

# Computing the Implicit Voronoi Diagram in Triple Precision

David L. Millman

Jack Snoeyink

University Of North Carolina - Chapel Hill

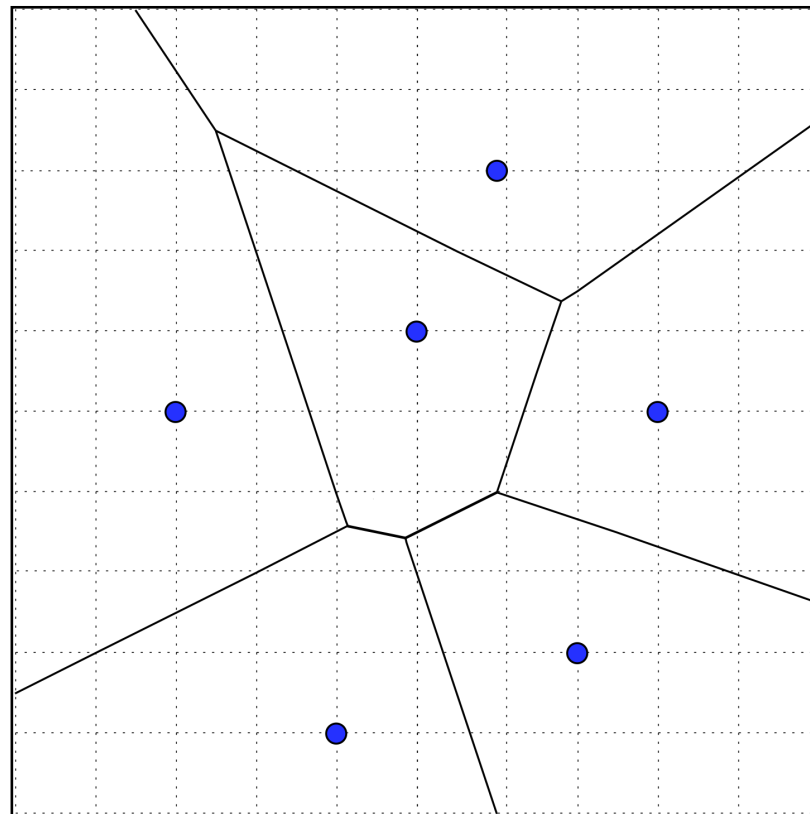
I will...

- define Voronoi, arithmetic degree, implicit Voronoi [LPT99]
- define a more structured *reduced-precision Voronoi diagram*
- describe its incremental construction
- present open problems created by this work

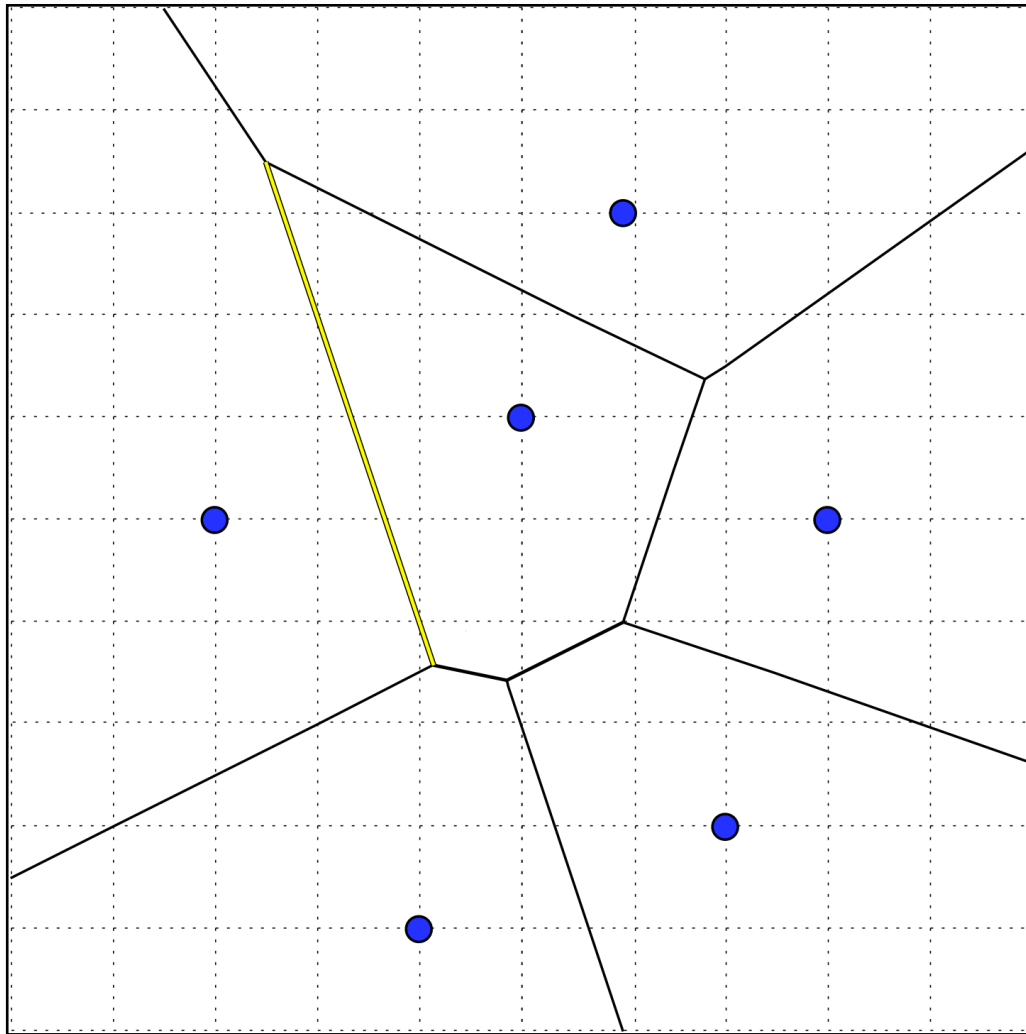
WADS09  
August 23, 2009

# Voronoi Diagram

Given a finite set of sites on a grid, the *Voronoi diagram* is the partition of the plane into maximally connected regions having the same set of closest sites



