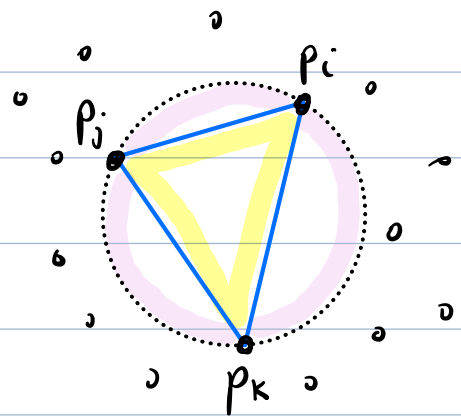
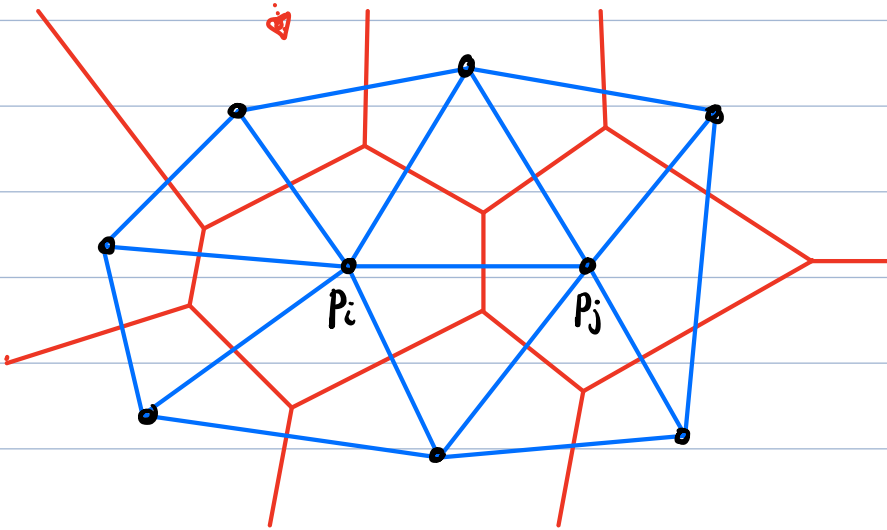


# CMSC 754 - Computational Geometry

## Lecture 12: Delaunay Triangulations (Construction)

Last lecture: - Delaunay triangulation + properties  
- Given a set  $P = \{p_1, \dots, p_n\}$  of sites,  
 $DT(P)$  is the dual of  $Vor(P)$

