdivision is defined by two rules: 1) **topologic refinement rules** and 2) **geometric refinement rules**.

# Primal Triangle Quadrissection (PTQ)

- A topologic refinement rule defined on triangle meshes.
- Each triangle is split into four to insert new vertices and edges:
  - ① insert a vertex on each edge.
  - ② connect the new vertices by edges to split each triangle.
  
- The obtained mesh is said to have **subdivision connectivity** (PTQ connectivity).

# Geometric Refinement Rules

- A geometric refinement rule modifies the positions of new vertices (and probably old vertices).
- The vertices whose positions will be updated are called **target vertices**.
- The vertices that participate in the computation are called **support vertices**.
- A geometric refinement rule is defined by a mask.
- A mask specifies the target vertex and support vertices and their weights.
- The position of a target vertex is updated by weighted sum of vertices on a mask.



# Loop Subdivision

- 1 Apply PTQ.
- 2 Apply Mask I to each new interior vertex  $v_e$ :

$$v_e = \frac{3}{8}(v_1 + v_2) + \frac{1}{8}(v_3 + v_4).$$

- 3 Apply Mask II to each old interior vertex  $v$ :

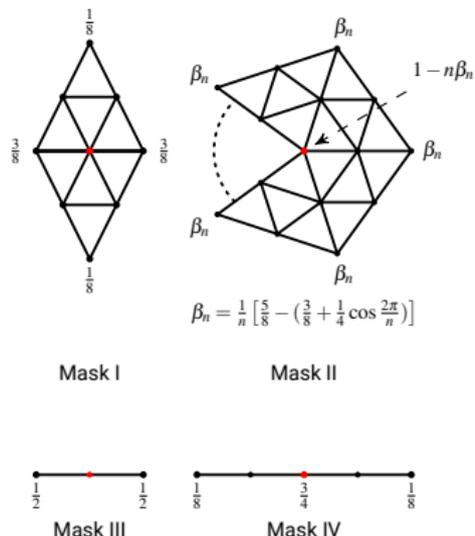
$$v' = (1 - n\beta_n)v + \beta_n \sum_{i=1}^n v_i.$$

- 4 Apply Mask III to each new boundary vertex  $v_e$ :

$$v_e = \frac{1}{2}(v_1 + v_2).$$

- 5 Apply Mask IV to each old boundary vertex  $v$ :

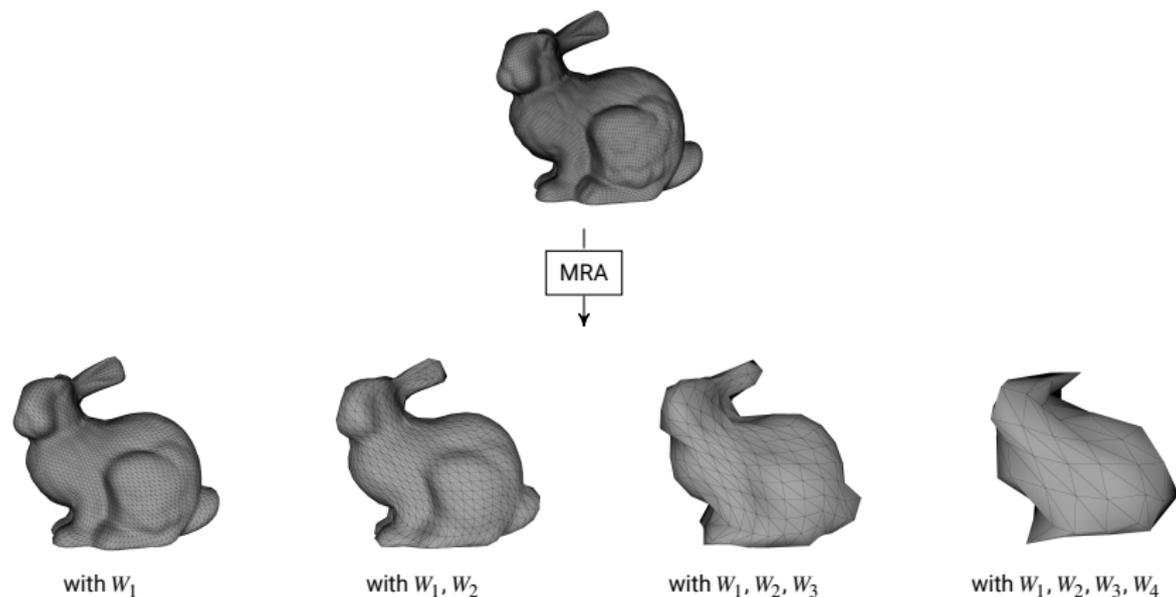
$$v' = \frac{3}{4}v + \frac{1}{2}(v_1 + v_2).$$