# Voronoi Diagram



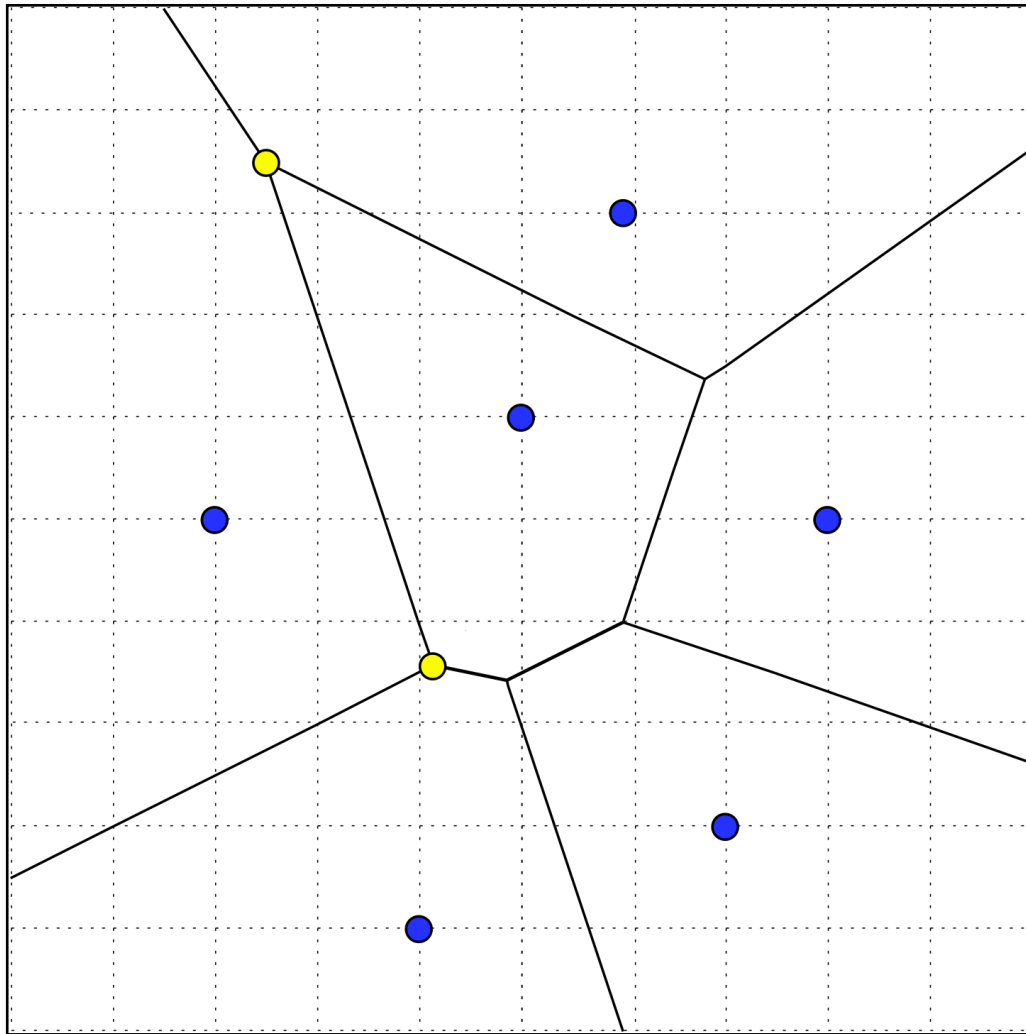
Voronoi edges

Voronoi vertices

Voronoi cell

Voronoi diagram

# Voronoi Diagram



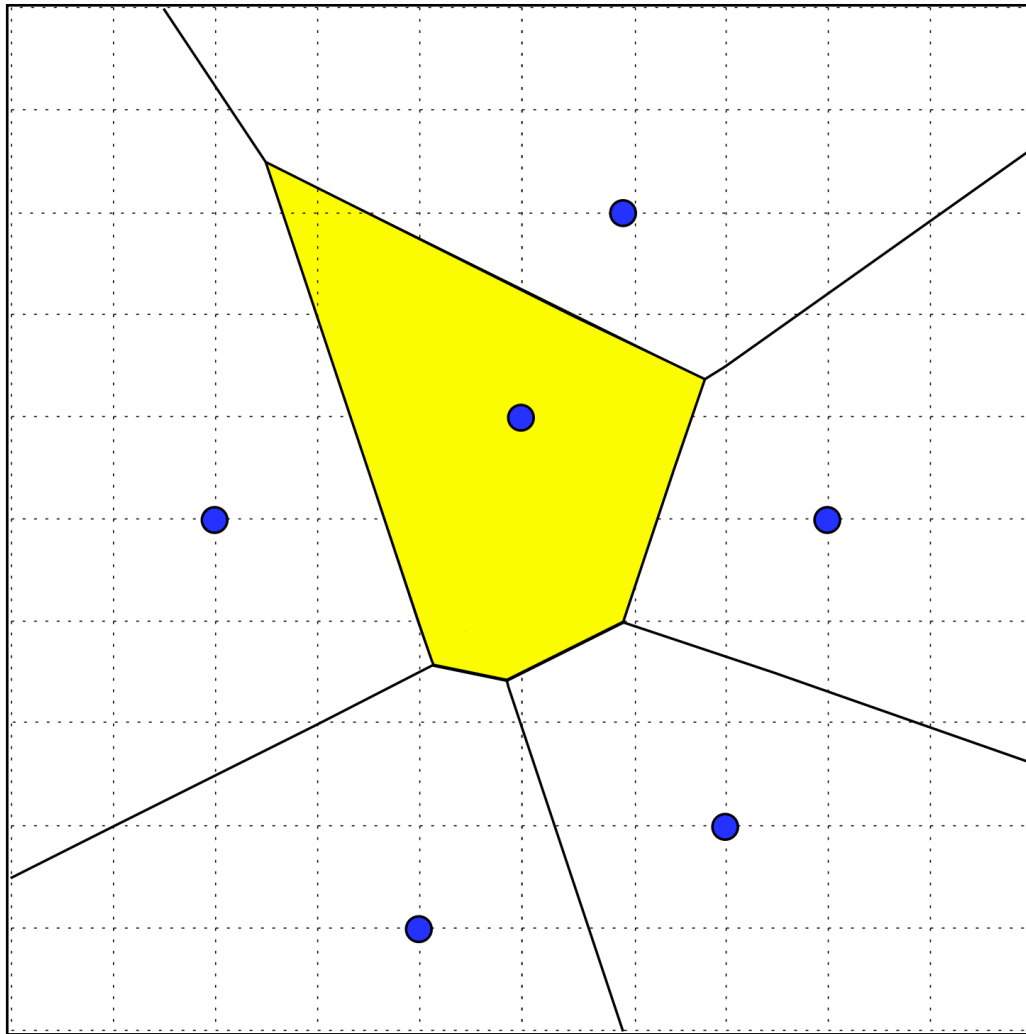
Voronoi edges

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Voronoi diagram

# Voronoi Diagram



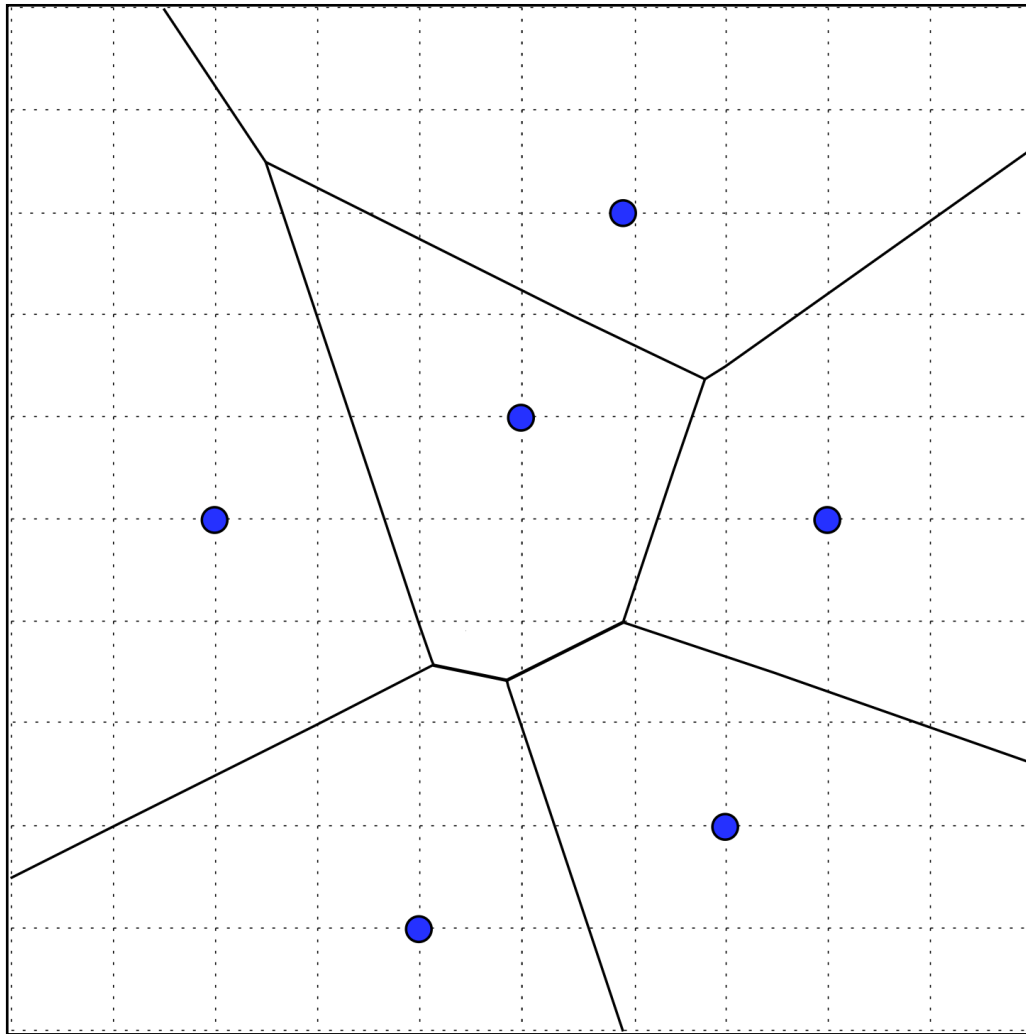
Voronoi edges

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Voronoi diagram

# Voronoi Diagram



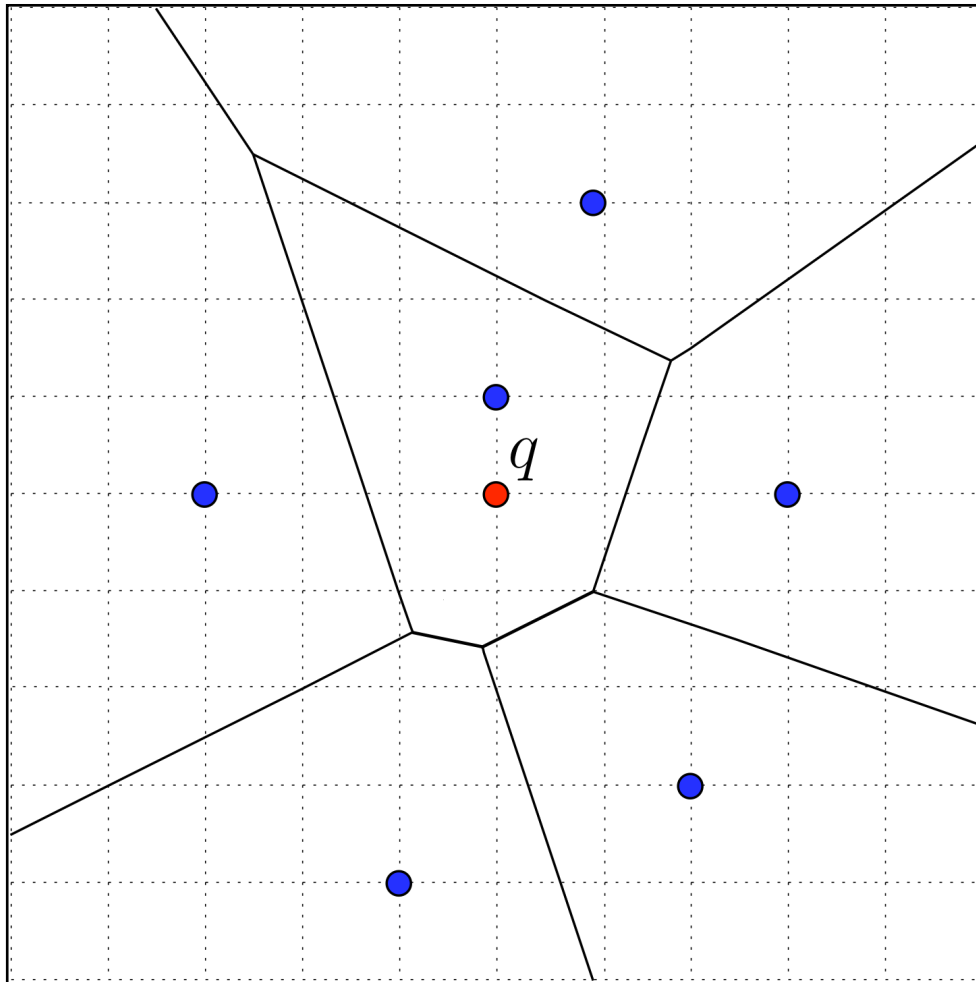
Voronoi edges

Voronoi vertices

Voronoi cell

Voronoi diagram

# Point location returns nearest neighbor



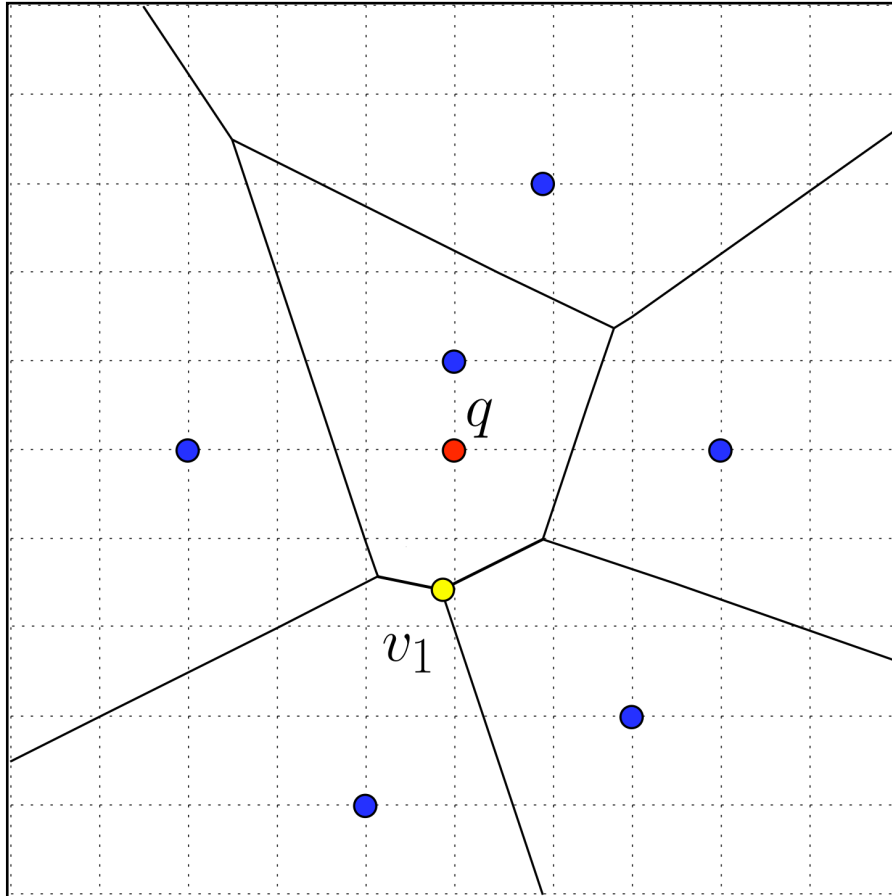
Given:

A set of sites  $S$  the  
Voronoi diagram of  $S$  &  
query point  $q$

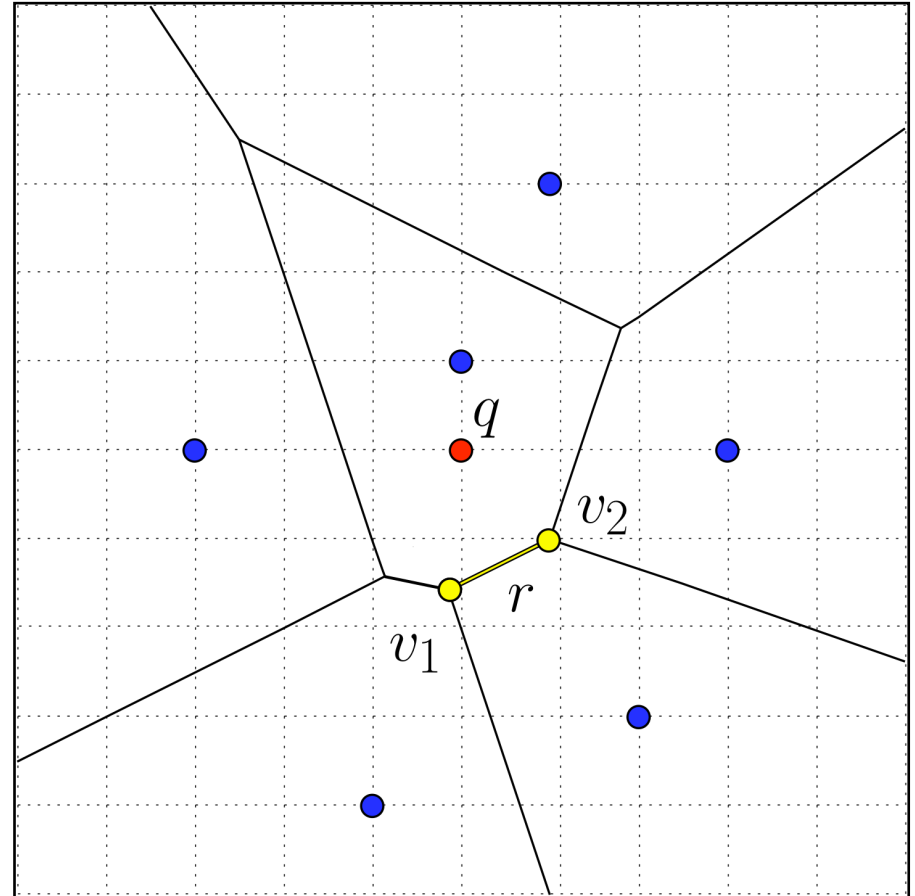
Determine:

the site of  $S$  closest to  $q$

# Predicates and their precision



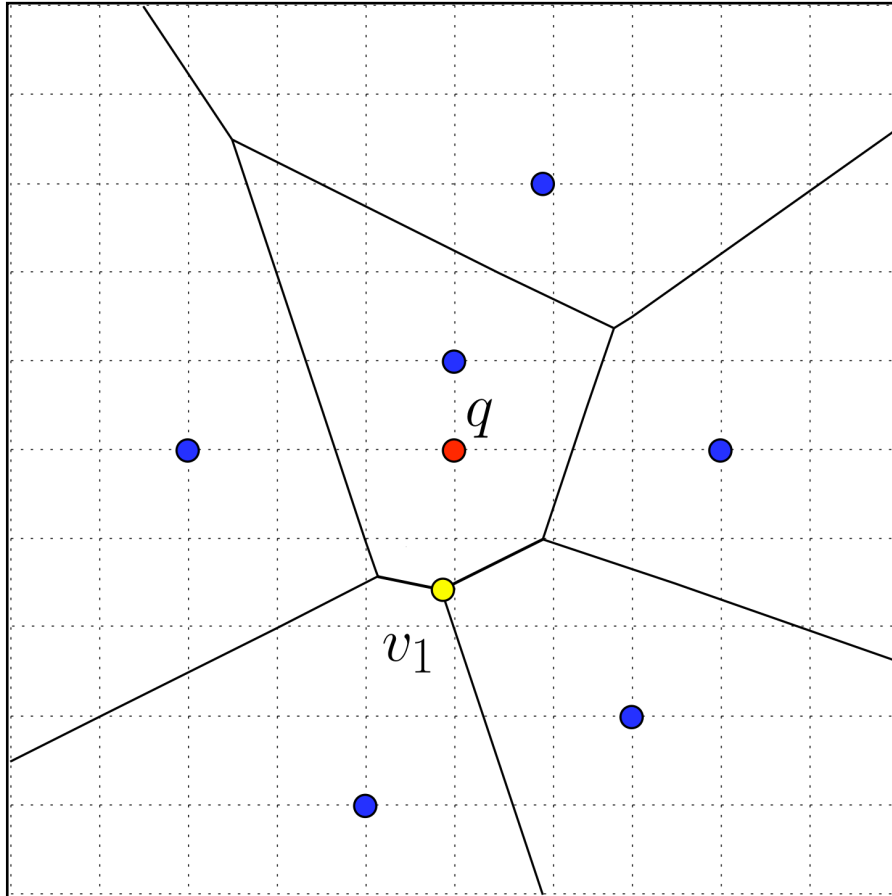
Is  $q.x$  left/right of vertex  $v_1.x$ ?  
3× precision



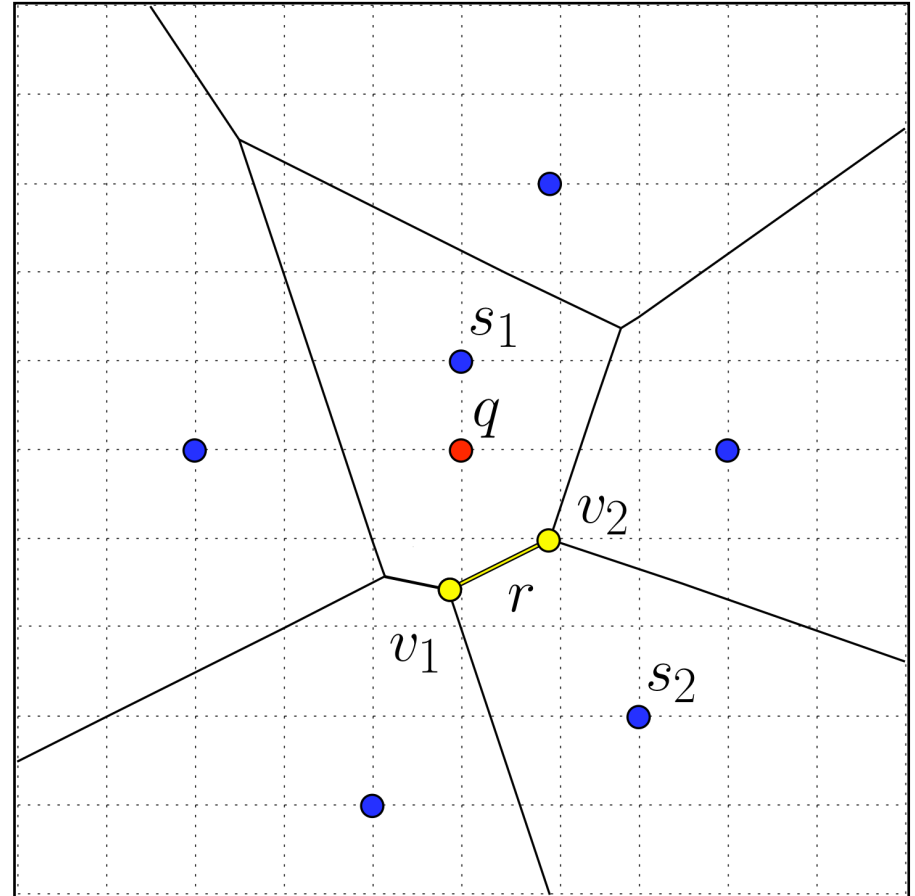
Is  $q$  above/below segment  $r$ ?  
6× precision [LPT99]



# Predicates and their precision



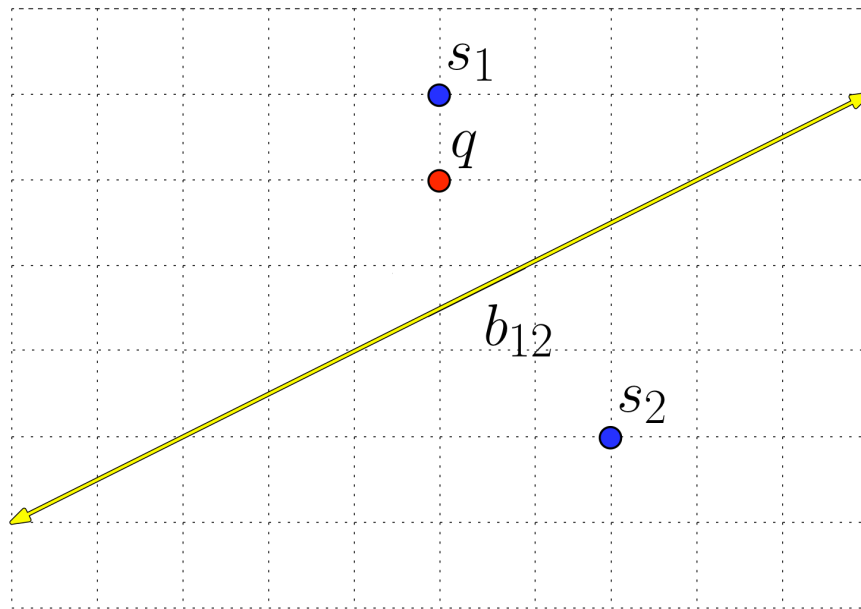
Is  $q.x$  left/right of vertex  $v_1.x$ ?  
3× precision



Is  $q$  above/below segment  $r$ ?  
6× precision [LPT99]

# Arithmetic Degree – Side of Bisector

Is  $q$  closer to  $s_1$ ?



$$q = (x_q, y_q)$$

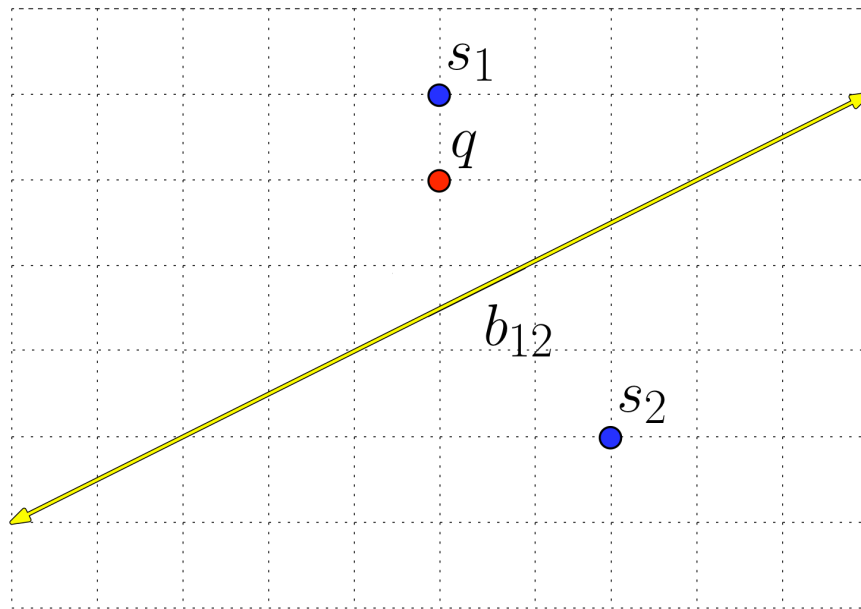
$$s_1 = (x_1, y_1)$$

$$s_2 = (x_2, y_2)$$

$$\|q - s_1\|_2 \leq \|q - s_2\|_2$$

# Arithmetic Degree – Side of Bisector

Is  $q$  closer to  $s_1$ ?



