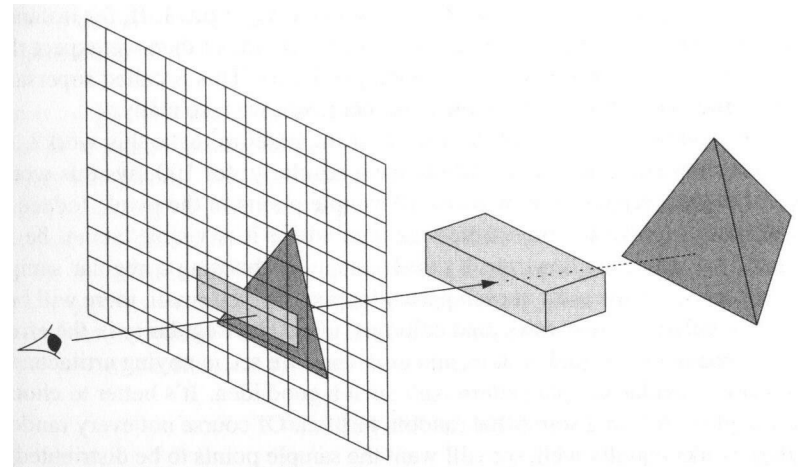




# Ray-Tracing

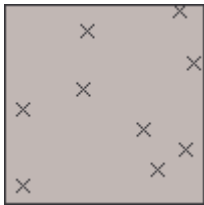
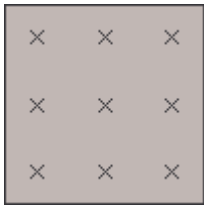
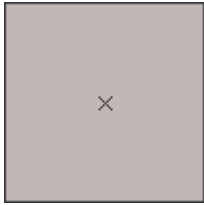
- Render a scene by shooting a ray from the viewer through each pixel in the scene, and determining what object it hits.
- Straight lines will have visible distortion
- We need to *super-sample*



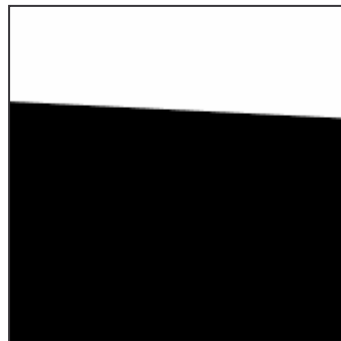
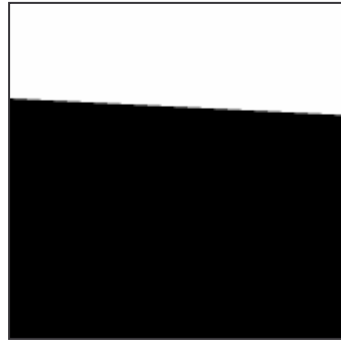
# Super-sampling

- We shoot many rays through each pixel and average the results.
- How should we distribute the rays over the pixel? Regularly?
- Distributing rays regularly isn't such a good idea. Small per-pixel error, but regularity in error across rows and columns. (Human vision is sensitive to this.)

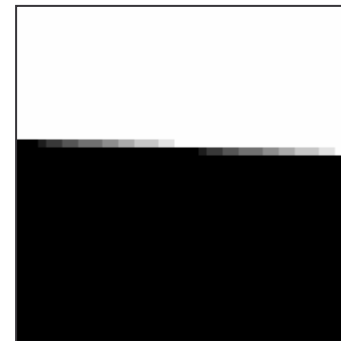
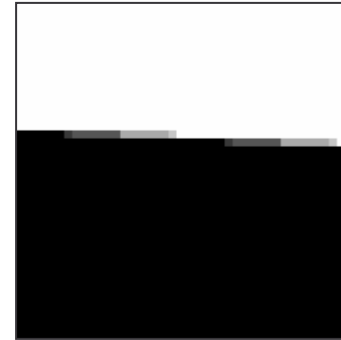
Sample Point Set



Rendered Half-Plane



(4x zoom)

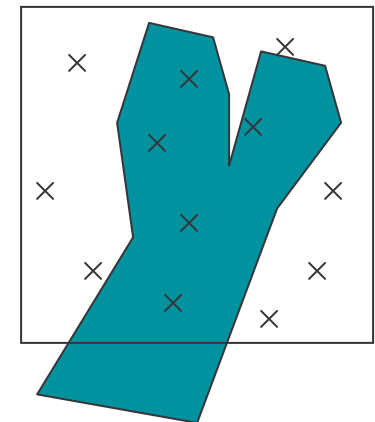
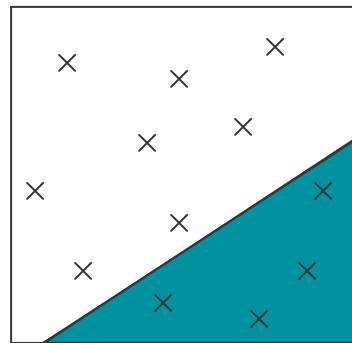


# Super-sampling

- We need to choose our sample points in a somewhat random fashion.
- Finding the ideal distribution of  $n$  sample points in the pixel is a very difficult mathematical problem.
- Instead we'll generate several random samplings and measure which one is best.
- How do we measure how good a distribution is?

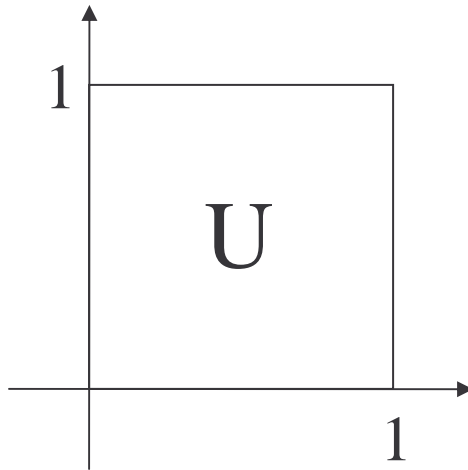
# Discrepancy

- We want to calculate the discrepancy of a distribution of sample points relative to possible scenes.
- Assume all objects project onto our screen as polygons.
- We're really only interested in the simplest case: more complex cases don't exhibit regularity of error.