# Multiresolution Analysis and Wavelet Transforms

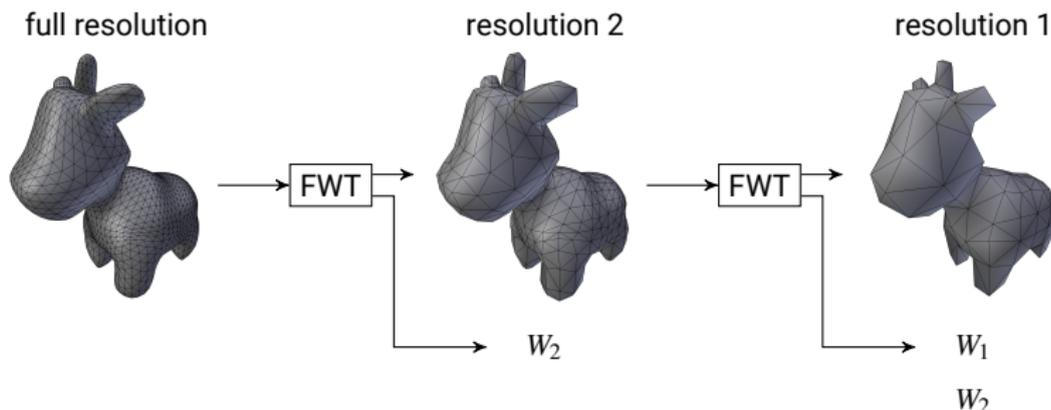
# Multiresolution Analysis (MRA)

- MRA represents a complicated mesh in a multiresolution form: a coarse approximation in the lowest resolution and sets of wavelet coefficient that encode information in each higher resolutions.



# Wavelet Transform I

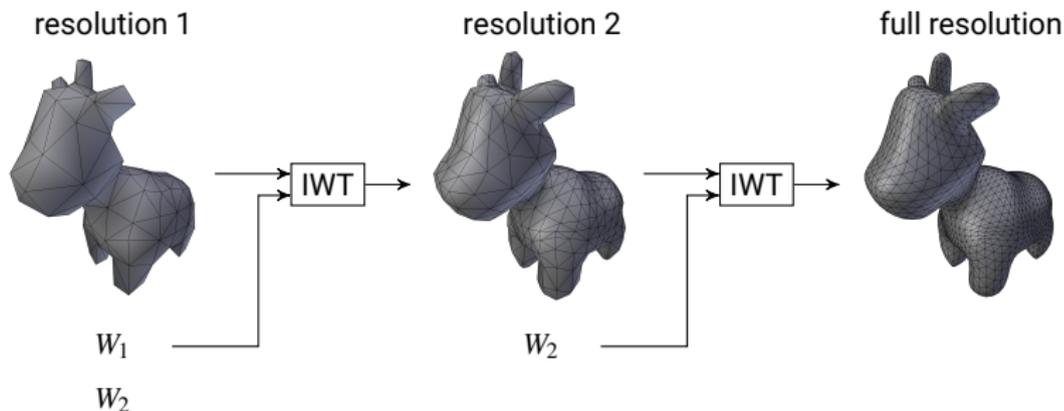
- A multiresolution analysis is associated with a wavelet transform.
- A level of **forward wavelet transform** (FWT) yields a coarse mesh in the next lower resolution and a set of wavelet coefficients.



- A FWT requires subdivision connectivity [1], which guarantees the existence of a multiresolution analysis.

# Wavelet Transform II

- A level of **inverse wavelet transform** (IWT) incorporate a set of wavelet coefficients into a coarse mesh to recover the mesh in the next higher resolution.



