



# Mesh Compression

Ligang Liu

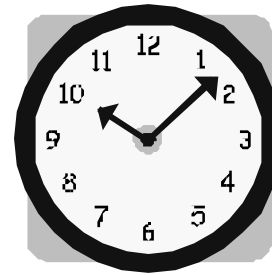
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# Problem

- Delays in accessing 3D mesh models
  - Online games, viewer, search engine...

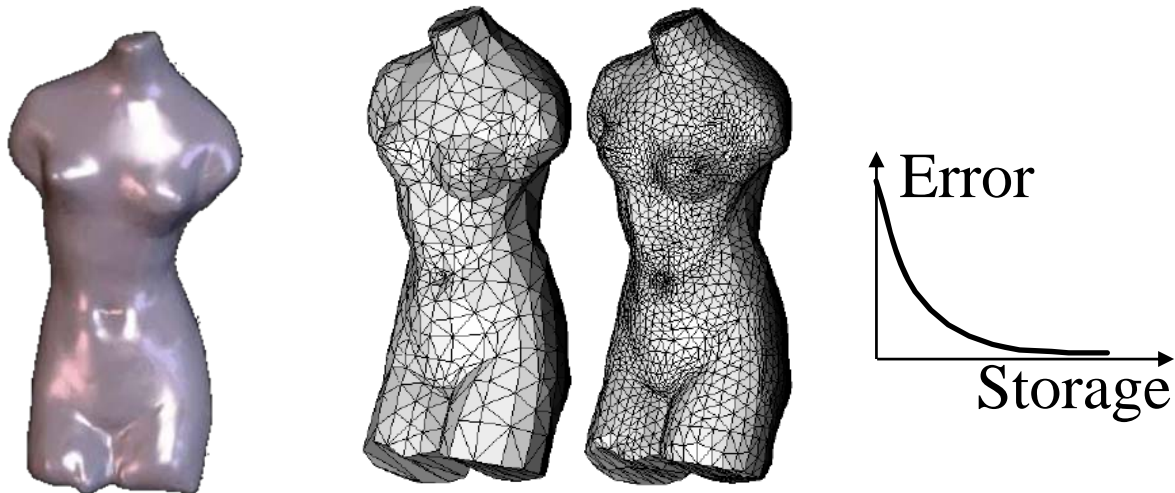


# Motivation

- Bandwidth
  - Communicate large complex & highly detailed 3D models through low-bandwidth connection (e.g. VRML over the Internet)
- Storage
  - Store large & complex 3D models (e.g. 3D scanner output)

# Storage size depends on

- The shape, topology, and attributes of the **model**
- Choice of **representation**
- Acceptable **accuracy** loss
- **Compression** used

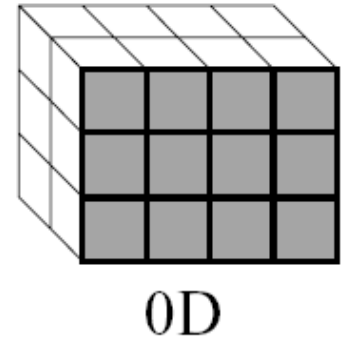
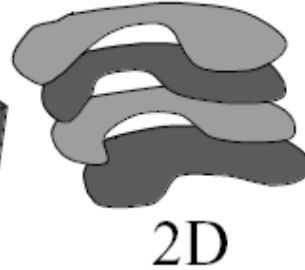
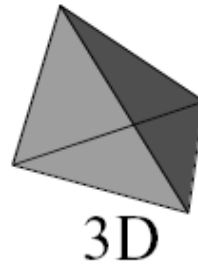


# Representations of 3D Models

(Regularly) spaced samples: 3D primitives

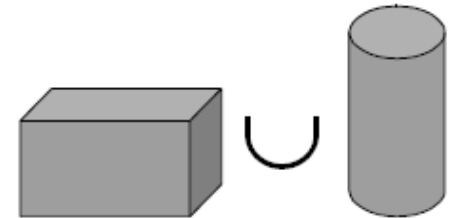
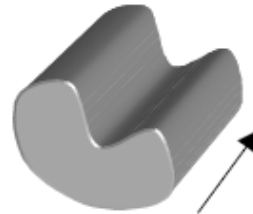
- **Volume decomposition**

- Tetrahedra
- Extrusions (slices, rays)
- Voxels (octrees)



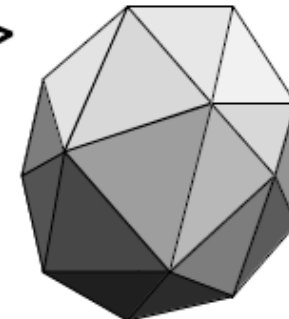
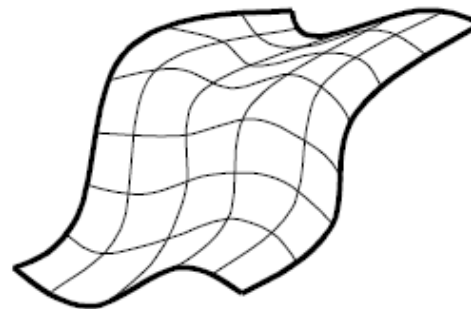
- **Procedural (constructive) representations**

- CSG, R-sets
- Sweeps, Minkowski sums

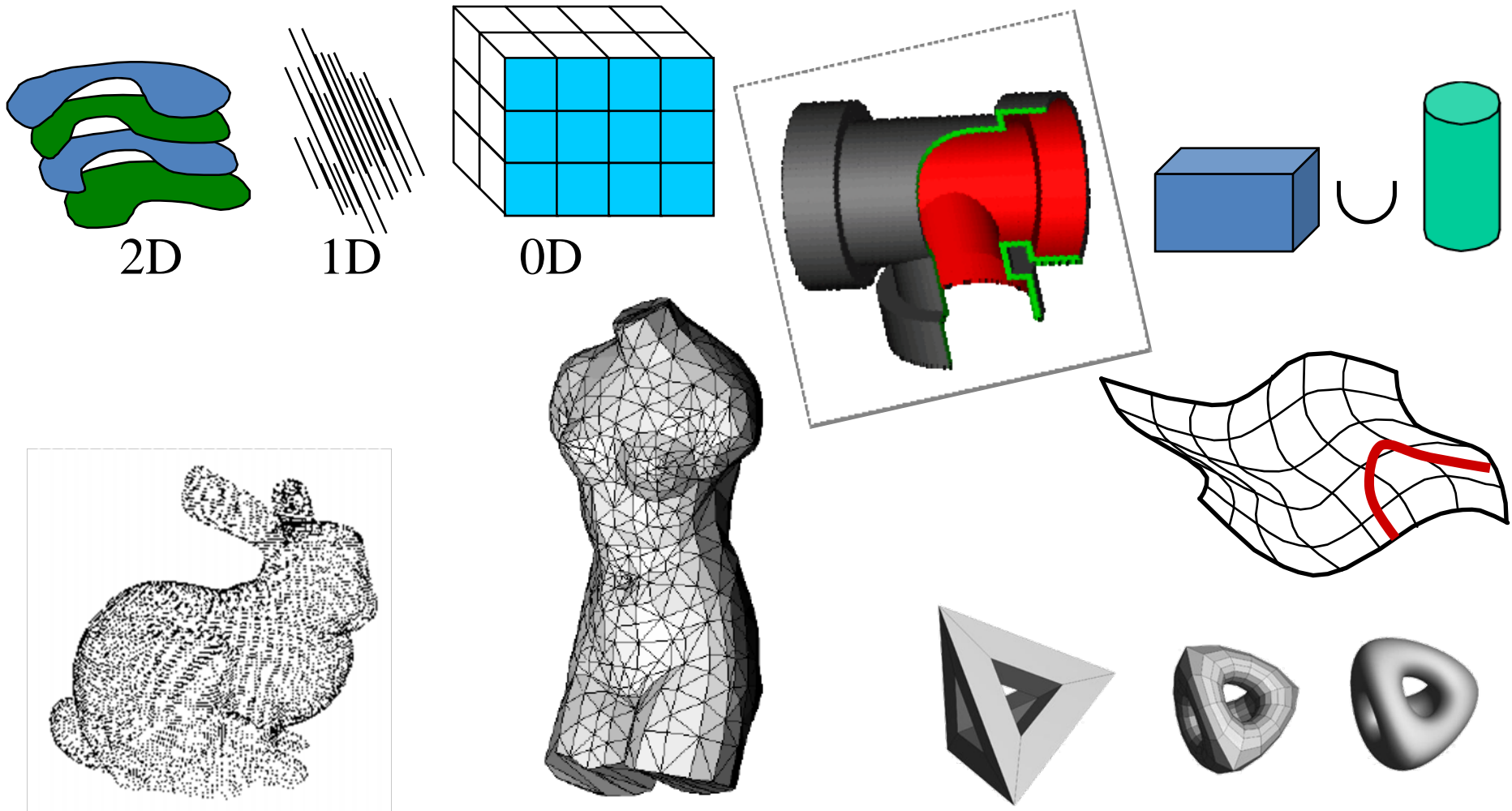


- **Boundary decomposition**

- Parametric patches
- Triangles, polygons, quads

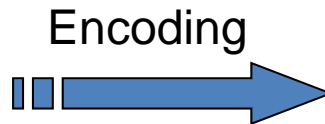


# Storage size depends on representation



# Mesh Encoding

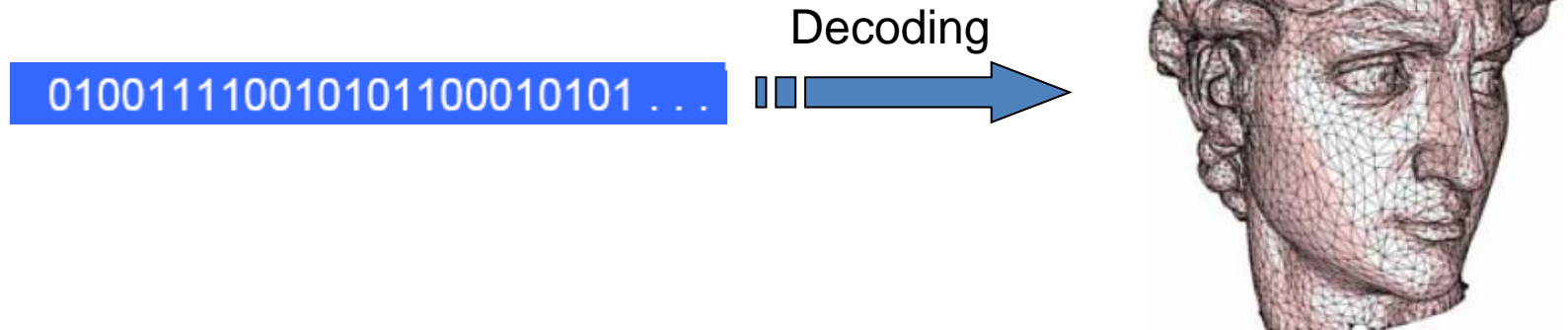
- Input: 3D triangular mesh
  - Assumed to be orientable manifold
- Output: bit stream
  - 010011110010101100010101 ...



010011110010101100010101 ...

# Mesh Decoding

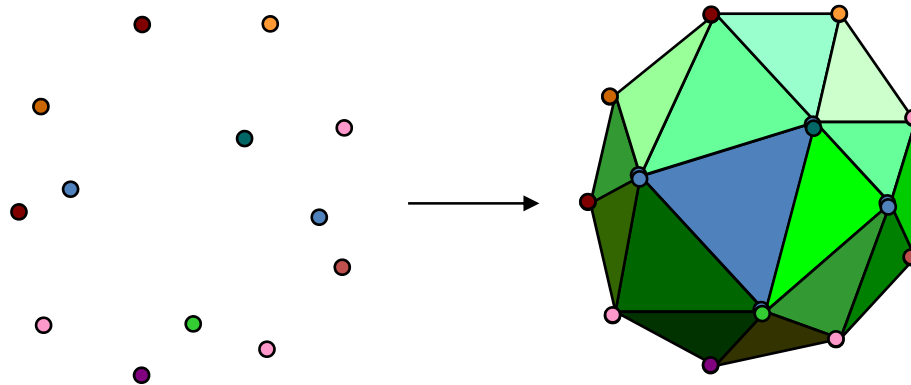
- Input
  - Bit stream
- Output
  - Reconstruction of original 3D triangular mesh



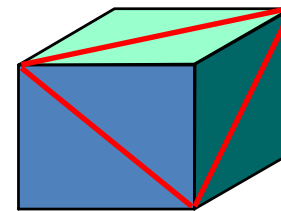
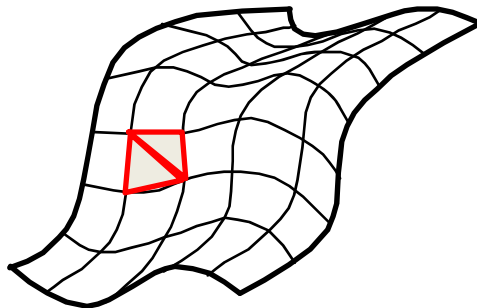
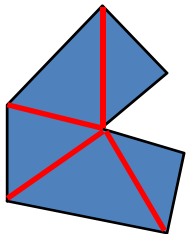


# Why triangles and tetrahedra?

**Triangles** and **tetrahedra** are the simplest ways of specifying how **irregular point-samples** and associated values (color, density...) should be **interpolated** to approximate (non-homogeneous) sets.



Other representations may be easily triangulated/tetrahedralized.



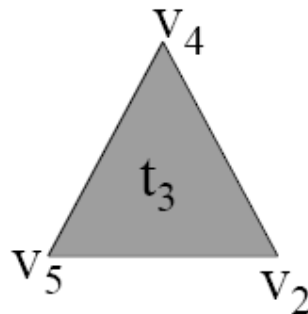
# Representing Triangle and Tetrahedra Meshes

**Vertices and values:**  
 **$3 \times 16 + k$  bits/vertex**

vertex 1	X	y	Z	c
vertex 2	X	y	Z	c
vertex 3	X	y	Z	c

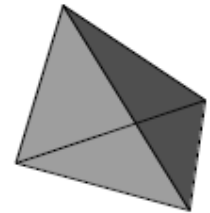
**Triangle/vertex incidence:**  
 **$3 \times \log_2(V)$  bits/triangle**

Triangle 1	1	2	3
Triangle 2	3	2	4
Triangle 3	4	2	5
Triangle 4	7	5	6
Triangle 5	6	5	8
Triangle 6	8	5	1



**Tetrahedron/vertex incidence:**  
 **$4 \times \log_2(V)$  bits/tetrahedron**

Tetrahedron 1	1	2	3	4
Tetrahedron 2	3	2	4	6
Tetrahedron 3	4	2	5	8
Tetrahedron 4	7	5	6	2
Tetrahedron 5	6	5	8	4
Tetrahedron 6	8	5	1	5
Tetrahedron 7	1	2	3	6
Tetrahedron 8	3	2	4	5
Tetrahedron 9	4	2	5	2
....				
Tetrahedron 17	6	5	8	1
Tetrahedron 18	8	5	1	2



$$T \sim 6.5V$$

$$T = 2V$$

**Connectivity dominates storage cost!**

# Bandwidth Requirements for Triangular Meshes

- Naïve representation of a triangle mesh
  - Each triangle is represented by 3 vertices
    - Each vertex is represented by 3 coordinates
      - Each coordinate is represented by a float
- Total storage = 576 bits per vertex (bpv) for geometry
  - $3 \times 3 \times 32$  bits per triangle
  - Twice as many triangles as vertices
- Not counting colors, normals, textures, motions

# Two Parts for 3D Meshes

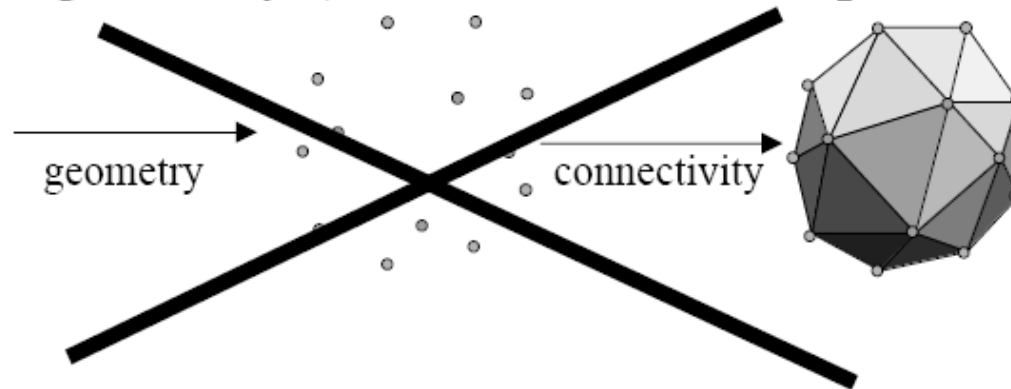
- Geometry
  - Coordinates of the vertices
  - $v \ x \ y \ z$
- Connectivity
  - How the vertices connect with each other
  - $f \ i \ j \ k$
- $T = 2V$

# Mesh Compression

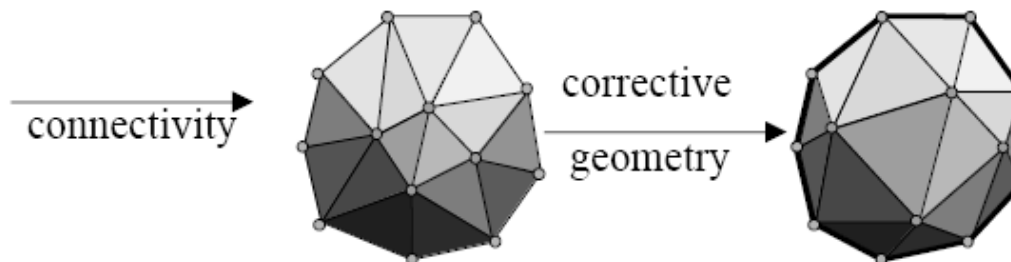
- Geometry encoding
- Connectivity encoding
- Which one should be done first?

# Must Decode Connectivity First

**Cannot** use geometry to estimate connectivity, because connectivity is used to **predict** geometry (see vertex-data compression section).



Must develop **connectivity compression** methods **independent of the vertex locations**.



# Two Categories

- Single resolution
  - Edge breaker, Topological surgery...
  - not transmission friendly.
- Multi resolution
  - CPM, PFS, VD...
  - transmission friendly

# Discussions



# Compression Theory

Coding Techniques

# Coding Techniques

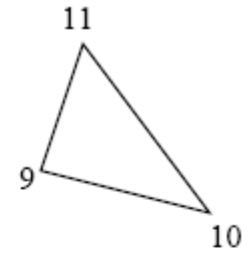
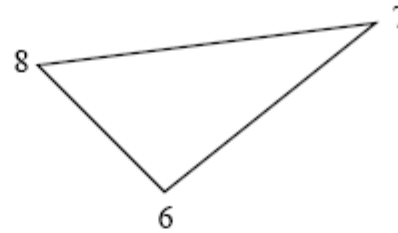
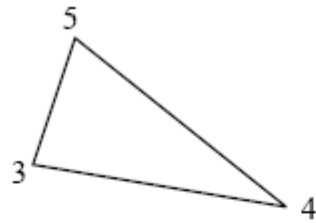
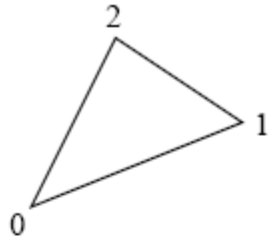
- RLE: Run Length Encoding
- LZW coding
- Huffman coding
- Arithmetic coding

# Connectivity Encoding

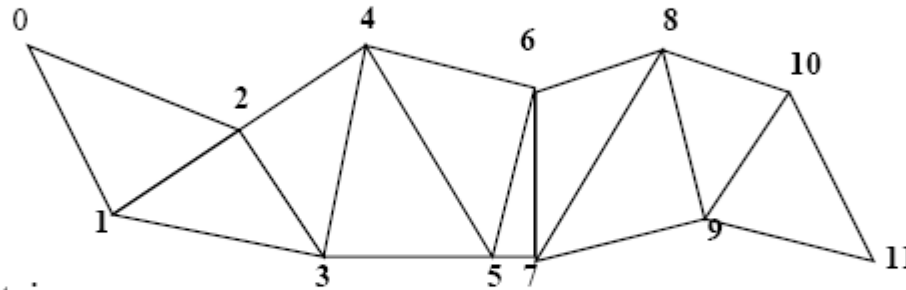
# Connectivity Compression: An Old Problem

- **Use vertex permutation to encode incidence**
  - Denny,Sohler: **Encoding a triangulation as a permutation of its point set**, CCCG, 97
- **Compression of the connectivity graph (planar triangle graph)**
  - Itai,Rodeh: **Representation of graphs**, Acta Informatica, 82
  - Turan: **On the succinct representation of graphs**, Discrete Applied Math, 84
  - Naor: **Succinct representation of general unlabeled graphs**, Discrete Applied Math, 90
  - Keeler,Westbrook: **Short encoding of planar graphs and maps**, Discrete Applied Math, 93
  - Deering: **Geometry Compression**, Siggraph, 95
  - Taubin,Rossignac: **Geometric compression through topological surgery**, ACM ToG, 98
  - Taubin,Horn,Lazarus,Rossignac: **Geometry coding and VRML**, Proc. IEEE, 98
  - Touma,Gotsman: **Triangle Mesh Compression**, GI, 98
  - Gumbold,Straßer: **Realtime Compression of Triangle Mesh Connectivity**, Siggraph, 98
  - Rossignac: **Edgebreaker: Compressing the incidence graph of triangle meshes**, TVCG, 99
  - Rossignac,Szymczak: **Wrap&Zip: Linear decompression of triangle meshes**, CGTA, 99
  - Szymczak,Rossignac: **Grow&Fold: Compression of tetrahedral meshes**, ACM SM, 99
- **Compressed inverse of progressive simplification steps or batches**
  - Hoppe: **Progressive meshes**, Siggraph, 96
  - Taubin,Gueziec,Horn,Lazarus: **Progressive forest split compression**, Siggraph, 98
  - Pajarola,Rossignac: **Compressed Progressive Meshes**, IEEE TVCG99
  - Pajarola,Szymczak,Rossignac: **ImplantSpray: Compressed Tetrahedral Meshes**, VIS 99

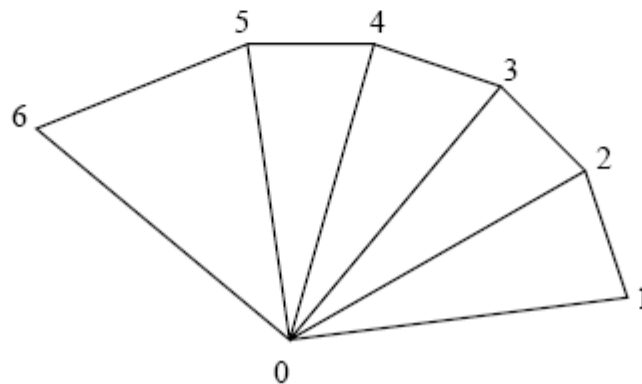
# Simple Triangle Strips



Isolated Triangle Strip



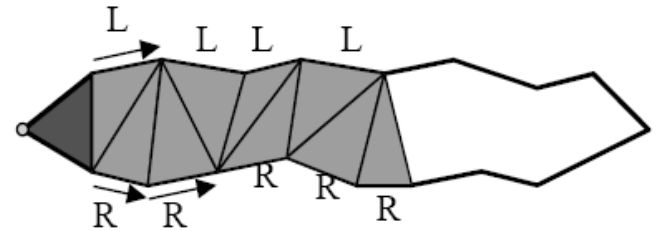
Zig-zag Triangle Strip



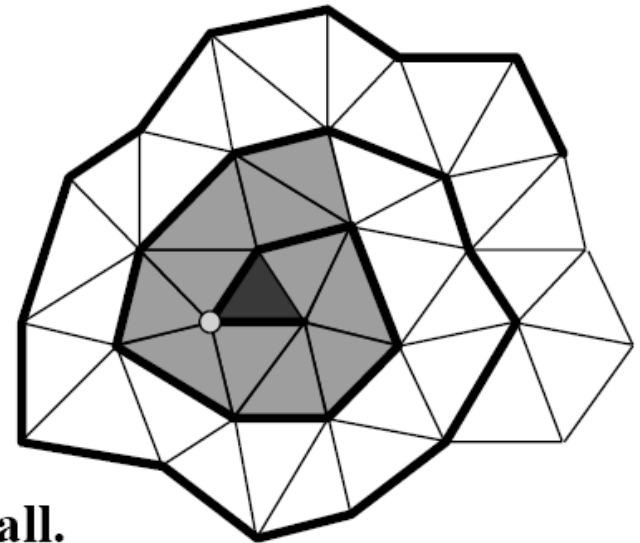
Star Triangle Strip

# Case 1: Spiraling Walls and Corridors

Given the left and right boundaries of a triangle strip (**corridor**), we need T (left/right) bits to encode its triangulation. ex: LRLLRLRR



Connecting vertices into a single **spiral** (Hamiltonian walk) defines the left and the right boundaries (**walls**) of a long corridor.