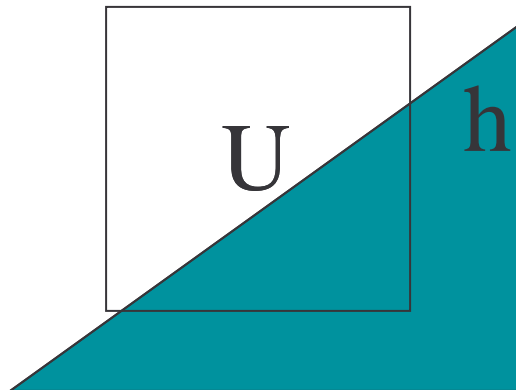
# Discrepancy

- Pixel: Unit square  $U = [0:1] \times [0:1]$



# Discrepancy

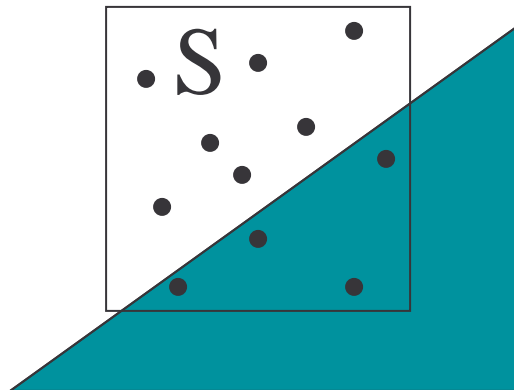
- Pixel: Unit square  $U = [0:1] \times [0:1]$
- Scene:  $H =$  (infinite) set of all possible half-planes  $h$ .





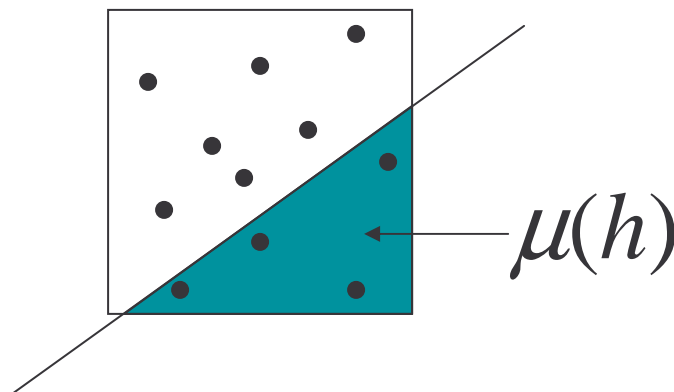
# Discrepancy

- Pixel: Unit square  $U = [0:1] \times [0:1]$
- Scene:  $H =$  set of all possible half-planes  $h$ .
- Distribution of sample points: set  $S$



# Discrepancy

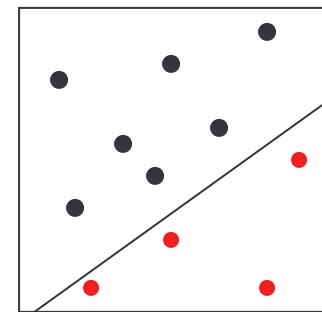
- Pixel: Unit square  $U = [0:1] \times [0:1]$
- Scene:  $H =$  set of all possible half-planes  $h$ .
- Distribution of sample points: set  $S$
- Continuous Measure:  $\mu(h) =$  area of  $h \cap U$



# Discrepancy

- Pixel: Unit square  $U = [0:1] \times [0:1]$
- Scene:  $H =$  set of all possible half-planes  $h$ .
- Distribution of sample points: set  $S$
- Continuous Measure:  $\mu(h) = \text{area of } h \cap U$
- Discrete Measure:

$$\mu_S(h) = \text{card}(S \cap h) / \text{card}(S)$$

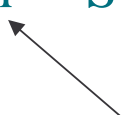


# Discrepancy

- Pixel: Unit square  $U = [0:1] \times [0:1]$
- Scene:  $H =$  set of all possible half-planes  $h$ .
- Distribution of sample points: set  $S$
- Continuous Measure:  $\mu(h) =$  area of  $h \cap U$
- Discrete Measure:  
$$\mu_S(h) = \text{card}(S \cap h) / \text{card}(S)$$
- Discrepancy of  $h$  with respect to  $S$ :  
$$\Delta_S(h) = | \mu(h) - \mu_S(h) |$$
- Half-plane discrepancy of  $S$ :

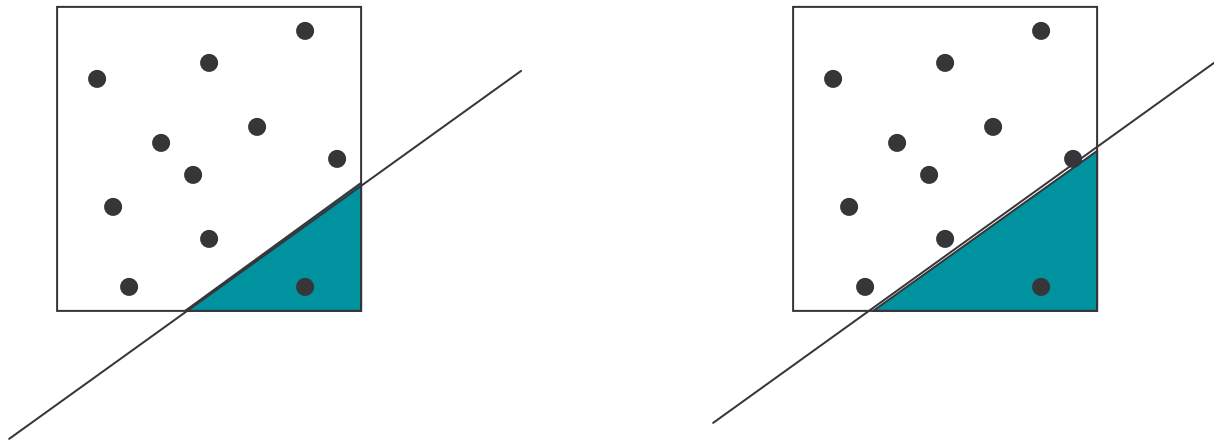
$$\Delta_H(S) = \max_h \Delta_S(h)$$

# How to Compute $\Delta_H(S)$ ?

- $\Delta_H(S) = \max_h \Delta_S(h)$ 
- There is an infinite number of possible half-planes... We can't just loop over all of them
- Need to discretize them somehow