# Lifting Scheme and Lifted Wavelet Transforms

# Lifting Scheme

- a framework, proposed by Sweldens [3], for designing, analyzing, and implementing a WT.
- can yield the inverse transform trivially.
- can compute the WT in linear time.
- computation steps:
  - 1 partition data into disjoint sets.
  - 2 lifting step: add (subtract) a filtered version of other sets to (from) a set.
  - 3 scaling step: multiply (divide) a set by a scalar.

# Lifted Wavelet Transforms

- IWT (one level):
  - ① Refine the mesh by a topologic refinement rule (naturally classify vertices as old and new vertex sets).
  - ② Initialize the positions of new vertices with wavelet coefficients.
  - ③ Perform cascaded lifting steps and scaling steps.
- FWT (one level):
  - ① Partition vertices based on subdivision connectivity. For PTQ connectivity, vertices are classified into old and new vertex sets.
  - ② Perform reversed lifting steps and scaling steps.
  - ③ Coarsen mesh (new vertices become wavelet coefficients).



(a) One level IWT.

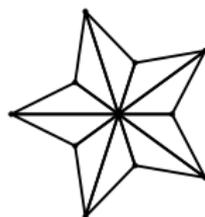
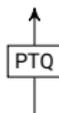
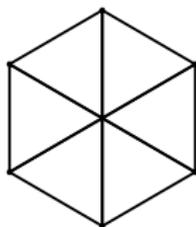
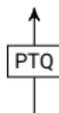
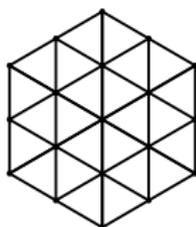
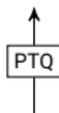
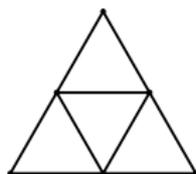


(b) One level FWT.

# Vertex Partition and Coarsening I

## Topologic examples

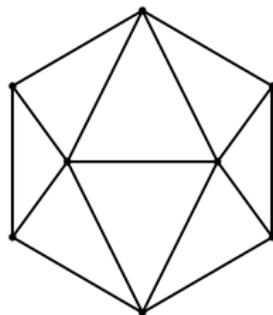
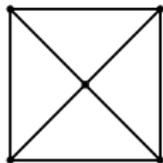
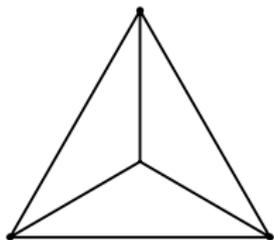
- Partitioning depends on subdivision connectivity.
- Examples with PTQ connectivity:



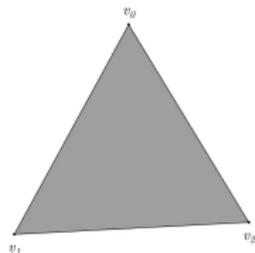
# Vertex Partition and Coarsening II

## Topologic examples

- Examples without PTQ connectivity:



- Taubin's **covering mesh** method [4] (consider topology only).
  - 1 Construct tiles by reversing PTQ on each triangle.



- 2 Group tiles by connectivity.
- 3 Check if a group of tiles can yield the topology of the original mesh.

# PTQ Connectivity Detection

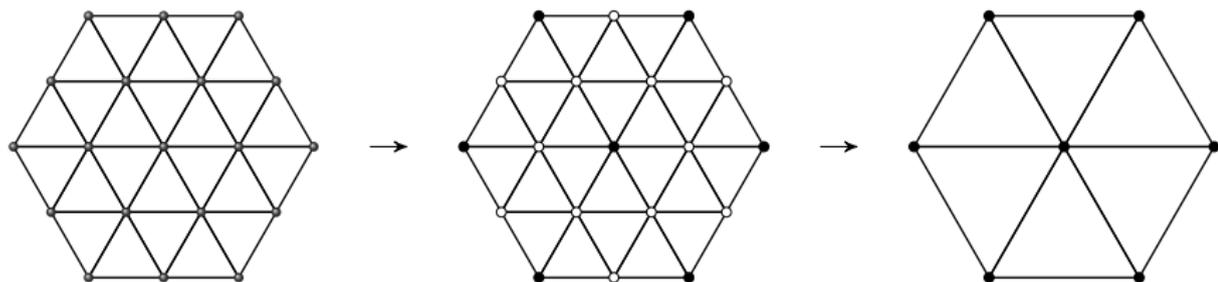
Construct tiles

# PTQ Connectivity Detection

Filter tiles

# Coarsening

- Identify the vertices introduced by PTQ (new vertices).
- Remove the new vertices and the edges that connect them.