$$q = (x_q, y_q)$$

$$s_1 = (x_1, y_1)$$

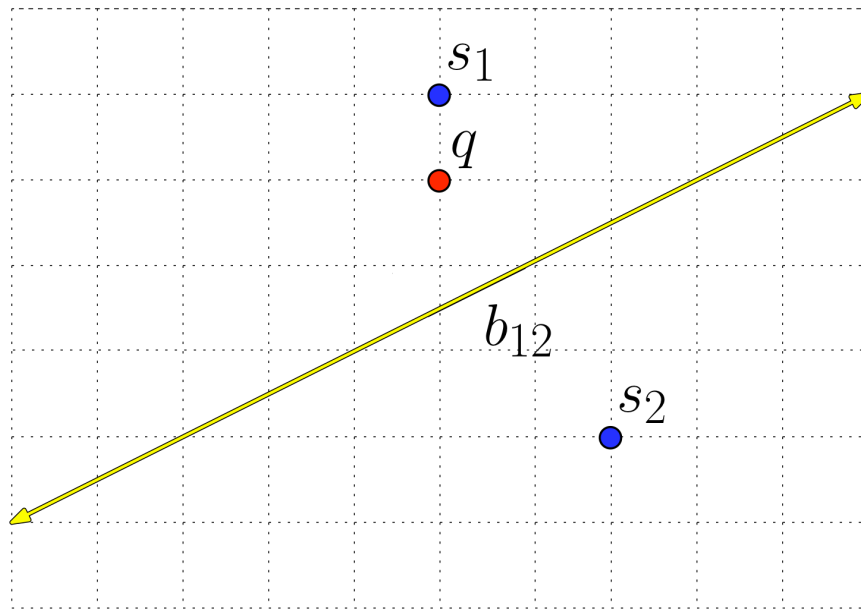
$$s_2 = (x_2, y_2)$$

$$\|q - s_1\|_2 \leq \|q - s_2\|_2$$

$$(x_q - x_1)^2 + (y_q - y_1)^2 \leq (x_q - x_2)^2 + (x_q - y_2)^2$$

# Arithmetic Degree – Side of Bisector

Is  $q$  closer to  $s_1$ ?



$$q = (x_q, y_q)$$

$$s_1 = (x_1, y_1)$$

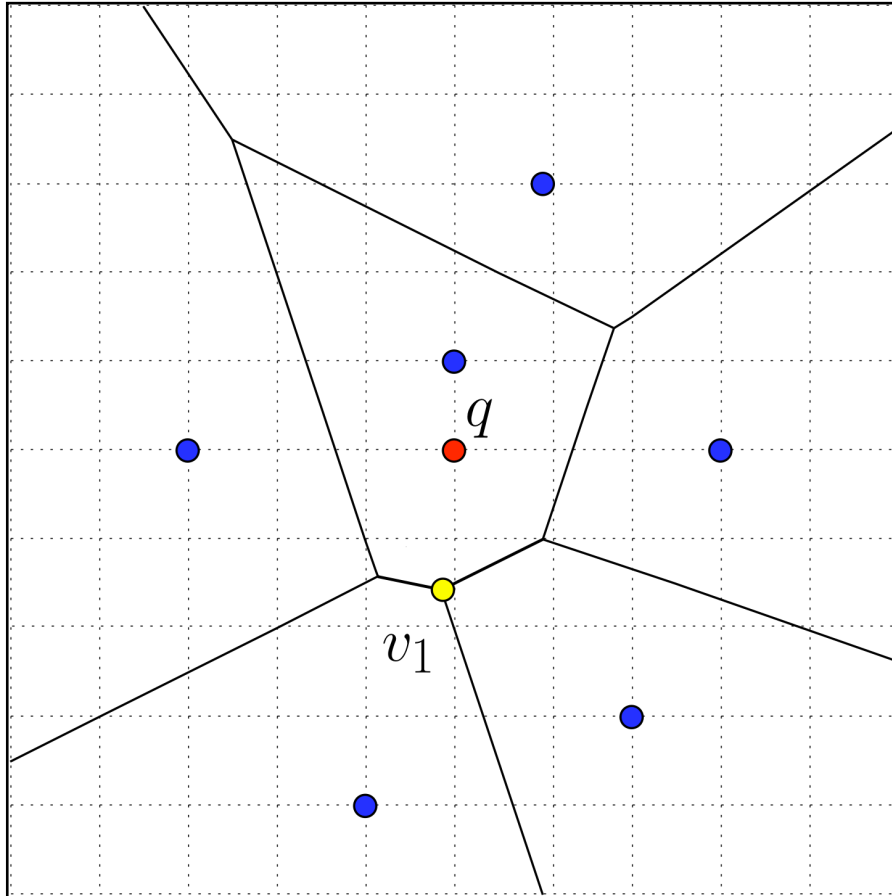
$$s_2 = (x_2, y_2)$$

$$\|q - s_1\|_2 \leq \|q - s_2\|_2$$

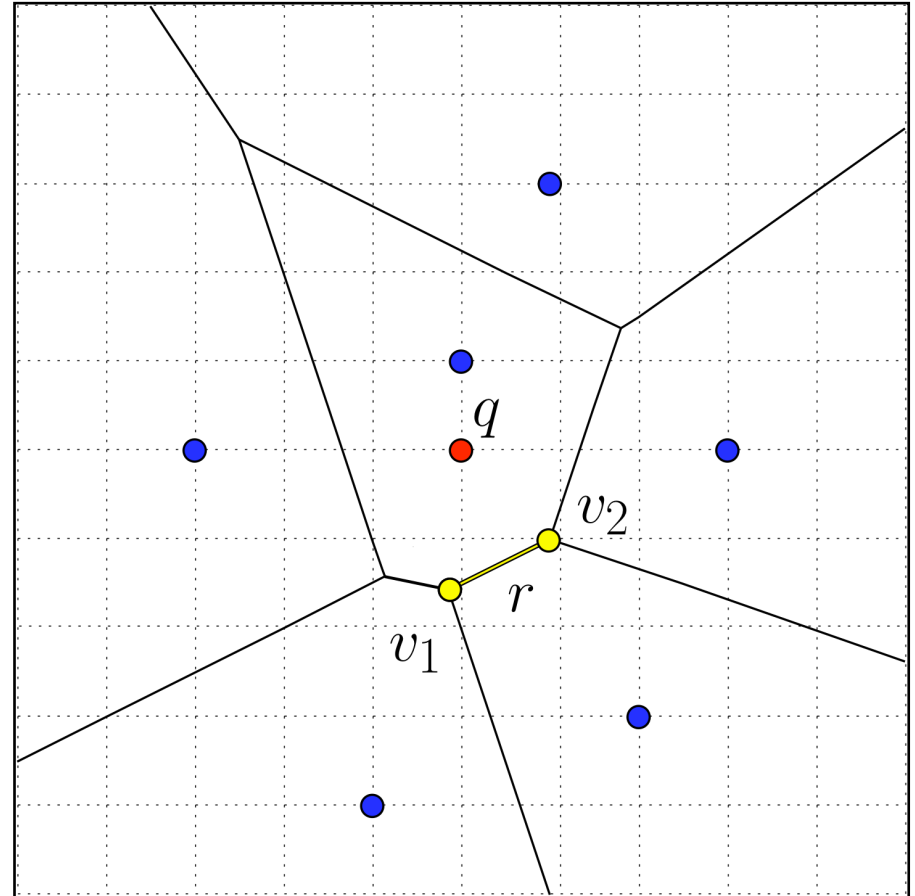
$$(x_q - x_1)^2 + (y_q - y_1)^2 \leq (x_q - x_2)^2 + (y_q - y_2)^2$$