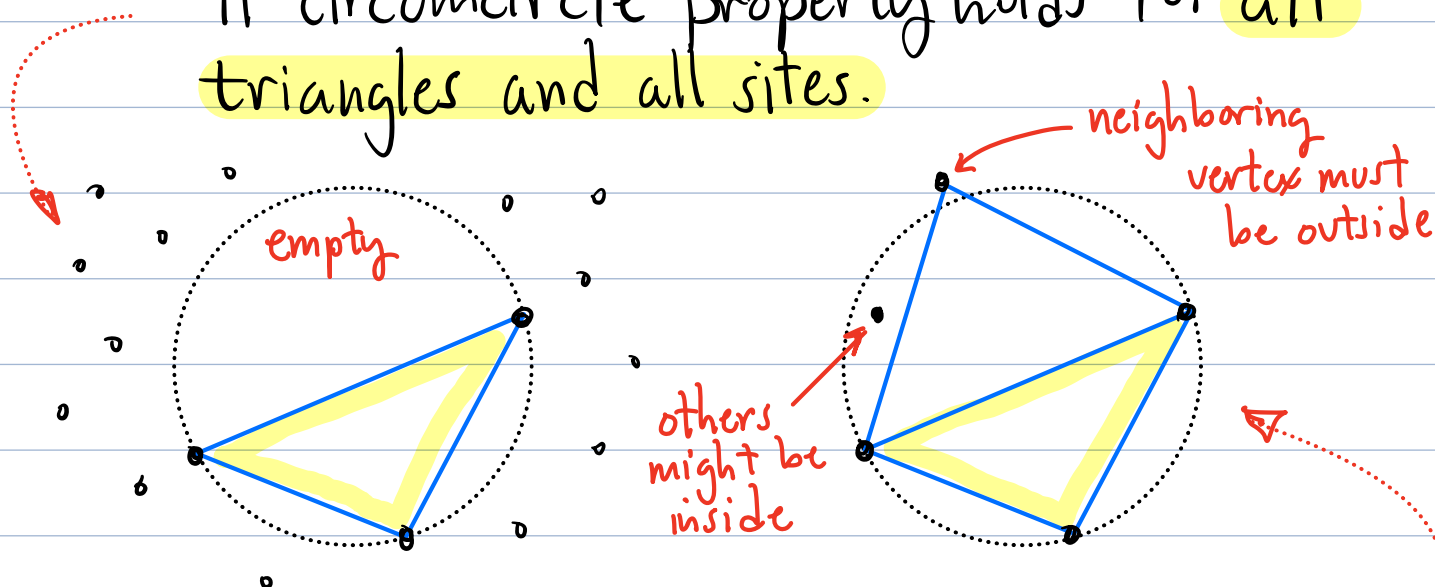


Circumcircle Property:

$\Delta p_i p_j p_k \in DT(P)$  iff circumcircle  
of  $p_i, p_j, p_k$  contains no sites

## Local/Global Delaunay:

- A triangulation is globally Delaunay if circumcircle property holds for all triangles and all sites.



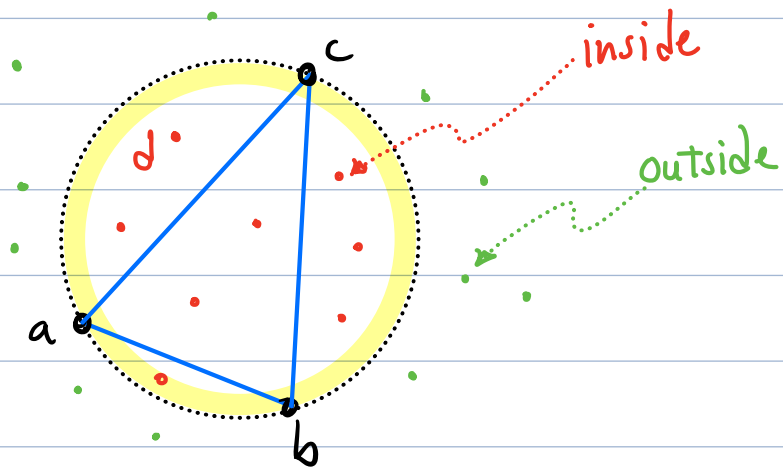
- A triangulation is locally Delaunay if circumcircle property holds the vertices of every pair of adjacent triangles.

Does it matter? No.

**Thm (Delaunay):** A triangulation is globally Delaunay iff it is locally Delaunay.

(See lecture notes/text for proof)

**Incircle Test:** Given points  $a, b, c + d \in \mathbb{R}^2$ ,  
 does  $d$  lie in circumcircle of  $\Delta abc$ ?  
 (Assume  $a, b, c$  given in CCW order)



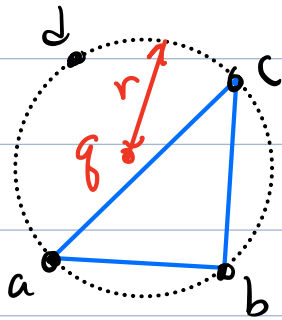
**inCircle( $a, b, c; d$ ):**  $d$  is inside if

$$\det \begin{pmatrix} a_x & a_y & a_x^2 + a_y^2 & 1 \\ b_x & b_y & b_x^2 + b_y^2 & 1 \\ c_x & c_y & c_x^2 + c_y^2 & 1 \\ d_x & d_y & d_x^2 + d_y^2 & 1 \end{pmatrix} > 0$$

**Obs:**

- This is an **orientation test in  $\mathbb{R}^3$**
- Generalizes to **any dimension**
- Computable in  **$O(1)$  time** in any fixed dimension.

