

Last Time

Greedy Flip Algorithm takes  $O(n^2)$  time.

Any  $\Delta^n$  can be flipped to Delaunay

Today Randomized Incremental Construction

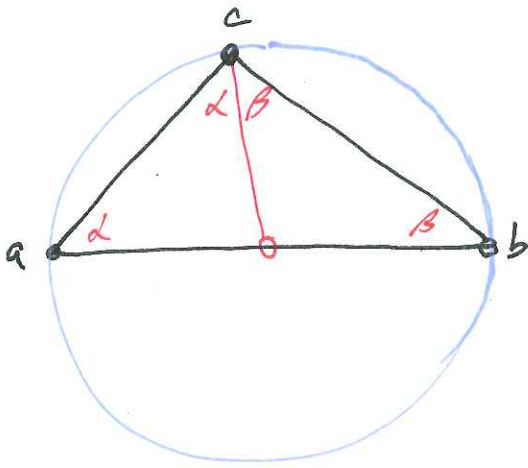
... but first, yet another definition of  
(characterization)  
the Delaunay  $\Delta^n$ .

Claim: Among all  $\Delta^n$ s of a point set  $P$ , the Delaunay  $\Delta^n$  maximizes the minimum angle.

pf idea: Show that flipping an edge that is not LD can only increase the smallest angle.

So, our algorithmic result, gives a way to prove facts about Delp.

First, a refresher from high school/ancient Greece.

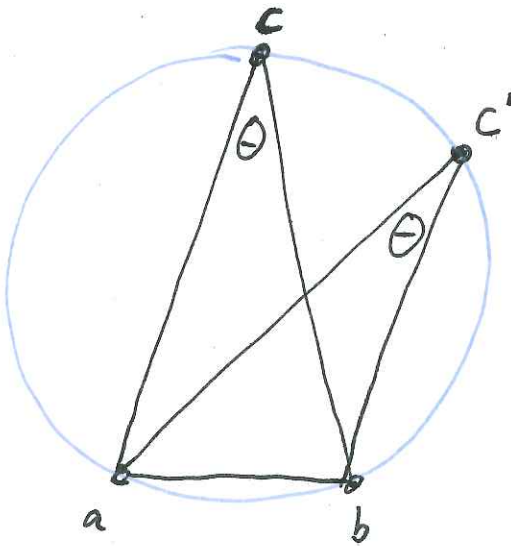


Thales Thm If  $\overline{ab}$  is the diameter of circle  $(a, b, c)$ , then  $\angle acb$  is  $90^\circ$ .

pf  $2\alpha + 2\beta = 180^\circ$

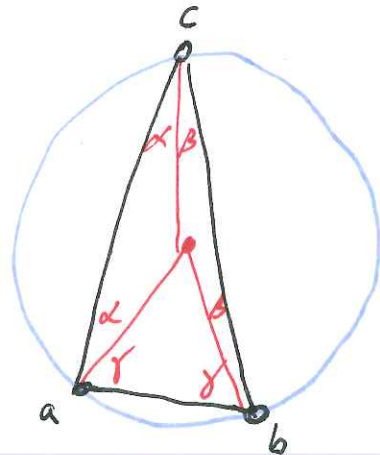
$\Rightarrow \angle acb = \alpha + \beta = 90^\circ$ .

This is true more generally.



If  $\triangle abc$  and  $\triangle abc'$  have the same circumcircle, then  $\angle acb = \angle ac'b$ .