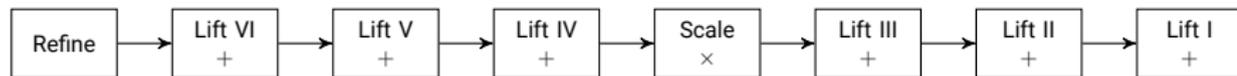
- an old vertex
- a new vertex

# Lifted Loop WT

- defined on triangle meshes with or without boundaries.
- proposed by Bertram [5] and Wang et al. [6].
- consists of six lifting steps and one scaling step.



Operations in the FWT



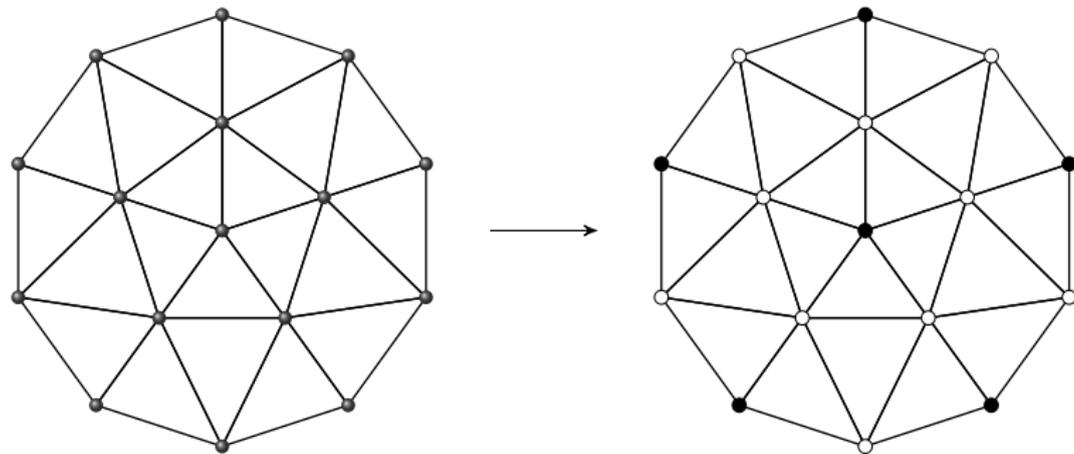
Operations in the IWT

- partition vertices in two groups: new vertices and old vertices.

# Lifted Loop FWT

## Vertex Parition

- 1 Detect PTQ connectivity and classify vertices as new vertices and old vertices.



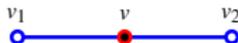
● an old vertex

○ a new vertex

# Lifted Loop FWT

- 2 Lift an old boundary vertex  $v$  by new boundary vertices  $v_1$  and  $v_2$ :

$$v' = v - \frac{1}{4}(v_1 + v_2)$$



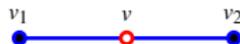
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- 3 Lift a new boundary vertex  $v$  by old boundary vertices  $v_1$  and  $v_2$ :

$$v' = v - \frac{1}{2}(v_1 + v_2)$$



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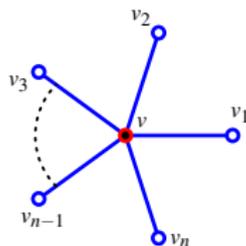
$$v' = v - \frac{1}{4}(v_1 + v_2)$$

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$$v' = v - \frac{1}{2}(v_1 + v_2)$$