**Degree 2**

# Predicates and their precision

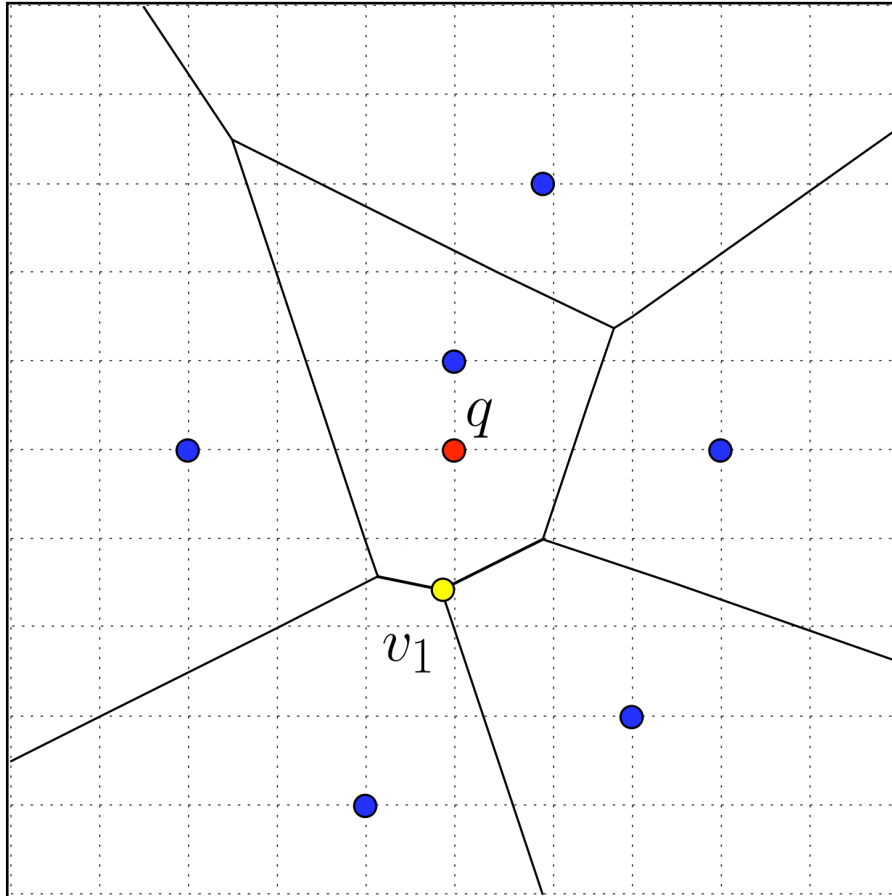


Is  $q.x$  left/right of vertex  $v_1.x$ ?  
degree 3

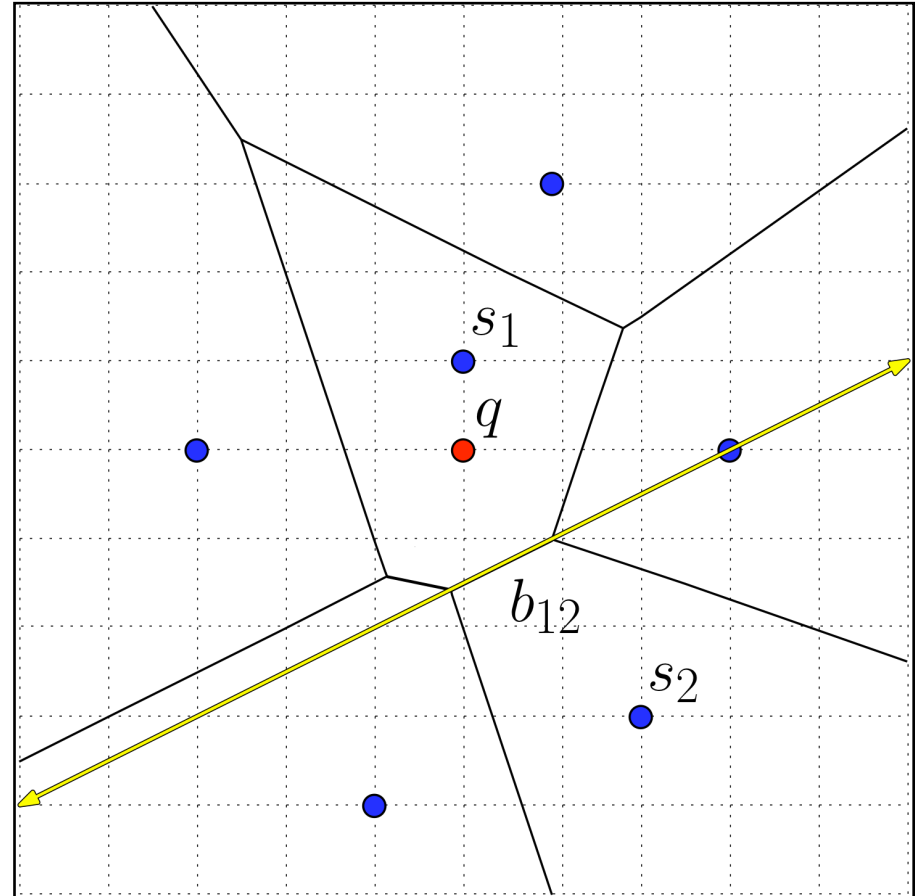


Is  $q$  above/below segment  $r$ ?  
degree 6

# Predicates and their precision

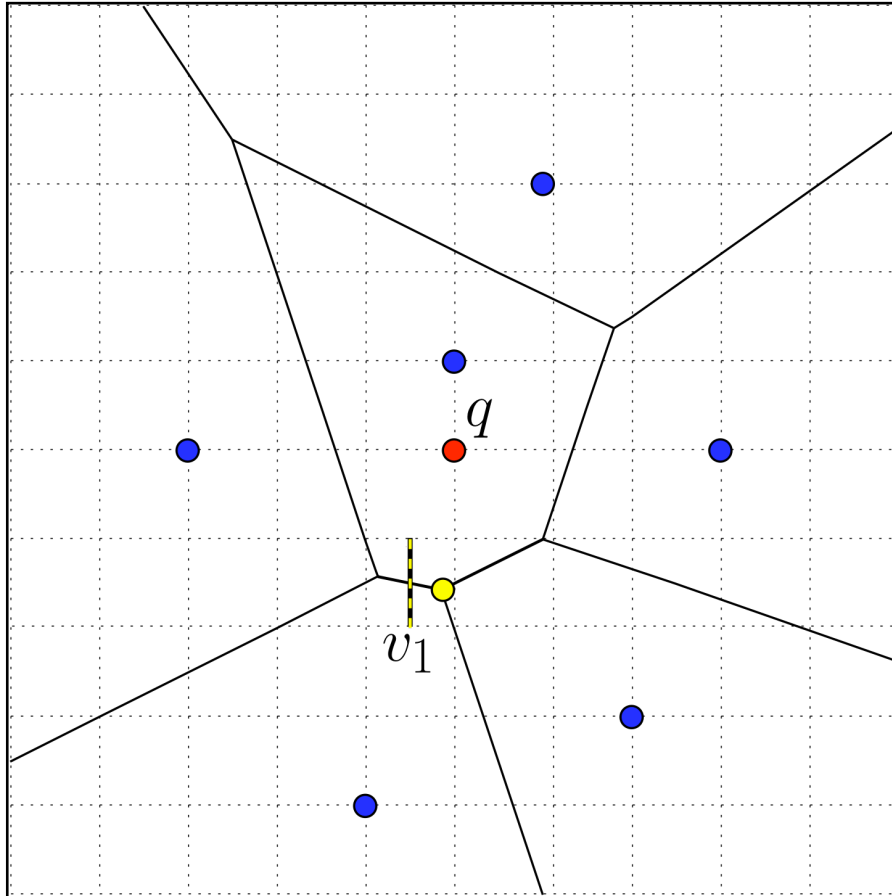


Is  $q.x$  left/right of vertex  $v_1.x$ ?  
degree 3

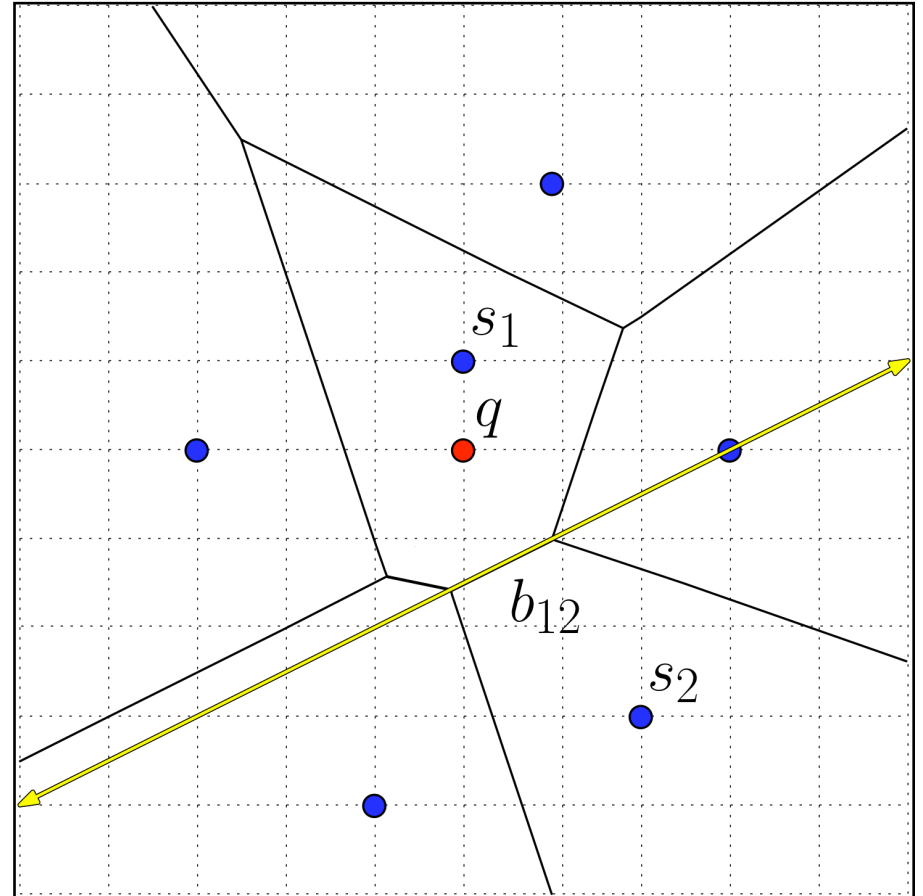


Is  $q$  closer to  $s_1$  or  $s_2$ ?  
degree 2

# Predicates and their precision

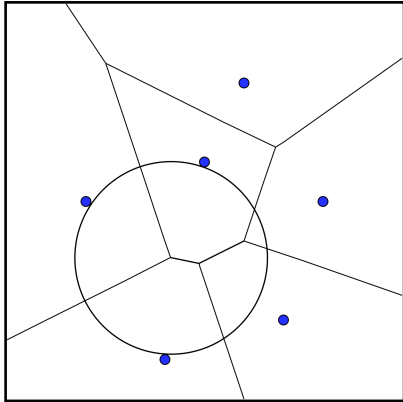


Is  $q.x$  left/right of the grid cell  
containing  $v_1$ ? [LPT99]  
degree 1

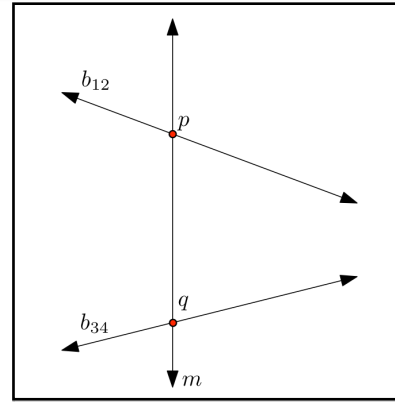


Is  $q$  closer to  $s_1$  or  $s_2$ ?  
degree 2

# Preds, Ops, Constructions and their precision



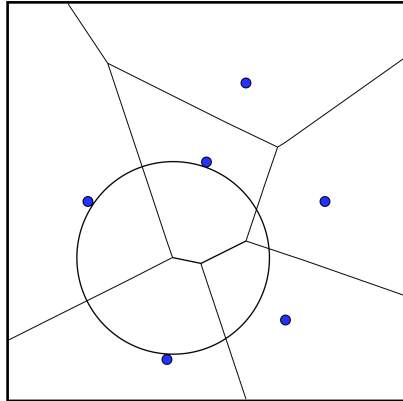
InCircle  
degree 4



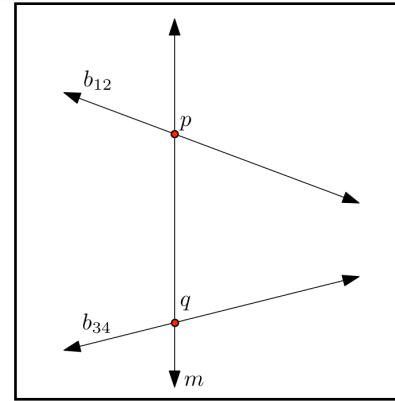
Vertical order  
degree 3



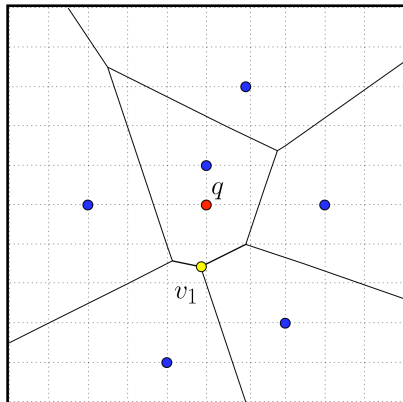
# Preds, Ops, Constructions and their precision