pf

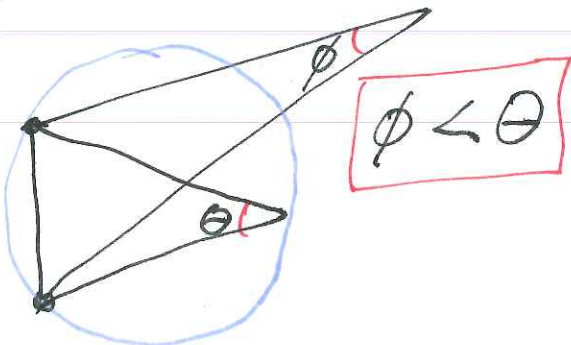


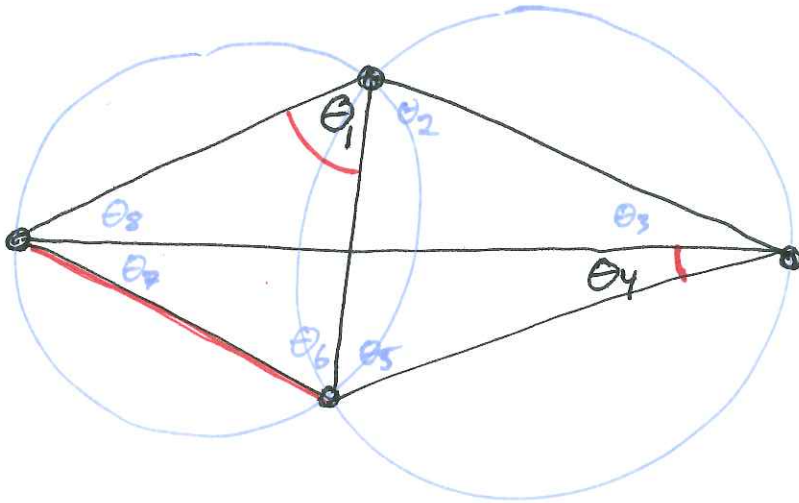
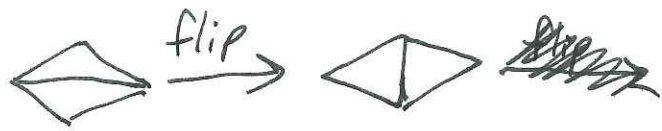
$2\alpha + 2\beta + 2\gamma = 180^\circ$

$\Rightarrow \angle acb = \alpha + \beta = 90 - \gamma$

For  $c'$ ,  $\alpha$  and  $\beta$  change but  $\gamma$  is the same so  $\alpha + \beta$  does not change. **Be careful: Add signed angles.**

So,





$$\theta_1 > \theta_4$$

$$\theta_2 > \theta_7$$

$$\theta_6 > \theta_3$$

$$\theta_5 > \theta_8$$

So, every angle after the flip is bigger than some angle that appeared before the flip.

# Incremental Algorithms

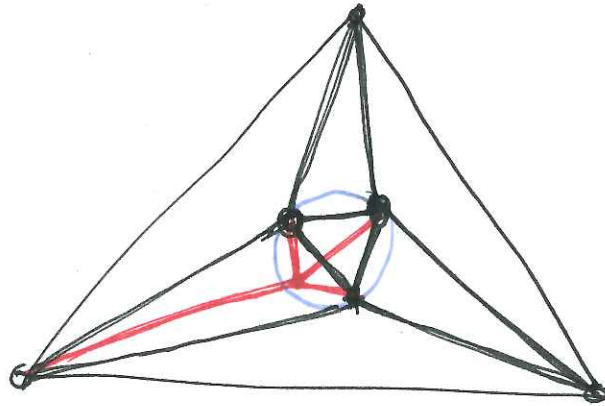
A staple of computational geometry

Idea: Add points one at a time.

Invariant: After  $i$  points added,  
we have computed the Del.  $\Delta^n$   
of those  $i$  pts.

1st Step Start with convex hull.

But for now assume its a triangle.



2nd Step

Add one new point.

- Find  $\Delta$  containing  $p_{i+1}$

- Split it into 3

- Run the Greedy Flip Algorithm.



3rd Step

Repeat.



Question: How many flips?

Some observations

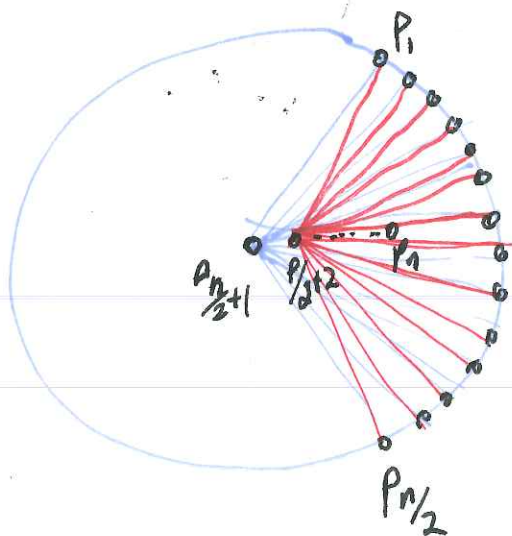
- 1) All new triangles <sup>in step  $i$</sup>  have a vertex at  $p_i$ .
- 2) Every flip adds one edge incident to  $p_i$ .
- 3) No flip removes an edge incident to  $p_i$ .

$\Rightarrow$  degree( $p_i$ ) - 3 flips in step  $i$ .

$\uparrow$  This is the degree  
in  $\text{Del}_{\{p_1, \dots, p_i\}}$ .