Why? Consider boundary case  $\rightarrow$  cocircular  
 Center  $q = (q_x, q_y)$  radius =  $r$



$$\Rightarrow (a_x - q_x)^2 + (a_y - q_y)^2 = r^2$$

$$\Rightarrow \boxed{-2q_x} a_x - \boxed{2q_y} a_y + \boxed{1} \cdot (a_x^2 + a_y^2) + \boxed{(q_x^2 + q_y^2 - r^2)} = 0$$

Same applies to  $b, c, d \Rightarrow$

$$\begin{pmatrix} a_x & a_y & a_x^2 + a_y^2 & 1 \\ b_x & b_y & b_x^2 + b_y^2 & 1 \\ c_x & c_y & c_x^2 + c_y^2 & 1 \\ d_x & d_y & d_x^2 + d_y^2 & 1 \end{pmatrix} \begin{pmatrix} -2q_x \\ -2q_y \\ 1 \\ q_x^2 + q_y^2 - r^2 \end{pmatrix} = 0$$

$\rightarrow$  A linear combination of columns is identically 0

$\Rightarrow$  column vectors are lin. dependent

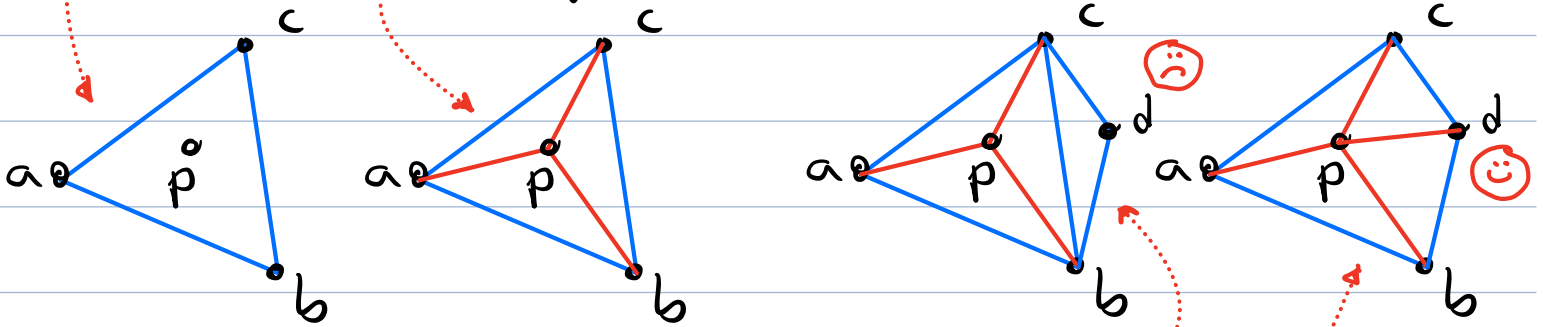
$\Rightarrow$  det of matrix is 0

# (Randomized) Incremental Construction:

- Add sites one-by-one in random order + update the triangulation after each.

① Find triangle  $\Delta abc$  containing the new site  $p$ .

② Add edges connecting  $p$  to  $a, b, c$



③ Check neighboring triangles for violations of local Delaunay

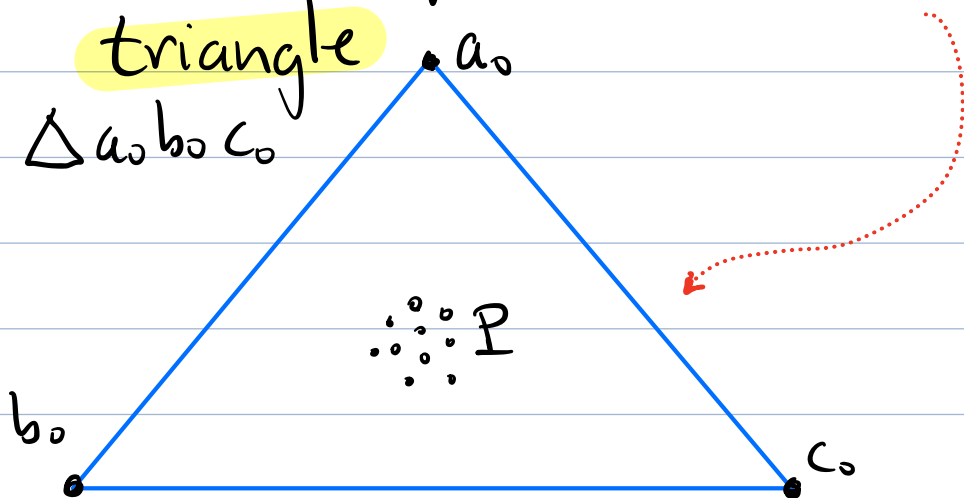
④ Apply edge flips to correct these

⑤ Repeat until local Delaunay for all neighbors

## Sentinel sites:

- If new site is not in convex hull - it's not in any triangle!