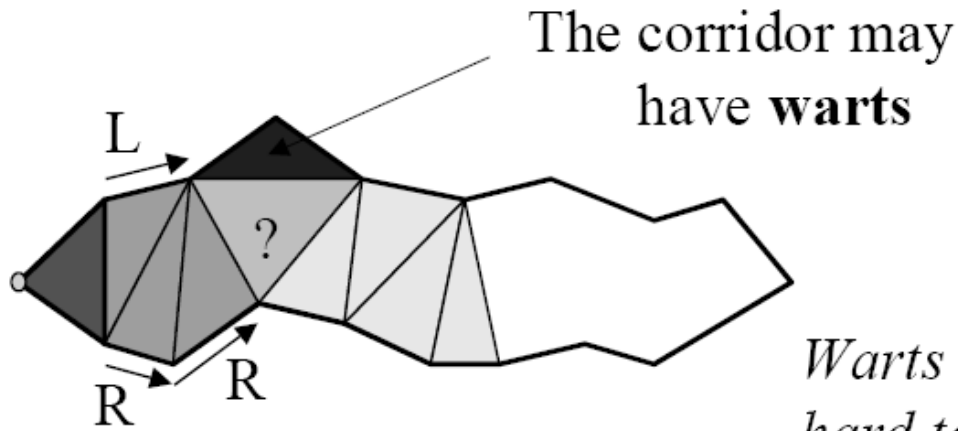


Store **vertices** in their **order along the wall**.

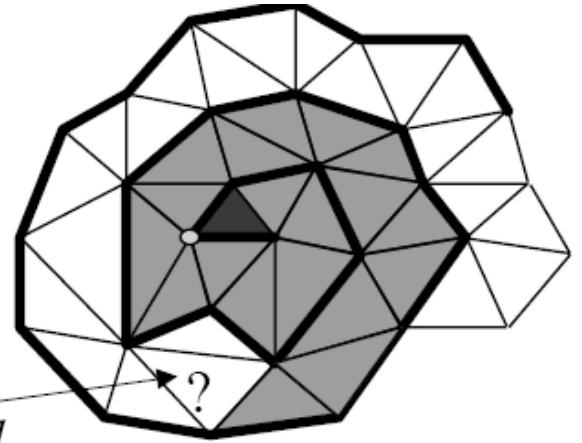
(Can use former vertices to predict location of new ones.)

Encode **connectivity** using only **1 (left/right) bit per triangle** !

# Problem

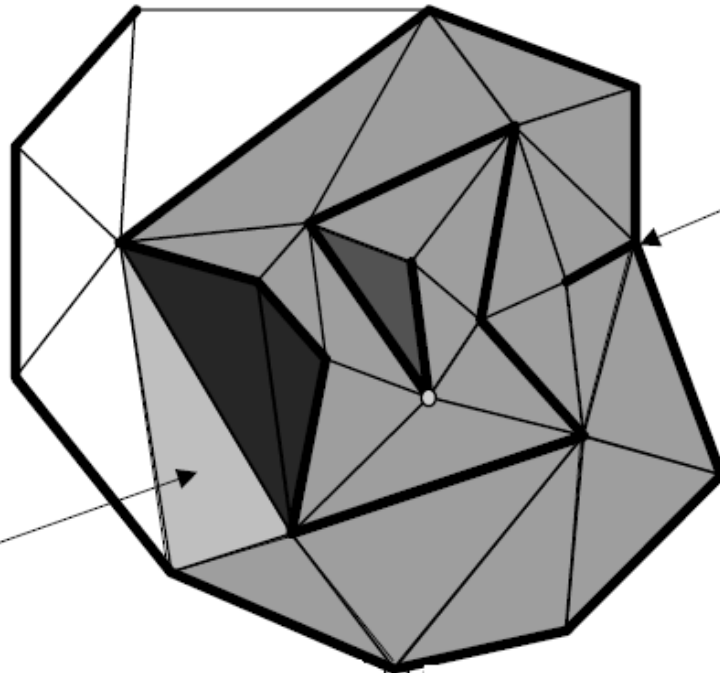


*Warts are hard to avoid*

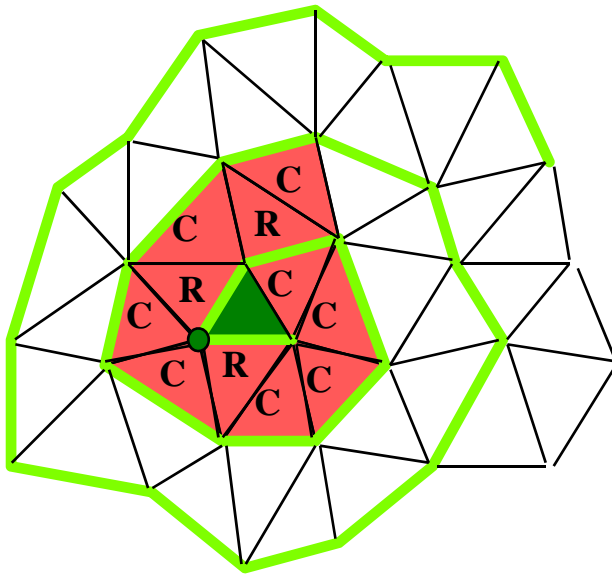


The **spiral** may bifurcate

The **corridor** may bifurcate

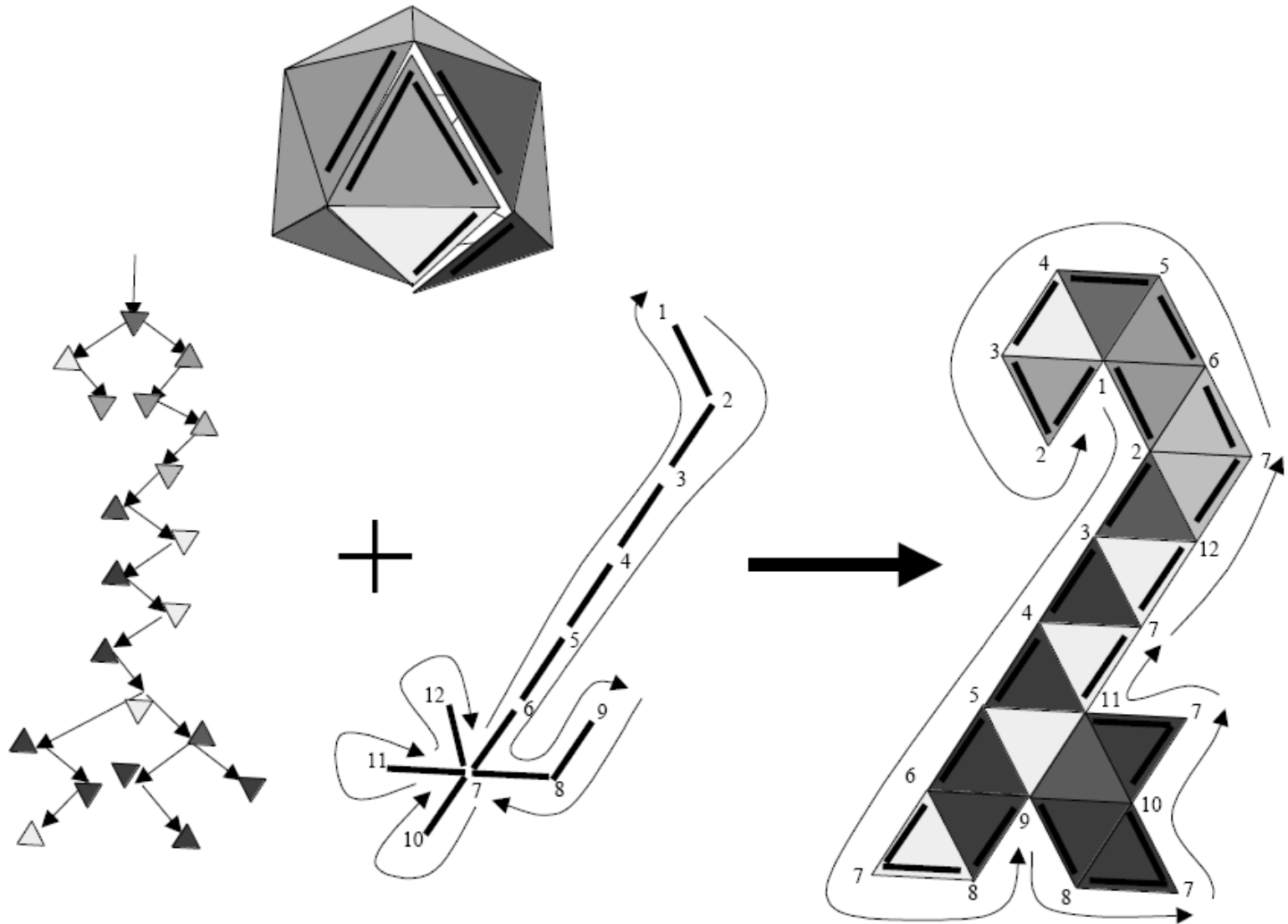


# Example





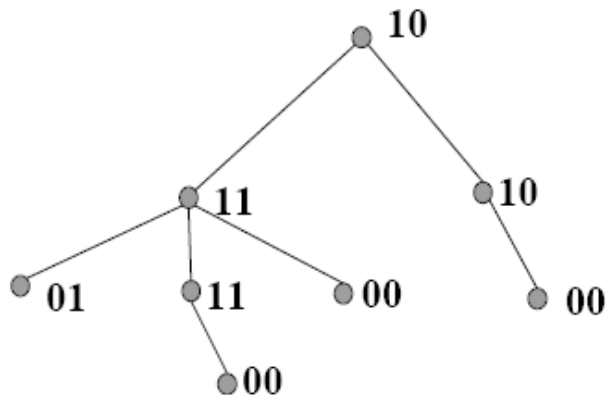
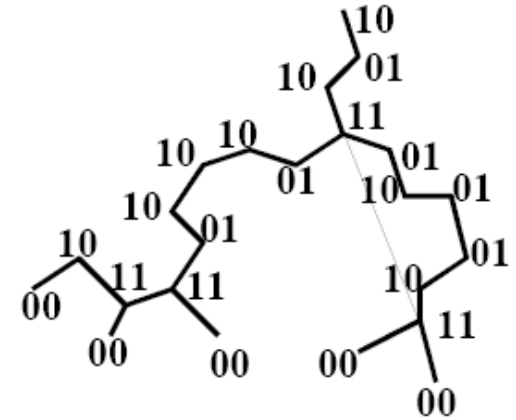
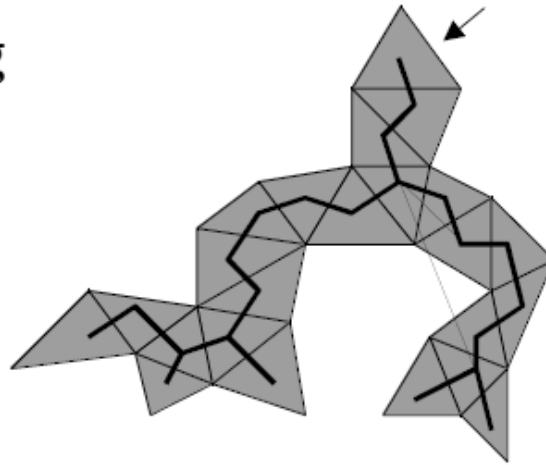
# Case 2: Triangle-tree & vertex-tree



# 3T bit encoding

The triangle spanning tree may be encoded using 2T bits:

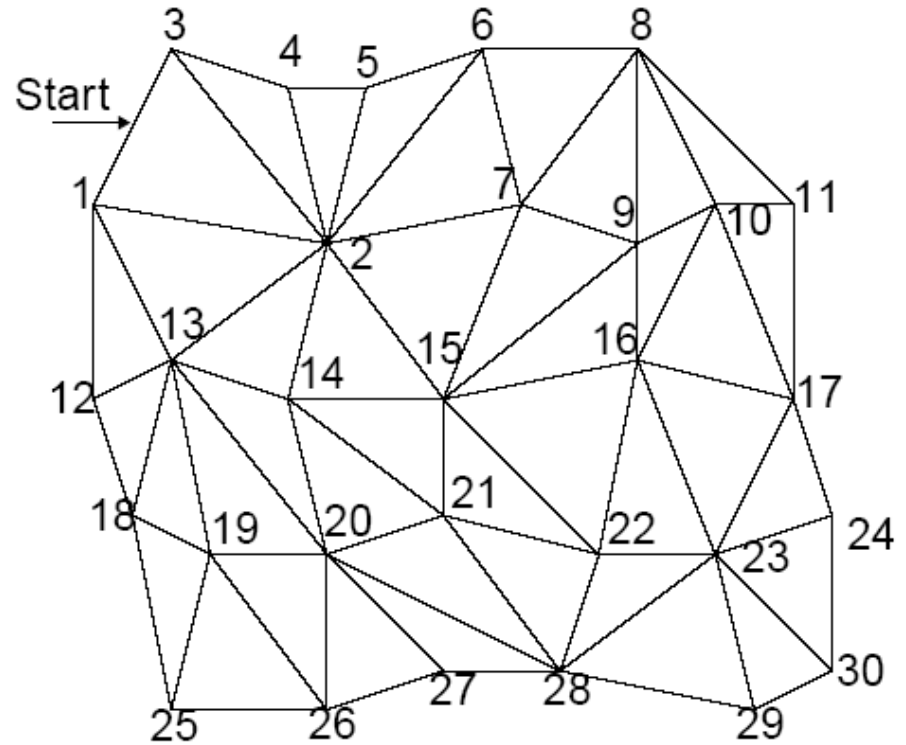
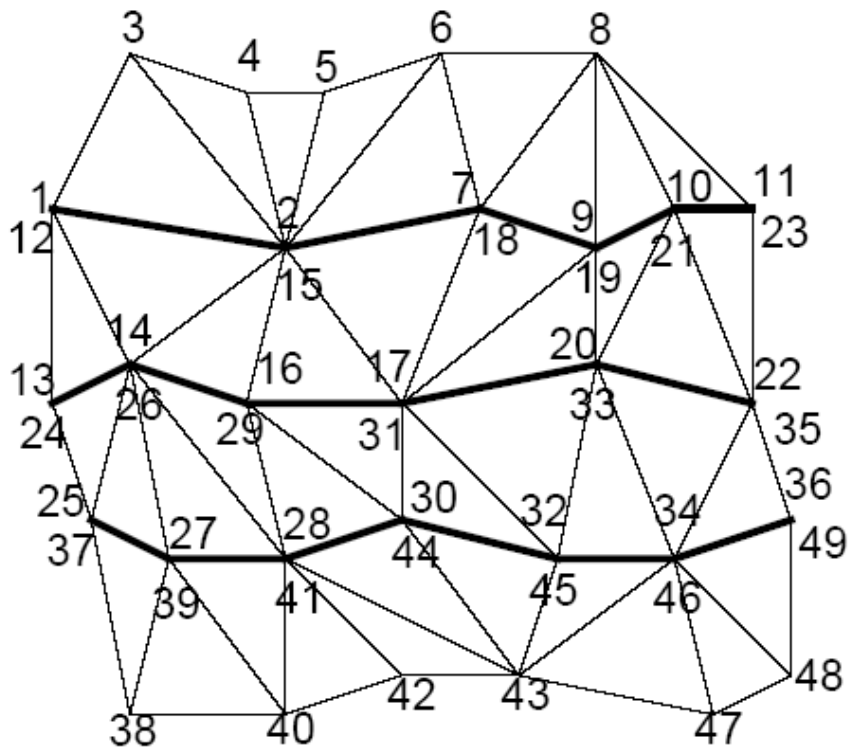
- has-left-child
- has-right-child



A vertex spanning tree may be encoded using 2V bits (= 1T bits):

- has-children
- has-right-sibling

# Generalized Triangle Strip & Generalized Triangle Mesh

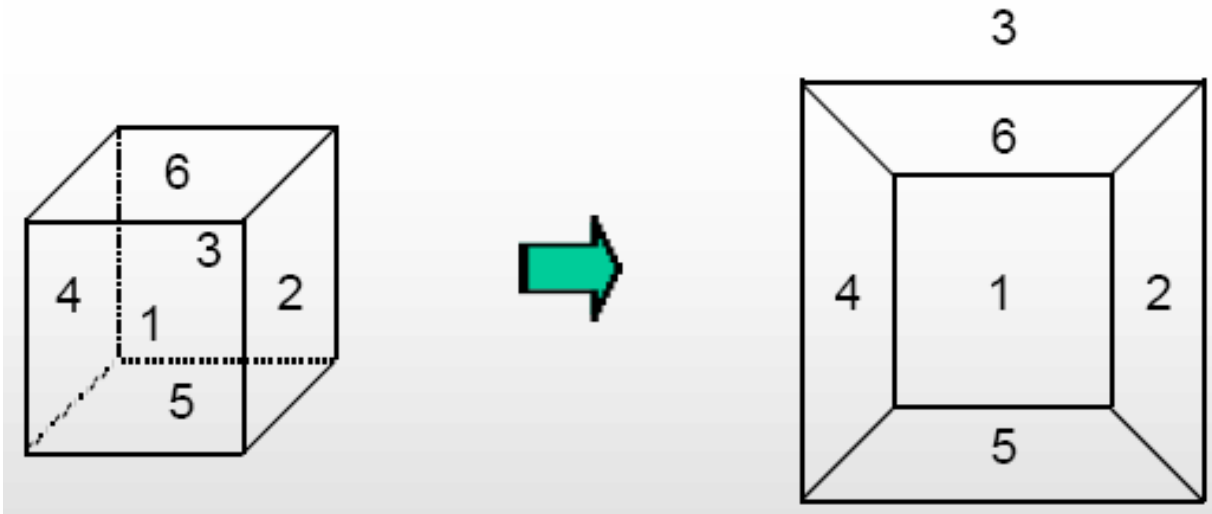


# Case Study: Valence-based Codes

Touma C. and Gotsman C.  
Triangle Mesh Compression.  
Graphics Interface 1998

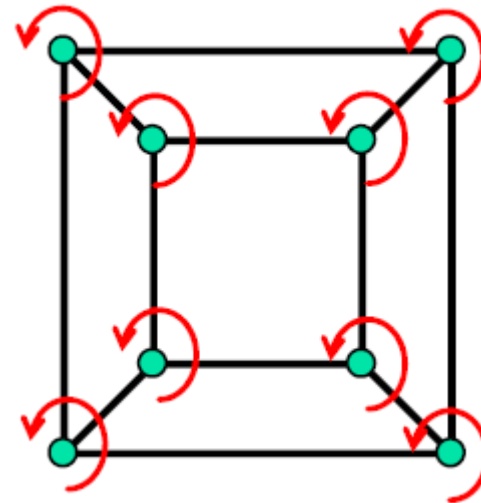
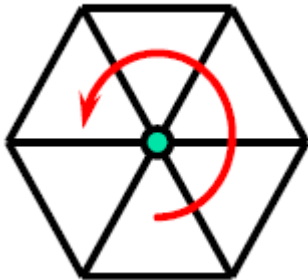
# Key Principle

- A genus-0 manifold mesh is topologically equivalent to a planar graph.



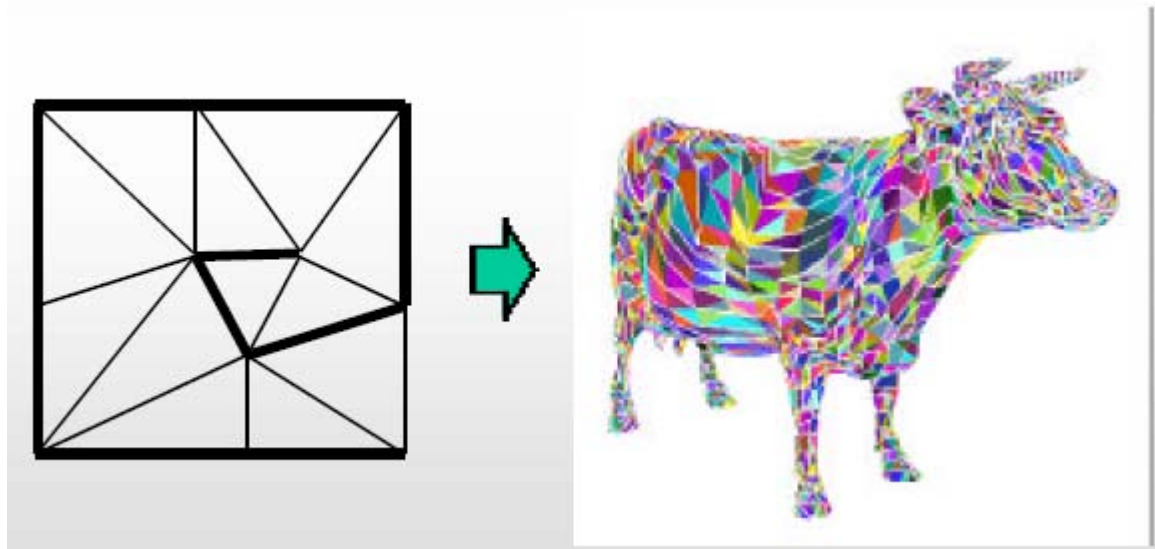
# Key Principle (cont.)

- In any planar graph edges incident on any vertex may be ordered consistently counter-clockwise



# Mesh Traversal

- The mesh vertices may be ordered in a set of winding paths that traverse the mesh.



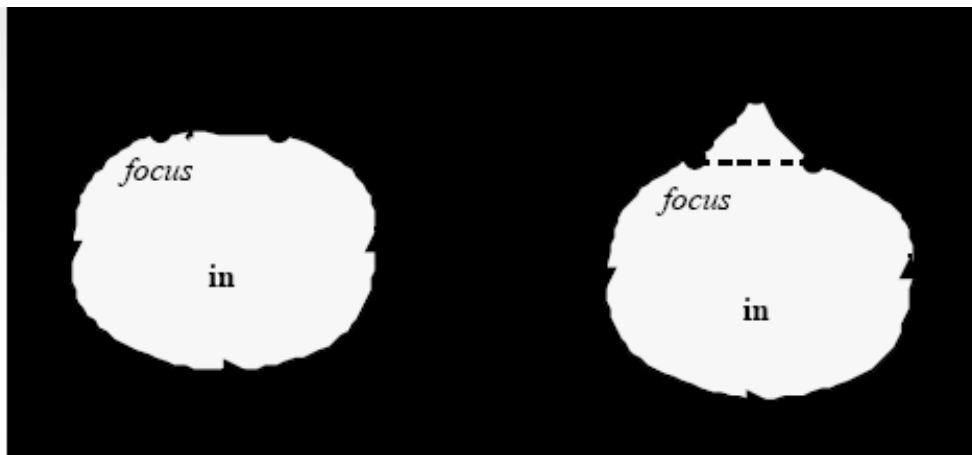
# Code Words

- The topology may be encoded with :
  - add <degree>
  - split <offset>
  - merge <offset>
- and then entropy encoded (Huffman, run-length).

