CSC279 HW5

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Collaborator

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PROBLEM 15

Answer:

1. Assume q is inside P. We want to find the closest point to q in $\{p_1, \ldots, p_n\}$.
   Reasoning:
   Hard and required $\Omega(n)$ runtime. Arrange all points on the circumference of a circle like regular convex n-polygon enclosing point q as its center. If the algorithm is deterministic and assumes an easy case, some points remain unvisited. For those unvisited point, we one of them closer. Therefore, the algorithm can not find the correct closest point and outputting incorrect results.

2. Assume q is outside P. We want to find the closest point to q in $\{p_1, \ldots, p_n\}$.
   Reasoning:
   Hard and required $\Omega(n)$ runtime. Place all points on a quarter-circle like regular convex n-polygon enclosing point q while ensuring P is convex and non-enclosing. Assume easy, then there will be some point that the algorithm (deterministic) will not visit. For an unvisited point, we move it closer. Therefore, the algorithm can not find the correct closest point and outputting incorrect results.

3. Assume q is inside P. We want to find the farthest point to q in $\{p_1, \ldots, p_n\}$.
   Reasoning:
   Hard and required $\Omega(n)$ runtime. Similar to Q1, but this time we move an unvisited point further.

4. Assume q is outside P. We want to find the farthest point to q in $\{p_1, \ldots, p_n\}$.
   Reasoning:
   Hard and required $\Omega(n)$ runtime. Similar to Q2, but this time we move an unvisited point further.

5. Assume q is inside P. We want to find the closest point to q on P.
   Reasoning:
   Hard and required $\Omega(n)$ runtime. Similar to Q1 again, The number of edges equals the number of points, so we still need at least $O(n)$ runtime.

6. Assume q is outside P. We want to find the closest point to q on P.
   Reasoning:
   Easy and can be solved within $O(logn)$.
   The algorithm finds the closest point to q on a convex polygon P in $O(\log n)$ time using the unimodal nature of the distance function from q to P. Using ternary search on the edges of P, it narrows the search interval until the closest edge is identified, and then computes the closest point on that edge. The convexity of P ensures the unimodal property, guaranteeing the correctness of the ternary search.

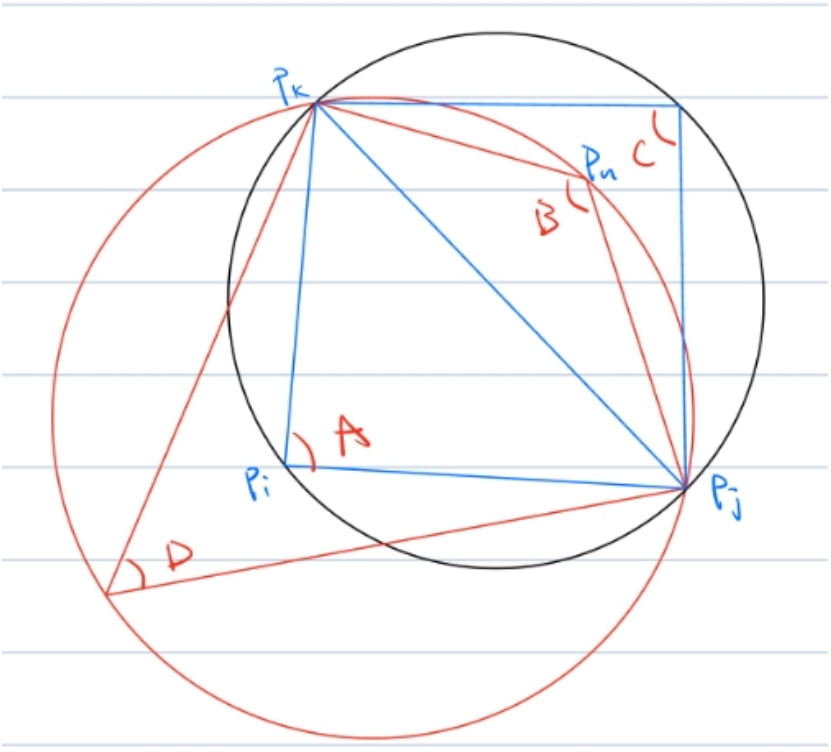
```
def closest_point_on_convex_polygon(q, P):
    n = len(P)
    low = 0
    high = n - 1

while high - low > 3:
    m1 = low + (high - low) // 3
    m2 = high - (high - low) // 3

    D_m1 = distance_to_edge(q, P[m1], P[(m1 + 1) % n])
    D_m2 = distance_to_edge(q, P[m2], P[(m2 + 1) % n])

    if D_m1 < D_m2:
        high = m2
    else:
        low = m1

min_dist = float('inf')
closest_point = None

for i in range(low, high + 1):
    p1 = P[i]
    p2 = P[(i + 1) % n]
    c = closest_point_on_segment(q, p1, p2)
    D = distance(q, c)
    if D < min_dist:
        min_dist = D
        closest_point = c

return closest_point
```