# Idea

- The half-plane of maximum discrepancy must pass through one of the sample points



# Computing the Discrepancy

- The half-plane of maximum discrepancy must pass through at least one sample point
- It may pass through exactly one point
- ... Or two points

# The one point case

- The half-plane has one degree of freedom, i.e., slope.
- The worst-case  $h$  must maximize or minimize  $\mu(h)$
- Constant number of extrema to check
- Algorithm:
  - Enumerate all points  $p$  through which  $h$  passes
  - Enumerate all extrema of  $\mu(h)$
  - Report the largest discrepancy found
- Running time:  $O(n^2)$



# The two point case

- There are  $O(n^2)$  possible point pairs, each defining  $h$
- Need to compute  $\mu_S(h)$  and  $\mu(h)$  in a  $O(1)$  time per  $h$
- $\mu(h)$  is easy
- We need some new techniques for  $\mu_S(h)$

# New Concept: Duality

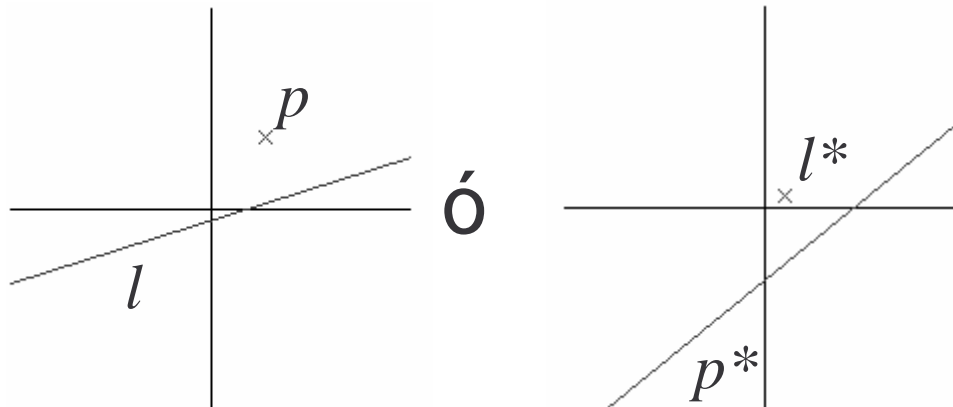
- The concept: we can map between different ways of interpreting 2D values.
- Points  $(x,y)$  can be mapped in a one-to-one manner to lines (slope,intercept) in a different space.
- There are different ways to do this, called *duality transforms*.

# Duality Transforms

- One possible duality transform:
  - point  $p: (p_x, p_y)$   $\acute{o}$  line  $p^*: y = p_x x - p_y$
  - line  $l: y = mx + b$   $\acute{o}$  point  $l^*: (m, -b)$

# Duality Transforms

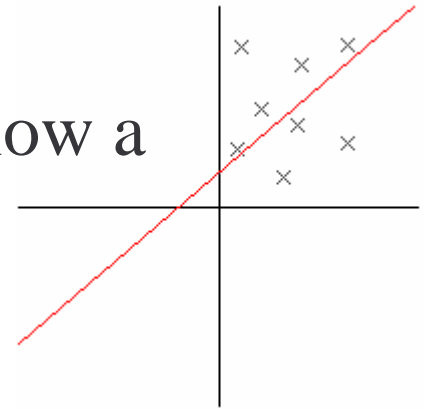
- This duality transform preserves order
  - Point  $p$  lies above line  $l$   $\hat{=}$  point  $l^*$  lies above line  $p^*$



# Back to the Discrepancy problem

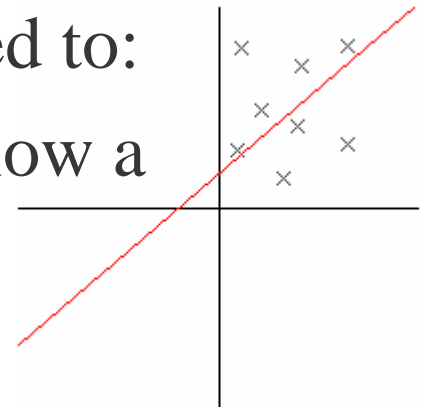
To determine our discrete measure, we need to:

Determine how many sample points lie below a given line (in the primal plane).



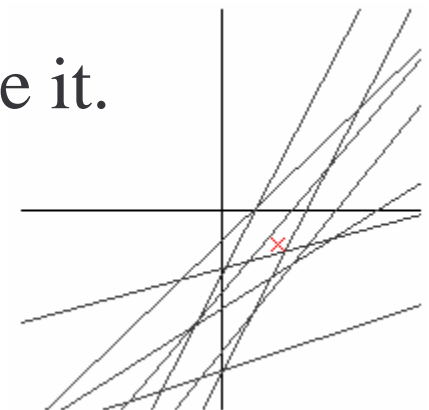
# Back to the Discrepancy problem

To determine our discrete measure, we need to:  
Determine how many sample points lie below a given line (in the primal plane).



$\circ$  dualizes to  $\circ$

Given a point in the dual plane we want to determine how many sample lines lie above it.



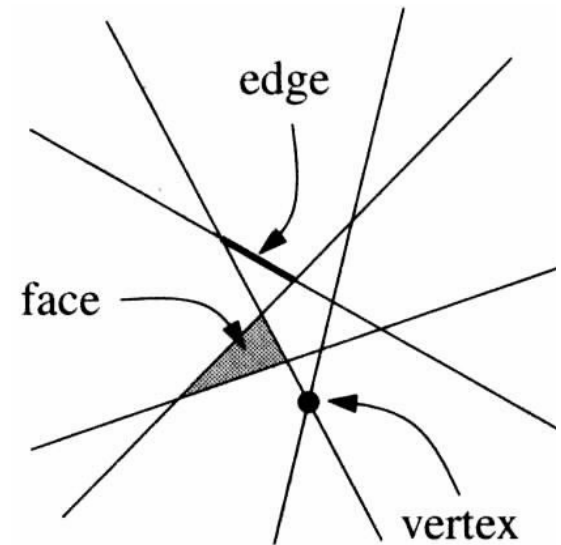
*Is this easier to compute?*

# Duality

- The dualized version of a problem is no easier or harder to compute than the original problem.
- But the dualized version may be easier to think about.