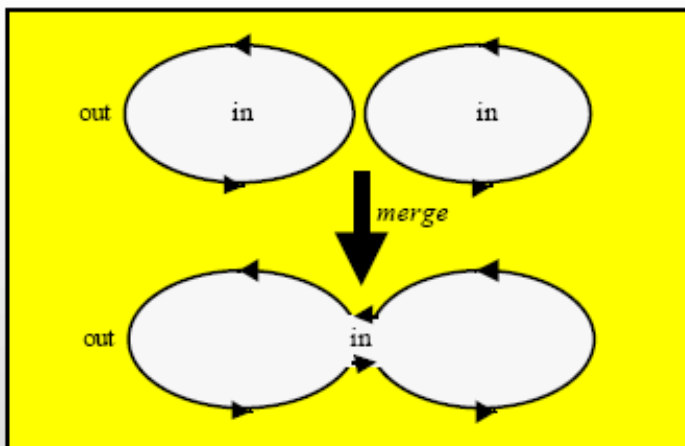


# Topology Codewords

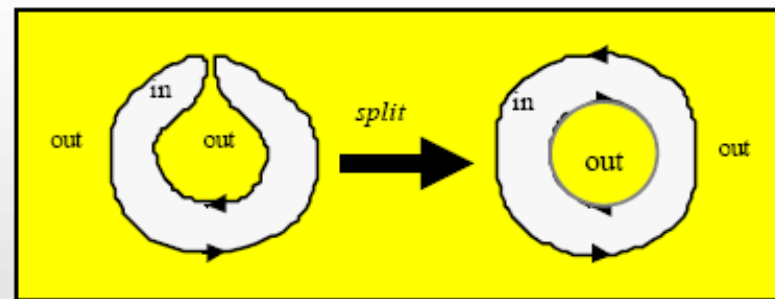
Add



Merge

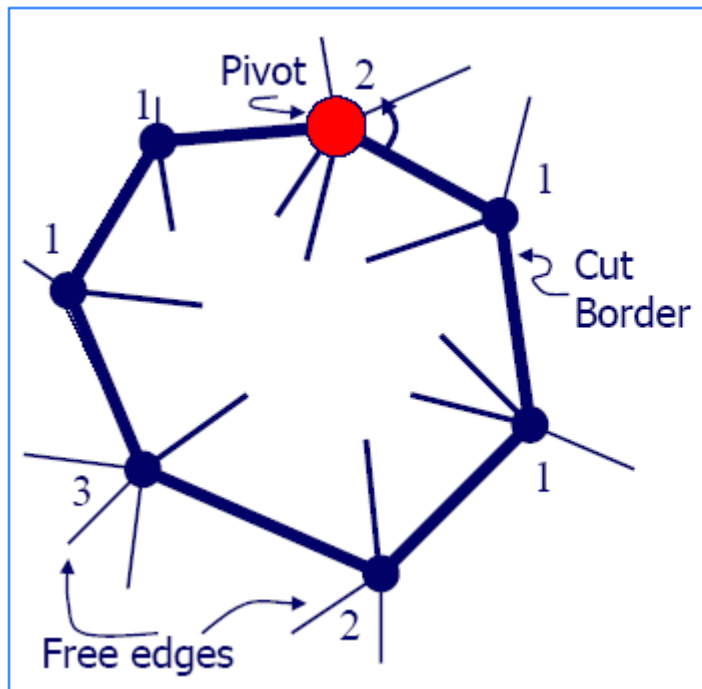


Split

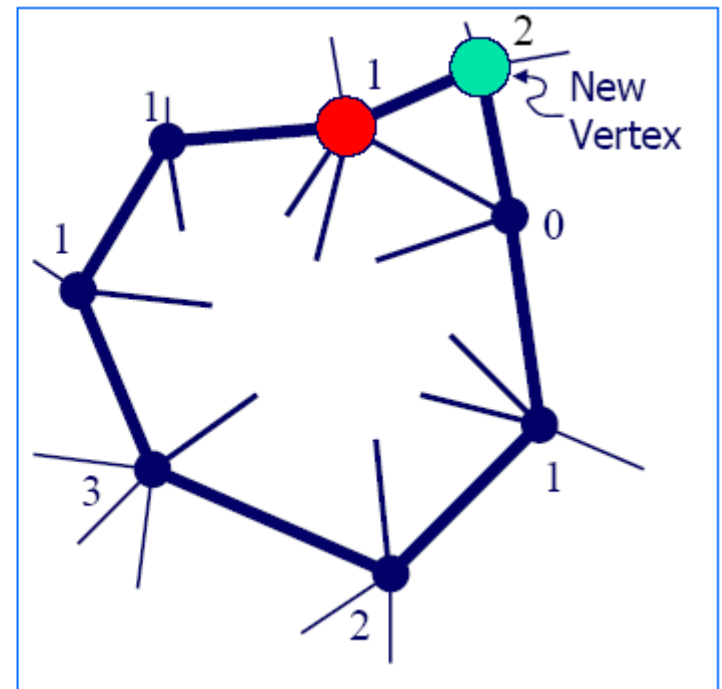
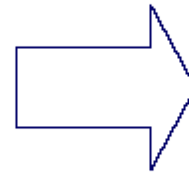


# Topology Codewords

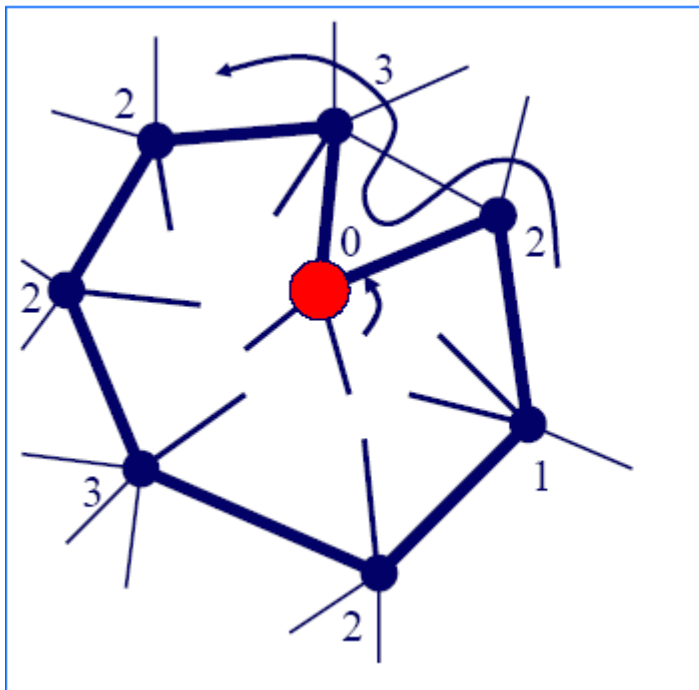
- Cut-border expansion: add <valence>



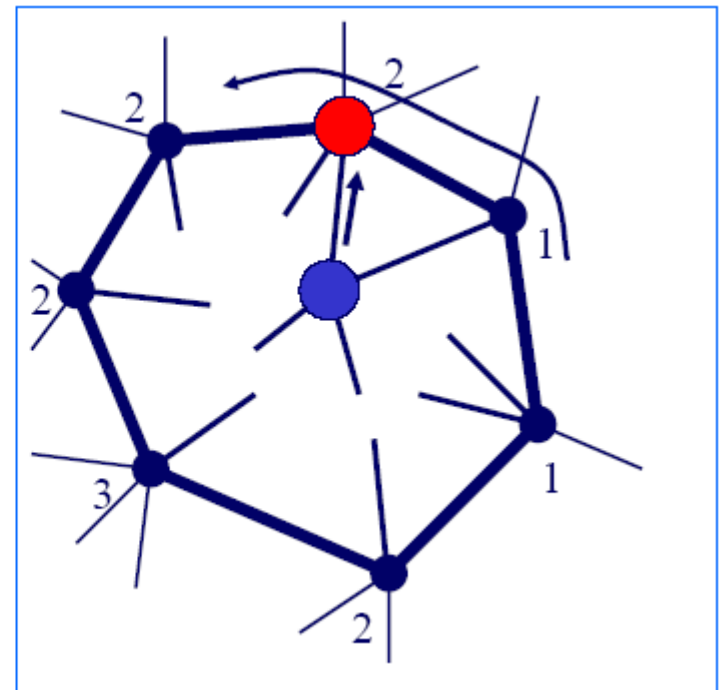
Output  
"add 4"



# Topology Codewords

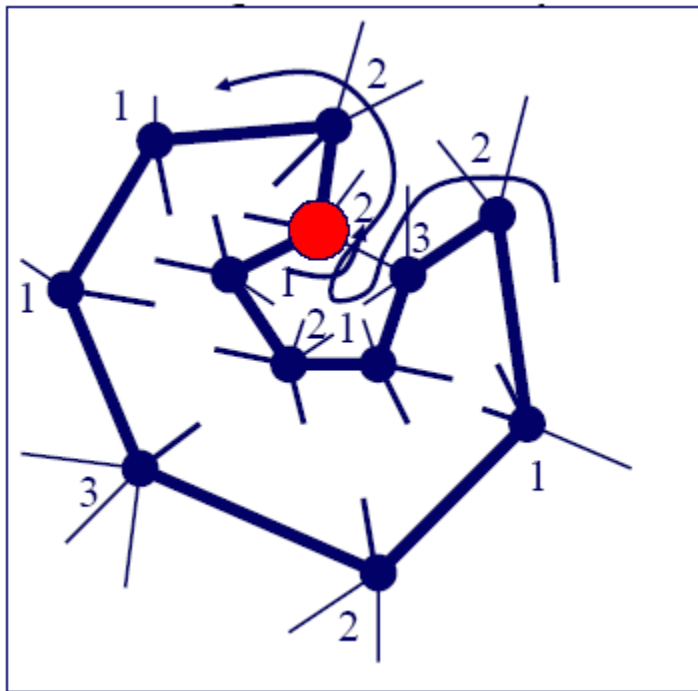


Remove  
full  
vertex

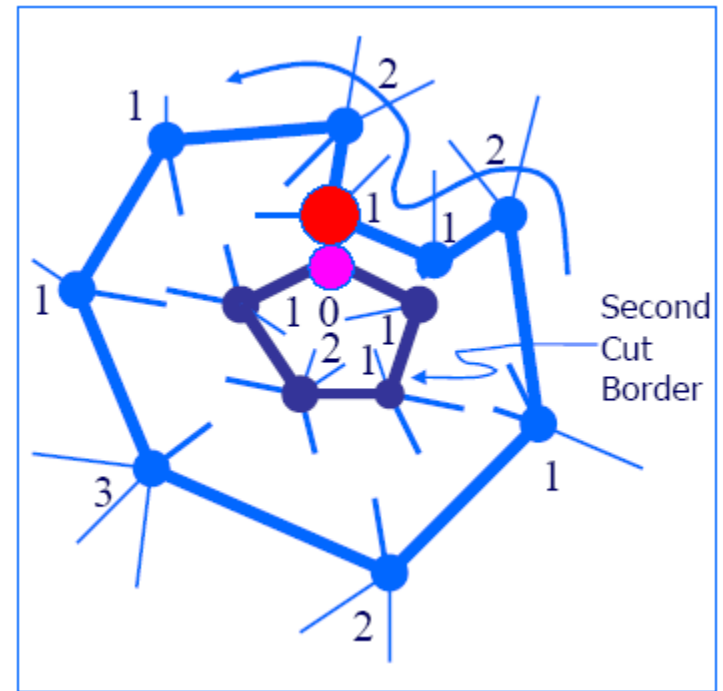


# Topology Codewords

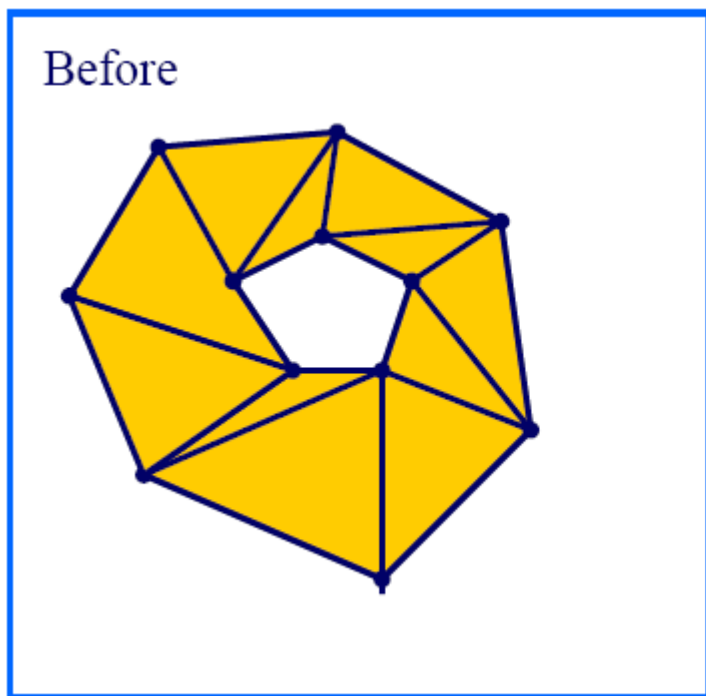
- split <offset>



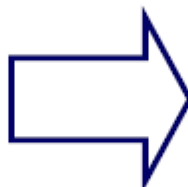
Output  
"split 6"



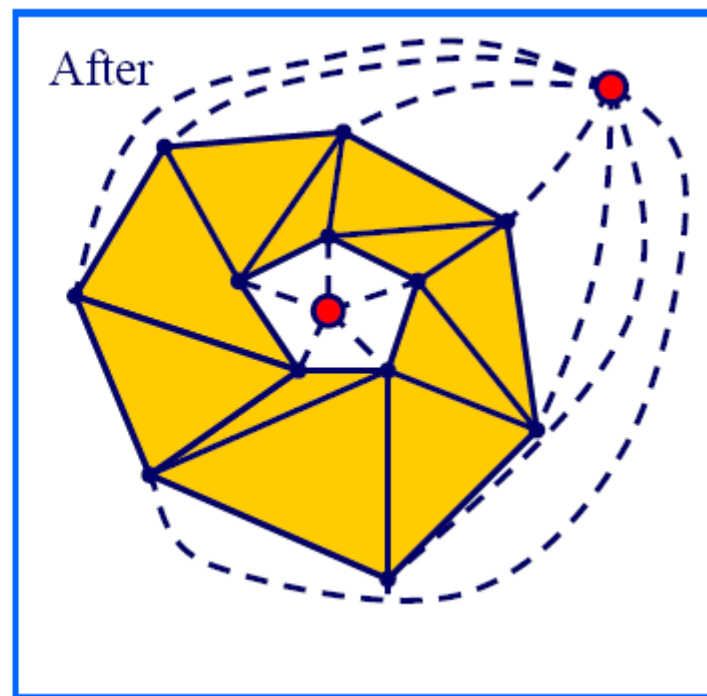
# Topology Codewords



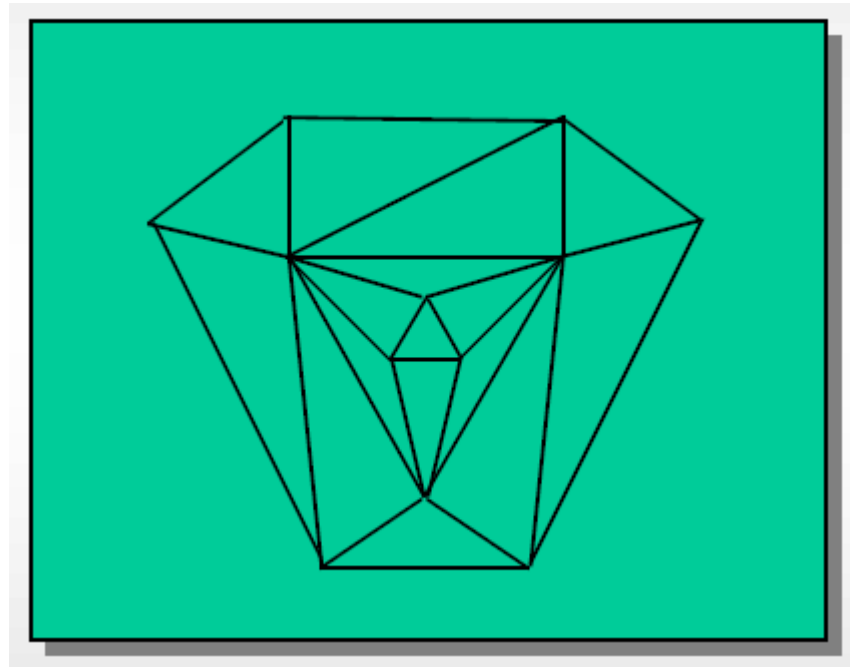
Add  
dummy  
vertices



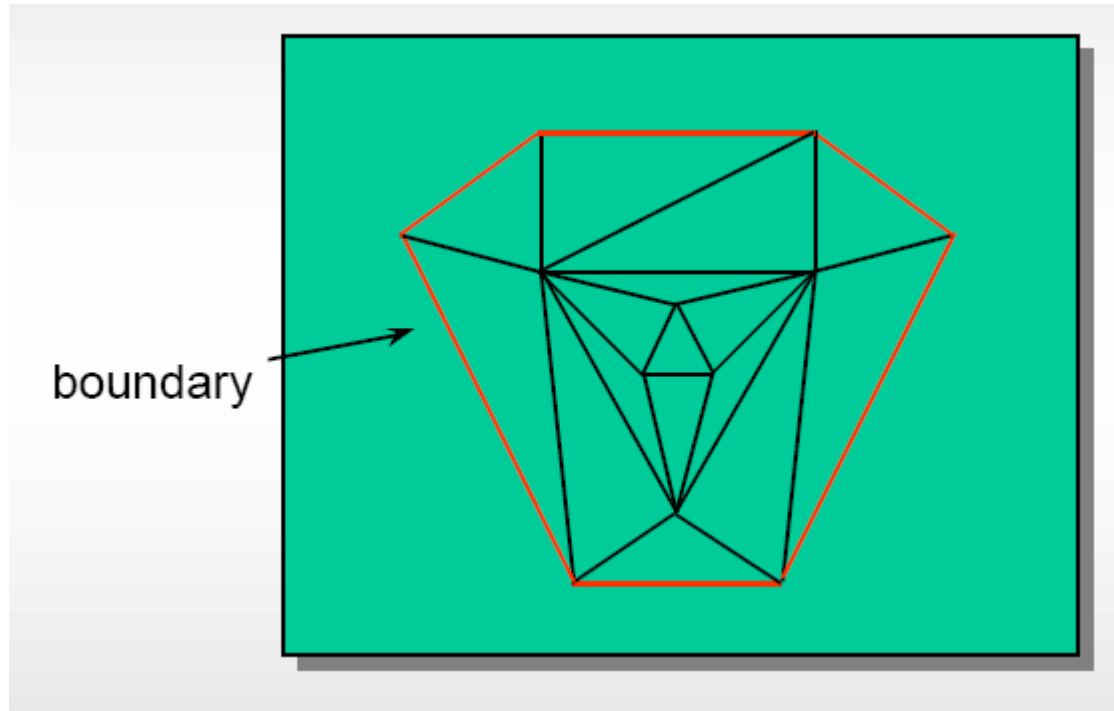
Close  
mesh



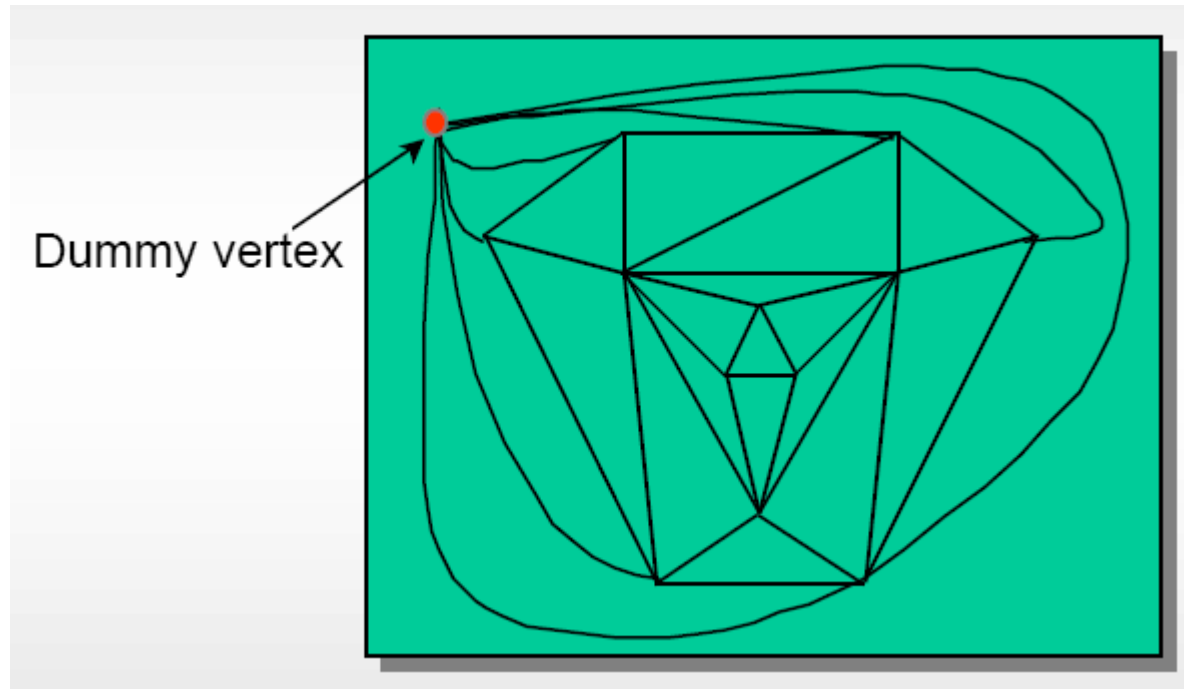
# Example



# Encoding

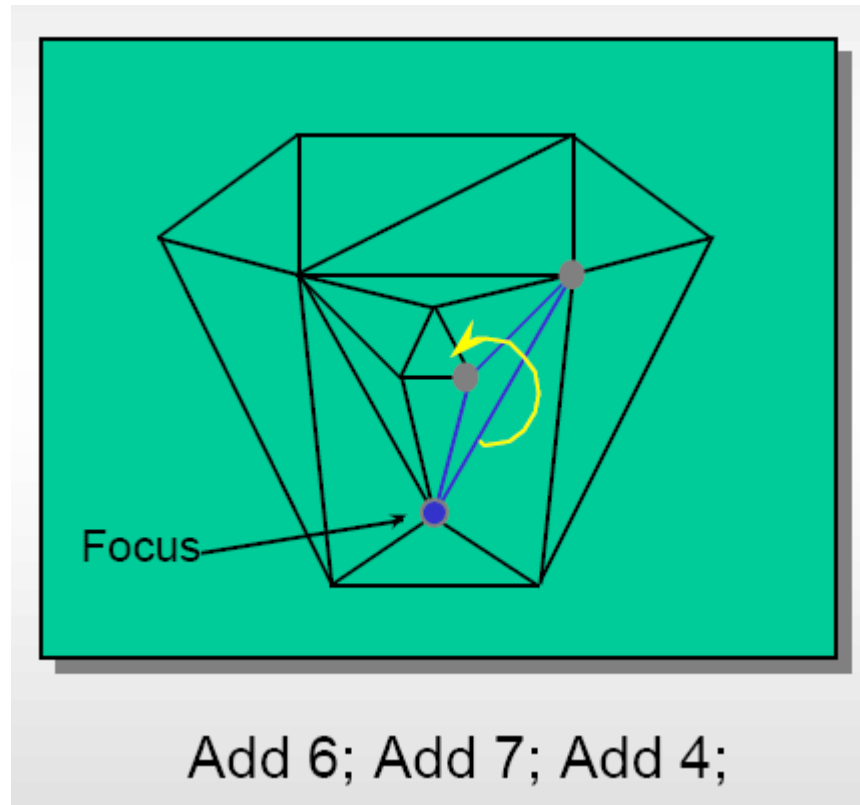


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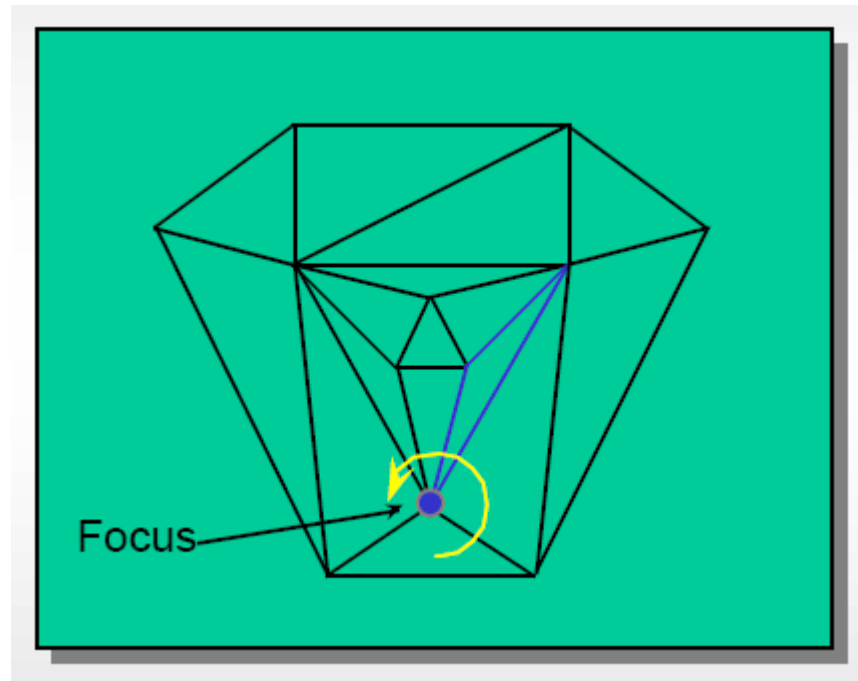