7. Assume q is inside P. We want to find the farthest point to q on P.
   Reasoning:
   Hard and required $\Omega(n)$ runtime. Similar to Q3, so similar argument can be made.

8. Assume q is outside P. We want to find the farthest point to q on P.
   Reasoning:
   Hard and required $\Omega(n)$ runtime. Similar to Q4. The farthest point must lie on the circumcircle as all other points are on an n-gon, so similar argument can be made.

PROBLEM 16

Proof. **Theorem:**
A convex polygon is fully contained within the largest circumcircle formed by three of its consecutive vertices.
Lemma:
Let $P = \{p_1, p_2, \ldots, p_n\}$ represent a convex polygon. Suppose a triangle T is formed by three vertices of P, and the circumcircle of T contains P. For any edge $\overline{p_a p_b}$ of T, there exists a vertex p_c between p_a and p_b such that the circumcircle of $T_{ab,c}$ contains P.
Proof
Let p_i, p_j, p_k be three vertices defining the triangle $T_{ij,k}$. Without loss of generality, consider the edge $\overline{p_j p_k}$ and its corresponding arc on the circumcircle. There exists $c \in (i, j)$ such that for every $a \in (i, j)$, the circumcircle of $T_{ij,c}$ contains p_a.
Now, we examine two cases for p_c:
Case 1: p_c **lies on the circumcircle of** $T_{ij,k}$ If p_c is on the circumcircle of $T_{ij,k}$, then the circumcircle of $T_{j,k,c}$ is the same as that of $T_{ij,k}$. Thus, the lemma holds.
Case 2: p_c **lies inside the circumcircle of** $T_{ij,k}$ Construct a quadrilateral



with vertices p_j, p_c, p_k, D that forms a cyclic quadrilateral. By the properties of cyclic quadrilaterals:

$$\angle A + \angle D = \pi \quad \text{and} \quad \angle B + \angle C = \pi.$$

Using these properties:

$$\angle A + \angle B = \pi - \angle C < \pi - \angle D \implies \angle A > \angle D.$$

For any point z inside or on the circumcircle, it cannot satisfy $\angle p_j z p_k > \angle p_j p_i p_k$. Thus, z must lie outside the circumcircle of $T_{ij,k}$, ensuring that the circumcircle of $T_{ij,c}$ contains all points between the arc $p_j p_i p_k$. Hence, the lemma is proved.

Triangulation Construction

1. Start with three consecutive vertices p_i, p_{i+1}, p_{i+2} such that the circumcircle of $T_{p_i p_{i+1} p_{i+2}}$ contains P.

2. For each new triangle T, select any edge $\overline{p_a p_b}$. If there are no points of P within the range of vertices $\overline{p_a p_b}$, skip this edge. Otherwise, find a point p_c such that the circumcircle of $T_{p_a p_b p_c}$ contains P.

3. Repeat this process iteratively, ensuring that every newly constructed triangle satisfies the condition that its circumcircle contains P.