# Arrangements of Lines

- $L$  is a set of  $n$  lines in the plane.
- $L$  induces a subdivision of the plane that consists of vertices, edges, and faces.
- **This is called the *arrangement* induced by  $L$ , denoted  $A(L)$**
- The *complexity* of an arrangement is the total number of vertices, edges, and faces.



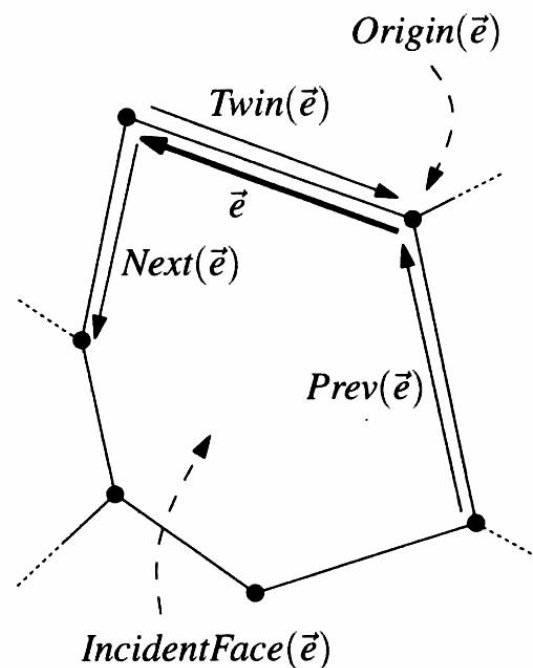


# Combinatorics of Arrangements

- Number of vertices of  $A(L) \leq \binom{n}{2}$ 
  - Vertices of  $A(L)$  are intersections of  $l_i, l_j \in L$
- Number of edges of  $A(L) \leq n^2$ 
  - Number of edges on a single line in  $A(L)$  is one more than number of vertices on that line.
- Number of faces of  $A(L) \leq \frac{n^2}{2} + \frac{n}{2} + 1$
- Inductive reasoning: add lines one by one  
Each edge of new line splits a face.  $\Rightarrow 1 + \sum_{i=1}^n i$
- Total complexity of an arrangement is  $O(n^2)$

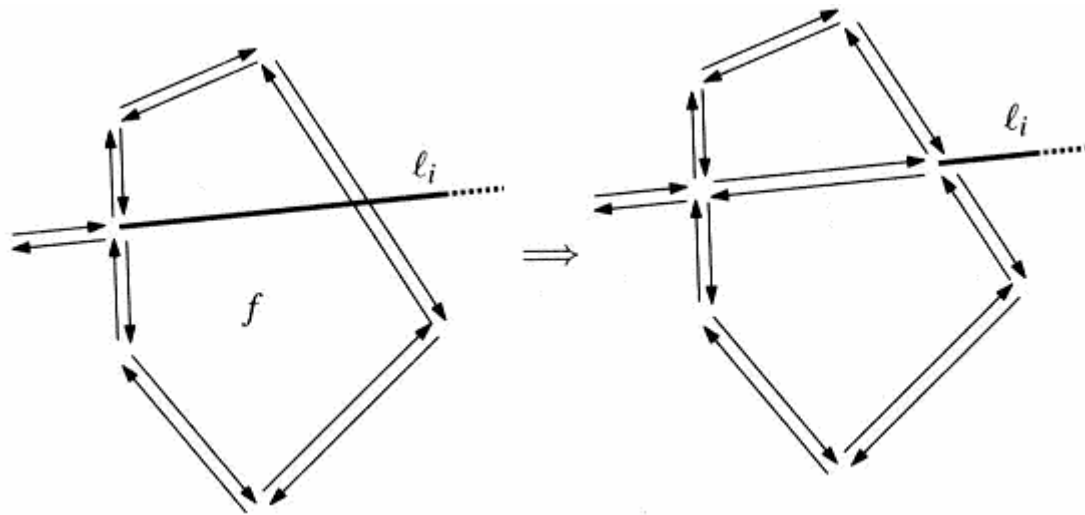
# How Do We Store an Arrangement?

- Data Type: doubly-connected edge-list (DCEL)
  - Vertex:
    - Coordinates, Incident Edge
  - Face:
    - an Edge
  - Half-Edges
    - Origin Vertex
    - Twin Edge
    - Incident Face
    - Next Edge, Prev Edge



# Constructing the Arrangement

- Iterative algorithm: put one line in at a time.
- Start with the first edge  $e$  that  $l_i$  intersects.
- Split that edge, and move to  $Twin(e)$



# Constructing Arrangement

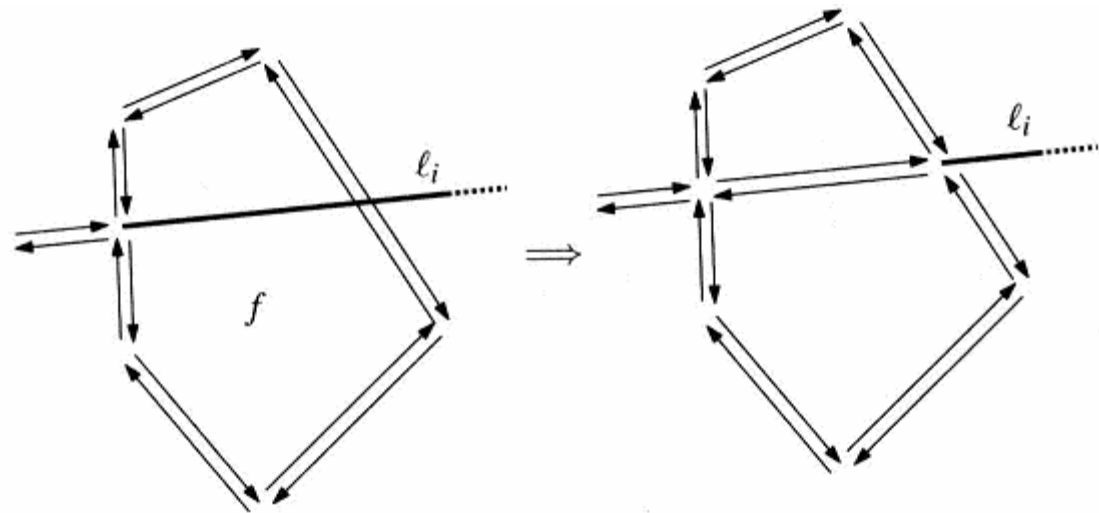
*Input:* A set  $L$  of  $n$  lines in the plane