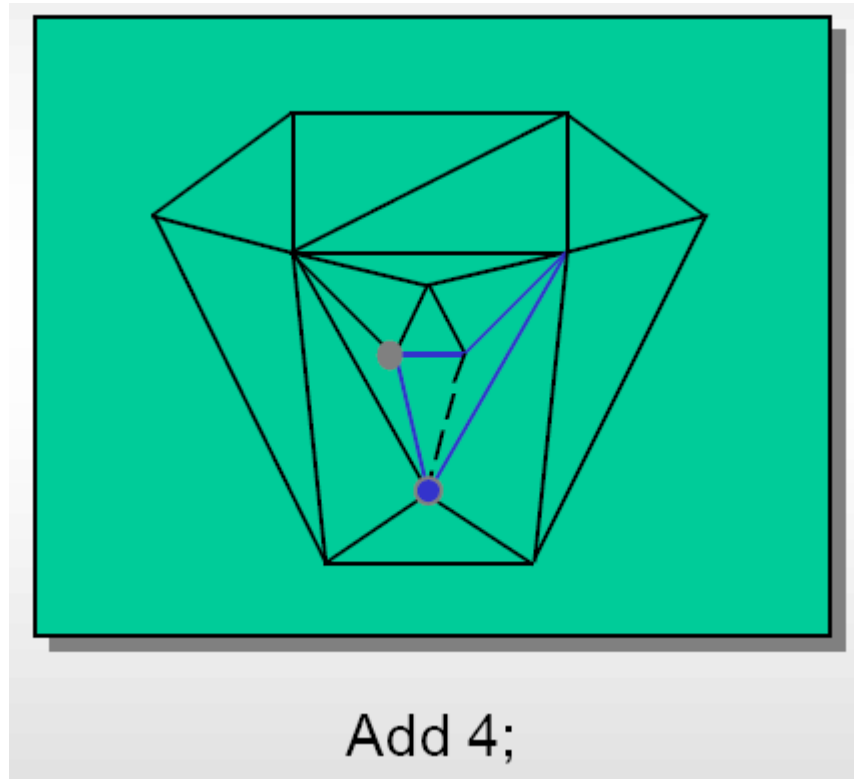
# Encoding



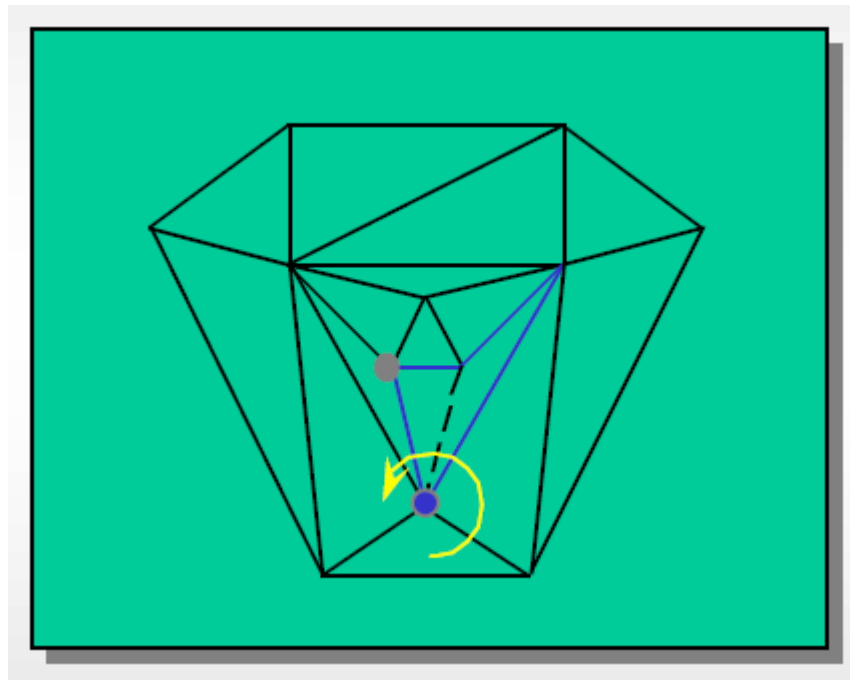
# Encoding



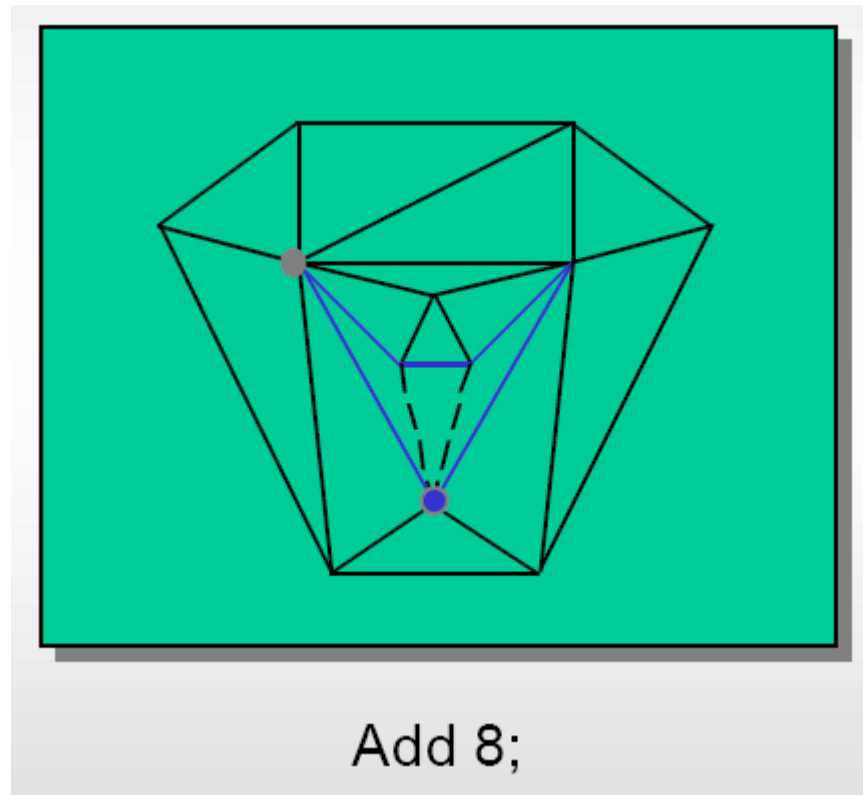
# Encoding



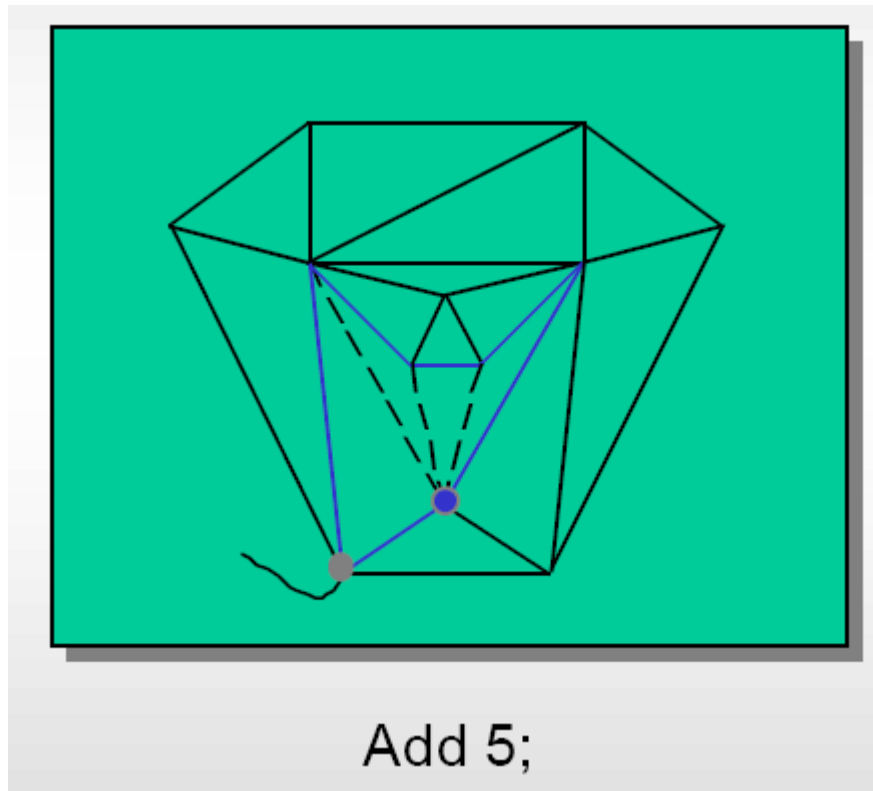
# Encoding



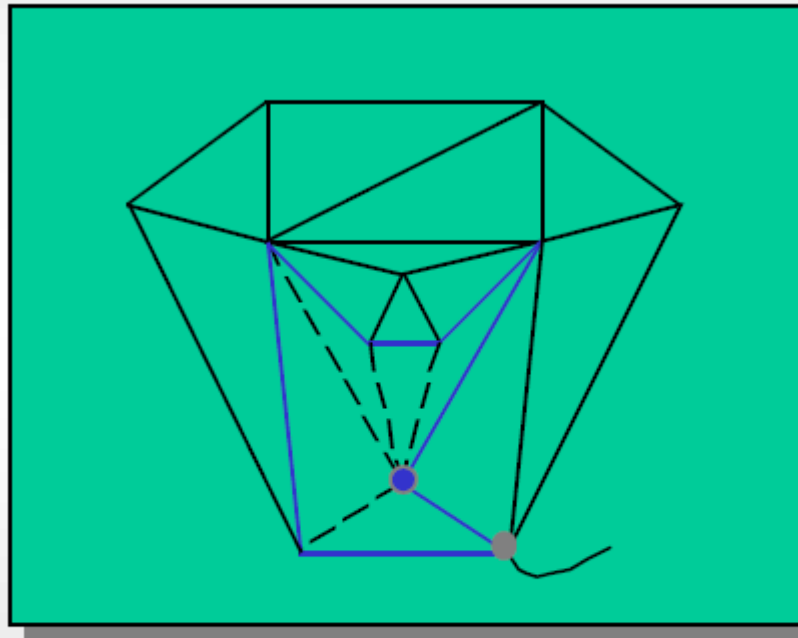
# Encoding



# Encoding

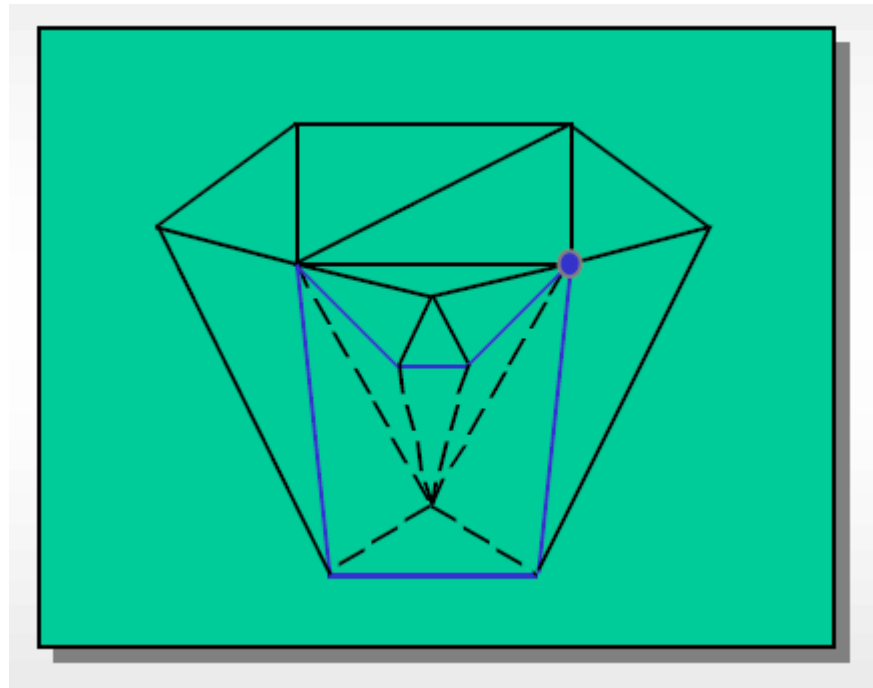


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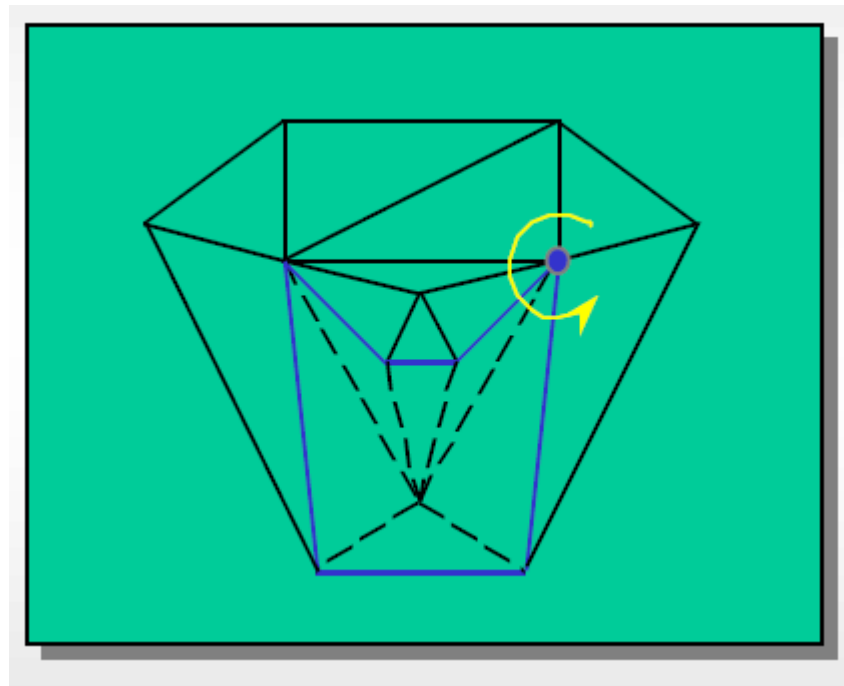
Add 5;  
(focus full)

# Encoding

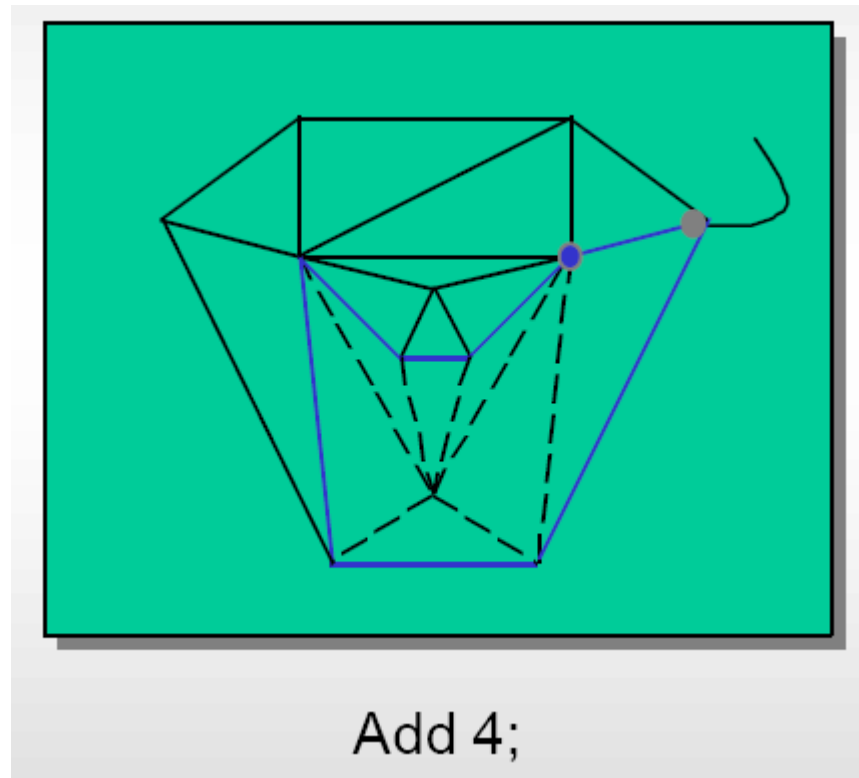




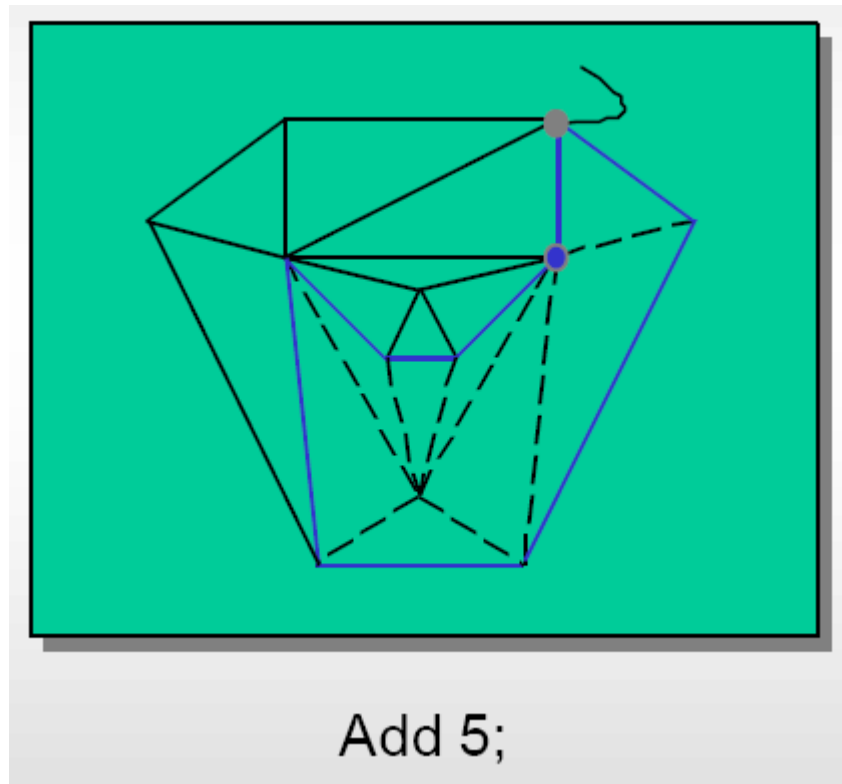
# Encoding



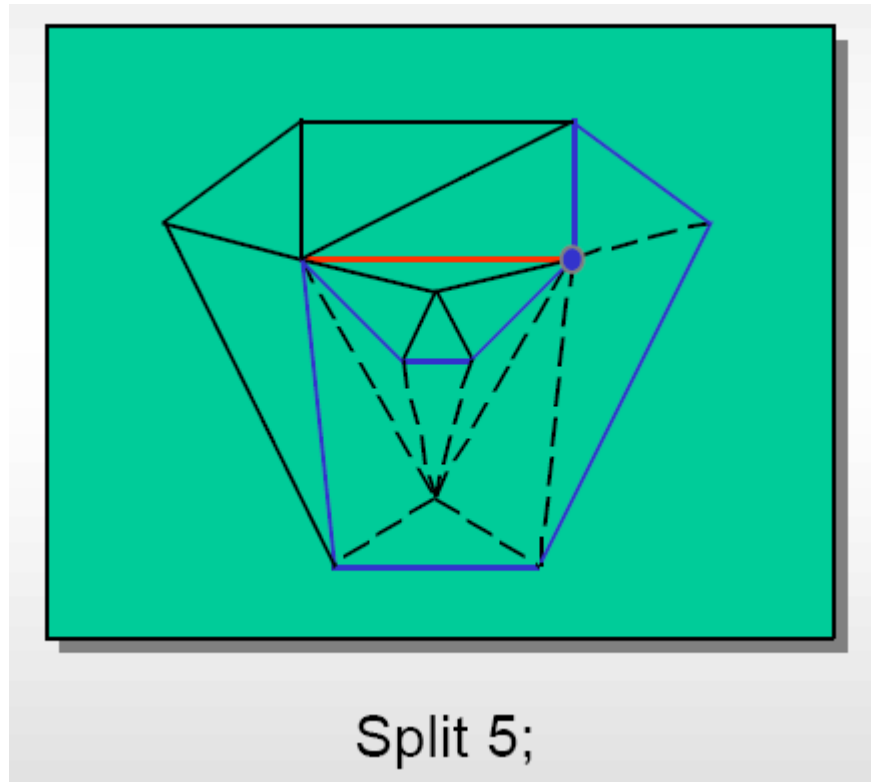
# Encoding



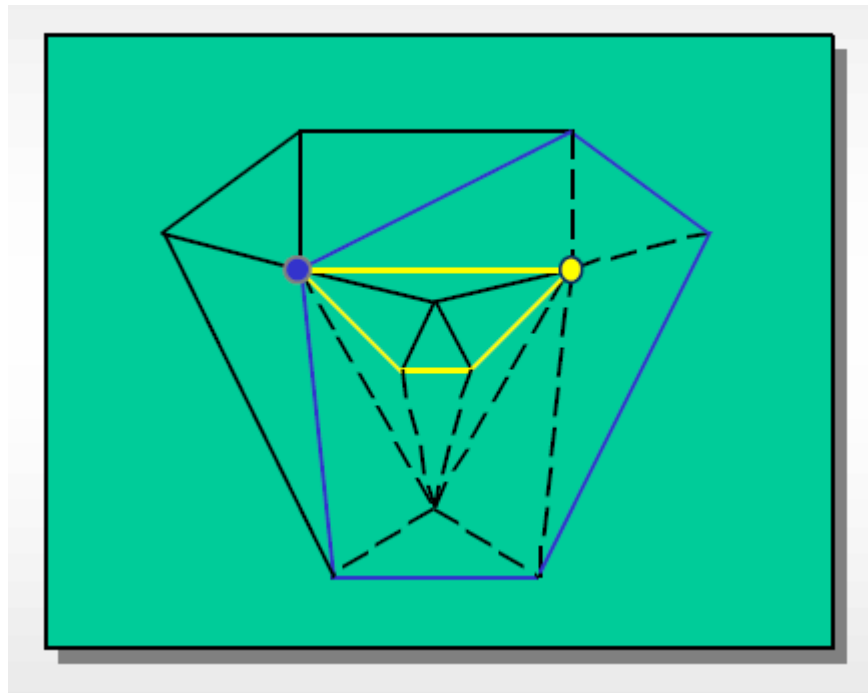
# Encoding



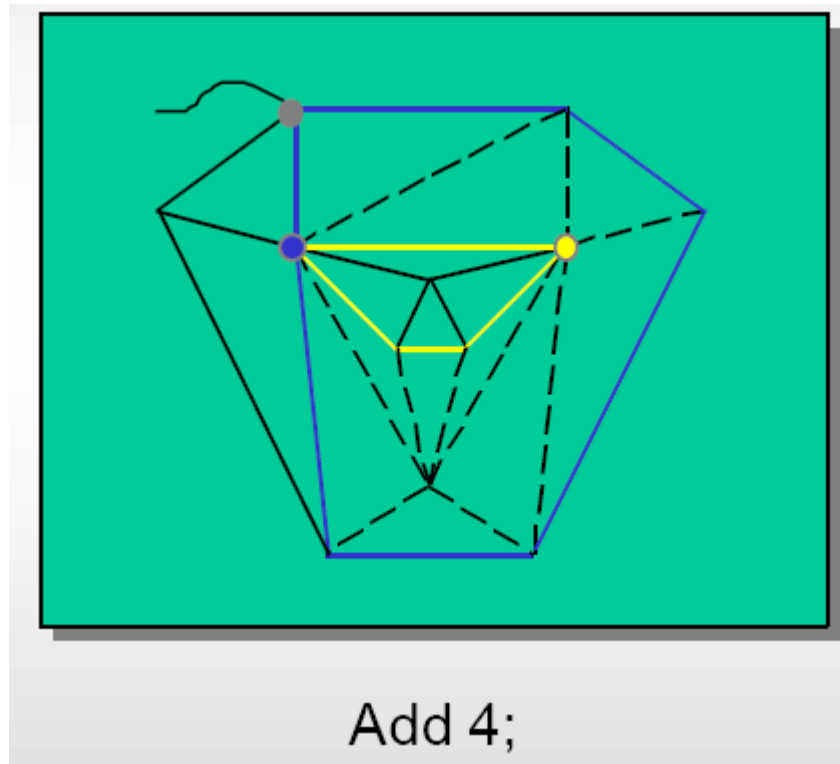
# Encoding



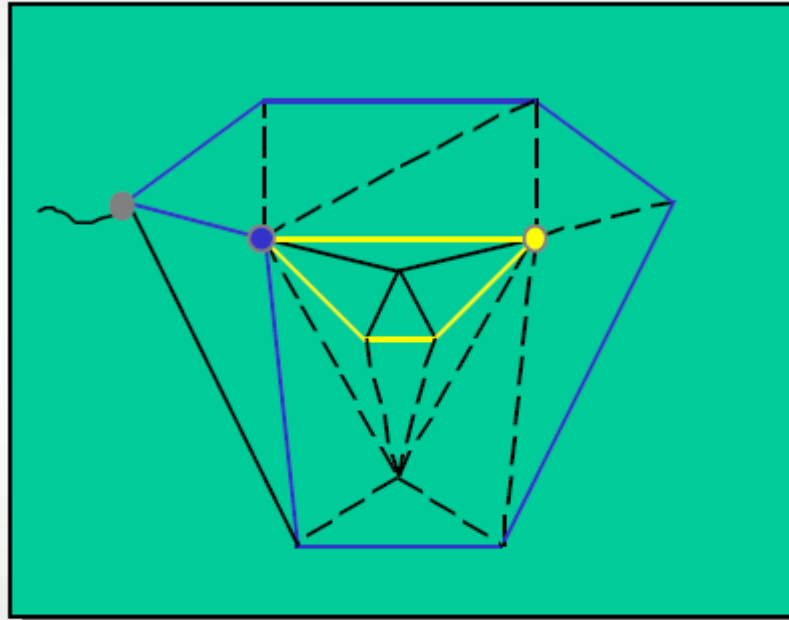
# Encoding



# Encoding

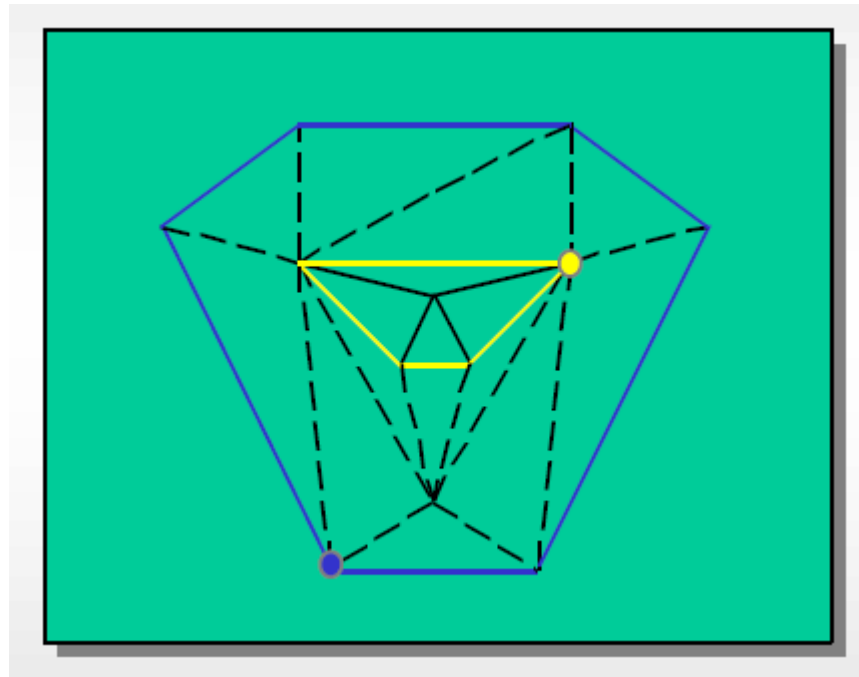


# Encoding



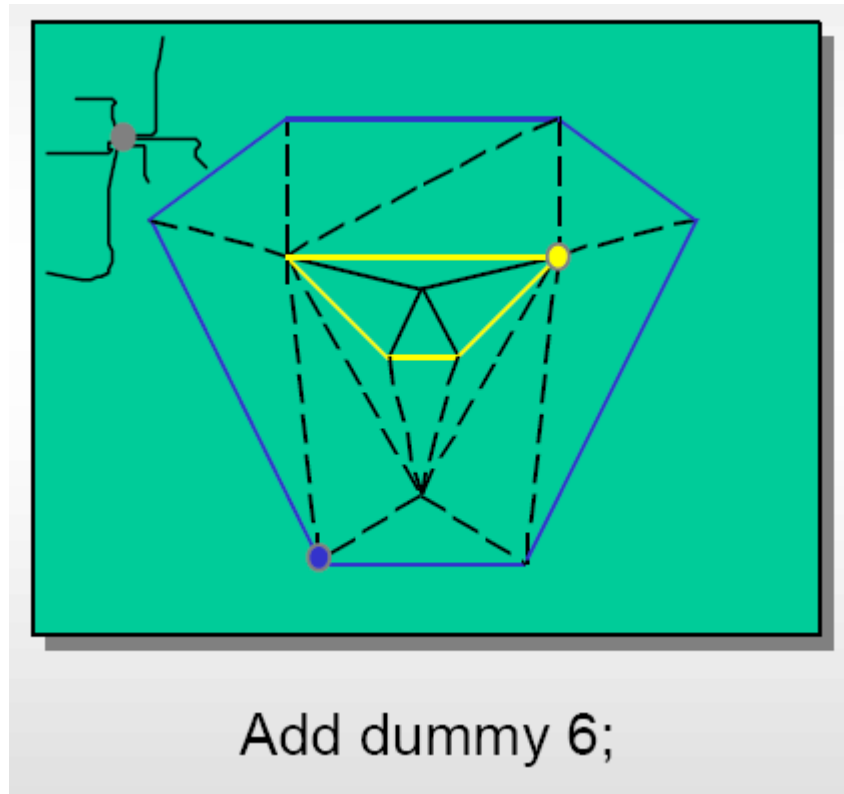
Add 4;  
(focus full)