This method guarantees that the entire polygon P is contained within the circumcircle of the final triangulation. □

PROBLEM 17

General Algorithm Thoughts:

1. **Construct the Voronoi diagram** for all sites.
2. **For each Voronoi cell**, examine its corners (vertices).
3. **Check if any corner is at a distance $\geq l + r$ from its associated site**.
   - **Reasoning**: Corners are the farthest points within a cell from the site.
   - They are **equidistant to the site and neighboring sites**.
   - If a corner is at distance $\geq l + r$ from the site, it is also that far from neighboring sites.
4. **Conclusion**: If such a corner exists, the site is "good" because all points at that corner are sufficiently distant from all relevant sites.

Potentially A More Refined and Rigorous Version

The algorithm identifies all "good" points by first constructing the Voronoi diagram of the given points, which efficiently captures proximity relationships in $O(n \log n)$ time. For each point p_i, it examines only its neighboring points in the Voronoi diagram, as these are the only ones that could potentially interfere with placing a new circle. By computing the angular intervals where a circle of radius ℓ touching C_i would intersect any neighboring C_j, the algorithm determines the directions that are blocked. If there exists at least one direction where such interference does not occur, the point p_i is therefore "good".

```
# Helper Functions
def compute_interfering_angles(p_i, p_j, r, l, d_ij):
    # Calculate the angle between p_i and p_j
    delta_x = p_j.x - p_i.x
    delta_y = p_j.y - p_i.y
    alpha = atan2(delta_y, delta_x)

    # Law of Cosines to find the angular width
    cos_theta = (d_ij**2 + (r + l)**2 - (r + l)**2) / (2 * d_ij * (r + l))
    if abs(cos_theta) <= 1:
        theta = acos(cos_theta)
        # The interfering interval is [alpha - theta, alpha + theta]
        interval = [(alpha - theta) % (2 * pi), (alpha + theta) % (2 * pi)]
        # Handle interval wrapping around 2pi
        if interval[0] > interval[1]:
            return [(interval[0], 2 * pi), (0, interval[1])]
        else:
```

```
            return [interval]
    else:
        # Circles do not intersect; no interfering angles
        return []

# Main Function
def find_good_points(P, r, l):
    # Construct the Voronoi diagram
    # Need O(nlogn)
    V = voronoi_diagram(P)

    good_points = []

    # For each point p_i
    # Need O(n)
    for p_i in P:
        interfering_angles = []  # List to store interfering angular intervals

        # Get neighboring points in the Voronoi diagram
        neighbors = V.get_neighbors(p_i)

        # For each neighbor p_j
        for p_j in neighbors:
            d_ij = distance(p_i, p_j)

            # Only consider neighbors that may interfere
            if d_ij < 2 * (r + l):
                # Compute the angular intervals of interference
                angles = compute_interfering_angles(p_i, p_j, r, l, d_ij)
                interfering_angles.extend(angles)

        # Compute the union of interfering intervals
        interfering_union = union_of_intervals(interfering_angles)

        # Determine the complement of the union over [0, 2pi)
        non_interfering_angles = complement_of_intervals(interfering_union, 0, 2 * pi)

        # If there is at least one non-interfering angle, p_i is good
        if non_interfering_angles:
            good_points.append(p_i)

    return good_points
```

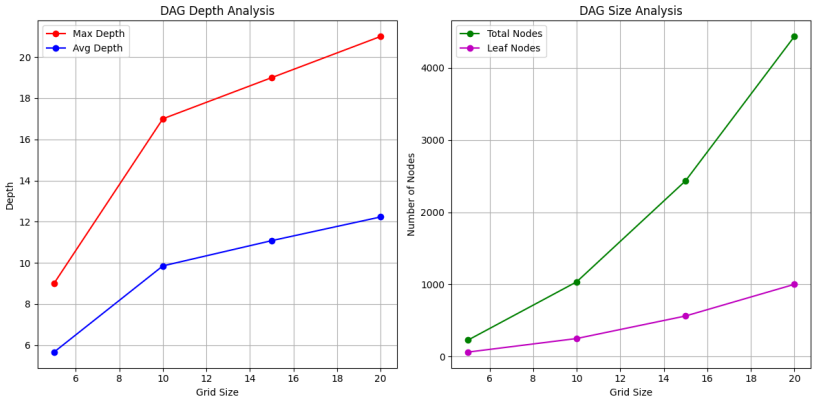
PROBLEM 18

Summary: The randomized incremental Delaunay triangulation algorithm employs a history DAG to efficiently manage point insertion and triangle updates while ensuring the Delaunay property. The algorithm inserts points in random order, using the history DAG for $O(\log n)$ expected-time point location, followed by triangle splitting and recursive edge flipping to maintain the Delaunay criterion. With an expected time complexity of $O(n \log n)$ and space complexity of $O(n \log n)$ (including the history DAG), it offers good average-case performance and practical simplicity.