*Output:* DCEL for the subdivision induced by the part of  $A(L)$  inside a bounding box

1. Compute a bounding box  $B(L)$  that contains all vertices of  $A(L)$  in its interior
2. Construct the DCEL for the subdivision induced by  $B(L)$
3. **for**  $i=1$  to  $n$  **do**
4.     Find the edge  $e$  on  $B(L)$  that contains the leftmost intersection point of  $l_i$  and  $A_i$
5.      $f$  = the bounded face incident to  $e$
6.     **while**  $f$  is not the face outside  $B(L)$  **do**
7.         Split  $f$ , and set  $f$  to be the next intersected face

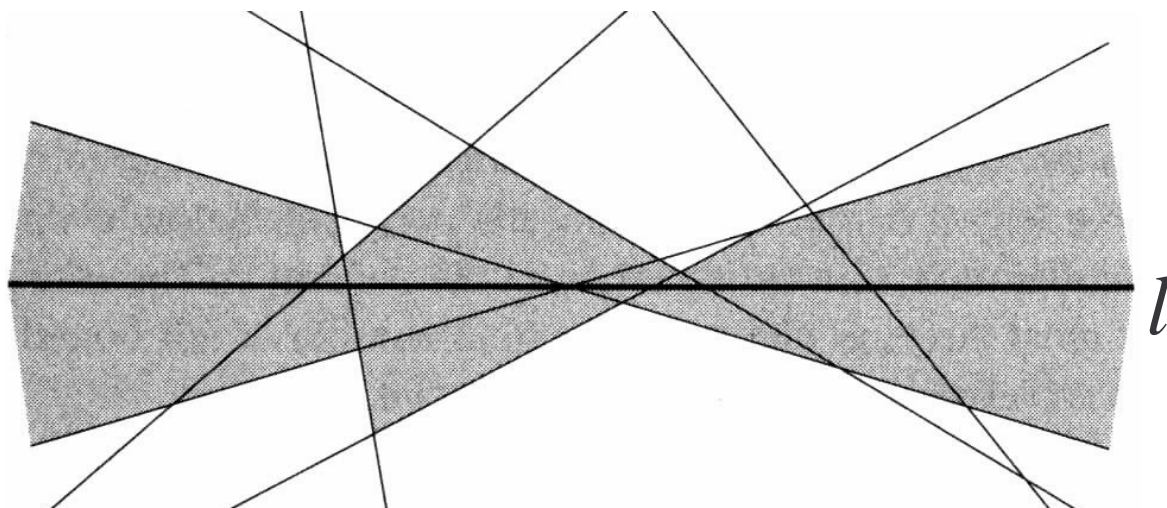
# Running Time

- We need to insert  $n$  lines.
- Each line splits  $O(n)$  edges.
- We may need to traverse  $O(n)$   $Next(e)$  pointers to find the next edge to split.



# Zones

- The *zone* of a line  $l$  in an arrangement  $A(L)$  is the set of faces of  $A(L)$  whose closure intersects  $l$ .



- Note how this relates to the complexity of inserting a line into a DCEL...

# Zone Complexity

- The complexity of a zone is defined as the total complexity of all the faces it consists of, i.e. the sum of the number of edges and vertices of those faces.
- The time it takes to insert line  $l_i$  into a DCEL is linear in the complexity of the zone of  $l_i$  in  $A(\{l_1, \dots, l_{i-1}\})$ .

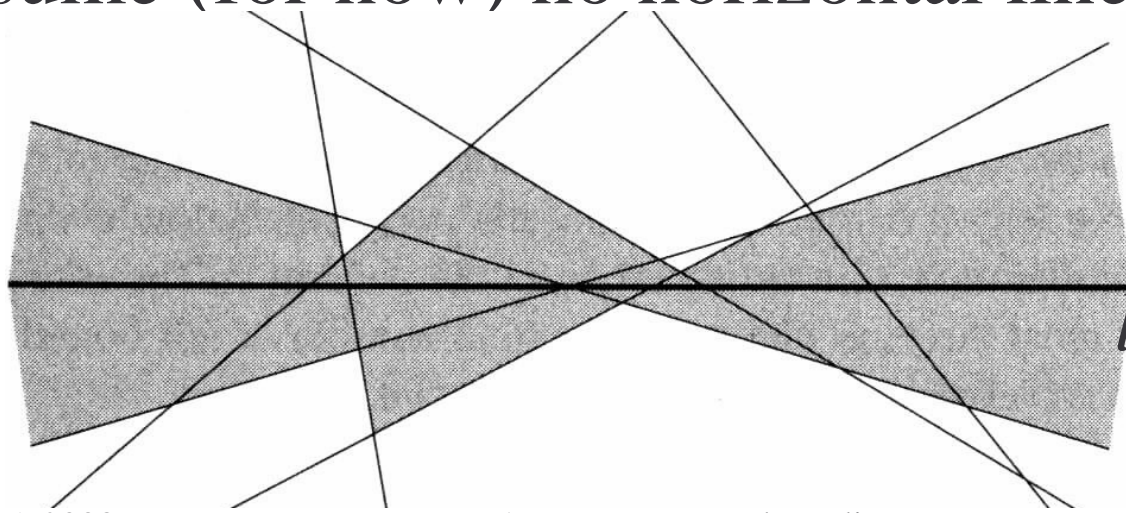
# Zone Theorem

- The complexity of the zone of a line in an arrangement of  $m$  lines on the plane is  $O(m)$
- Therefore:
  - We can insert a line into an arrangement in linear time
  - We can compute the arrangement in  $O(n^2)$  time