# Encoding

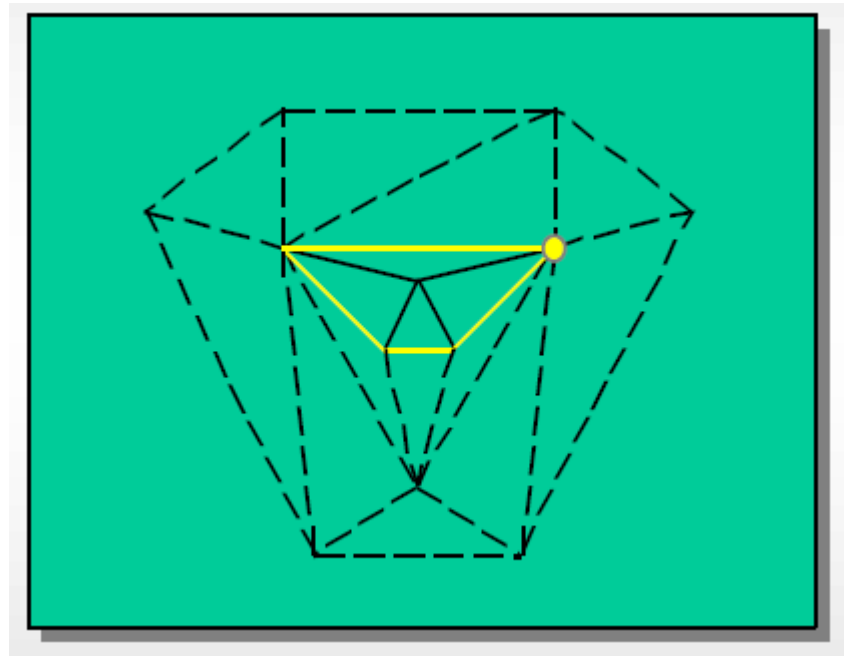




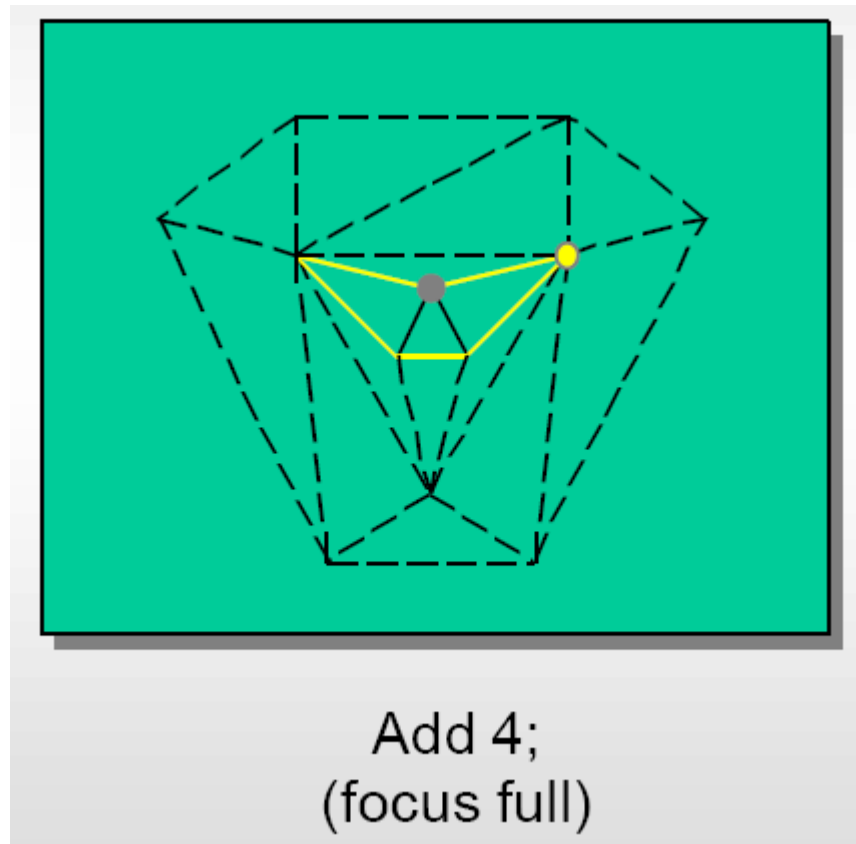
# Encoding



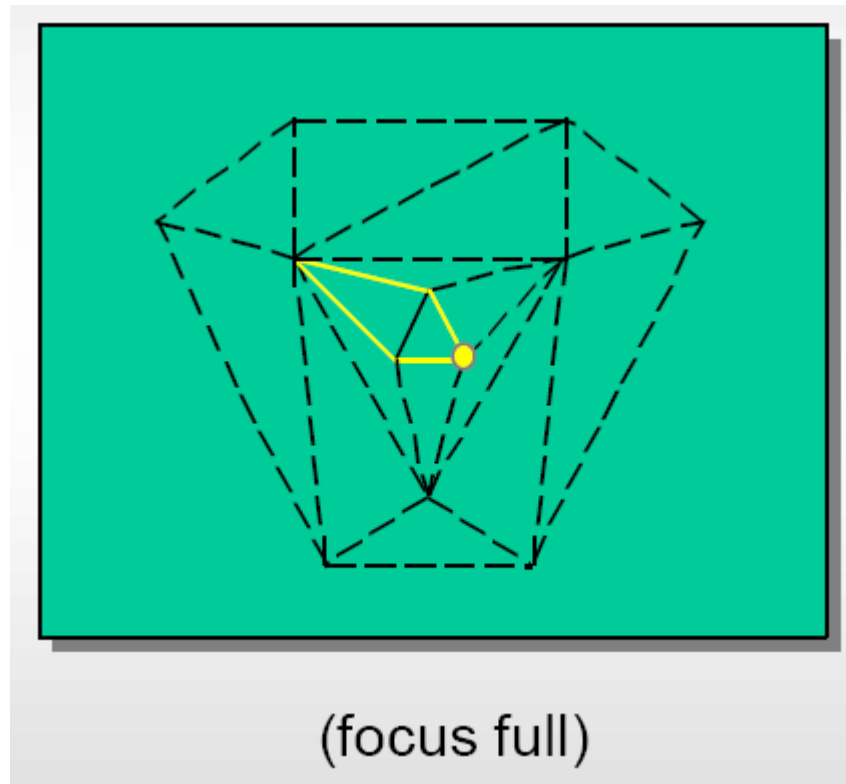
# Encoding



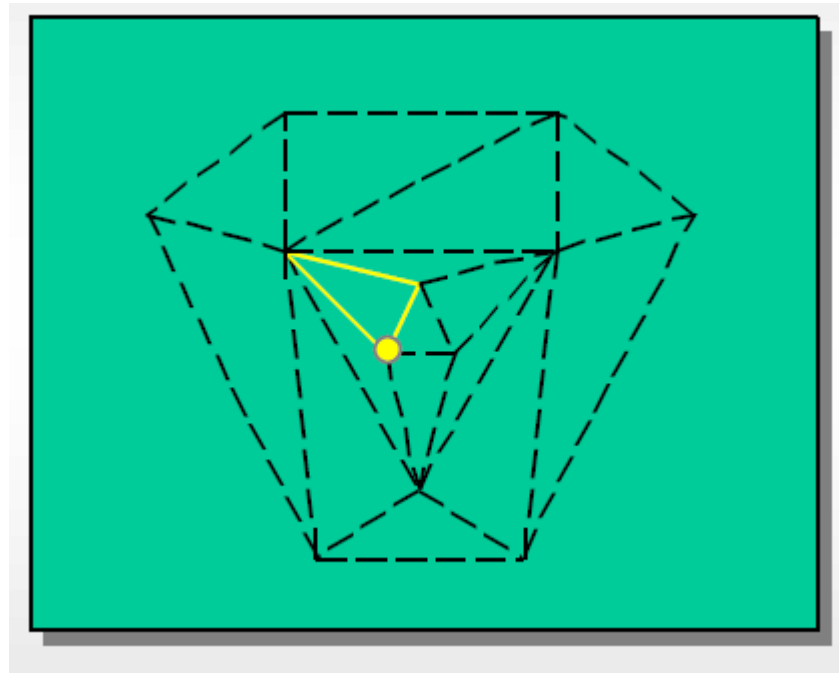
# Encoding



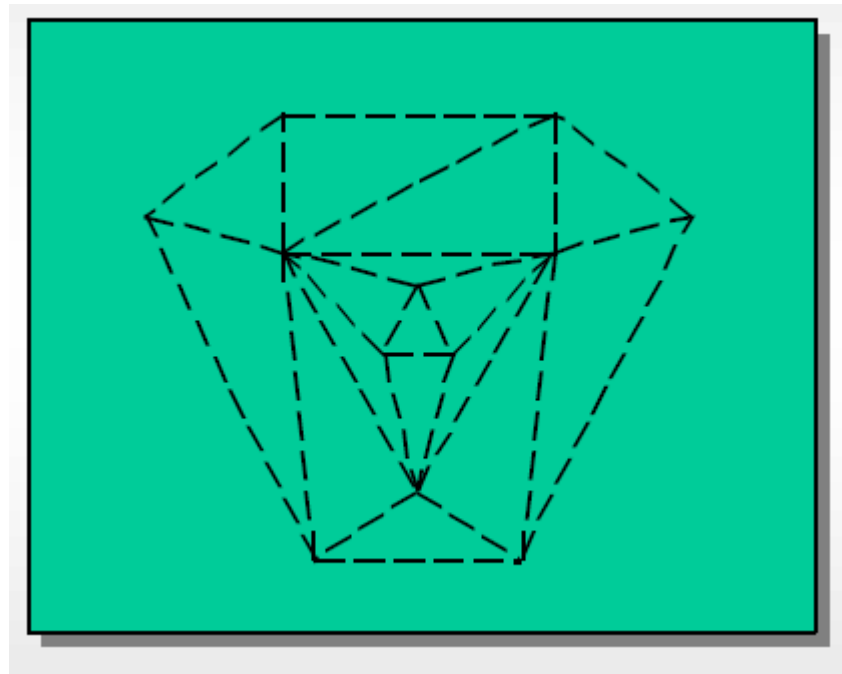
# Encoding



# Encoding



# Encoding

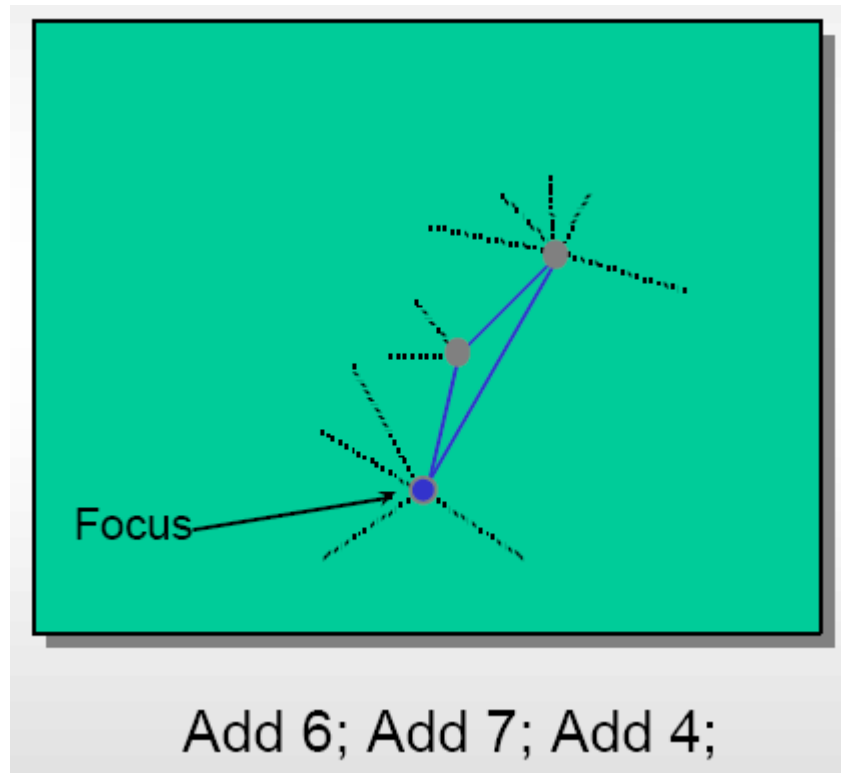


# The Code

```
Add 6; Add 7; Add 4; Add 4; Add 8;  
Add 5; Add 5; Add 4; Add 5; Split 5;  
Add 4; Add 4; Add Dummy 6; Add 4;
```

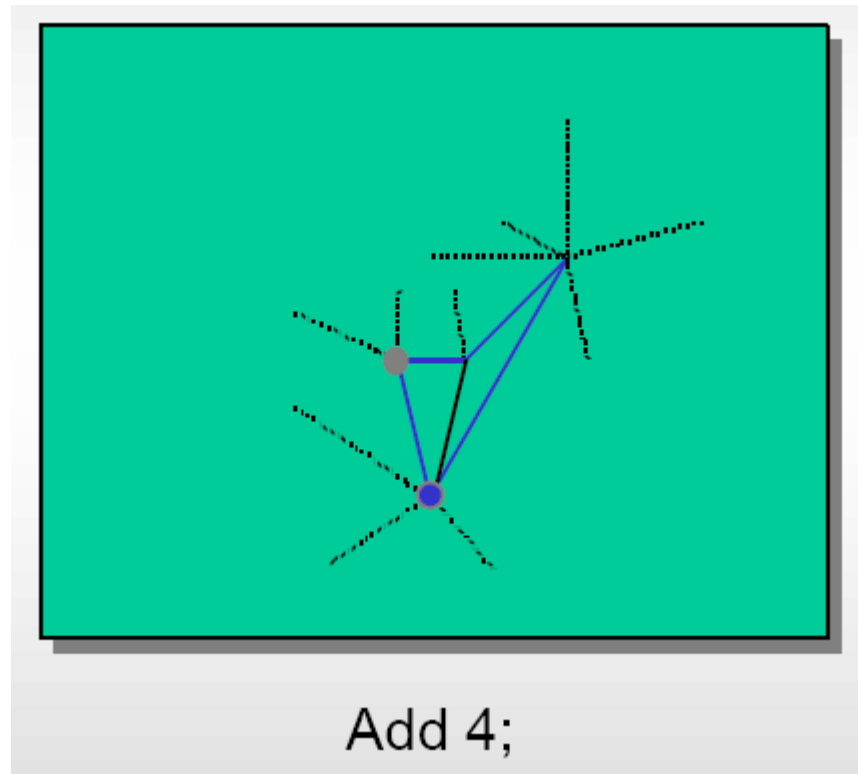
- For regular meshes (constant degree), spectacular compression ratios may be achieved.

# Decoding

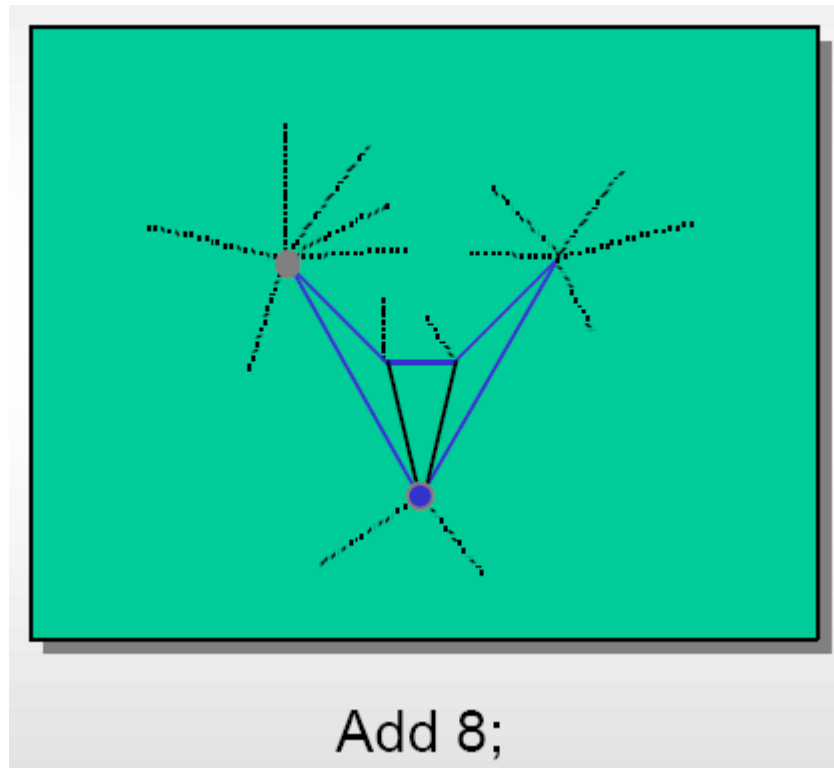




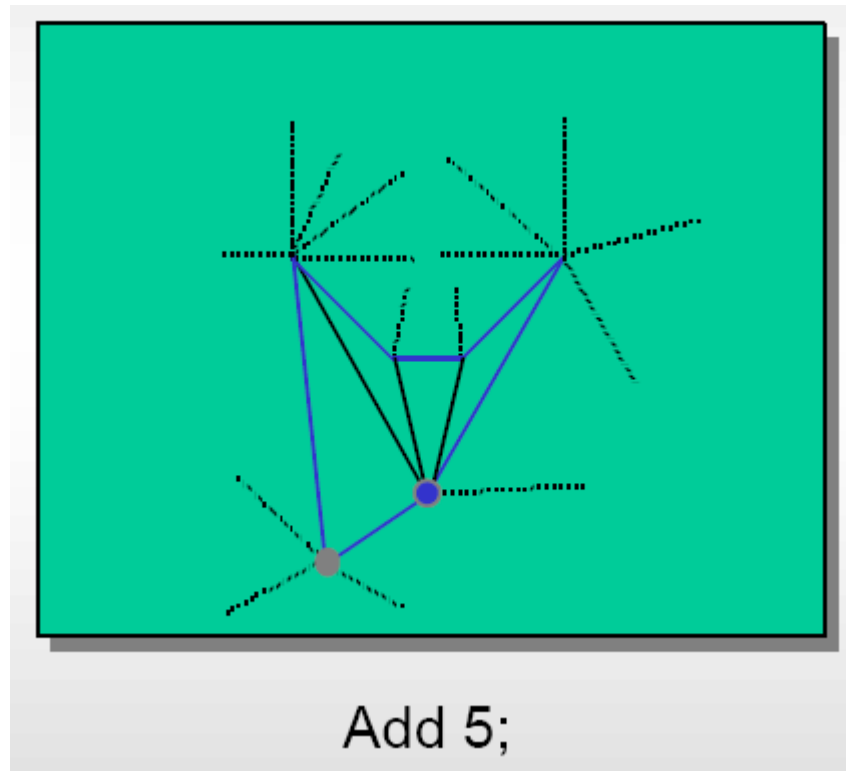
# Decoding



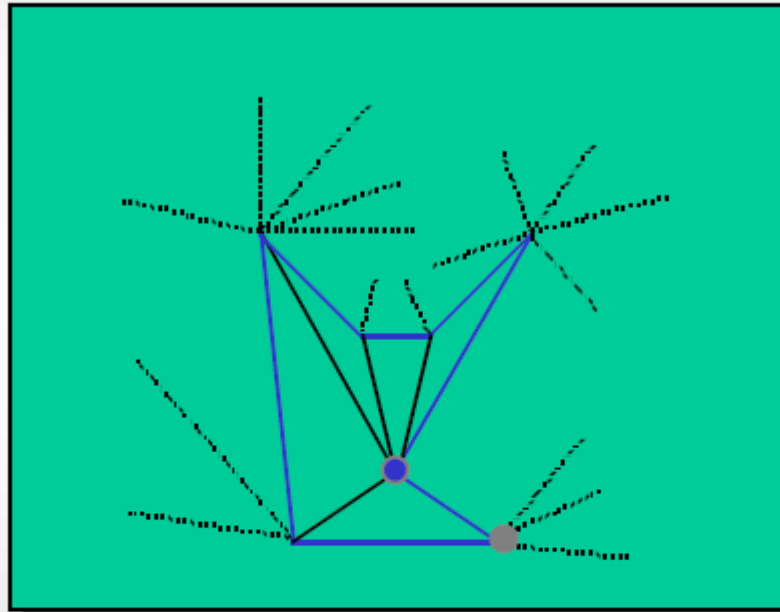
# Decoding



# Decoding

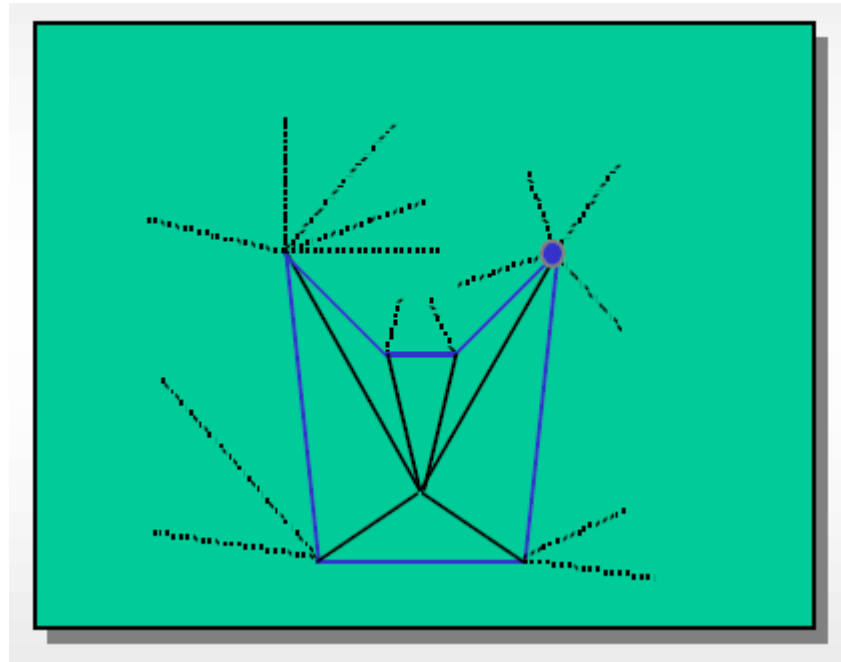


# Decoding

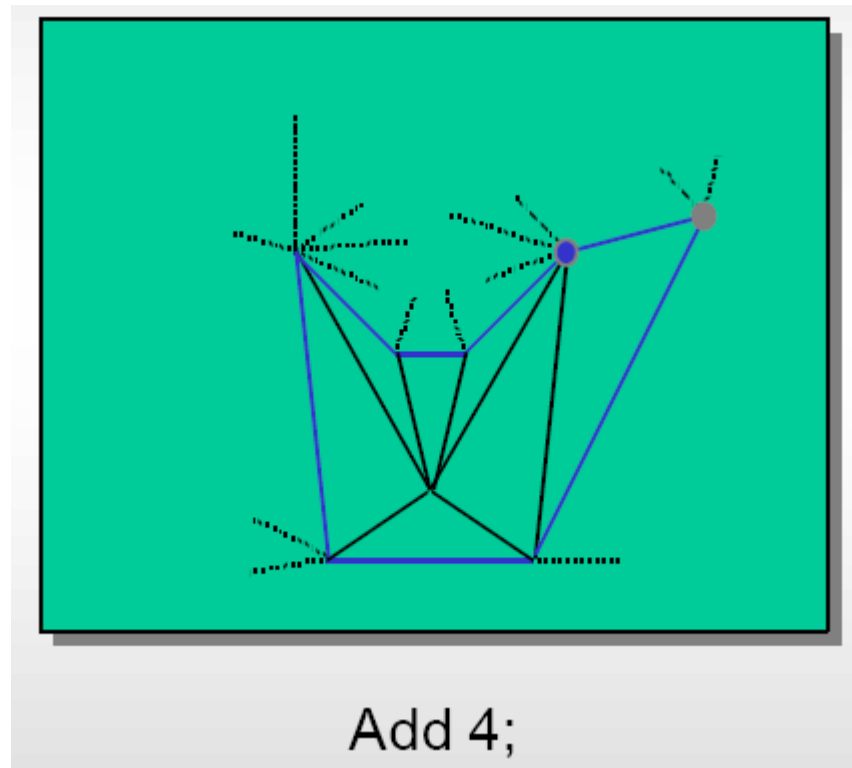


Add 5;  
(focus full)