Result:

Processing n	**Max Depth**	**Avg Depth**
10	8	5.45273631840796
20	12	7.750312109862672
30	18	8.939478067740144
40	17	9.610121836925961
50	21	9.93361327734453

Table 1: Depth statistics for different values of n



Short Analysis:

The result I got is reasonable, with the average depths increasing in *logn* as expected, indicating that the algorithm effectively maintains a balanced DAG structure. Although the maximum depths are somewhat higher than theoretical predictions, they remain within an acceptable range considering the algorithm's randomness and the potential for local depth increases during edge legalization.

Implementation:

The following code of randomized Delaunay triangulation algorithm with history

DAG was implemented in Python (I fixed the random seed = 20 for better representation):

```
import numpy as np
import matplotlib.pyplot as plt
from typing import List, Set, Tuple, Optional
from dataclasses import dataclass
import random
from collections import defaultdict

# Basic geometric structures
@dataclass
class Point2D:
    x: float
    y: float

    def __eq__(self, other):
        if not isinstance(other, Point2D):
            return False
        return abs(self.x - other.x) < 1e-10 and abs(self.y - other
            .y) < 1e-10

    def __str__(self):
        return f"Point2D({self.x:.2f}, {self.y:.2f})"

class Triangle2D:
    def __init__(self, points=None, p1=None, p2=None, p3=None):
        if points is not None:
            self.vertices = list(points)
        else:
            self.vertices = [p1, p2, p3]

    def get_points(self):
        return self.vertices

    def get_point(self, index):
        return self.vertices[index]

    def set_points(self, points=None, p1=None, p2=None, p3=None):
        if points is not None:
            self.vertices = list(points)
        else:
            self.vertices = [p1, p2, p3]

class DagNode:
    def __init__(self, triangle_index: int):
        self.triangle = triangle_index
        self.children = []

    def append_child(self, new_node):
        self.children.append(new_node)

    def get_index(self):
        return self.triangle

    def get_children(self):
        return self.children
```

```
54
55 class TriangulationMember(Triangle2D):
56     def __init__(self, points, adj_list, dag_node, is_active=True):
57         super().__init__(points)
58         self.adj_list = list(adj_list)
59         self.dag_node = dag_node
60         self.active = is_active
61
62     def set_active(self):
63         self.active = True
64
65     def set_inactive(self):
66         self.active = False
67
68     def is_active(self):
69         return self.active
70
71     def get_neighbour(self, index):
72         return self.adj_list[index]
73
74     def get_neighbours(self):
75         return self.adj_list
76
77     def get_dag_node(self):
78         return self.dag_node
79
80     def set_neighbour(self, neighbour, new_index):
81         self.adj_list[neighbour] = new_index
82
83 class Triangulation:
84     def __init__(self, init_triangle: Triangle2D, dag_node: DagNode
       ):
85         adj_list = [0, 0, 0]
86         self.triangles = [TriangulationMember(init_triangle.
               get_points(), adj_list, dag_node)]
87
88     def get_triangle(self, index):
89         return self.triangles[index]
90
91     def get_triangles(self):
92         return self.triangles
93
94     def size(self):
95         return len(self.triangles)
96
97     def add_triangle(self, triangle):
98         self.triangles.append(triangle)
99
100    def set_triangle_active(self, index):
101        self.triangles[index].set_active()
102
103    def set_triangle_inactive(self, index):
104        self.triangles[index].set_inactive()
105
106    def set_triangle_neighbour(self, triangle, neighbour, new_index
       ):
107        self.triangles[triangle].set_neighbour(neighbour, new_index
```

```
            )

# Geometric utilities
class GeometryUtils:
    @staticmethod
    def point_in_circle(p1: Point2D, p2: Point2D, p3: Point2D, p4:
        Point2D, include_edges: bool) -> bool:
        matrix = np.array([
            [p1.x - p4.x, p1.y - p4.y, (p1.x - p4.x)**2 + (p1.y -
                p4.y)**2],
            [p2.x - p4.x, p2.y - p4.y, (p2.x - p4.x)**2 + (p2.y -
