Title:	Maximum st-Flow in Planar Graphs
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# Maximum st-Flow in Planar Graphs

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### Years aud Authors of Summarized Original Work

2010; Erickson 2009; Borradaile, Klein 2006; Borradaile, Klein

# **Keywords**

Planar graphs; Maximum Flow

# **Problem Definition**

Given a directed, planar graph G = (V, E) with arc capacities  $c : E \to \Re^+$ , a source vertex s and a sink vertex t, the goal is to find a flow assignment  $f_e$  for each arc  $e \in E$  such that:

$$\max \sum_{su:su \in E} f_{su}$$
s.t. 
$$\sum_{uv:uv \in E} f_{uv} - \sum_{vw:uv \in E} f_{vw} = 0 \qquad \forall v \in V \setminus \{s, t\}$$
(1)

$$0 \le f_e \le c_e \qquad \forall e \in E \tag{2}$$

### **Key Results**

In the paper proposing the maximum flow problem in general graphs, Ford and Fulkerson [5] gave a generic method for computing a maximum flow: the augmenting-path algorithm. The algorithm is iterative: find a path P from the source to the sink such that capacity contraint (2) is loose for each arc on P (*residual*); increase the flow on each arc in P by a constant chosen so that at least one of the capacity constraints become tight; update the capacities of each arc, making note that the reverse of these arcs now have *residual capacity*; repeat until there is no path from the source to the sink along which the flow can be augmented. By augmenting the flow along a path, the balance constraints (1) are always satisfied.

#### st-planar graphs

Ford and Fulkerson further showed that, in the case of planar graphs when the source and the sink are on a common face (st-planar graphs), by selecting the augmenting paths to be as far to the left as possible in each iteration (viewing s on the bottom and t on the top), each arc is saturated at most once, resulting in at most |E| iterations [5]. In 1979, Itai and Shiloach showed that each iteration of this algorithm could be implemented in  $O(\log n)$  time using a priority queue and gave a simple example showing that any implementation of this algorithm is capable of sorting n numbers [11]. In 1991, Hassin demonstrated that such a maximum st-flow could be derived from shortest-path distances in the planar dual  $G^*$  of G where capacities in G are interpreted as lengths in  $G^*$  [7]. Faster algorithms for computing shortest paths in planar graphs culminated in a linear-time algorithm for this case of maximum st-flow in planar graphs with s and t on a common face [9].

#### Undirected planar graphs

For undirected planar graphs, Reif gave an algorithm for computing the maximum st-flow where s and t need not be on a common face, by way of several shortest path computations in the dual [19]. The algorithm finds a shortest path P in  $G^*$  from a vertex adjacent to the face corresponding to s to a vertex adjacent to the face corresponding to s to a vertex adjacent to the face corresponding to s to a vertex adjacent to the face corresponding to t. Reif proves that C only crosses P once; by finding the minimum separating cycle  $C_v$  through each vertex v of P, we will surely find C: C is the minimum of the cycles  $C_v$ . These cycles can be found in time  $\log n$  times the time for one shortest path computation via divide and conquer over the length of P. Hassin and Johnson show that the corresponding maximum flow can be computed within this framework by computing shortest path distances between the nested cycles  $C_v$  [8]. The shortest path algorithms of Henzinger et al. [9] or Klein [15] can be used to re-implement these algorithms in  $O(n \log n)$  time. Italiano et al.[12] further improved this running time to  $O(n \log log n)$  by using an r-division to break the graph into sufficiently small pieces through which shortest paths can be efficiently computed.

If the capacities are all unit, the maximum st-flow can be computed in linear time [1].

#### Directed planar graphs

Maximum st-flow in directed graphs is more general since the problem of maximum stflow in an undirected graph can be converted to a directed problem by introducing two oppositely oriented arcs of equal capacity for each edge. Johnson and Venkatesan gave a divide-and-conquer algorithm that finds a flow of input value v in  $O(n^{1.5} \log n)$  time [13]. The algorithm divides the graph using balanced separators, finding a flow in each side of value v. However, the flow on the  $O(\sqrt{n})$ -boundary edges of each subproblem might not be feasible. Each boundary edge is made feasible via an st-planar flow computation. Miller and Naor showed that finding a directed st-flow of value v could be reduced to computing shortest-path distances in a graph with positive and negatives lengths [17]. Here, v units of flow are routed (perhaps violating the capacity constraints) along any *s*-to-*t* path *P*. For those arcs whose capacity are violated, we must route the excess flow through the rest of the graph. This is a feasible circulation problem and can be solved using shortest-path distances in the dual graph, where lengths may be negative (representing the negative or violated capacities). Using an  $O(n \operatorname{poly} \log n)$ time algorithm for computing shortest paths in a planar graph with negative edge lengths [4; 16; 18] gives an  $O(n \operatorname{poly} \log n \log C)$ -time algorithm where *C* is the sum of the capacities.

If the capacities are all unit, the maximum st-flow can be computed in linear time [21].

#### Leftmost-path algorithm

Borradaile and Klein gave an augmenting-path,  $O(n \log n)$ -time algorithm for the maximum st-flow problem in directed planar graphs. The algorithm is a generalization of the algorithm for the st-planar case, augmenting flow repeatedly along the leftmost path from s to t. However, with s and t not on a common face, what leftmost is not clear. With the graph embedded such that t is on the external face and the clockwise cycles saturated, a leftmost path is well-defined and can be found with a left-first, depth-first search into t. Clockwise cycles can be initially saturated with a circulation defined by potentials on the faces given by shortest-path distances in the dual graph [14] and clockwise cycles remain saturated under leftmost augmentations. Borradaile and Klein, and Erickson improved the analysis [3] showed that under these conditions an arc and its reverse can be saturated at most once, resulting in at most 2n augmentations. Augmentations can be performed in  $O(\log n)$  time using a dynamic-tree data structure, resulting in an  $O(n \log n)$  running time.

# Applications

Maximum *st*-flow in directed planar graphs has applications to computer vision problems. Schmidt et al. [20] use it as a black box for image segmentation and Greig et al. [6] provide an example for smoothing noisy images.

# **Open Problems**

Currently, maximum *st*-flow in undirected planar graphs can be computed more quickly than in directed. Can this gap be closed?

# **Experimental Results**

Schmidt et al. [20] have implemented this algorithm and compared its performance on an image segmentation problem.

# URLs to Code and Data Sets

Hoch and Wang have provided an open-source implementation of the algorithm [10]. Eisenstat has an implementation of the linear-time algorithm for unit-capacity graphs. [2].

### **Cross-References**

Multiple source, multiple sink maximum flow in directed planar graphs Maximum flow

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