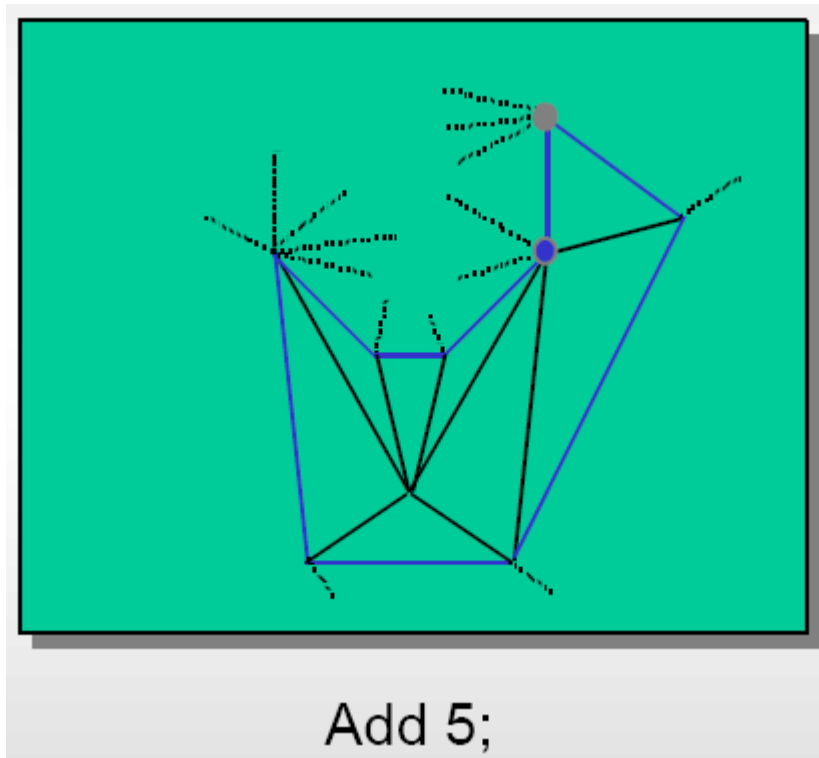
# Decoding



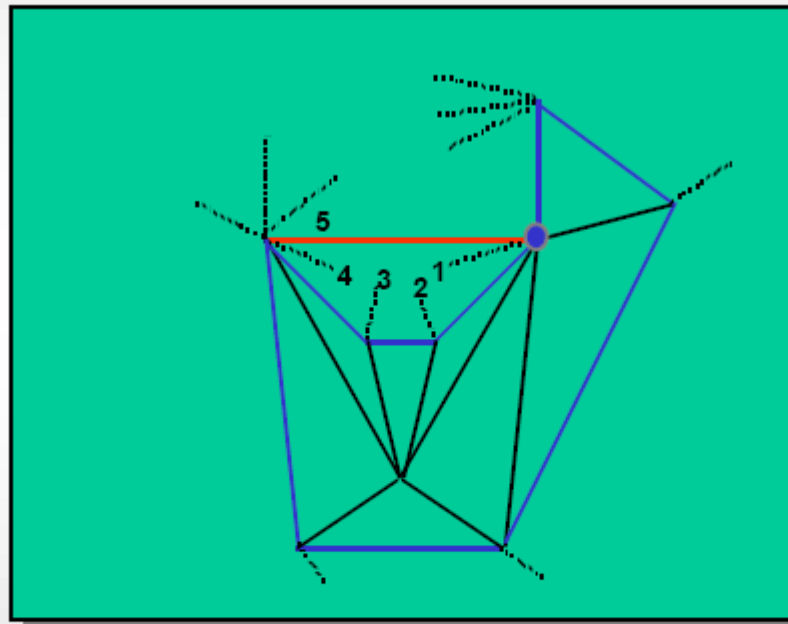
# Decoding



# Decoding



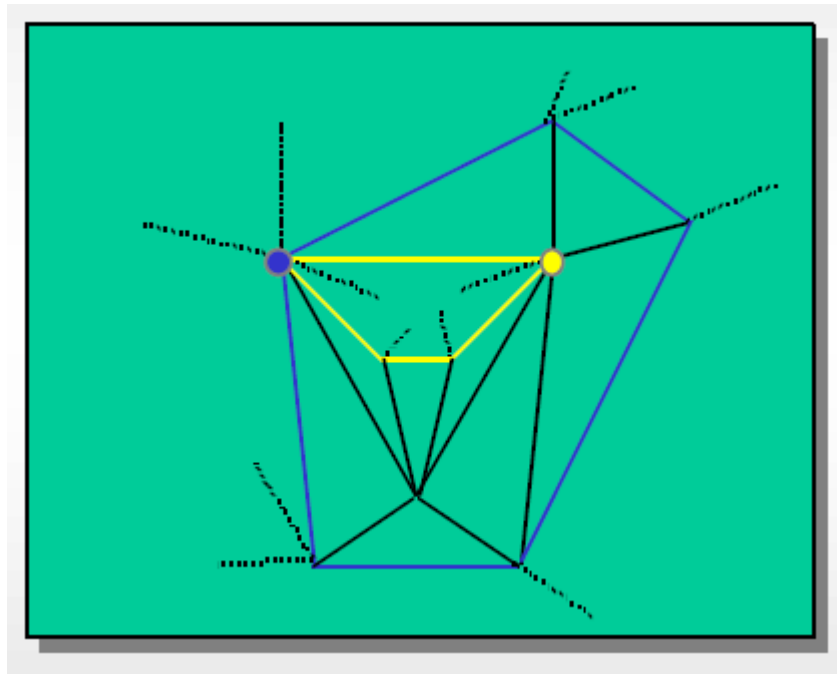
# Decoding



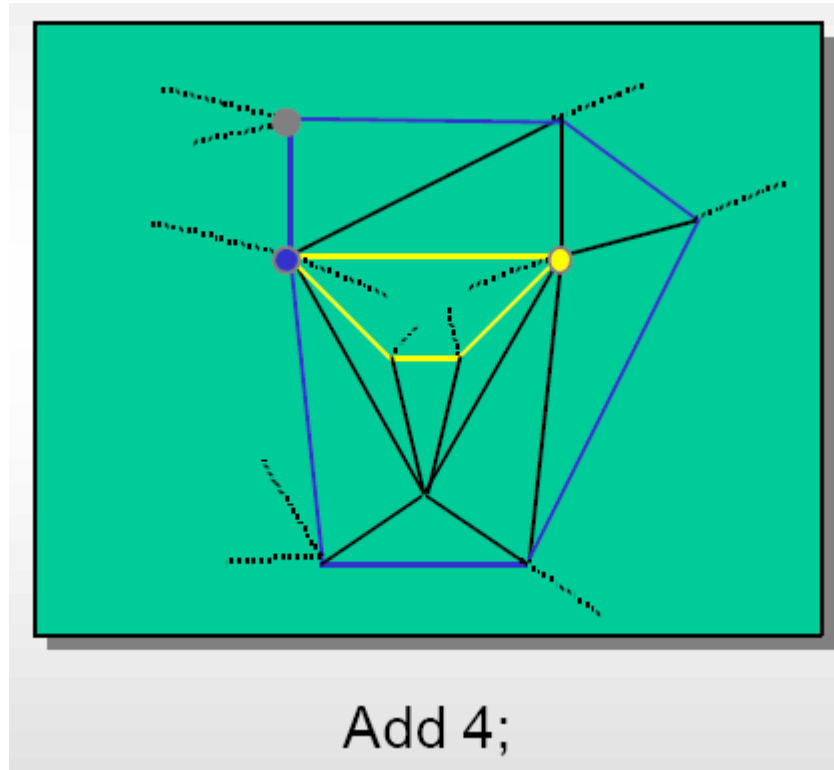
Split 5;  
(focus full)



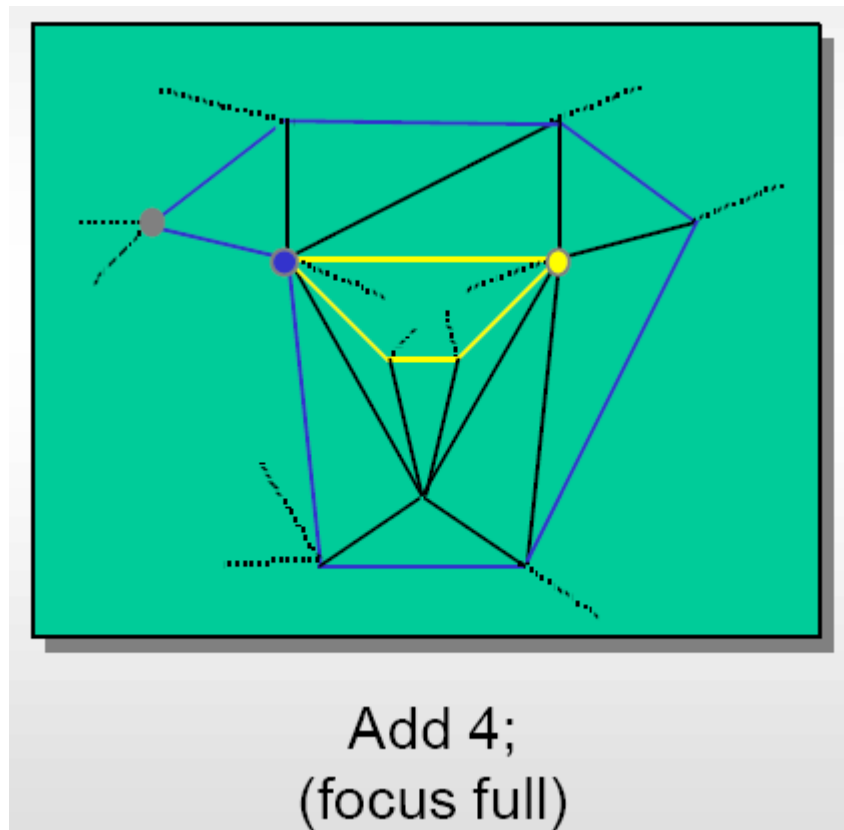
# Decoding



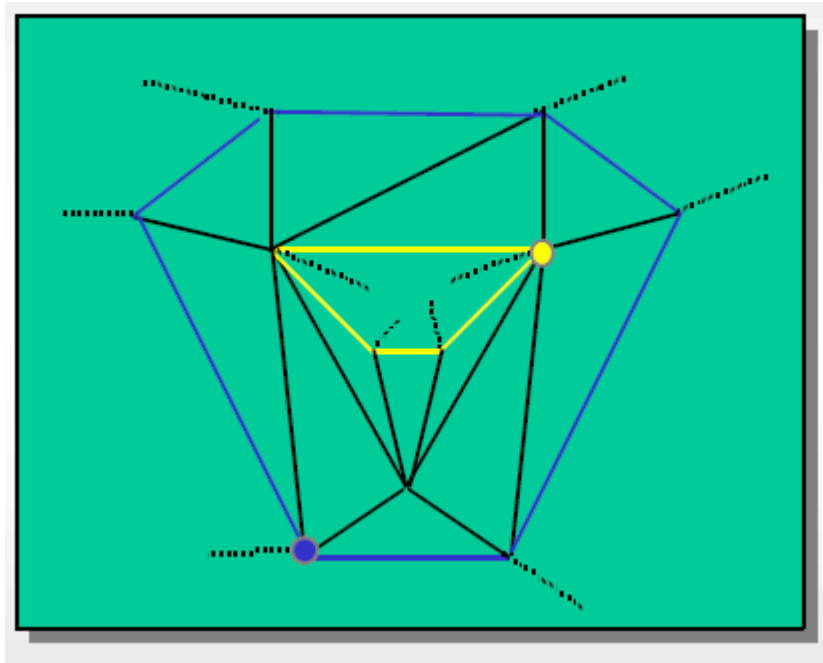
# Decoding



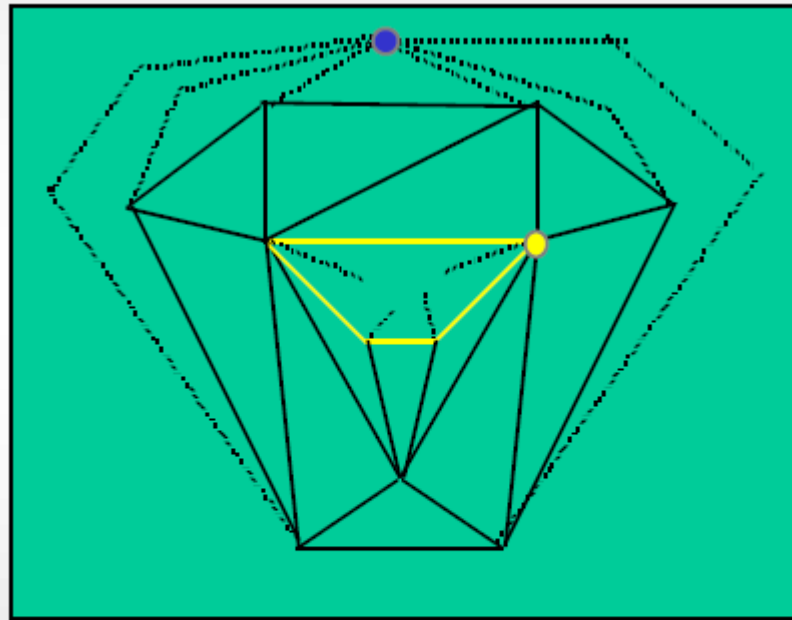
# Decoding



# Decoding

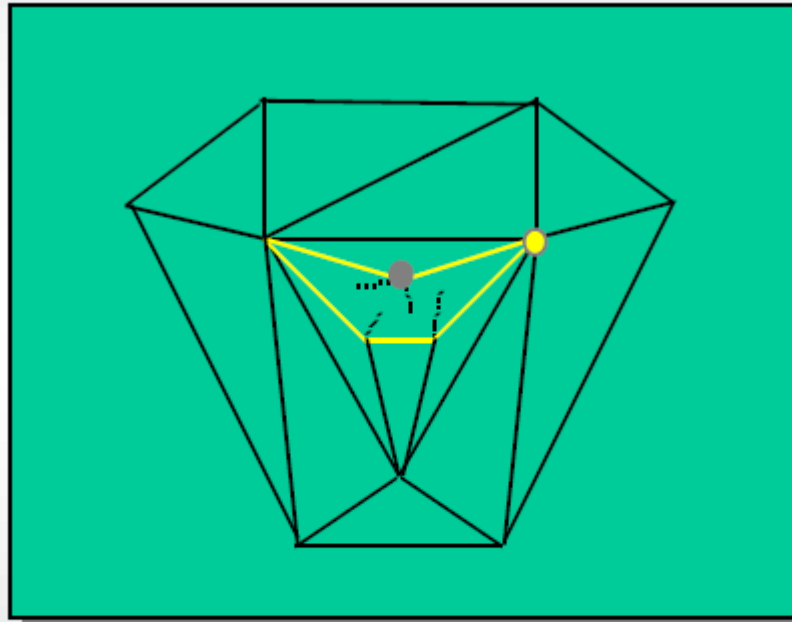


# Decoding



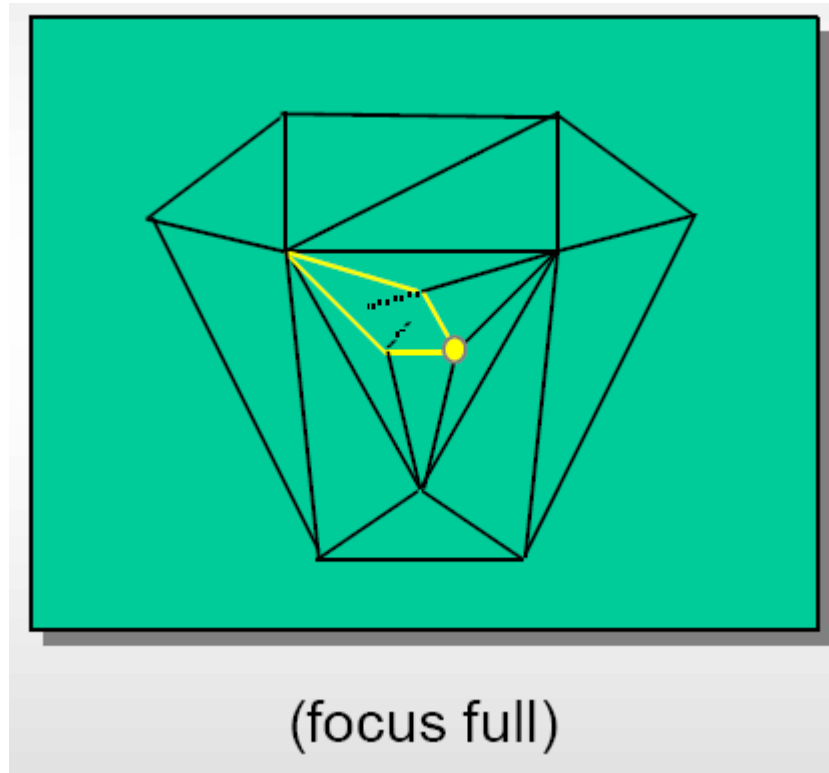
Add dummy 6;  
(AL full - pop AL)

# Decoding

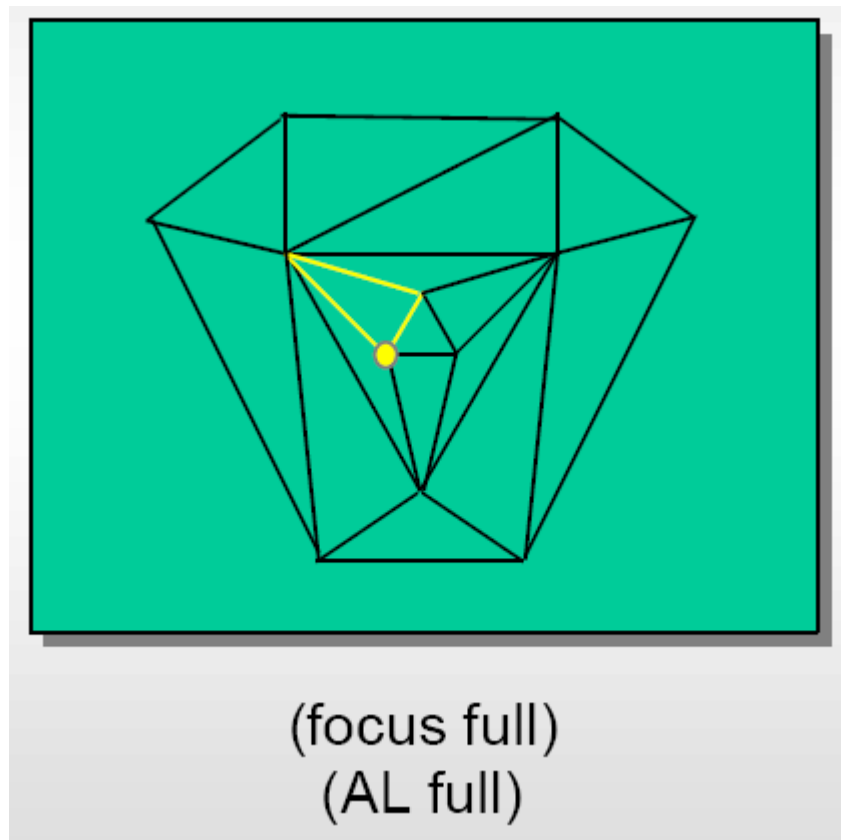


Add 4;  
(focus full)

# Decoding

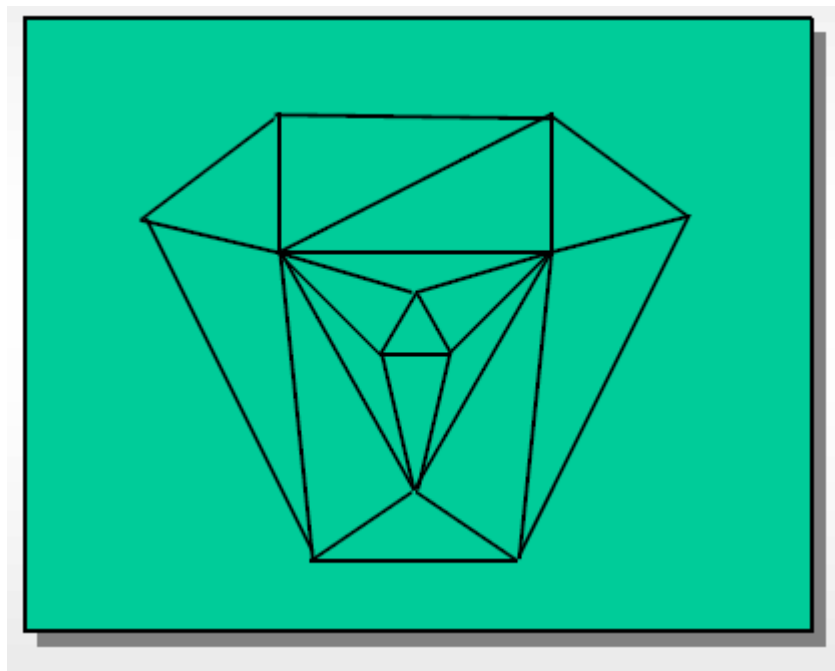


# Decoding

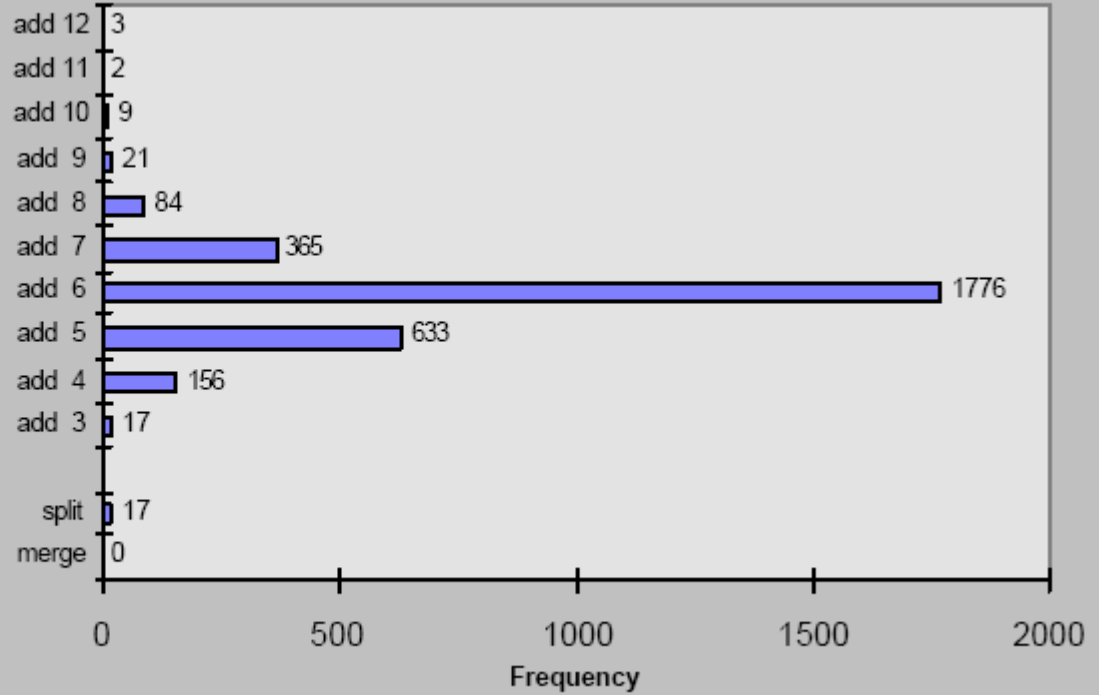




# Decoding



# Example



# More Examples



*Eight*: 1,536 tri.