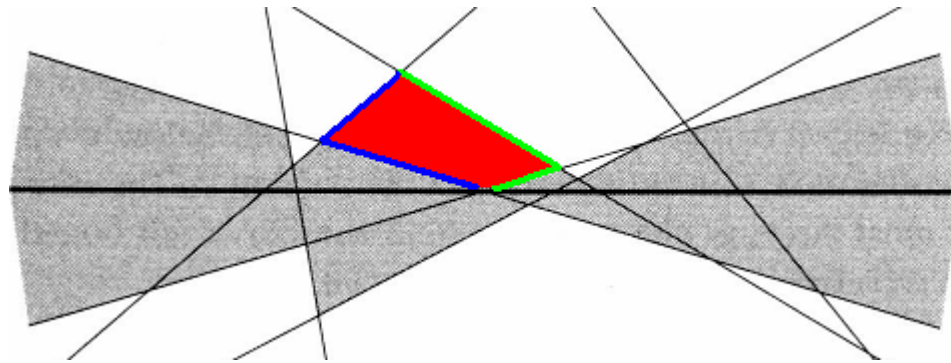
# Proof of Zone Theorem

- Given an arrangement of  $m$  lines,  $A(L)$ , and a line  $l$ .
- Change coordinate system so  $l$  is the x-axis.
- Assume (for now) no horizontal lines



# Proof of Zone Theorem

- Each edge in the zone of  $l$  is a *left bounding edge* and a *right bounding edge*.

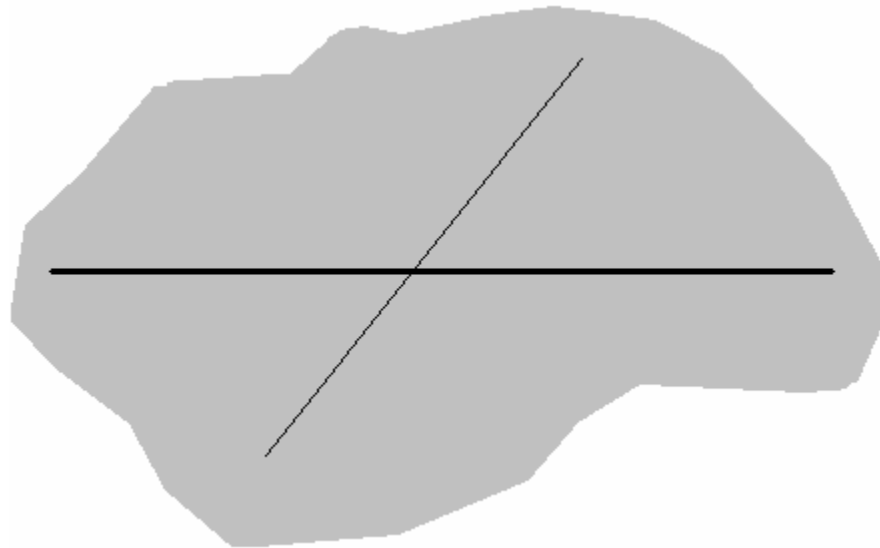


- Claim: number of left bounding edges  $\leq 5m$
- Same for number of right bounding edges  
à Total complexity of  $zone(l)$  is linear

# Proof of Zone Theorem

## -Base Case-

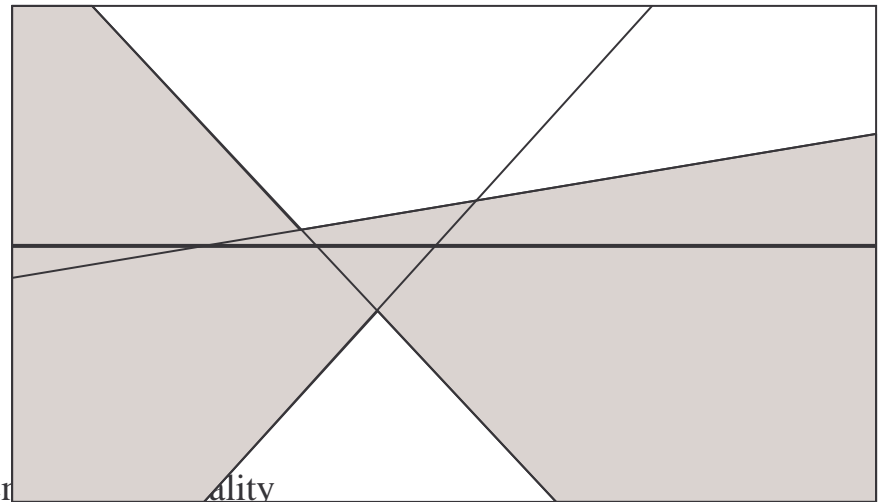
- When  $m=1$ , this is trivially true.  
(1 left bounding edge  $\leq$  5)



# Proof of Zone Theorem

## -Inductive Case-

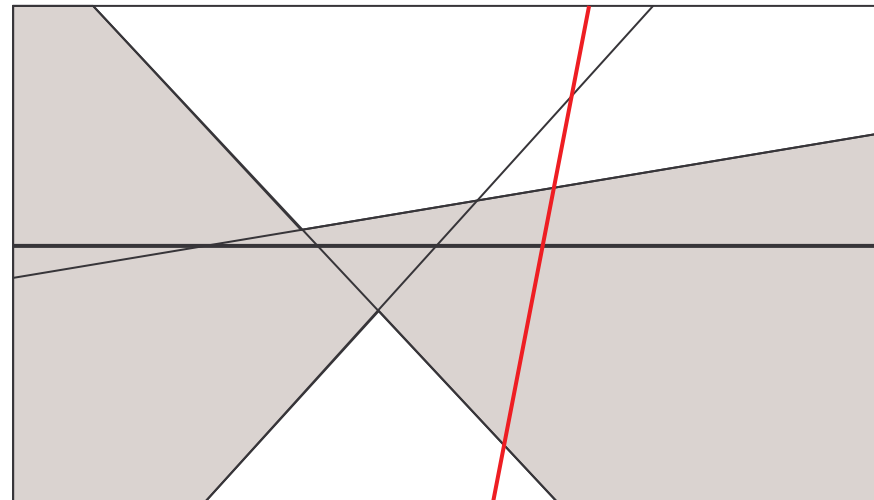
- Assume true for all but the rightmost line  $l_r$ :  
i.e. Zone of  $l$  in  $A(L-\{l_r\})$  has at most  $5(m-1)$  left bounding edges
- Assuming no other line intersects  $l$  at the same point as  $l_r$ , add  $l_r$