- Fix: Enclose points in a HUGE triangle



How huge? No circumcircle from  $P$  should contain  $a_0, b_0$  or  $c_0$

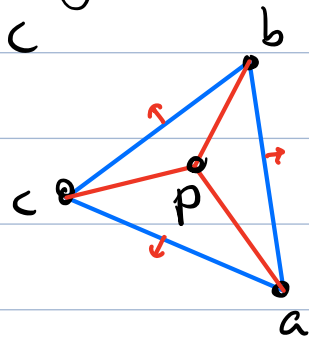
(see text for how)

## Build-Delaunay ( $P = \{p_1, \dots, p_n\}$ )

- Create sentinel triangle  $\Delta a_0 b_0 c_0$  containing  $P$
- Randomly permute  $P$
- for  $i=1$  to  $n$  Insert( $p_i$ )

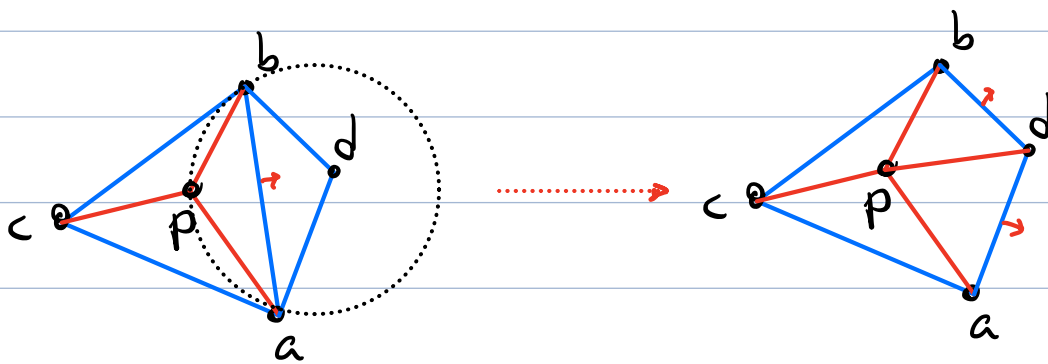
## Insert (p):

- Find  $\Delta abc$  containing p
- Add edges  $pa, pb, pc$
- SwapTest(ab)
- " (bc)
- " (ca)