                p4.y)**2],
            [p3.x - p4.x, p3.y - p4.y, (p3.x - p4.x)**2 + (p3.y -
                p4.y)**2]
        ])
        det = np.linalg.det(matrix)
        return det > 0 if include_edges else det >= 0

    @staticmethod
    def point_position_to_segment(p1: Point2D, p2: Point2D, p:
        Point2D) -> float:
        return (p2.x - p1.x) * (p.y - p1.y) - (p2.y - p1.y) * (p.x
            - p1.x)

    @staticmethod
    def point_in_triangle(p1: Point2D, p2: Point2D, p3: Point2D, p:
         Point2D, include_edges: bool) -> bool:
        pos1 = GeometryUtils.point_position_to_segment(p1, p2, p)
        pos2 = GeometryUtils.point_position_to_segment(p2, p3, p)
        pos3 = GeometryUtils.point_position_to_segment(p3, p1, p)

        if include_edges:
            return (pos1 >= 0 and pos2 >= 0 and pos3 >= 0) or (pos1
                 <= 0 and pos2 <= 0 and pos3 <= 0)
        else:
            return (pos1 > 0 and pos2 > 0 and pos3 > 0) or (pos1 <
                0 and pos2 < 0 and pos3 < 0)

class DelaunayTriangulation:
    @staticmethod
    def update_index_in_neighbour(triangulation: Triangulation,
        triangle_index: int,
                                  neighbour_index: int, new_index:
                                      int):
        if neighbour_index != 0:
            neighbour = triangulation.get_triangle(neighbour_index)
            for i in range(3):
                if neighbour.get_neighbour(i) == triangle_index:
                    triangulation.set_triangle_neighbour(
                        neighbour_index, i, new_index)

    @staticmethod
    def find_index_in_neighbour(triangulation: Triangulation,
        triangle_index: int,
                                neighbour_index: int) -> int:
        for i in range(3):
            if triangulation.get_triangle(neighbour_index).
```

```
                get_neighbour(i) == triangle_index:
                return i
        return 3

    @staticmethod
    def flip_edge(triangulation: Triangulation, triangle_index: int
        , point_index: int):
        triangle = triangulation.get_triangle(triangle_index)

        if triangle.get_neighbour((point_index + 1) % 3) != 0:
            adj_triangle = triangulation.get_triangle(triangle.
                get_neighbour((point_index + 1) % 3))
            adj_point_index = (DelaunayTriangulation.
                find_index_in_neighbour(
                triangulation, triangle_index,
                triangle.get_neighbour((point_index + 1) % 3)) + 2)
                    % 3

            if GeometryUtils.point_in_circle(
                triangle.get_point(0), triangle.get_point(1),
                triangle.get_point(2), adj_triangle.get_point(
                    adj_point_index), False):

                triangulation.set_triangle_inactive(triangle_index)
                triangulation.set_triangle_inactive(triangle.
                    get_neighbour((point_index + 1) % 3))

                current_index = triangulation.size()
                new_triangle_index1 = current_index
                new_triangle_index2 = current_index + 1

                # Create new triangles
                new_triangle1 = Triangle2D(
                    p1=triangle.get_point(point_index),
                    p2=triangle.get_point((point_index + 1) % 3),
                    p3=adj_triangle.get_point(adj_point_index)
                )
                new_triangle2 = Triangle2D(
                    p1=triangle.get_point(point_index),
                    p2=adj_triangle.get_point(adj_point_index),
                    p3=triangle.get_point((point_index + 2) % 3)
                )

                # Set up adjacency lists
                adj_list1 = [
                    triangle.get_neighbour(point_index),
                    adj_triangle.get_neighbour((adj_point_index +
                        2) % 3),
                    new_triangle_index2
                ]
                adj_list2 = [
                    new_triangle_index1,
                    adj_triangle.get_neighbour(adj_point_index),
                    triangle.get_neighbour((point_index + 2) % 3)
                ]

                # Update neighbors
```

```