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This could still be quadratic.



First  $n/2$  points "near" a circle.  
Next  $n/2$  points all require  
 $n/2 - 2$  flips.

$\Rightarrow$   $\Theta(n^2)$  total flips.

Idea: Add the points in a random order

all permutations have equal prob.

Let  $\langle p_1, \dots, p_n \rangle$  be the random order.

Let  $Q_i = \{p_1, \dots, p_i\}$  ( $Q_i$  is the first  $i$  pts in the order)

We want to know the degree of  $p_i$  in  $\text{Del}(Q_i)$ ,  
~~be~~ call it  $\delta_i$ .

~~We know~~ We know  $\# \text{flips} < \sum_{i=1}^n \delta_i$

What about  $E[\# \text{flips}]$ ?

Expectation over all random orderings.

Use linearity of expectations:

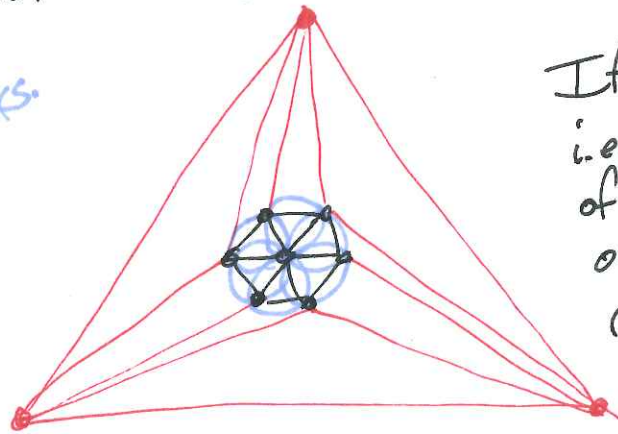
$$E[\# \text{flips}] < E\left[\sum_{i=1}^n \delta_i\right] = \sum_{i=1}^n E[\delta_i]$$

Before we fix the algorithm,  
let's deal with the "big  $\Delta$ " problem.

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Idea 1: Add a big  $\Delta$  of our own

This "open" works.



If it's "big enough"  
i.e. outside all circumcircles  
of input pts, then the  
output we want is  
contained in the output  
we get.

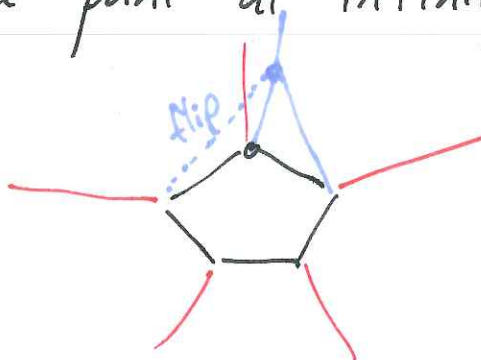
Question: What's big enough?

nearly  
collinear  
input pts



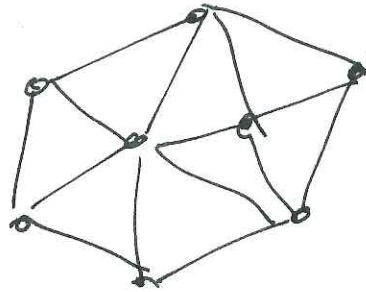
Circumcircle  
is huge.

Can we make the  $\Delta$  infinitely large?  
add a point at infinity?



Need predicates  
to work with  
special  $\infty$  points.

Observe: (1)  $\text{Del } Q_i$  does not depend on the ordering of  $p_1, \dots, p_i$ .



(2) Each point has equal probability of being  $p_i$

(3) So, if we fix  $Q_i$ ,  $E[\delta_i]$  is the average degree of a vertex in  $\text{Del } Q_i$ .

Recall Euler's Formula

$$V - E + F = 2$$

Since each face has at least 3 edges and each edge touches 2 faces

$$3F \leq 2E$$

$$\text{So } V - E + \frac{2}{3}E \geq 2$$

$$\Rightarrow E \leq 3V$$

$$(4) \text{ avg deg} = \frac{1}{i} \sum_{j=1}^i \text{deg}_{Q_i}(p_j) = \frac{2}{i} E \leq \left(\frac{2}{i}\right)(3i) = 6$$

(5) No matter what the first  $i$  points are,  $E[\delta_i] \leq 6$

$$(6) \sum_{i=1}^n E[\delta_i] \leq 6n$$

(7)  $O(n)$  flips.

I thought we expected  $n \log n \dots$