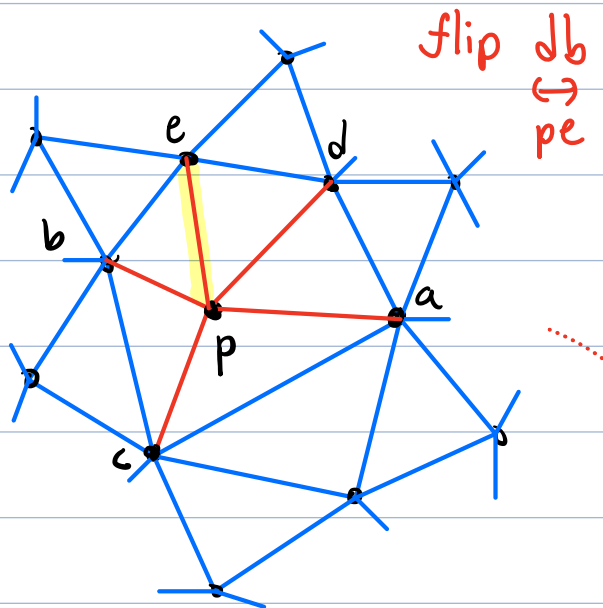
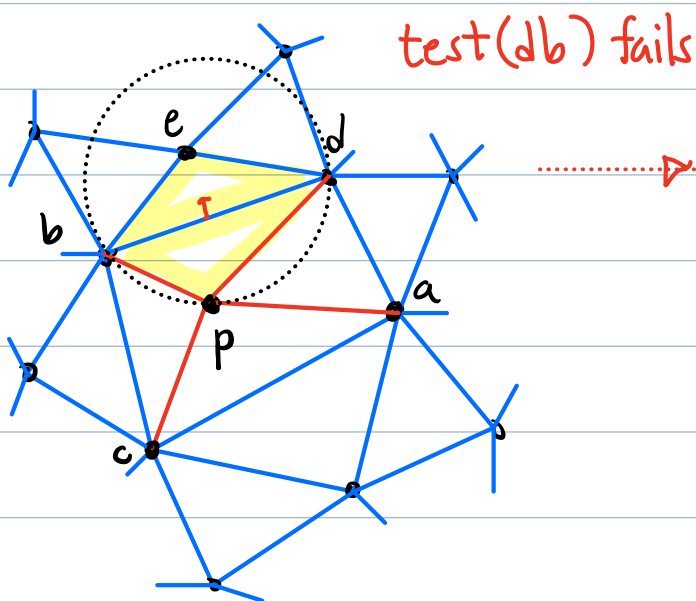
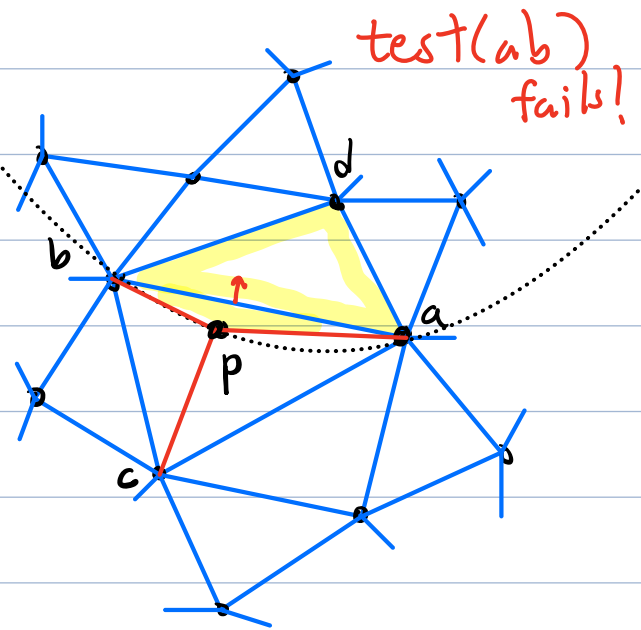