                DelaunayTriangulation.update_index_in_neighbour(
                    triangulation, triangle_index,
                    triangle.get_neighbour(point_index),
                        new_triangle_index1
                )
                DelaunayTriangulation.update_index_in_neighbour(
                    triangulation, triangle.get_neighbour((
                        point_index + 1) % 3),
                    adj_triangle.get_neighbour((adj_point_index +
                        2) % 3),
                    new_triangle_index1
                )
                DelaunayTriangulation.update_index_in_neighbour(
                    triangulation, triangle_index,
                    triangle.get_neighbour((point_index + 2) % 3),
                    new_triangle_index2
                )
                DelaunayTriangulation.update_index_in_neighbour(
                    triangulation, triangle.get_neighbour((
                        point_index + 1) % 3),
                    adj_triangle.get_neighbour(adj_point_index),
                    new_triangle_index2
                )

                # Create DAG nodes
                dag1 = DagNode(new_triangle_index1)
                dag2 = DagNode(new_triangle_index2)

                # Add triangles to triangulation
                triangulation.add_triangle(TriangulationMember(
                    new_triangle1.get_points(), adj_list1, dag1
                ))
                triangulation.add_triangle(TriangulationMember(
                    new_triangle2.get_points(), adj_list2, dag2
                ))

                # Update DAG
                triangle.get_dag_node().append_child(dag1)
                adj_triangle.get_dag_node().append_child(dag1)
                adj_triangle.get_dag_node().append_child(dag2)
                triangle.get_dag_node().append_child(dag2)

                # Recursively check new edges
                DelaunayTriangulation.flip_edge(triangulation,
                    new_triangle_index1, 0)
                DelaunayTriangulation.flip_edge(triangulation,
                    new_triangle_index2, 0)

    @staticmethod
    def discard_bounding_vertexes(triangulation: Triangulation):
        bounding_triangle = triangulation.get_triangle(0)
        for i in range(triangulation.size()):
            if triangulation.get_triangle(i).is_active():
                triangle = triangulation.get_triangle(i)
                for j in range(3):
                    if (triangle.get_point(j) == bounding_triangle.
                        get_point(0) or
```

```
                        triangle.get_point(j) == bounding_triangle.
                            get_point(1) or
                        triangle.get_point(j) == bounding_triangle.
                            get_point(2)):
                        triangulation.set_triangle_inactive(i)
                        break

    @staticmethod
    def get_triangulation(triangulation: Triangulation, dag:
        DagNode,
                          points: List[Point2D]):
        shuffled_points = points.copy()
        random.shuffle(shuffled_points)

        for point in shuffled_points:
            DelaunayTriangulation.incremental_step(triangulation,
                dag, point)

        DelaunayTriangulation.discard_bounding_vertexes(
            triangulation)

    @staticmethod
    def incremental_step(triangulation: Triangulation, dag: DagNode
        , point: Point2D):
        current_node = DelaunayTriangulation.locate_point(
            triangulation, dag, point)
        triangulation.set_triangle_inactive(current_node.get_index
            ())
        current_triangle = triangulation.get_triangle(current_node.
            get_index())

        # Check if point already exists
        if (point == current_triangle.get_point(0) or
            point == current_triangle.get_point(1) or
            point == current_triangle.get_point(2)):
            return

        # Split triangle
        current_index = triangulation.size()
        for i in range(3):
            new_triangle = Triangle2D(
                p1=point,
                p2=current_triangle.get_point(i),
                p3=current_triangle.get_point((i + 1) % 3)
            )
            adj_list = [
