## Flow networks COMS20010 (Algorithms II)

John Lapinskas, University of Bristol

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- Power networks;

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They're also useful in a wide variety of other settings, including:

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- Airline scheduling;
- Image segmentation;
- Proving graph theory results;
- Survey design;
- Professional baseball. (See KT 7.12!)

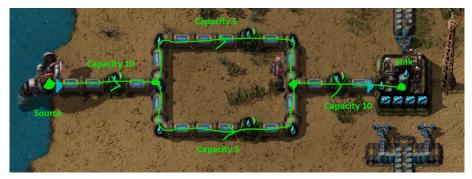
For now, let's just consider a toy problem. One pump supplies water for one factory, passing through a network of pipes of different capacities.



The problem: How much water can get to the factory?

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For brevity, we write  $f^-(v) = \sum_{u \in N^-(v)} f(u, v)$  for the total flow into v, and  $f^+(v) = \sum_{w \in N^+(v)} f(v, w)$  for the total flow out of v.

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The **value** of f, denoted v(f), is  $f^+(s)$ .

**The problem:** Find a maximum flow: a flow f maximising v(f).

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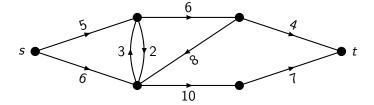
Because we get the same answer either way! Let's make that formal.

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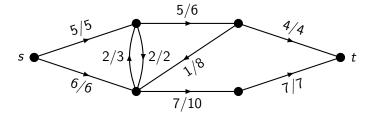


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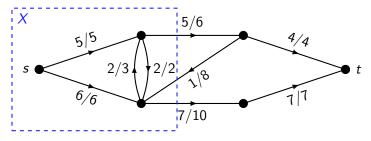


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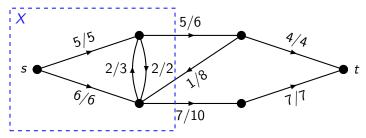


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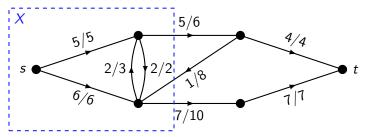
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For example, here  $f^{+}(X) = 5 + 7 = 12$  and  $f^{-}(X) = 1$ .

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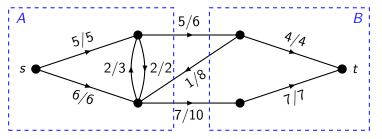
For all  $e \subseteq X$ , f(e) appears once on each side; after cancelling those terms we're left with  $f^+(X) = f^-(X)$ .

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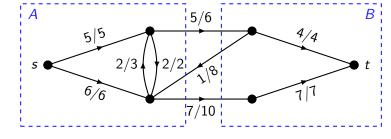
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A **cut** is any pair of disjoint sets  $A, B \subseteq V$  with  $A \cup B = V$ ,  $s \in A$  and  $t \in B$ . (So A and B partition V, the source is in A and the sink is in B.)



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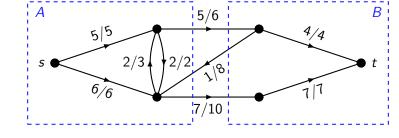
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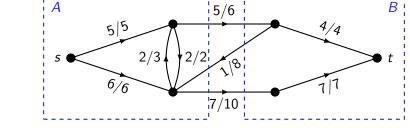


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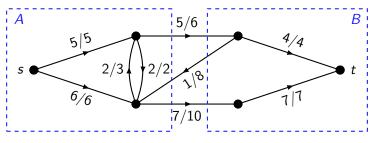
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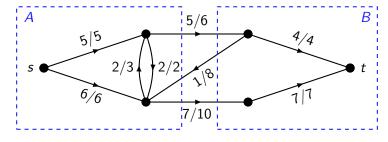
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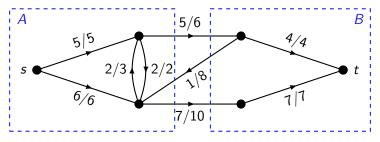
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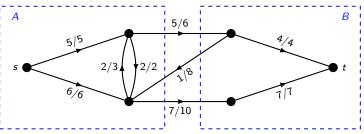
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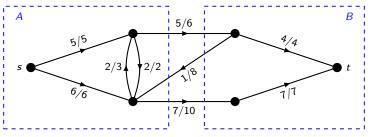


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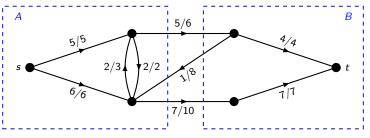
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Lemma 2 implies we could have defined v(f) via **any** cut in the network. In particular,  $f^+(s) = f^-(t)$ .