*Triceratops*: 5,660 tri.



*Cow*: 5,804 tri.



*Beethoven*: 5,028 tri.



*Dodge*: 16,646 tri.



*Starship*: 8,152 tri.

# Results

Model	#tri.	bits/tri
Eight	1,536	0.2
Triceratops	5,666	1.4
Cow	5,804	1.1
Beethoven	5,028	1.4
Dodge	16,646	0.9
Starship	8,152	0.5
<b>Average</b>		<b>0.9</b>

# Performance

- Disadvantages:
  - No theoretical upper bound on code length
- Advantages:
  - Gives **very good** compression rates (approx 2 bits/vertex) on typical meshes
  - Gives excellent rates on highly regular meshes

# Extensions

- Merge operation required when genus  $> 0$ 
  - Occurs when two different cut-borders intersect
- Non-manifolds treated by cutting into manifold pieces

# Several Other Solutions

- **Deering: Generalized triangle strips**
  - Use buffer to avoid sending vertices more than once
  - Designed for hardware decompression
- **Taubin&Rossignac: Topological Surgery**
  - Efficient encoding of vertex and triangle trees
  - MPEG-4 Standard
- **Gumhold&Strasser: Cutborder**
  - Encode spiraling pattern and offsets that define bifurcations
- **Touma&Gotsman**
  - Encode vertex valence and bifurcation offsets (great for regular meshes)
- **Rossignac&Szymczak&King: Edgebreaker**
  - No need to encode offsets of spiraling pattern
  - 1.83T bits **guaranteed**, 1.0T bits demonstrated for large models

# Discussions



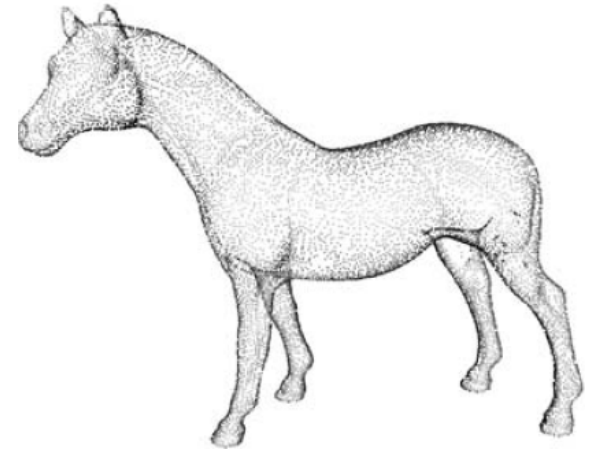
# Geometry Encoding

# Vertex Data

- **Position: x y z**
- **Normal: nx ny nz**
- **Color: r g b {a}**
- **Texture coordinates: s t {r} {q}**
- **(Others)**

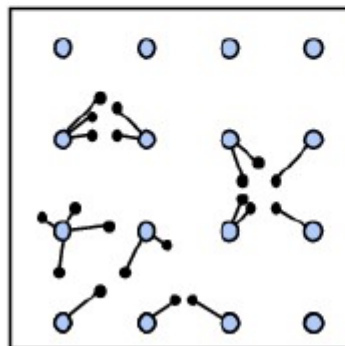
# The Geometry

- Vertex coordinates  $(x, y, z)$  are
  - Floating point values
  - Almost unrestricted in:
    - range
    - precision
  - **Uniformly** spread in 3D
- Compression exploits input redundancy
  - **hard to find in raw geometry data**
- **Lossy compression is OK!!**

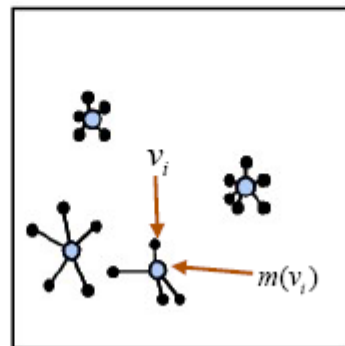


# Quantization

- Map  $n$  values  $v_i$  to  $k \ll n$  values  $m(v_i)$ , without losing **too much** information
- Quantization error: 
$$Err(v, m) = \sum_{i=1}^n \|v_i - m(v_i)\|^2$$
- Find  $k$  and  $m$  such that  $Err(v, m)$  is minimized



Uniform



Non-uniform

# Quantization

- Example: rounding a set of doubles into integers
- Applications:
  - Image and voice compression
  - Voice recognition
  - Color display
  - Geometric compression

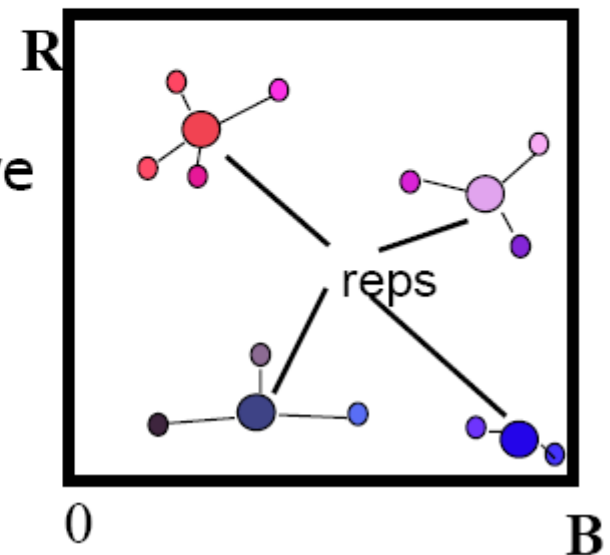
# Example: color quantization

- Used for limited dynamic-range displays (e.g. an 8 bit display can display only 256 different colors)

- Reducing number of colors
  - Choosing set of representative colors (*colormap* or *palette*)
  - Map rest of colors to them

- Usually uses 256 colors

quantization to 4 colors



# Representatives

- How to choose representative colors?
  - Fixed representatives, image independent - fast
  - Image content dependent – slow
- Which image colors mapped to which representatives?
  - Nearest representative - slow
  - By space partitioning - fast

# Color quantization examples



256 colors



64 colors



16 colors



8 colors



4 colors

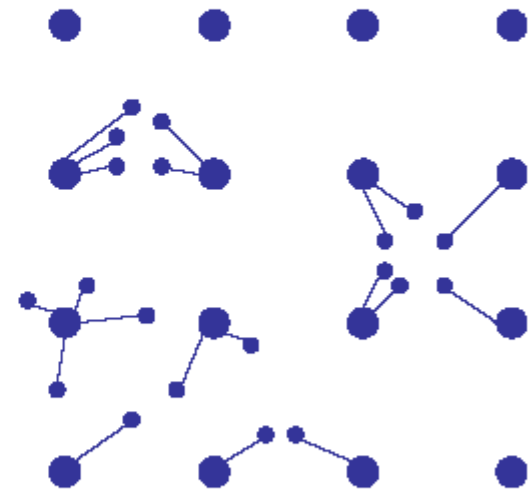


2 colors



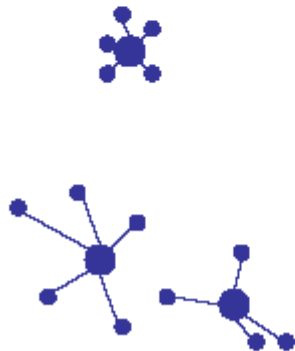
# Uniform Quantization

- Quantization space partitioned into equal sized regions (e.g. grid) – fixed representatives
- Input independent
- Some representatives may be *wasted*
- Common way for 24- $\rightarrow$ 8 bit color quantization: retain 3+3+2 most significant bits of R, G & B components



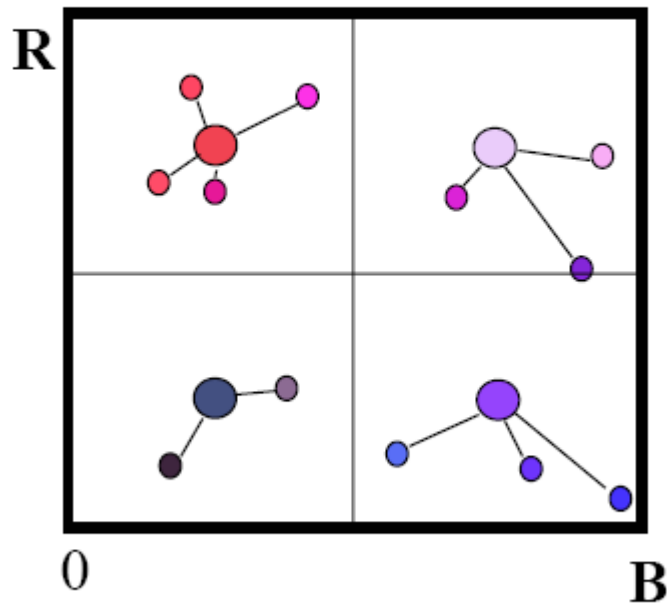
# Non-uniform Quantization

- Quantization space partitioned according to input data
- Goal: choosing "best" representatives
  - Minimal distance error (if "distance" is defined)



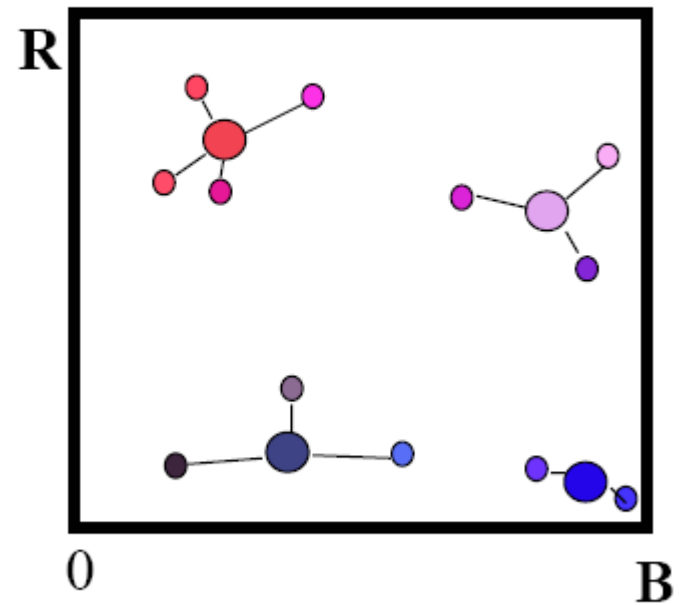
# Examples

uniform quantization  
to 4 colors



large *quantization error*

image-dependent  
quantization to 4 colors



small *quantization error*

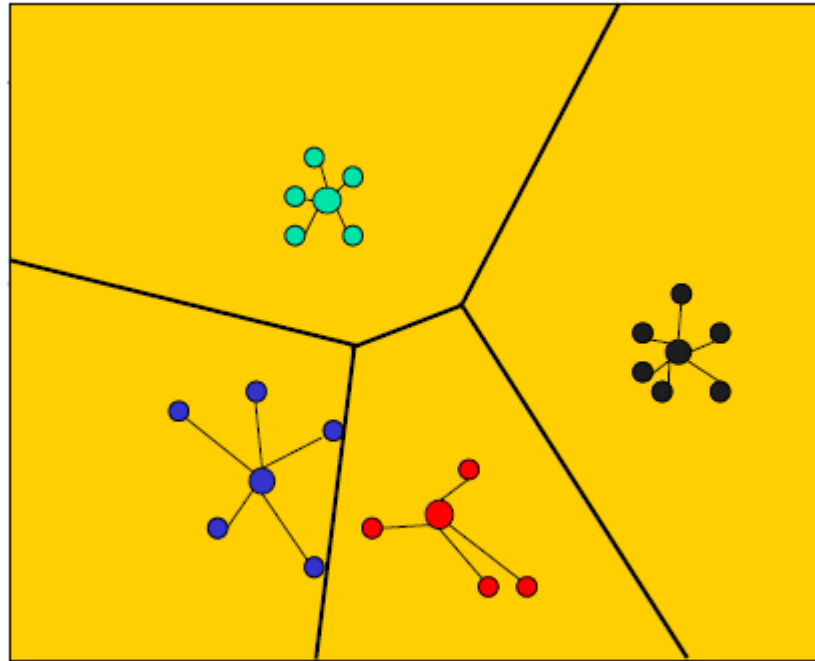
# Quantization & Lossy Coding

- Quantization used as lossy coding method when there is notion of distance between symbols to be coded
  - Coordinates
  - Colors
  - Normals
  - Not good for characters

# Lloyd algorithm for VQ

- Given  $k$ , finds best  $k$  representatives
- Iterative method: ( $v_i$  – representatives)
  - for  $i=1$  to  $k$  do {  $v_i \leftarrow$  random point }
  - While ( $v_i$  still moves)
    - $S_i \leftarrow$  closest data points to  $v_i$
    - $v_i \leftarrow$  centroid of  $S_i$  (sum of  $S_i$  coordinates /  $|S_i|$ )

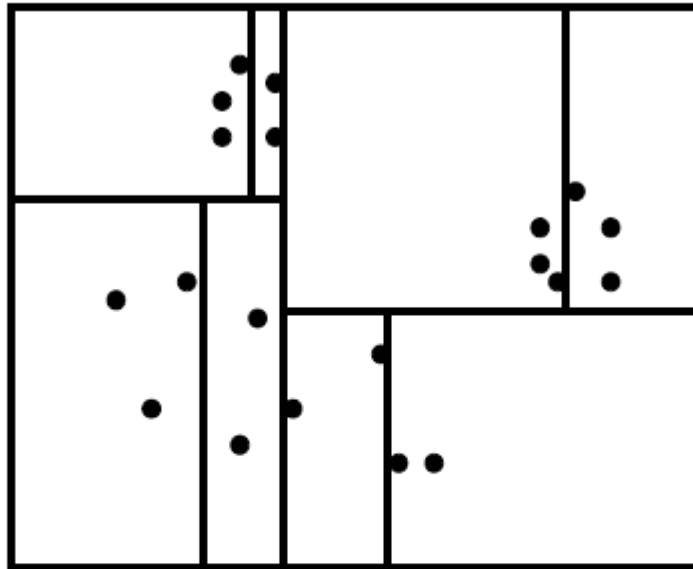
# Lloyd algorithm - example



# Lloyd algorithm (cont.)

- At each iteration, find  $S_i$  using Voronoi diagram (with  $v_i$  as sites)
- VQ problem in general is NP-Complete (finding BEST representatives). Lloyd algorithm generates the optimal solution but is very slow.
- What if  $k$  is not given?
  - Initialize  $k \leftarrow 2$
  - Perform Lloyd algorithm
  - While quantization error is too big do:
    - $k \leftarrow k+1$
    - Perform Lloyd algorithm

# Median cut quantization



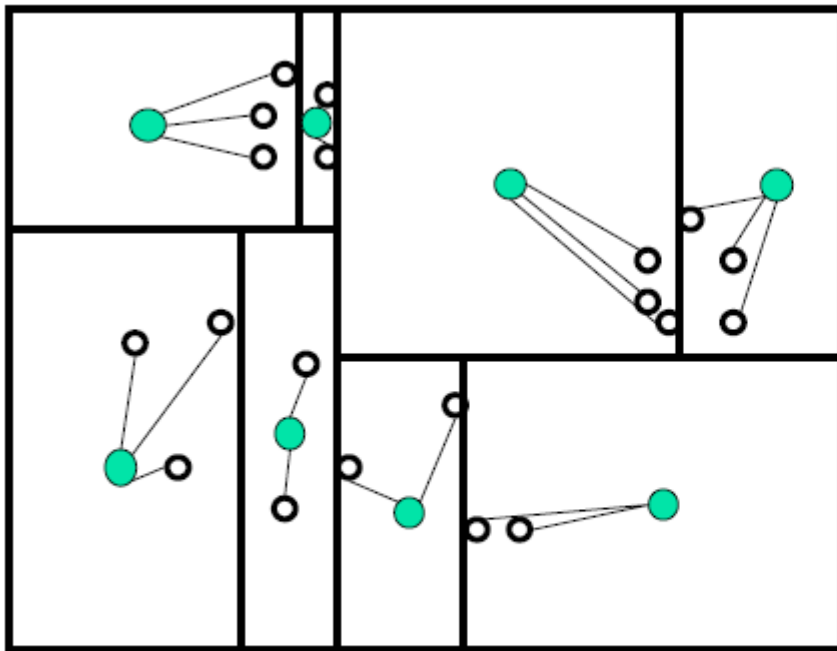
Median cut alg. - heuristic approximation to optimal (Lloyd) VQ solution



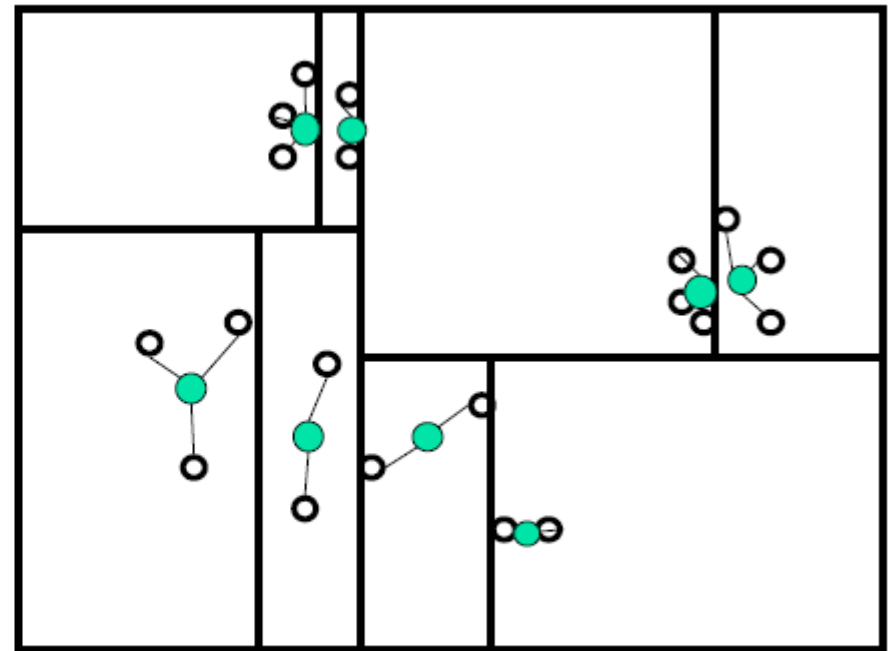
# Median cut (cont.)

- *while (num\_of\_cells < k) do*
  - Split each cell into half vertically/horizontally alternately, according to number of sites
- Choose representatives for each cell:
  - Geometric cell center
  - Centroid of sites in cell (better results)

# Median cut (cont.)



Cell center



Centroids

# Uniform vs. median cut



original - 256  
colors



uniform

8 colors

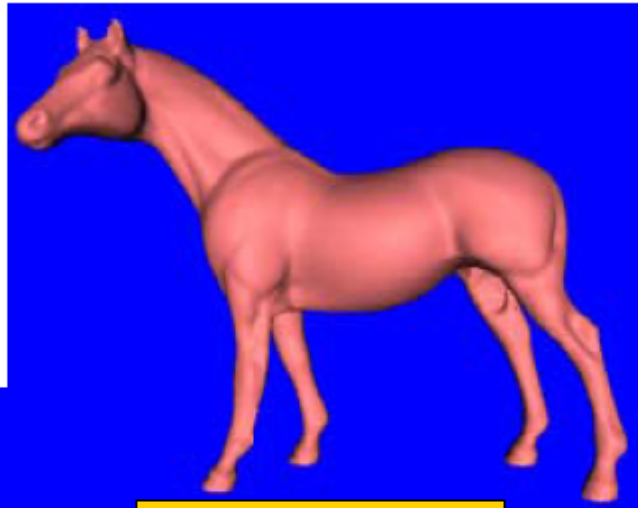


median cut

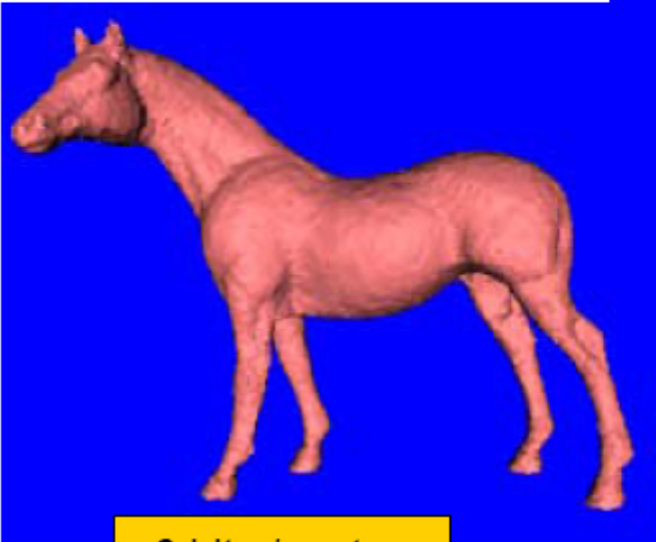
# Uniform geometry quantization

- Coordinates can be considered integers in a finite range after quantization
- Quantization is done on the data bounding box/cube intervals
- Geometry quantization to  $n$  bits:
  - All integer values in  $[0, 2^n-1]$  can be used
  - Scale/transform coordinates to be maximal over given range
  - Quantize each coordinate (rounding to nearest integer)

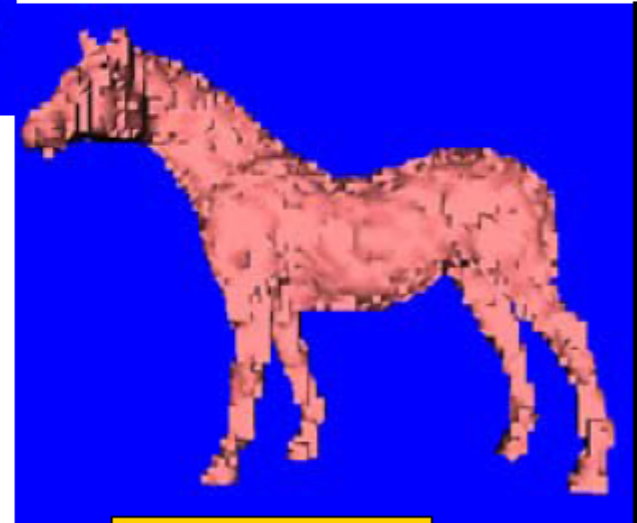
# Uniform geometry quantization - results



12 bits / vertex



8 bits / vertex

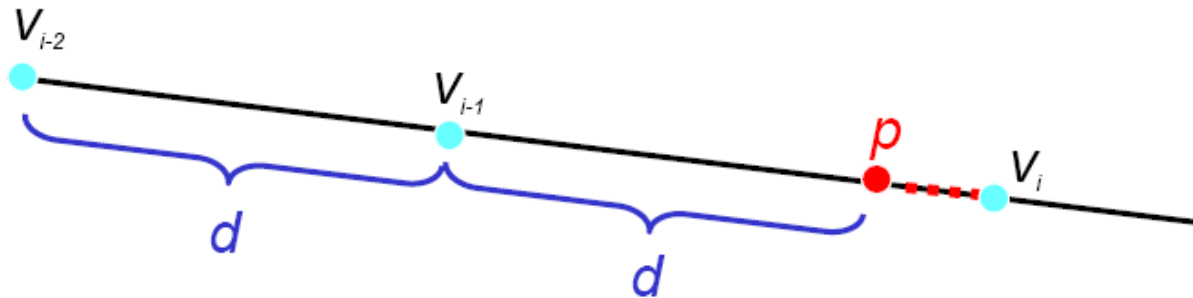


6 bits / vertex

# Prediction

## – History Repeats Itself

- Linear 2D predictor:

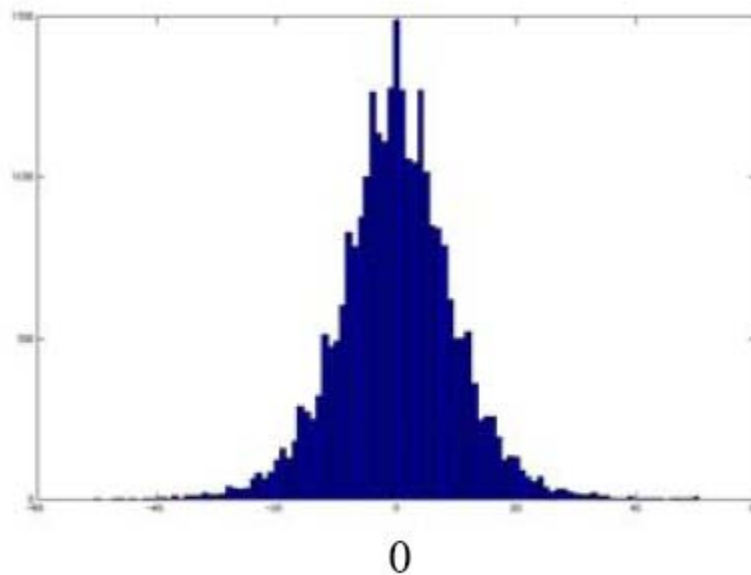
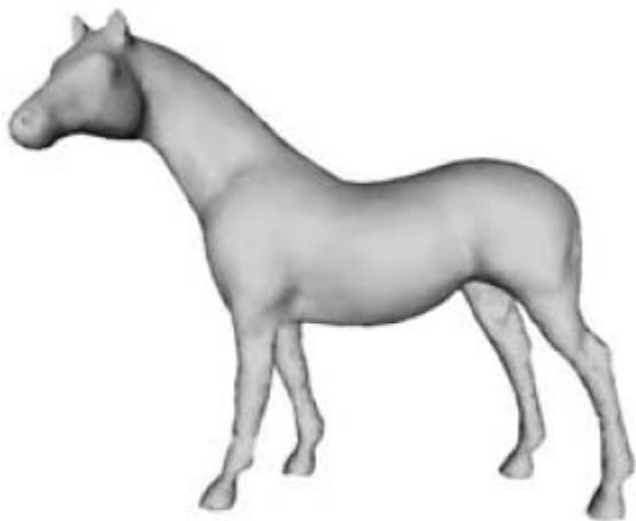