                current_index + ((i + 2) % 3),
                current_triangle.get_neighbour(i),
                current_index + ((i + 1) % 3)
            ]
            dag_node = DagNode(current_index + i)
            triangulation.add_triangle(TriangulationMember(
                new_triangle.get_points(), adj_list, dag_node
            ))
            current_node.append_child(dag_node)

            DelaunayTriangulation.update_index_in_neighbour(
```

```
                triangulation, current_node.get_index(),
                current_triangle.get_neighbour(i),
                current_index + i
            )

        # Check and flip edges
        for i in range(3):
            DelaunayTriangulation.flip_edge(triangulation,
                current_index + i, 0)

    @staticmethod
    def locate_point(triangulation: Triangulation, dag: DagNode,
        point: Point2D) -> DagNode:
        for child in dag.get_children():
            triangle = triangulation.get_triangle(child.get_index()
                )
            if GeometryUtils.point_in_triangle(
                triangle.get_point(0), triangle.get_point(1),
                triangle.get_point(2), point, True
            ):
                return DelaunayTriangulation.locate_point(
                    triangulation, child, point)
        return dag

class DelaunayTest:
    @staticmethod
    def create_bounding_triangle(points: List[Point2D]) ->
        Triangle2D:
        """Create a triangle that contains all points with some
            margin."""
        min_x = min(p.x for p in points) - 0.1
        max_x = max(p.x for p in points) + 0.1
        min_y = min(p.y for p in points) - 0.1
        max_y = max(p.y for p in points) + 0.1

        dx = max_x - min_x
        dy = max_y - min_y
        center_x = (min_x + max_x) / 2
        center_y = (min_y + max_y) / 2
        size = max(dx, dy) * 2

        p1 = Point2D(center_x - size, center_y - size)
        p2 = Point2D(center_x + size, center_y - size)
        p3 = Point2D(center_x, center_y + size)

        return Triangle2D(p1=p1, p2=p2, p3=p3)

    @staticmethod
    def generate_test_points(n: int, include_random: bool = True)
        -> List[Point2D]:
        """Generate test points in both grid and random patterns.""
            "
        points = []

        # Generate grid points
        for i in np.linspace(0, 1, n):
            for j in np.linspace(0, 1, n):
```

```
                points.append(Point2D(i, j))

        # Add random points if requested
        if include_random:
            num_random = n * n // 4  # Add 25% more random points
            random_points = [Point2D(random.random(), random.random
                ())
                             for _ in range(num_random)]
            points.extend(random_points)

        return points

    @staticmethod
    def verify_delaunay_property(triangulation: Triangulation) ->
        bool:
        """Verify that the triangulation satisfies the Delaunay
            property."""
        for i, tri in enumerate(triangulation.get_triangles()):
            if not tri.is_active():
                continue

            # Get triangle vertices
            p1, p2, p3 = tri.get_points()

            # Check against all points
            for j, other_tri in enumerate(triangulation.
                get_triangles()):
                if not other_tri.is_active() or i == j:
                    continue

                # Check if any point from other triangles lies
                    inside this triangle's circumcircle
                for point in other_tri.get_points():
                    if GeometryUtils.point_in_circle(p1, p2, p3,
                        point, False):
                        return False
        return True

    @staticmethod
    def analyze_dag_structure(root: DagNode) -> dict:
        """Analyze the DAG structure and return statistics."""
        depths = []
        nodes = []
        queue = [(root, 0)]
        visited = set()
        max_depth = 0

        while queue:
            node, depth = queue.pop(0)
            if node in visited:
                continue

            visited.add(node)
            nodes.append(node)
            depths.append(depth)
            max_depth = max(max_depth, depth)