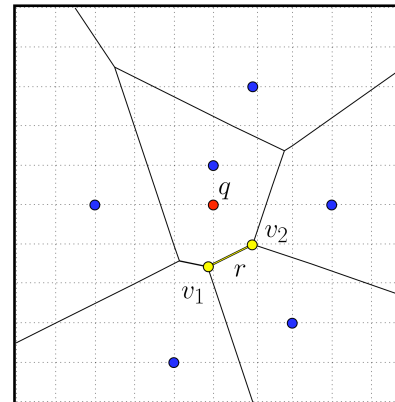
InCircle  
degree 4



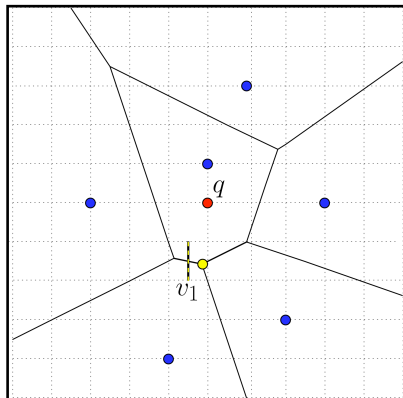
Vertical order  
degree 3



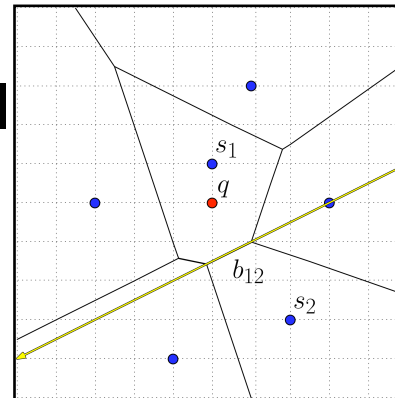
Left/right vertex  
degree 3



Above/below seg  
degree 6

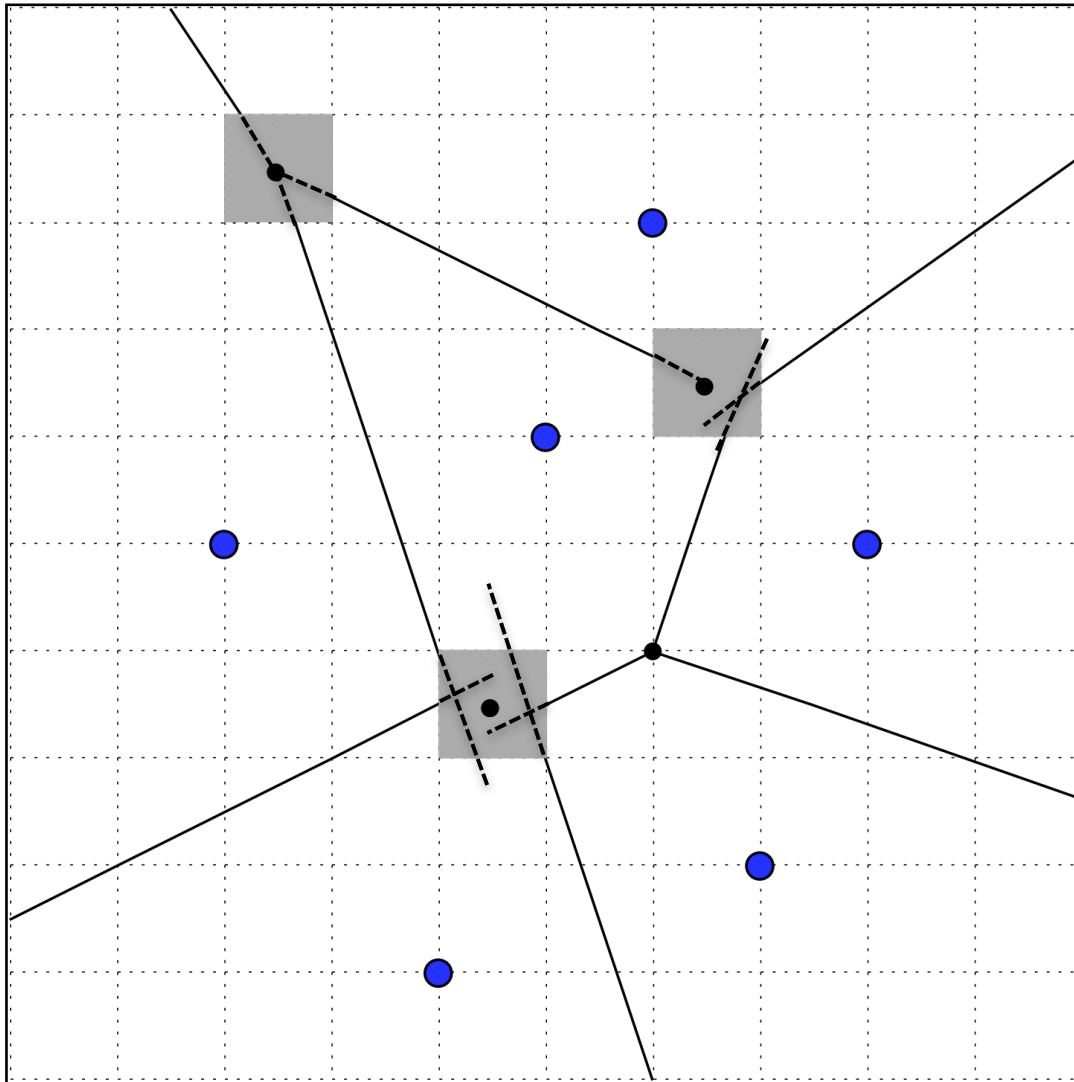


Left/right grid cell  
[LPT99]  
degree 1

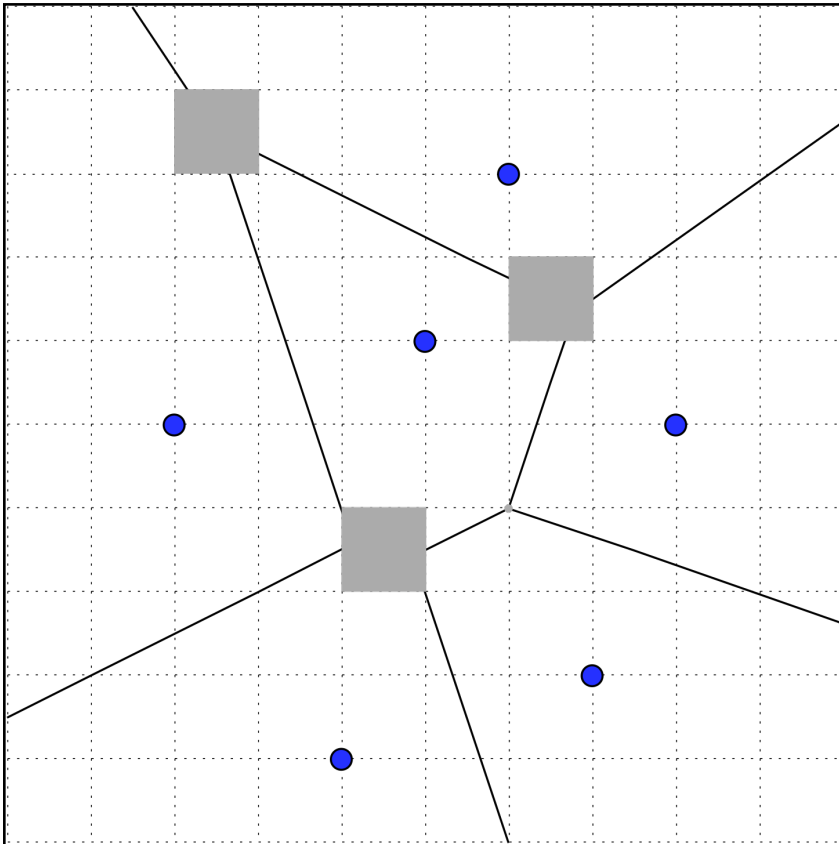


Side of a bisector  
degree 2

# Implicit Voronoi diagram [LPT99]



# Proximity queries w/ min arith precision?



Given:

sites  $S = \{s_1, s_2, \dots, s_n\}$

w/  $b$ -bit integer coords

Construct:

Implicit Voronoi with  
minimum precision.

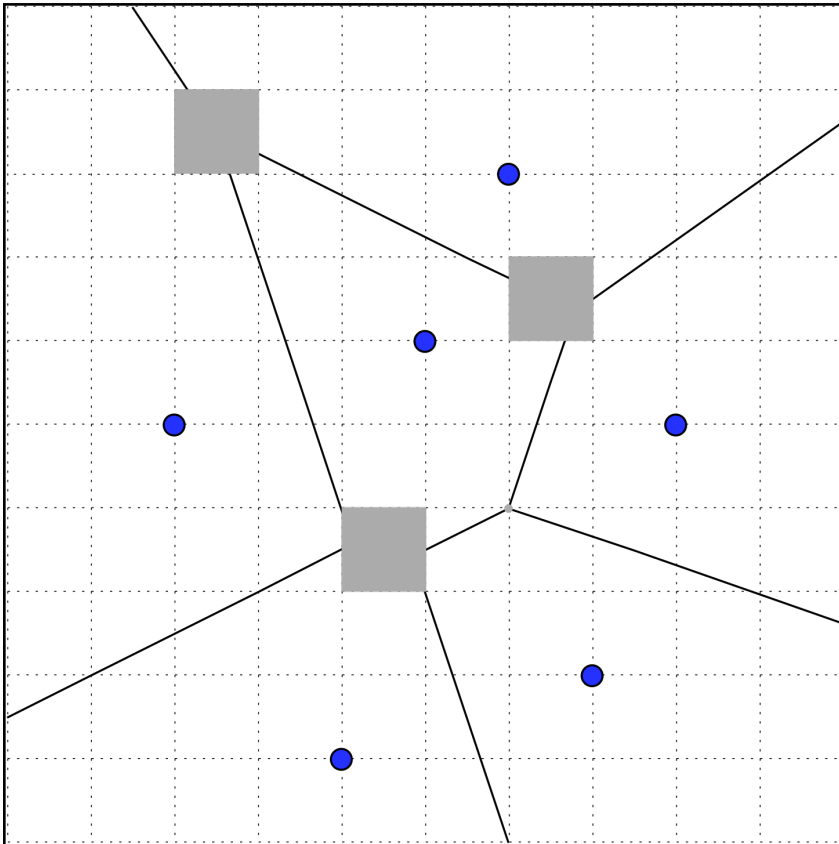
Note: precision  $< 4b$  bits  
precludes computing the  
Voronoi Diagram...

# Previous work on handling numerics in CG

Implementing geometric algorithms in finite precision computer arithmetic:

- Rely on machine precision (+epsilon)
- Exact Geometric Computation [Y97]
- Arithmetic Filters [FW93][DP99]
- Adaptive Predicates [P92][S97]
- Topological Consistency [SI92]
- Restricted precision algorithm design [LPT99]

# Proximity queries w/ min arith precision?



Given:

sites  $S = \{s_1, s_2, \dots, s_n\}$

w/  $b$ -bit integer coords

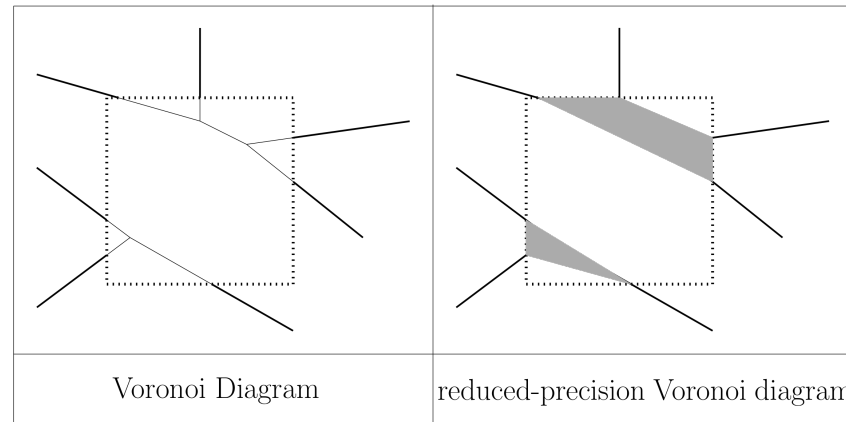
Construct:

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Note: precision  $< 4b$  bits  
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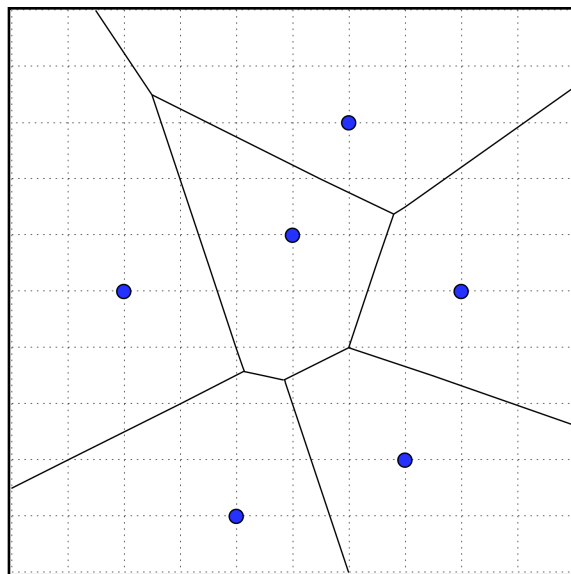
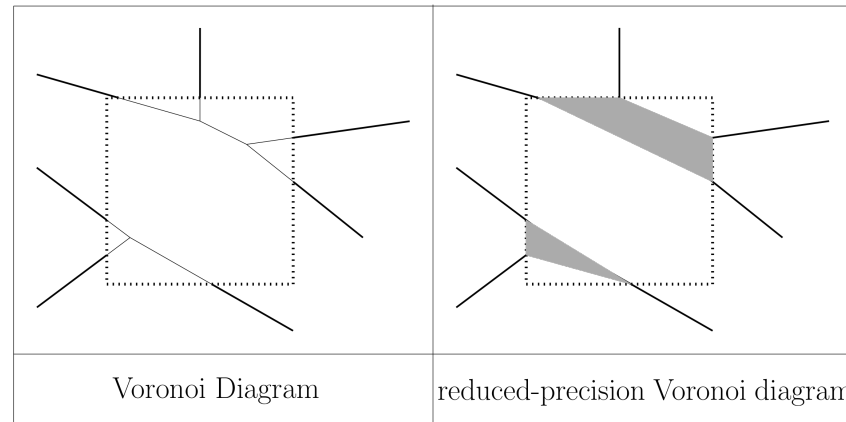
# Reduced-precision Voronoi diagram

Replace connected subtrees of Vor edges inside a cell with their convex hulls.