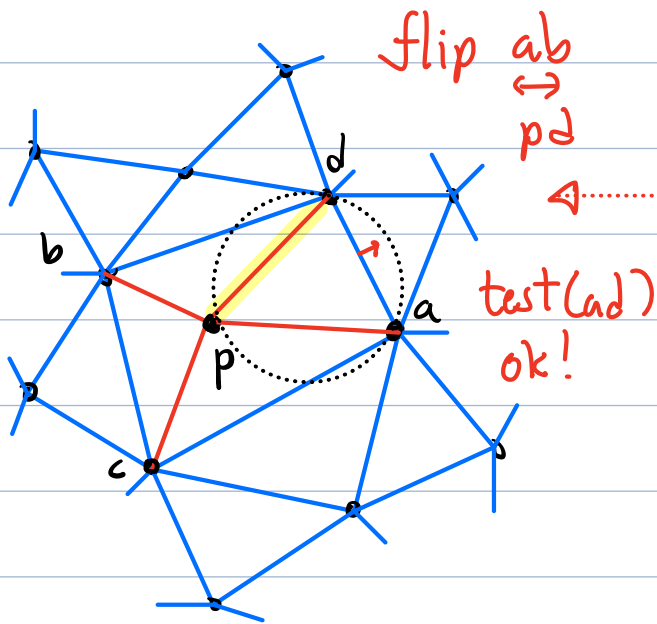
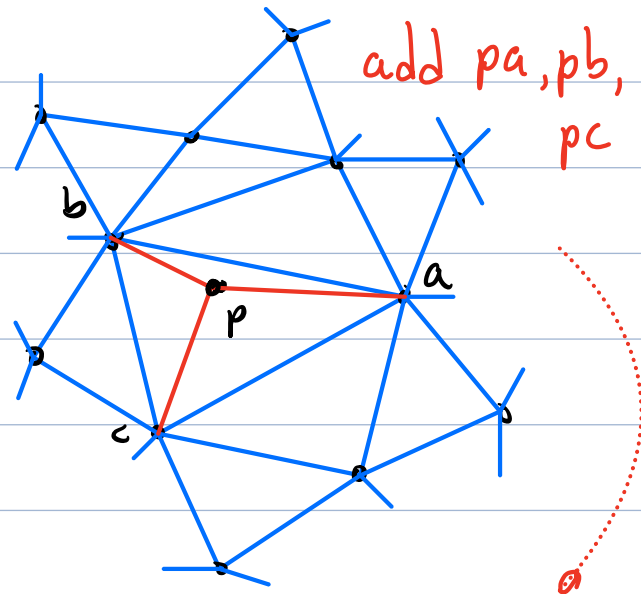
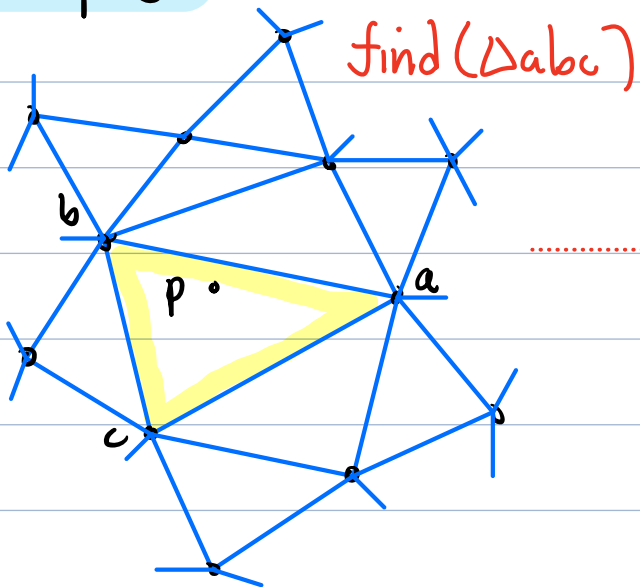