```

```
            for child in node.get_children():
                queue.append((child, depth + 1))

        return {
            'max_depth': max_depth,
            'avg_depth': sum(depths) / len(depths) if depths else 0,
            'total_nodes': len(nodes),
            'leaf_nodes': sum(1 for n in nodes if not n.get_children()),
            'branching_factor': len(nodes) / (len(nodes) - 1) if len(nodes) > 1 else 0
        }

    @staticmethod
    def plot_triangulation(triangulation: Triangulation, points: List[Point2D],
                           title: str = "Delaunay Triangulation") -> None:
        """Visualize the triangulation."""
        plt.figure(figsize=(12, 12))

        # Plot points
        xs = [p.x for p in points]
        ys = [p.y for p in points]
        plt.scatter(xs, ys, c='red', s=50, zorder=3, label='Input Points')

        # Plot triangles
        for tri in triangulation.get_triangles():
            if tri.is_active():
                vertices = tri.get_points()
                xs = [v.x for v in vertices + [vertices[0]]]
                ys = [v.y for v in vertices + [vertices[0]]]
                plt.plot(xs, ys, 'b-', alpha=0.5, zorder=1)

        plt.title(title)
        plt.xlabel('X')
        plt.ylabel('Y')
        plt.legend()
        plt.grid(True, alpha=0.3)
        plt.axis('equal')
        plt.show()

def run_comprehensive_test():
    """Run a comprehensive test of the Delaunay triangulation implementation."""
    print("Starting Delaunay Triangulation Tests...")

    # Test different grid sizes
    grid_sizes = [5, 10, 15, 20]
    results = []

    for n in grid_sizes:
        print(f"\nTesting {n}x{n} grid...")

        # Generate test points
```

```
448         points = DelaunayTest.generate_test_points(n)
449         print(f"Generated {len(points)} points")
450 
451         # Create initial triangulation
452         bounding_tri = DelaunayTest.create_bounding_triangle(points
                )
453         root_node = DagNode(0)
454         triangulation = Triangulation(bounding_tri, root_node)
455 
456         # Run triangulation
457         DelaunayTriangulation.get_triangulation(triangulation,
                root_node, points)
458 
459         # Verify properties
460         is_delaunay = DelaunayTest.verify_delaunay_property(
                triangulation)
461         dag_stats = DelaunayTest.analyze_dag_structure(root_node)
462 
463         results.append({
464             'grid_size': n,
465             'num_points': len(points),
466             'is_delaunay': is_delaunay,
467             'dag_stats': dag_stats
468         })
469 
470         # Visualize
471         DelaunayTest.plot_triangulation(triangulation, points,
472                                         f"Delaunay Triangulation ({
                                            n}x{n} grid)")
473 
474         # Print statistics
475         print(f"Results for {n}x{n} grid:")
476         print(f"- Number of points: {len(points)}")
477         print(f"- Delaunay property satisfied: {is_delaunay}")
478         print(f"- DAG Statistics:")
479         print(f"  - Maximum depth: {dag_stats['max_depth']}")
480         print(f"  - Average depth: {dag_stats['avg_depth']:.2f}")
481         print(f"  - Total nodes: {dag_stats['total_nodes']}")
482         print(f"  - Leaf nodes: {dag_stats['leaf_nodes']}")
483         print(f"  - Average branching factor: {dag_stats['
                branching_factor']:.2f}")
484 
485     # Plot summary statistics
486     plt.figure(figsize=(12, 6))
487 
488     # Plot depths
489     plt.subplot(121)
490     plt.plot([r['grid_size'] for r in results],
491              [r['dag_stats']['max_depth'] for r in results],
492              'ro-', label='Max Depth')
493     plt.plot([r['grid_size'] for r in results],
494              [r['dag_stats']['avg_depth'] for r in results],
495              'bo-', label='Avg Depth')
496     plt.xlabel('Grid Size')
497     plt.ylabel('Depth')
498     plt.title('DAG Depth Analysis')
499     plt.legend()
```

```
    plt.grid(True)

    # Plot nodes
    plt.subplot(122)
    plt.plot([r['grid_size'] for r in results],
             [r['dag_stats']['total_nodes'] for r in results],
             'go-', label='Total Nodes')
    plt.plot([r['grid_size'] for r in results],
             [r['dag_stats']['leaf_nodes'] for r in results],
             'mo-', label='Leaf Nodes')
    plt.xlabel('Grid Size')
    plt.ylabel('Number of Nodes')
    plt.title('DAG Size Analysis')
    plt.legend()
    plt.grid(True)

    plt.tight_layout()
    plt.show()

if __name__ == "__main__":
    # Set random seed for reproducibility
    random.seed(20)
    np.random.seed(20)

    # Run the comprehensive test
    run_comprehensive_test()
```