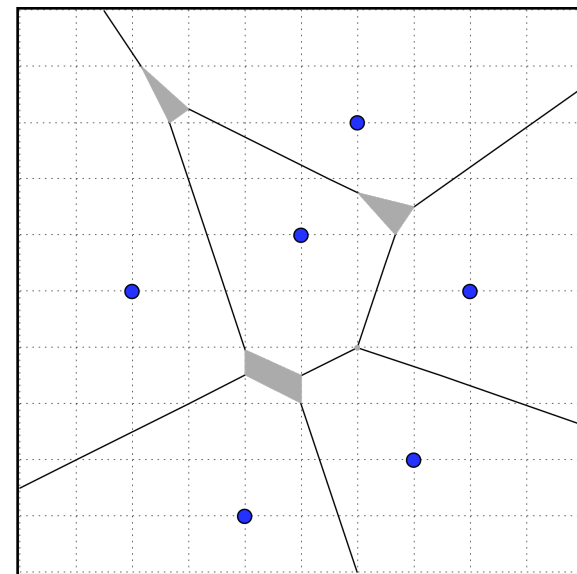


# Reduced-precision Voronoi diagram

Replace connected subtrees of Vor edges inside a cell with their convex hulls.



Voronoi diagram



reduced-precision Voronoi

# Results (preview)

Randomized Incremental Construction  
of the *reduced-precision Voronoi diagram*  
of  $n$  points on an  $m \times m$  grid.

Time:  $O(n (\log n + \log m))$  expected

Space:  $O(n)$  expected

Precision:  $3 \times$  precision of the input.

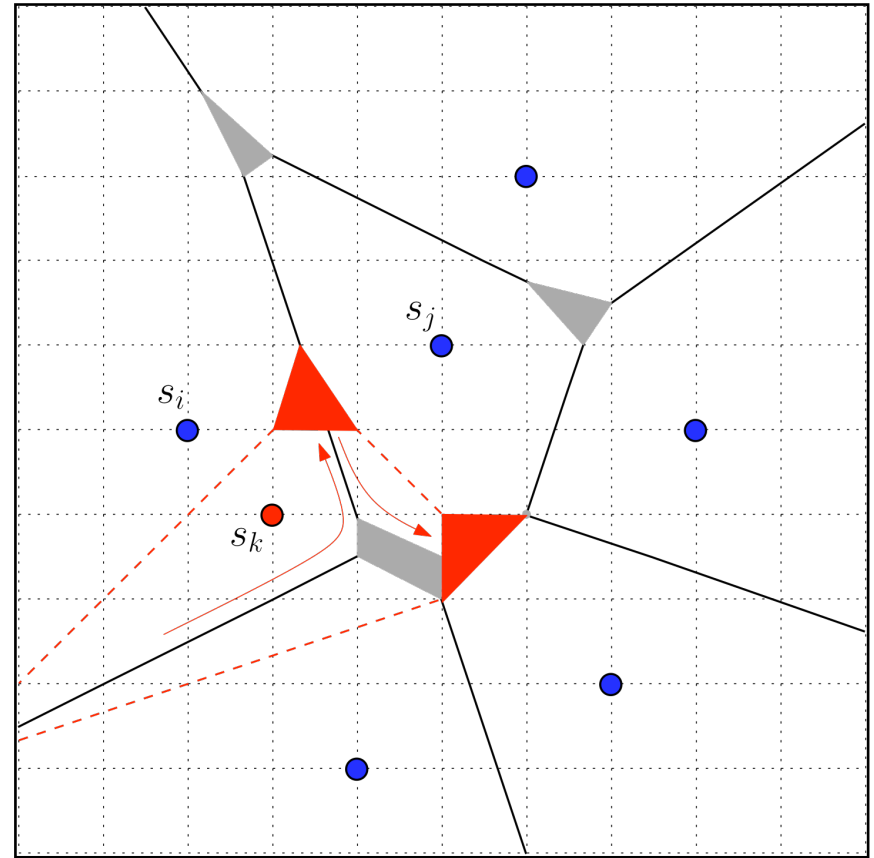
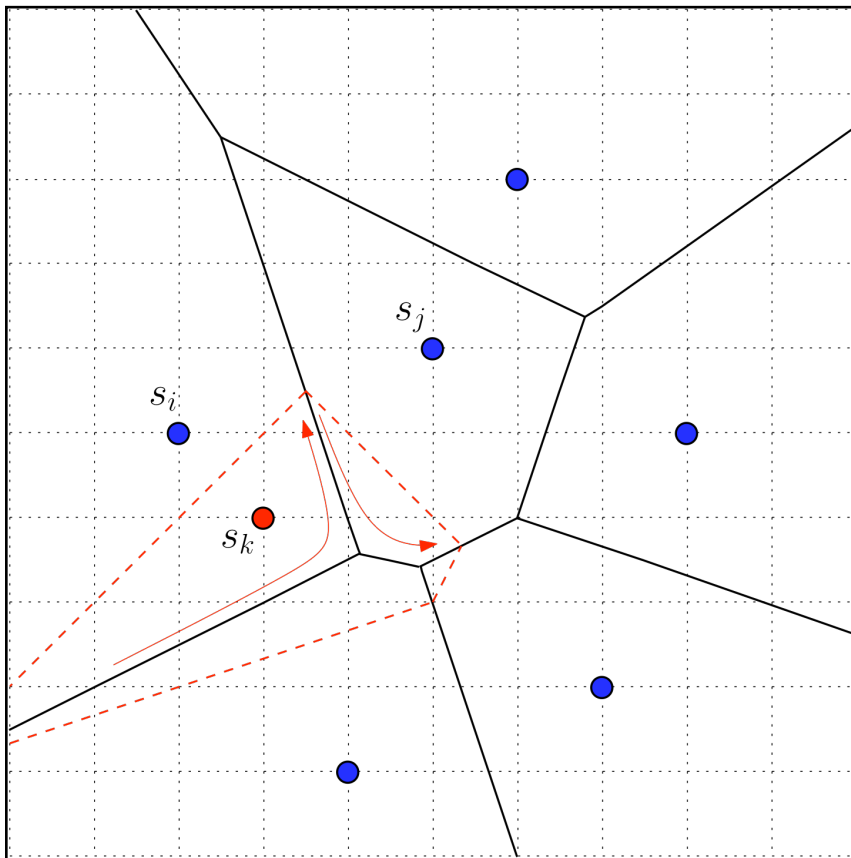
Construction of LPT's implicit Voronoi  
w/o computing the full Voronoi diagram.



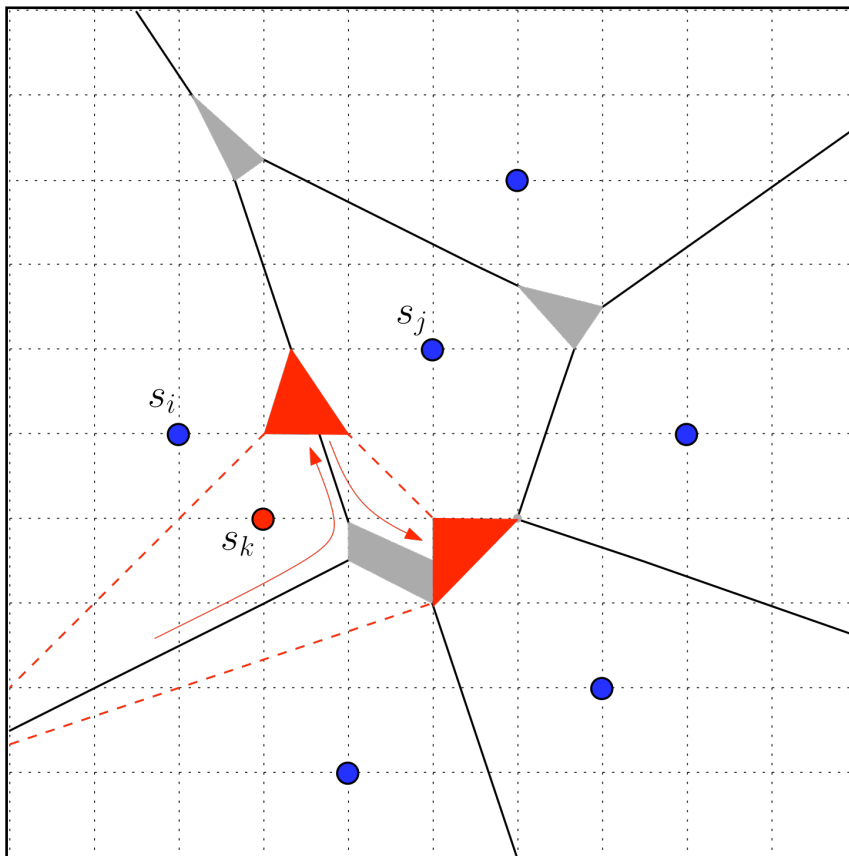
# Rand. Incremental Construction

Invariant: Maintain reduced-precision Voronoi as each new site is added.

Update step: Extension of [SI92], walk the deleted tree.



# Operations for RIC



What we need:

- Low precision construction for bisector intersection
- Determine the next edge in the tree walk

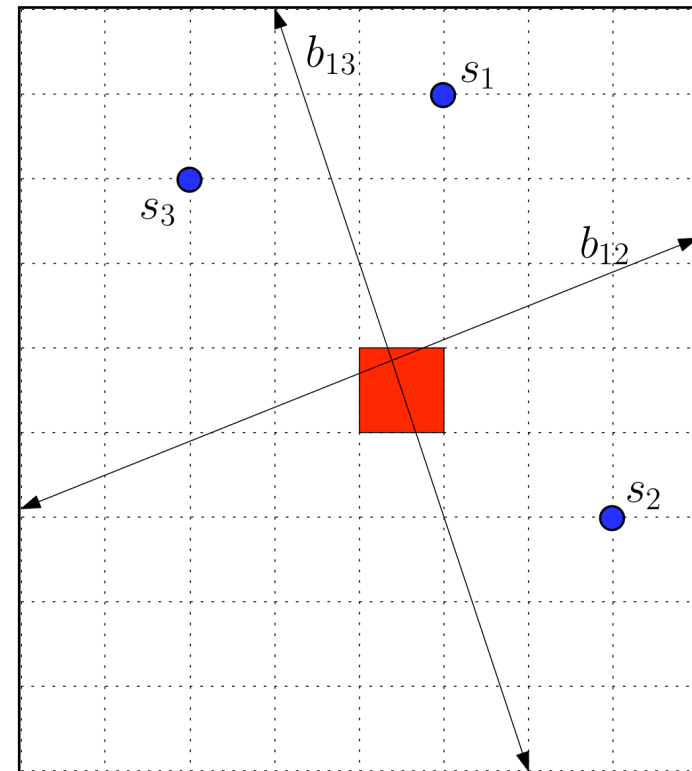
# Low precision bisector intersection

Given:

Three sites  $s_1$ ,  $s_2$  and  $s_3$

Find:

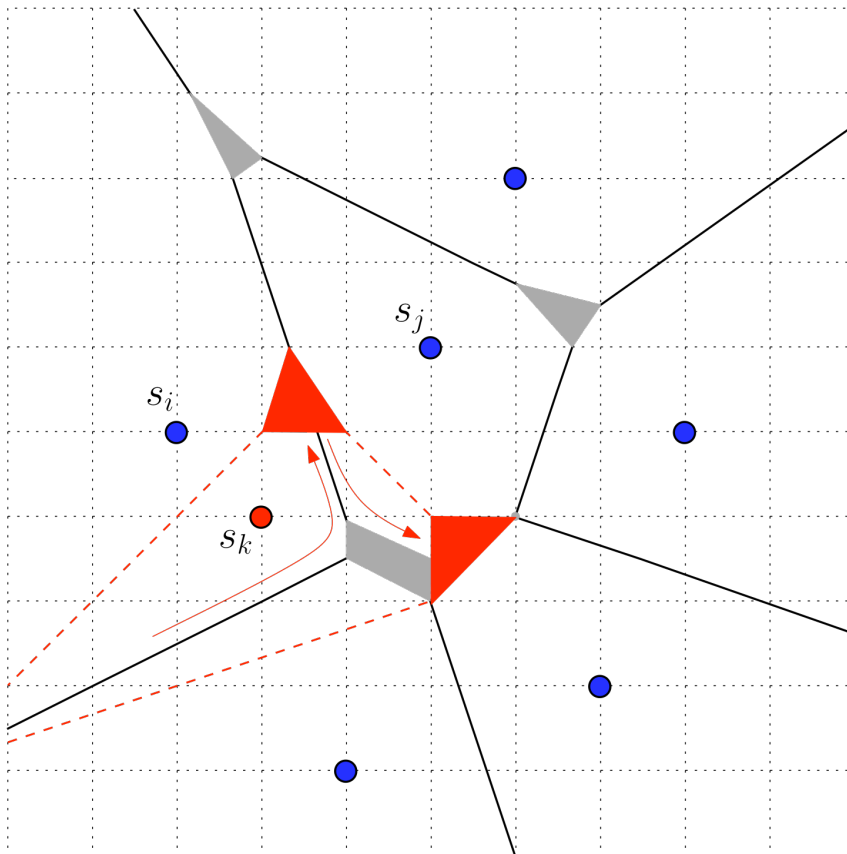
The grid cell that contains the intersection of bisectors  $b_{12}$  and  $b_{13}$



Time:  $O(\log m)$

Precision: degree 3

# Operations for RIC



What we needed:

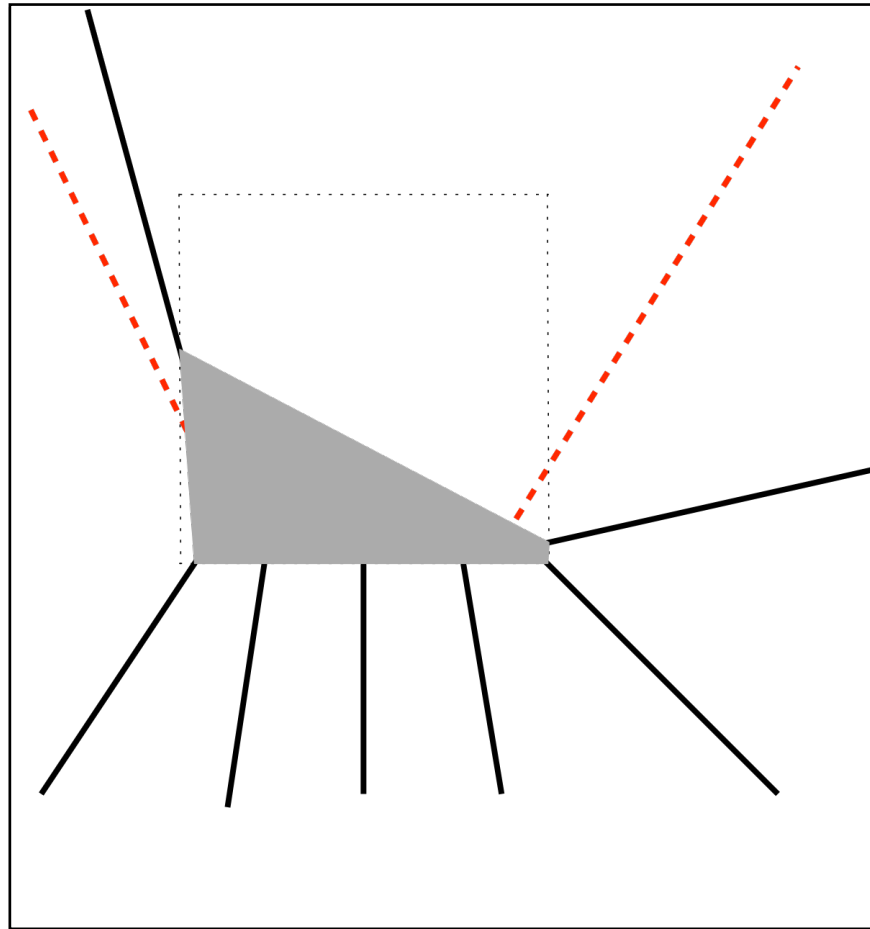
- Low precision construction for bisector intersection
- Determine the next edge in the tree walk

What we have:

- Bisector intersection degree 3,  $O(\log m)$

# Where to walk next

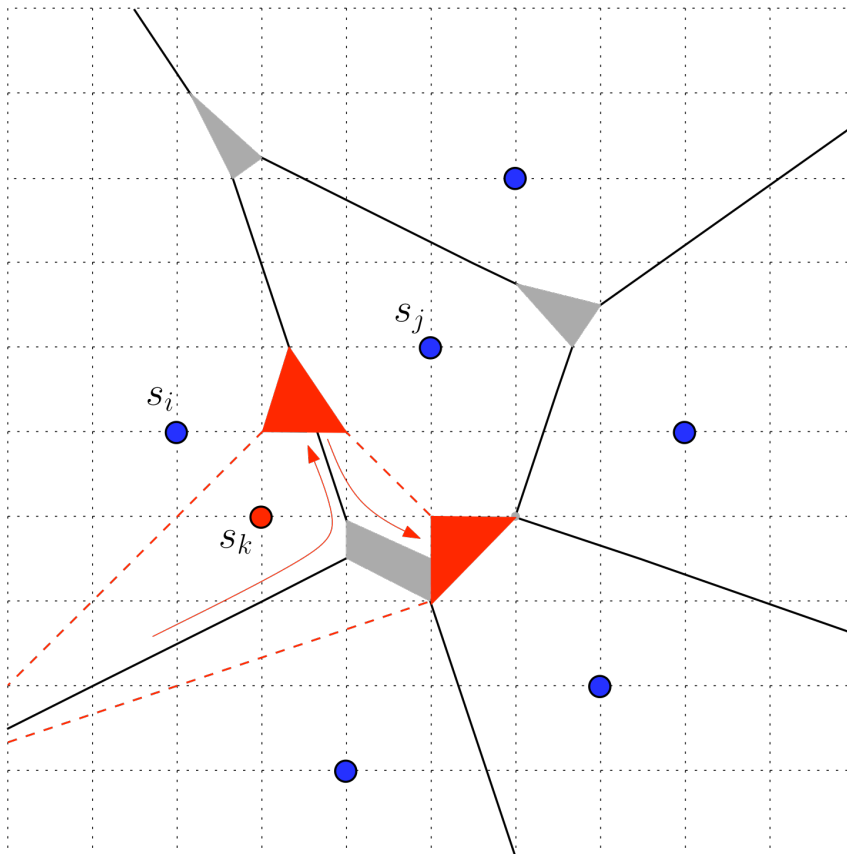
Where do we walk once we have found an intersection?







# Operations for RIC



What we needed:

- Low precision construction for bisector intersection
- Determine the next edge in the tree walk

What we have:

- Bisector intersection degree 3,  $O(\log m)$
- Next tree edge degree 3,  $O(\log n)$



# RIC alg for reduced-precision Voronoi

Update step to add a new site  $s_k$

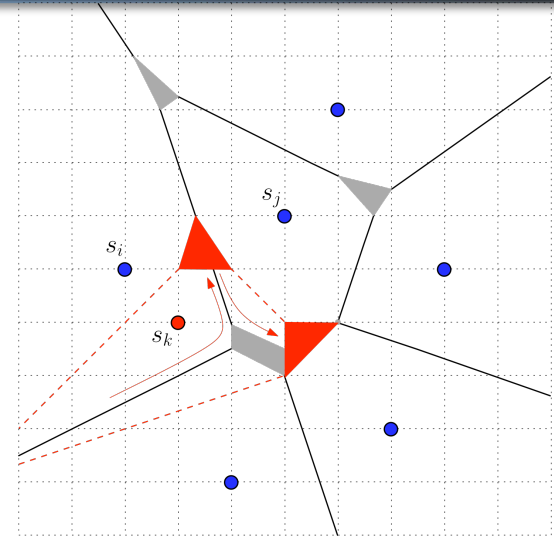
1. Find cell containing  $s_k$

2. Identify bisectors and cells in the new cell of  $s_k$

3. Walk tree inside cell of  $s_k$

3a. Binary search bisector for crossing

3b. Compute grid intersection with cell  $s_k$



# Analysis

## RIC Facts

Creates  $\theta(n)$  vertices expected

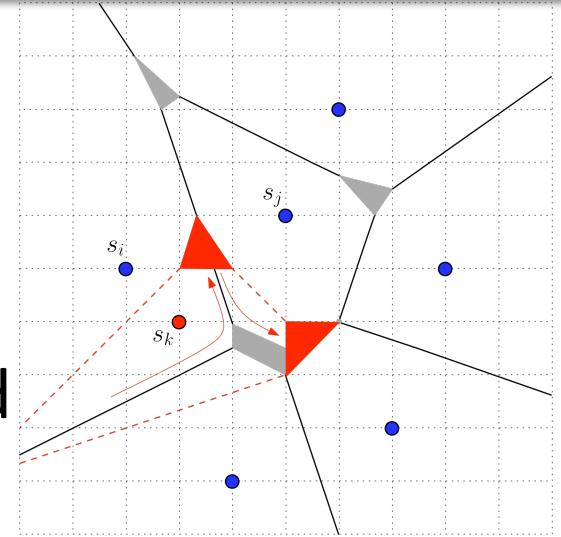
Point location takes  $\theta(n \log n)$  expected

## Charging scheme

Binary searchers for (3a) ( $\log m$ ) and (3b) ( $\log n$ ) are charged to vertex creation.

Therefore,

It takes  $O(n)$  space and  $O(n (\log n + \log m))$  time to build the reduced-precision Voronoi diagram of  $n$  sites on a grid of size  $m$  using  $3\times$  input precision.



# Results

Randomized Incremental Construction  
of the *reduced-precision Voronoi diagram*  
of  $n$  points on an  $m \times m$  grid.

Time:  $O(n (\log n + \log m))$  expected

Space:  $O(n)$  expected

Precision:  $3 \times$  precision of the input.

Construction of LPT's implicit Voronoi  
w/o computing the full Voronoi diagram.

# Open problems

Can we...

- create a reduced-precision Voronoi diagram with  $2\times$  precision of the input?
- generalize the algorithm to higher dimensions?
- Reduced-precision Voronoi diagrams with other input sites?
- treat precision as a limited resource (like time & space) when solving other algorithmic problems?

**THANK YOU!**