## SwapTest(ab):

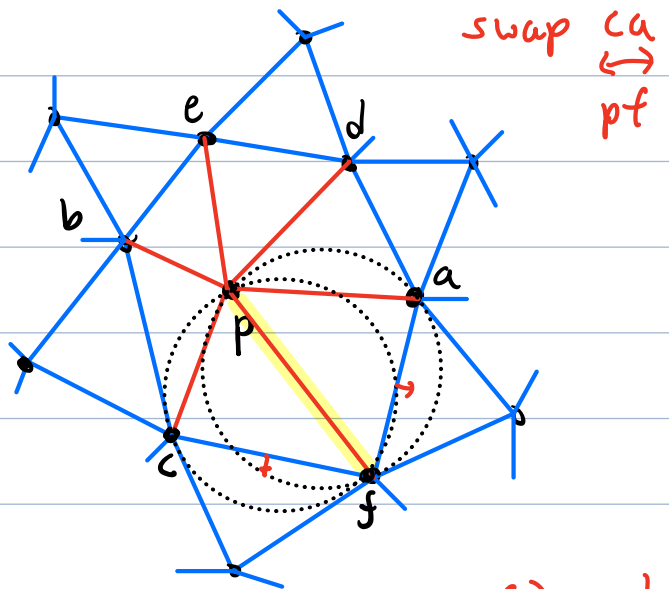
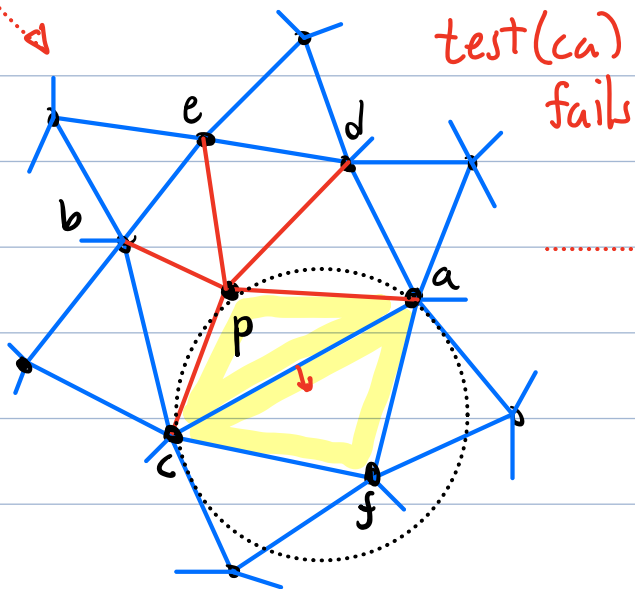
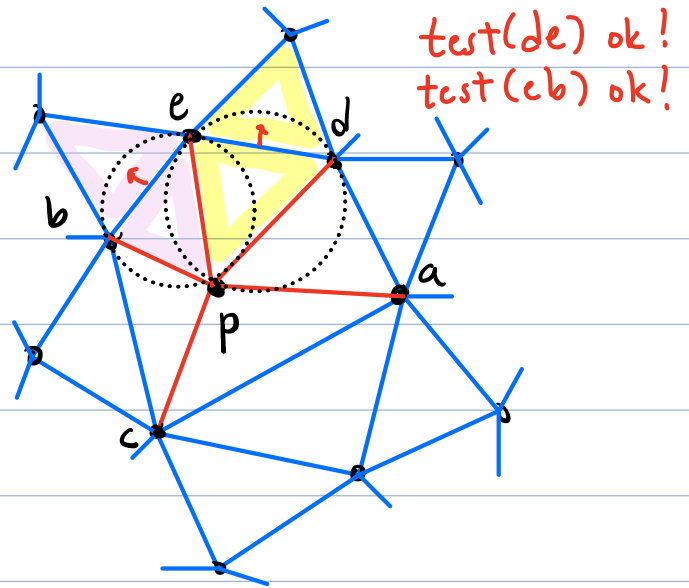
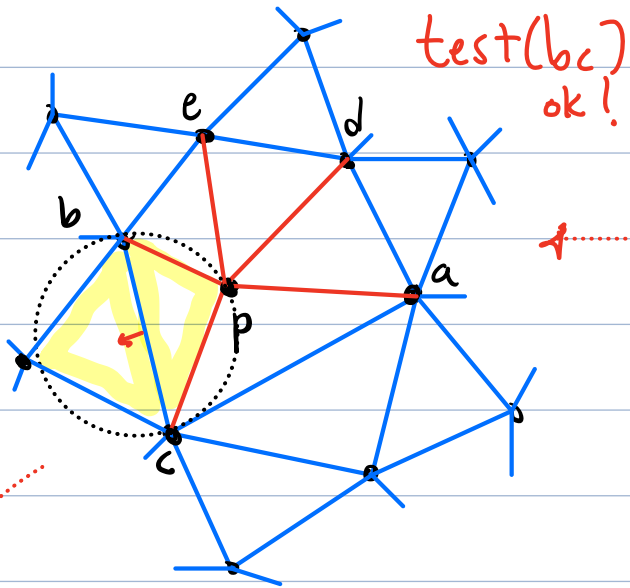
- if (ab is edge of external face) return
- $d \leftarrow$  vertex opposite p on ab
- if (inCircle(p, a, b, d))
- flip edge ab (for pd)
- SwapTest(ad)
- SwapTest(db)