- 4 Lift an old interior vertex  $v$  by  $n$  new interior vertices  $\{v_i\}$ :

$$v' = v - \delta_n \sum_{i=1}^n v_i$$



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- 5 Scale an old interior vertex  $v$  with a valence  $n$  by a scalar:

$$v' = \frac{v}{\beta_n}$$

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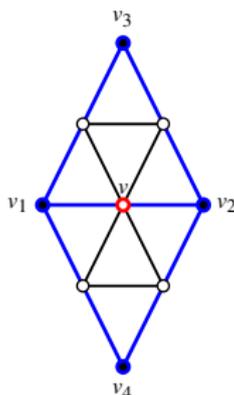
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- 5 Scale an old interior vertex  $v$  with a valence  $n$  by a scalar:

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- 6 Lift a new interior vertex  $v$  by old vertices  $v_1, v_2, v_3,$  and  $v_4$ :

$$v' = v - \left[ \frac{3}{8}(v_1 + v_2) + \frac{1}{8}(v_3 + v_4) \right]$$



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- 5 Scale an old interior vertex  $v$  with a valence  $n$  by a scalar:

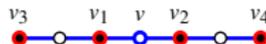
$$v' = \frac{v}{\beta_n}$$

- 6 Lift a new interior vertex  $v$  by old vertices  $v_1, v_2, v_3,$  and  $v_4$ :

$$v' = v - \left[ \frac{3}{8}(v_1 + v_2) + \frac{1}{8}(v_3 + v_4) \right]$$

- 7 Lift old boundary vertices  $v_1, v_2, v_3,$  and  $v_4$  by a new boundary vertex  $v$ :

$$v'_i = v_i - \eta_i v \quad \forall i = 1, 2, 3, 4$$



# Lifted Loop FWT

- 2 Lift an old boundary vertex  $v$  by new boundary vertices  $v_1$  and  $v_2$ :

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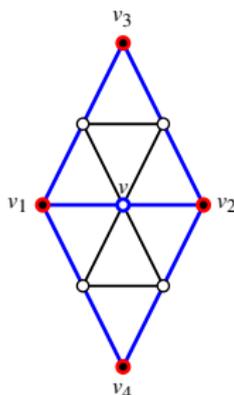
$$v' = v - \left[ \frac{3}{8}(v_1 + v_2) + \frac{1}{8}(v_3 + v_4) \right]$$

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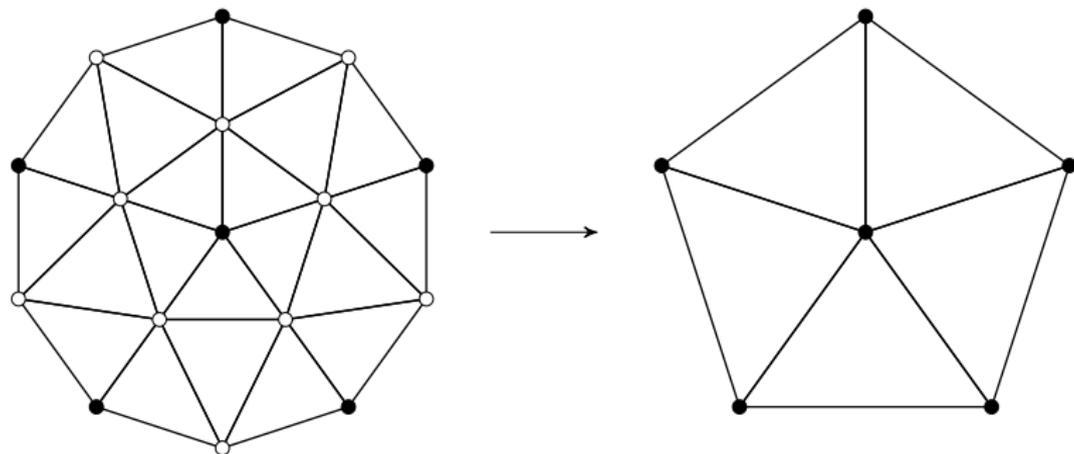
$$v'_i = v_i - \omega_i v \quad \forall i = 1, 2, 3, 4$$



# Lifted Loop FWT

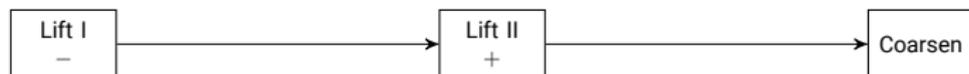
## Coarsening

- 9 Remove the new vertices from the mesh.