# Proof of Zone Theorem

## -Inductive Case-

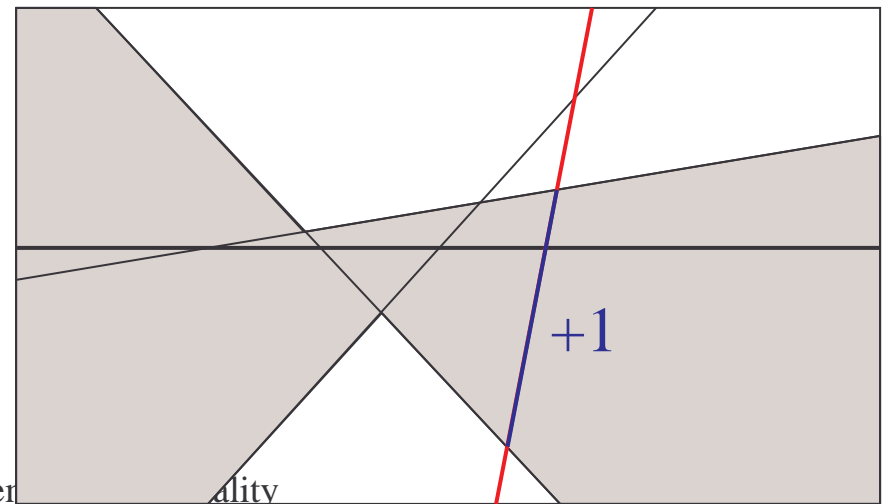
- Assume true for all but the rightmost line  $l_r$ :  
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- Assuming no other line intersects  $l$  at the same point as  $l_r$ , add  $l_r$



# Proof of Zone Theorem

## -Inductive Case-

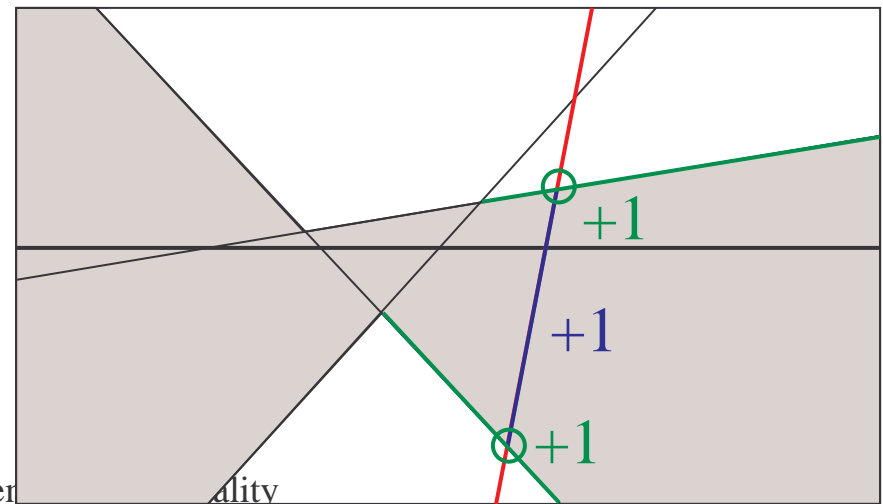
- Assume true for all but the rightmost line  $l_r$ :  
i.e. Zone of  $l$  in  $A(L - \{l_r\})$  has at most  $5(m-1)$  left bounding edges
- Assuming no other line intersects  $l$  at the same point as  $l_r$ , add  $l_r$ 
  - $l_r$  has one left bounding edge with  $l$  (+1)



# Proof of Zone Theorem

## -Inductive Case-

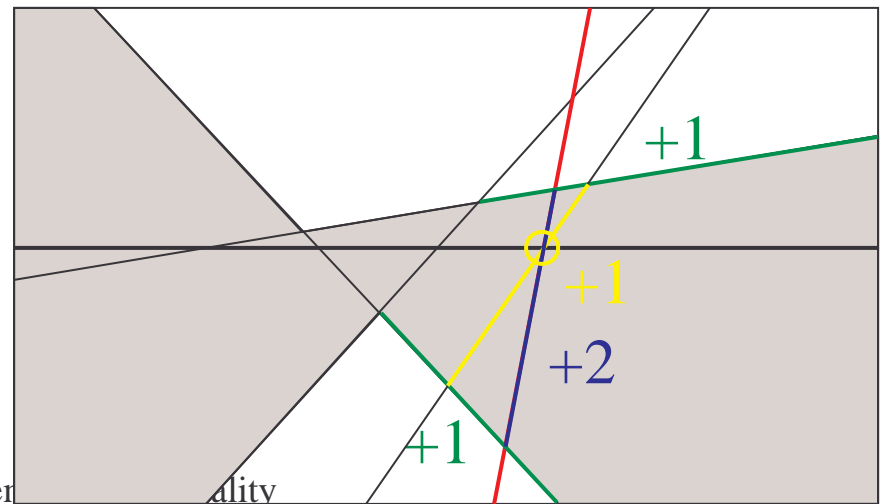
- Assume true for all but the rightmost line  $l_r$ :  
i.e. Zone of  $l$  in  $A(L-\{l_r\})$  has at most  $5(m-1)$  left bounding edges
- Assuming no other line intersects  $l$  at the same point as  $l_r$ , add  $l_r$ 
  - $l_r$  has one left bounding edge with  $l$  (+1)
  - $l_r$  splits at most two left bounding edges (+2)



# Proof of Zone Theorem

## Loosening Assumptions

- What if  $l_r$  intersects  $l$  at the same point as another line,  $l_i$  does?
  - $l_r$  has two left bounding edges (+2)
  - $l_i$  is split into two left bounding edges (+1)
  - As in simpler case,  $l_r$  splits two other left bounding edges (+2)