- Prediction rule:  $v_{i-1} - v_{i-2} = p - v_{i-1}$   
or:  $p = 2v_{i-1} - v_{i-2}$
- Prediction error:  $e_i = v_i - p$

# Using Predicted Geometry

- $(v_1 v_2 v_3 \dots)$  - vertex coordinates  
 $(e_3 e_4 e_5 \dots)$  - prediction errors
- Naive geometry coding:  $v_1 v_2 v_3 \dots$
- Coding using prediction:  $v_1 v_2 e_3 e_4 e_5 \dots$
- Decoding:  
$$v_i = 2 v_{i-1} - v_{i-2} + e_i \quad i > 2$$

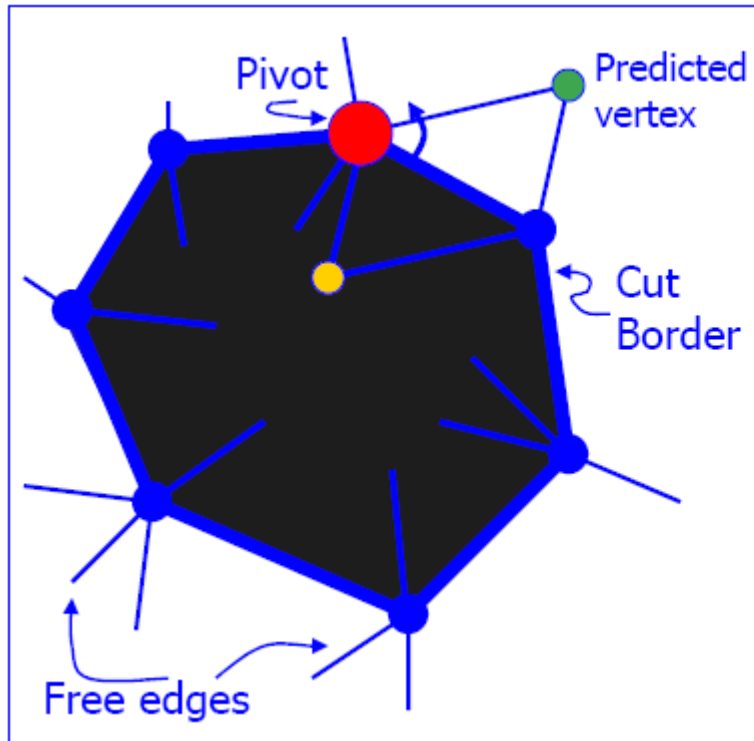
# Good Prediction Reduces Entropy



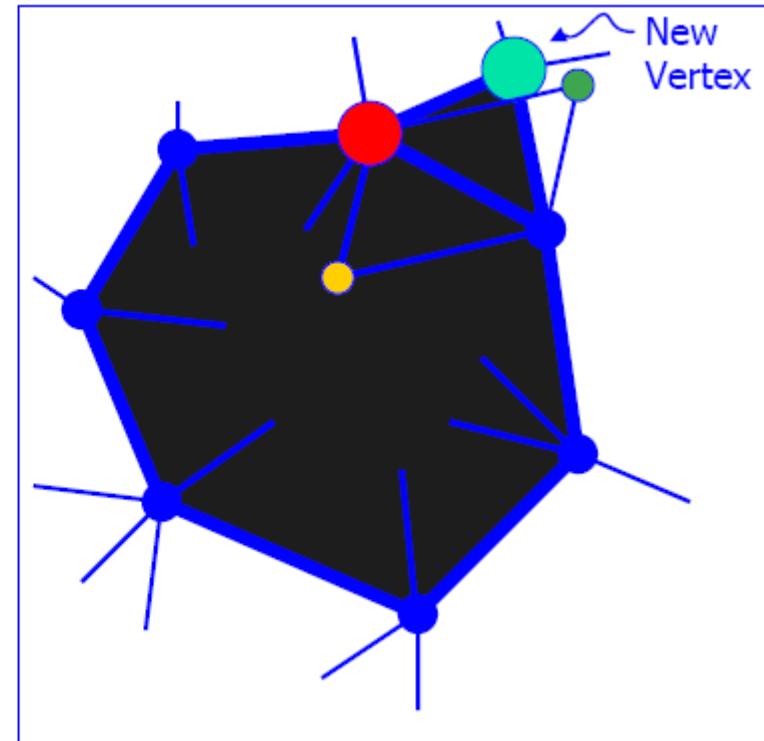
Distribution of prediction errors



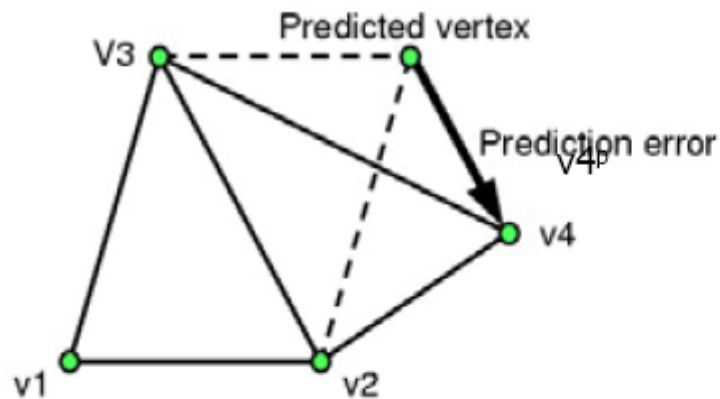
# Surface-Based Prediction



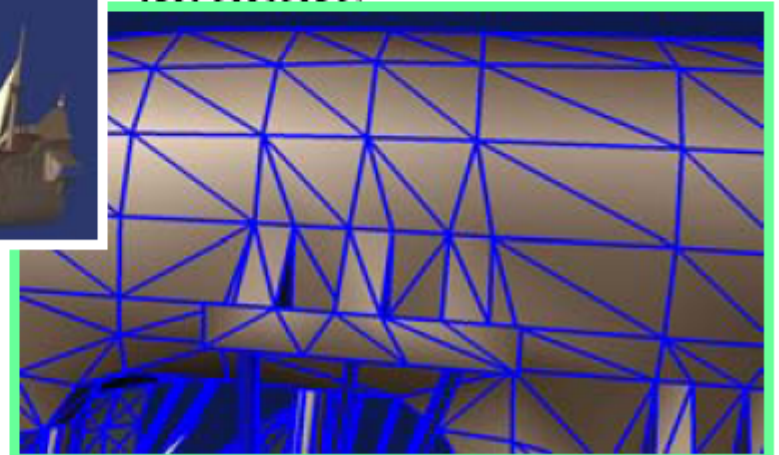
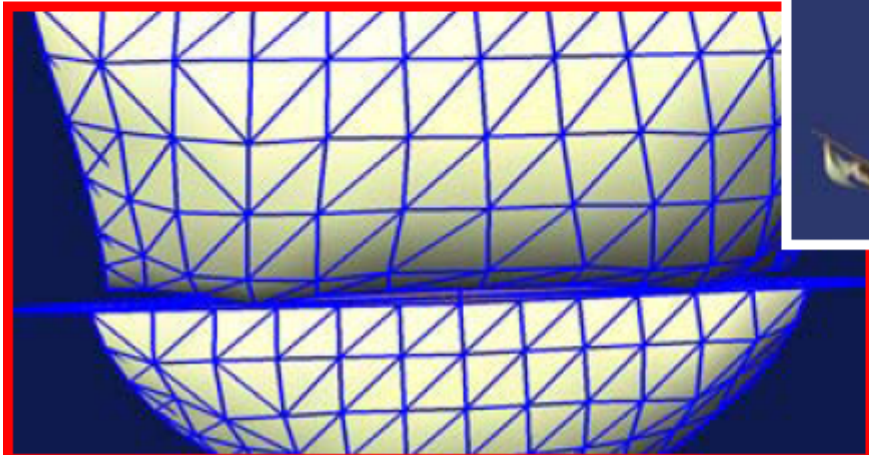
Output "add 4  
( $\Delta x, \Delta y, \Delta z$ )"



# Parallelogram Prediction



- Use the connectivity to predict the geometry:  
$$V_{4p} = v_2 + v_3 - v_1$$
- $(-1, 1, 1)$  in *barycentric coords*
- **Can** be applied to integers

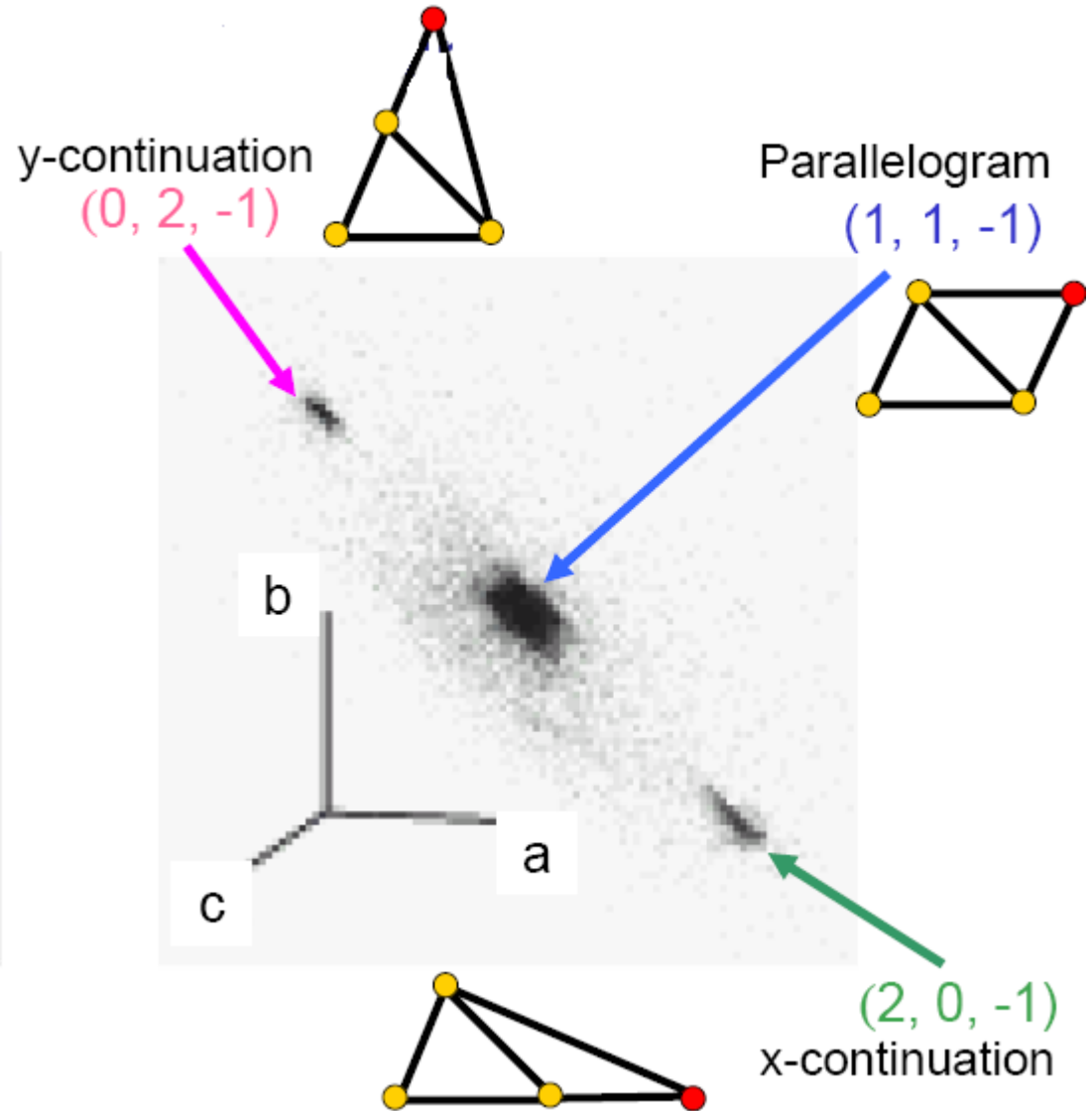


# Some Results

Raw quantized data = 10 bits/coord = 30 bits/vertex

<b>Model</b>	<b>vertices</b>	<b>line predictor</b>	<b>parallelogram</b>	<b>ratio</b>
Eight	766	18.8	14.0	1.3
Triceratops	3100	18.4	14.1	1.3
Cow	3078	18.9	14.6	1.3
Beethoven	2847	22.7	17.3	1.3
Dodge	10466	19.8	12.4	1.6
Starship	4468	19.2	13.2	1.5
<hr/>				
Average		19.6	14.3	1.4

# Other Predictive Patterns

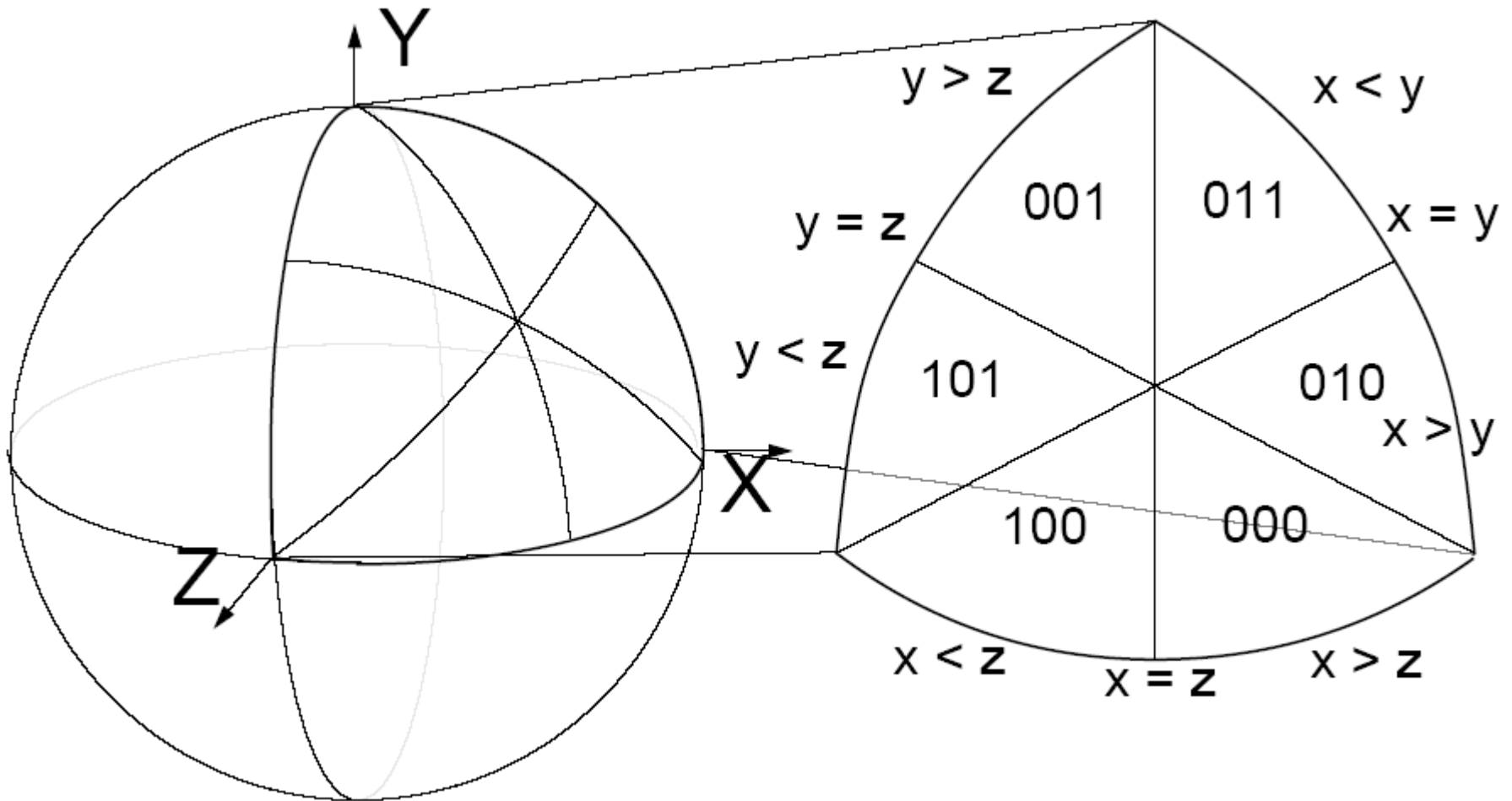


# Predictor Traversal Optimization

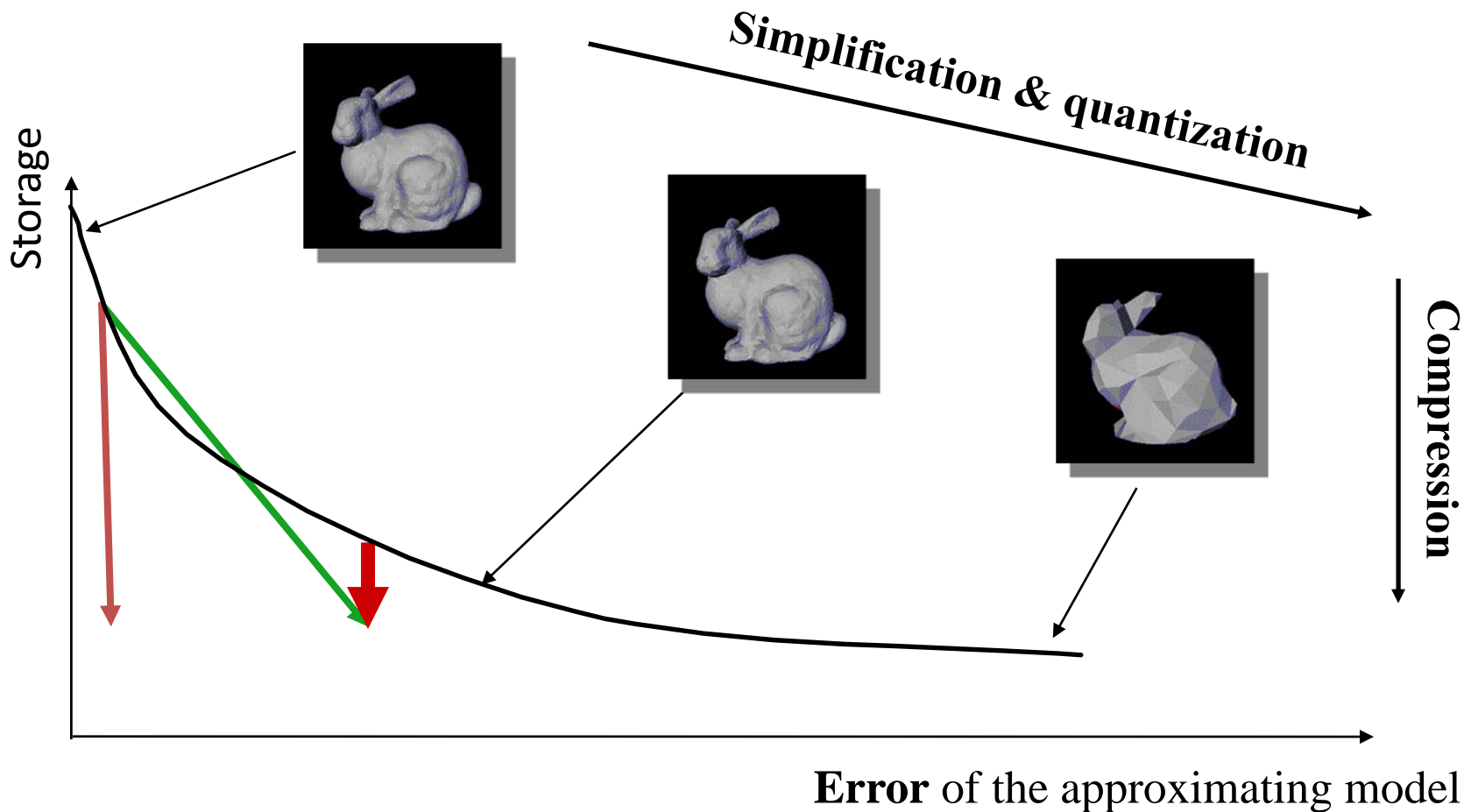
- Parallelogram predictor assumes mesh is locally planar and regular
- Problem: Fails on meshes with sharp corners and creases
- Solution: Optimize face traversal to achieve good predictors



# Alternate Normal Representation



# Complexity of a shape = Storage/Error curve

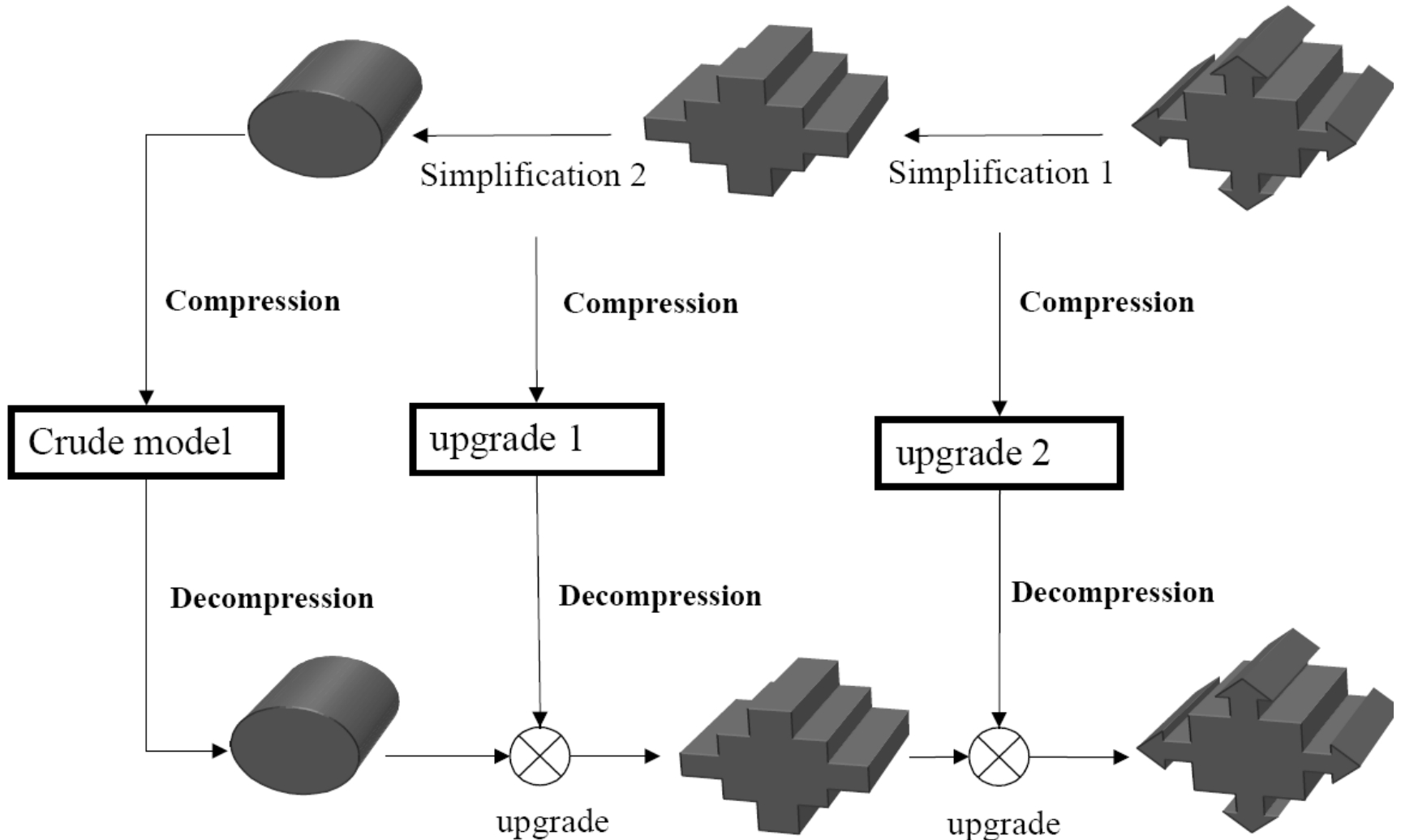


Curve depends on representation and compression scheme used

$$\text{Estimate } E_T = K/T$$

# Progressive Compression

## - Compressed Successive Upgrades





# Problems

- Higher compression ratio
- Random access
- Loss of bits

# Resources

- Siggraph 2000 Course #38
- Research papers
- Internet

# Discussions