# Lifted Butterfly WT

- defined on closed triangle meshes.
- proposed by Sweldens [2].
- consists of two lifting steps.



Operations in the FWT.



Operations in the IWT.

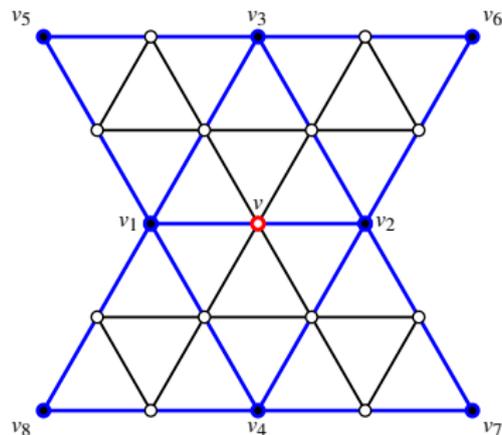
- partition vertices in two groups: new vertices and old vertices.

# Lifted Butterfly FWT

## Lifting I

- 1 Lift a new vertex  $v$  by old vertices  $\{v_i\}_{i=1}^8$ :

$$v' = v - \left[ \frac{1}{2}(v_1 + v_2) + \frac{1}{8}(v_3 + v_4) - \frac{1}{16}(v_5 + v_6 + v_7 + v_8) \right]$$



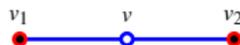
# Lifted Butterfly FWT

## Lifting II

- ② Lift old vertices  $\{v_i\}_{i=1}^2$  by a new vertex  $v$ :

$$v'_i = v_i + s_i v \quad \forall i = 1, 2$$
$$s_i = \frac{4^{L-j} - 1}{2 \left[ 1 + \frac{n}{6} (4^{L-j-1} - 1) \right]}$$

$L$  is the number of levels, and  $j \in \{1, 2, \dots, L\}$  is the current level.



# Wavelet Transform Toolkit

- Wavelet Transform Toolkit:

-  <https://github.com/uvic-aurora/wtt.git>
- a C++ header-only library for defining and computing lifted wavelet transforms.
- wavelet-based application programs.

- Library:

- an application programming interface (API) for defining custom wavelet transforms.
- built-in functions that implement Loop and Butterfly wavelet transforms, detecting PTQ connectivity, PTQ-based coarsening and refinement, etc.

- Application programs:

- FWT and IWT computations.
- wavelet-based compression, approximation, and denoising.

# Wavelet Transform Toolkit

- can compute FWT in  $O(n \log n)$  time and IWT in  $O(n)$  time on a mesh with  $n$  vertices.
- can compute FWT and IWT with  $O(n)$  memory on a mesh with  $n$  vertices.
- Execution time and memory cost (collected on a computer with Core i7-8700k CPU and 32GB RAM):

Name	Vertices	Time (ms)				Memory (MB)	
		Butterfly		Loop		FWT	IWT
		FWT	IWT	FWT	IWT		
torus	12288	13.40	8.00	14.40	8.00	13.8	8.3
bunny	24578	31.20	14.90	34.00	14.70	27.6	16.6
bulb	28162	52.40	23.60	58.00	30.00	31.6	18.9
dragon	32000	64.00	30.60	77.10	33.20	35.9	21.4
torusknot	40960	90.00	35.80	103.00	45.10	45.9	27.1
kid	49154	98.20	45.80	108.20	48.50	55.1	33.2
horse	65538	154.41	69.00	161.61	76.70	73.4	43.7
gargoyle	65538	156.71	70.00	167.51	74.80	73.4	43.7
tyra	98306	241.41	113.00	254.31	120.81	110.1	66.3
vase	196610	503.52	242.21	521.02	254.51	220.2	132.5
armardillo	262146	701.13	344.22	746.93	363.02	293.6	174.6
cow	393218	1080.00	509.12	1130.00	534.72	440.4	265.1
venus	1048578	3120.00	1420.00	3250.00	1500.0	1174.4	698.4

# Demonstration

# Q & A



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The Visual Computer, 2001



[Bertram, M.](#)

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