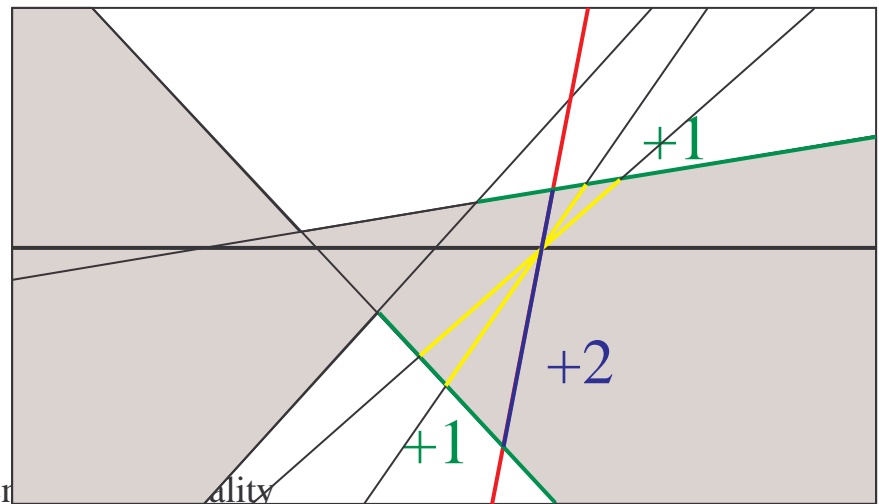




# Proof of Zone Theorem

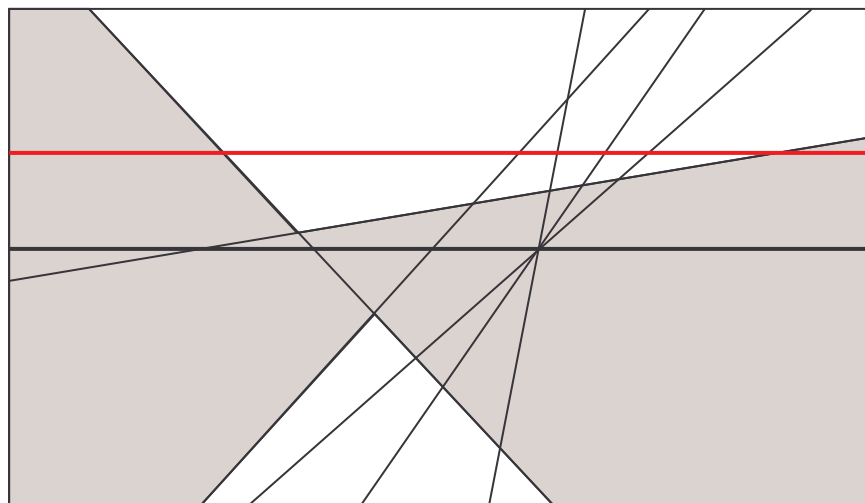
## Loosening Assumptions

- What if  $l_r$  intersects  $l$  at the same point as another line,  $l_i$  does? (+5)
- What if  $>2$  lines ( $l_i, l_j, \dots$ ) intersect  $l$  at the same point?
  - Like above, but  $l_i, l_j, \dots$  are already split in two (+4)



# Proof of Zone Theorem -Loosening Assumptions-

- What if there are horizontal lines in  $L$ ?
- A horizontal line introduces *not more* complexity into  $A(L)$  than a non-horizontal line.

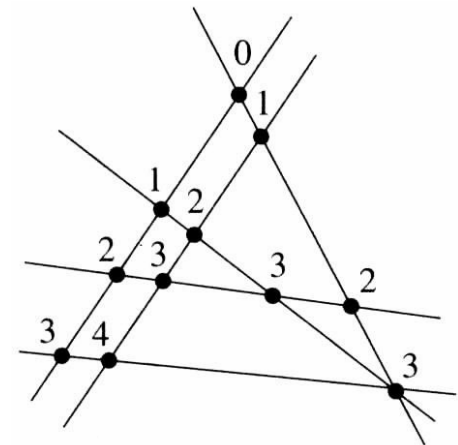


# Back to Discrepancy (Again)

- For every line between two sample points, we want to determine how many sample points lie below that line.

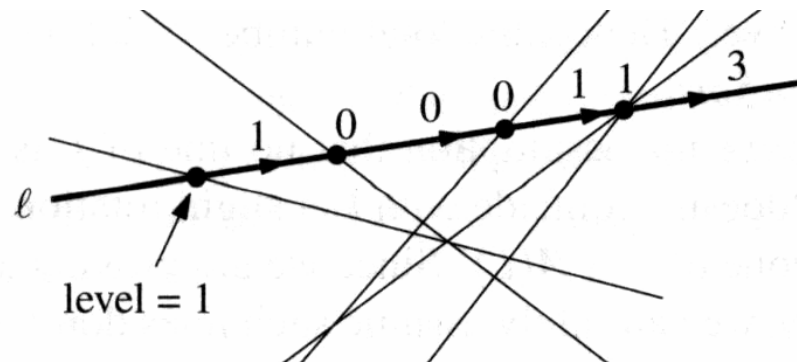
-or-

- For every vertex in the dual plane, we want to determine how many sample lines lie above it.
- We build the arrangement  $A(S^*)$  and use that to determine, for each vertex, how many lines lie above it. Call this the *level* of a vertex.



# Levels and Discrepancy

- For each line  $l$  in  $S^*$ 
  - Compute the level of the leftmost vertex.  $O(n)$ 
    - Check, for all other lines  $l_i$ , whether  $l_i$  is above that vertex
  - Walk along  $l$  from left to right to visit the other vertices on  $l$ , using the DCEL.
    - Walk along  $l$ , maintaining the level as we go (by inspecting the edges incident to each vertex we encounter).
  - $O(n)$  per line



# What did we just do?

- Given the level of a vertex in the (dualized) arrangement, we can compute the discrete measure of  $S$  wrt the  $h$  that vertex corresponds to in  $O(1)$  time.
- We can compute all the interesting discrete measures in  $O(n^2)$  time.
- Thus we can compute all  $\Delta_S(h)$ , and hence  $\Delta_H(S)$ , in  $O(n^2)$  time.

# Summary

- Problem regarding points  $S$  in ray-tracing
- Dualize to a problem of lines  $L$ .
- Compute arrangement of lines  $A(L)$  .
- Compute level of each vertex in  $A(L)$  .
- Use this to compute discrete measures in primal space.
- We can determine how good a distribution of sample points is in  $O(n^2)$  time.

# Extensions

- Zone Theorem has an analog in higher dimensions
  - Zone of a hyperplane in an arrangement of  $n$  hyperplanes in  $d$ -dimensional space has complexity  $O(n^{d-1})$