# Example:

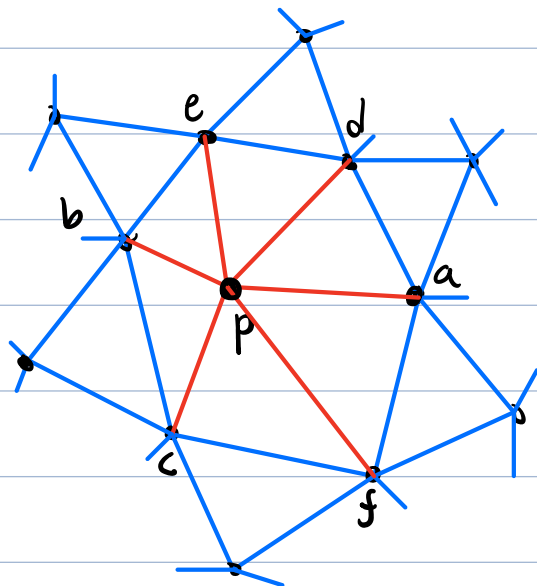






Done!

test(cf) ok!  
test(fa) ok!



Note: All new edges are incident to p

## Correctness:

- Only triangles that could violate local Delaunay are incident to  $p$ , + we check all
- By Delaunay's Thm, local  $\Rightarrow$  global Delaunay

## Running time:

- for each insertion  $p_1, \dots, p_n$
- find triangle containing  $p_i \rightarrow O(\log n)$
- swap tests + edge flips  $\rightarrow O(1)$   
in expectation
- Total:  $O(n \log n)$

**Lemma:** The expected update time (swap tests + edge flips) is  $O(1)$

**Proof:** (Backwards analysis)

- Update time  $\sim$  degree of  $p$  in final  $\Delta$ -tion
- Every pt is equally likely to be last
- $\sum_i \deg(p_i) = 2(\#edges) \leq 2(3n) = 6n$
- Expected time  $\sim$  Average degree  $\leq \frac{1}{n} \cdot 6n = 6$

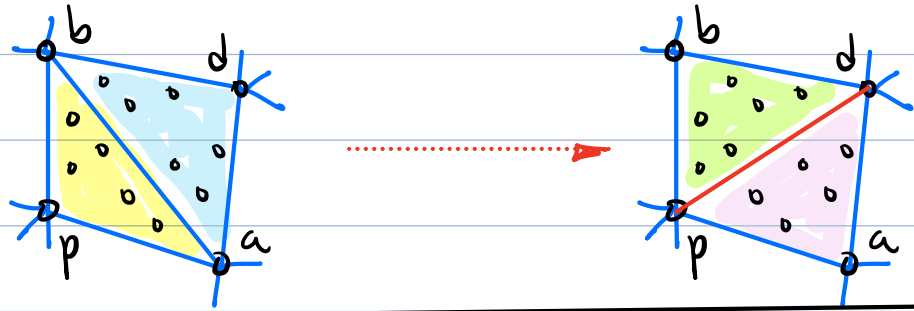
□

# Point-Location:

## Bucketing:

called a "bucket"

- Each triangle maintains future sites in this triangle
- To locate a point, just get its bucket id.
- When an edge flip is performed rebucket the affected sites



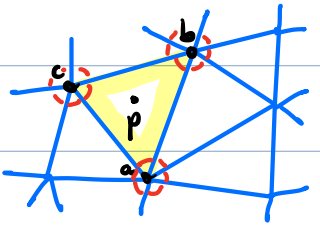
**Lemma:** Let  $p$  be any site. The probability that  $p$  is rebucketed as result of  $i^{\text{th}}$  insertion is  $\leq 3/i$

**Proof:** (Backwards Analysis)

- Sites are rebucketed only if in new triangle
- All new triangles are incident to last site
- Each site is equally likely to be last
- $\text{Prob}(p \text{ is rebucketed})$  [let  $p \in \Delta abc$ ]

$$\leq \text{Prob}(a, b, \text{ or } c \text{ was last inserted}) \\ \leq 3/i$$

□



**Lemma:** Total time for rebucketing is  $O(n \log n)$  in expectation

**Proof:** Rebucket time (expected)

$$= \sum_{p \in P} \sum_{i=1}^n 1 \cdot \text{Prob}(p \text{ was rebucketed in } i^{\text{th}} \text{ insertion})$$

$$\leq \sum_{p \in P} \sum_{i=1}^n 3/i \approx \sum_{p \in P} 3 \cdot \ln n \quad (\text{Harmonic series})$$

$$= 3n \ln n$$

$$= O(n \log n) \quad \square$$