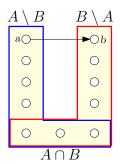
# A simple PTAS for Weighted Matroid Matching on Strongly Base Orderable Matroids

José A. Soto

Department of Mathematics M.I.T.

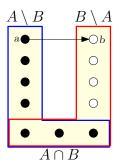
# $\emptyset \neq \mathcal{B} \subseteq 2^{\mathcal{V}}$ is the basis system of a matroid if

- Every  $B \in \mathcal{B}$  has the same size.
- basis exchange property: For all  $A, B \in \mathcal{B}$  distinct there are  $a \in A \setminus B$ ,  $b \in B \setminus A$  s.t.  $A a + b \in \mathcal{B}$ .



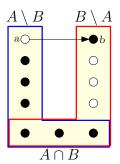
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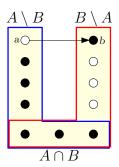
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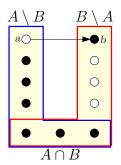


## Independent sets $\mathcal{I}$ .

Independent Sets = Basis subset.

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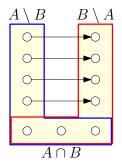
## Examples of matroid bases

- (Free) Only V.
- (Uniform) Sets of size k.
- (Graphic) Spanning forests.
- (Linear) Vector space bases.



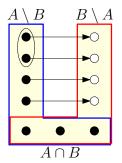
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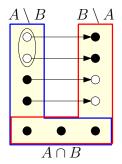
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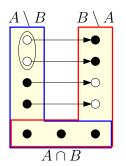
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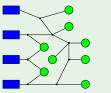
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## Examples of SBO matroid bases

- (Uniform) Sets of size k.
- (Gammoid)



Maximum sets of clients connected to servers by edge-disjoint paths.

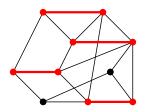
# Weighted Matroid Matching Problem

#### **Problem**

- Weighted graph G = (V, E),  $w: E \to \mathbb{R}^+$ .
- Matroid  $\mathcal{M} = (V, \mathcal{I})$ .

A matching  $M \subseteq E$  is **feasible** for  $\mathcal{M}$  if V(M) is independent.

Goal: Find a maximum weight feasible matching.



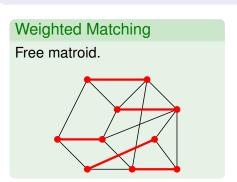
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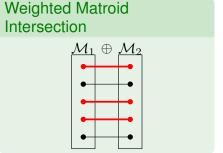
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# Complexity of WMM

- Not in oracle coNP even for unweighted case.
- NP-hard even for unweighted case.
- Special subproblems in P:
   Weighted matching / Weighted Matroid Intersection.
- (Lovász 1981) Unweighted case in P for linear matroids.
- (Tong et al. 1982) Weighted case in **P** for gammoids.
- (Camerini et al. 1992, Narayanan et al. 1994)
   Pseudopolynomial for weighted case in linear matroids.

## Unweighted

• **Greedy** gives 2-approximation.

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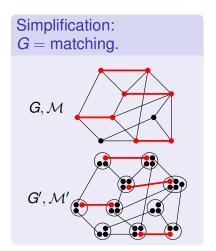
- Greedy gives 2-approximation.
- (S. 2011) PTAS for SBO-matroids.

#### Hardness

Still outside oracle coNP and NP-hard.

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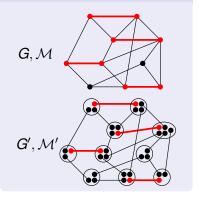
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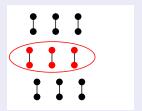
Still outside oracle coNP and NP-hard.

# Simplification: G = matching.



# Weighted Parity on SBO-matroids

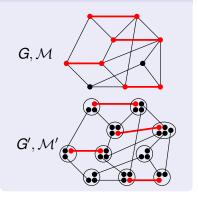
Find maximum weight set of pairs *feasible* for a SBO-matroid  $\mathcal{M}$ .



#### Hardness

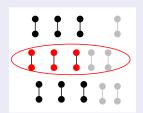
Still outside oracle coNP and NP-hard.

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## Weighted Parity on SBO-matroids

Find maximum weight *paired basis* of a SBO-matroid  $\mathcal{M}$ . (with dummy pairs)



### Local moves

## t-swap: For a current paired basis A

Swap at most t pairs to obtain paired basis B.

Gain: w(B) - w(A). High gain:  $w(B) - w(A) \ge w(A)/n^2$ .

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## Algorithm: For constant $1 \le t \le n$ ,

- Start with greedy solution.
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At most  $O(\log_{(1+1/n^2)} 1/2) = O(n^2)$  moves suffice.

Can find an *t*-local optimum in polynomial time  $(O(n^{2t+2}))$ 

#### **Theorem**

If paired basis A is a t-local optimum and B = OPT then

$$w(B) \leq \left(1 + \frac{2}{t-1}\right)w(A).$$

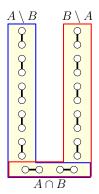
**PTAS**: To get  $(1 + \varepsilon)$ -approx set  $t = 1 + 2/\varepsilon$ . Running time  $n^{O(1/\varepsilon)}$ .

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#### **Auxiliar construction**



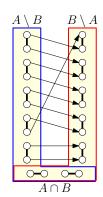
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 Matroid with dummy pairs is still SBO...



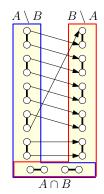
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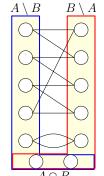
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- H: Union of cycles.







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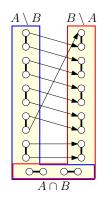
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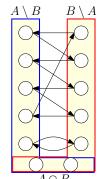
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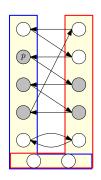






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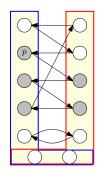
 $\mathbf{H_p}$ : Reachable from p using  $\leq 2(t-1)$  edges.

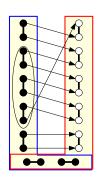


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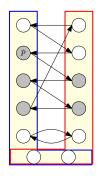


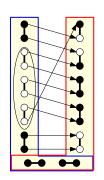


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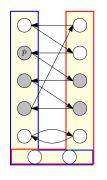


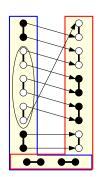


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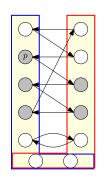


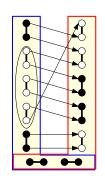


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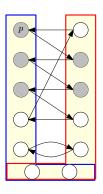
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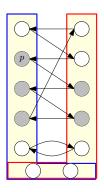


## Since we swap at most t pairs

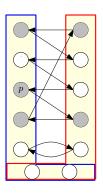
$$w(A)/n^2 > \text{Gain}(\mathbf{swap}(\mathbf{p})) = w(H_p \cap B) - w(H_p \cap A).$$



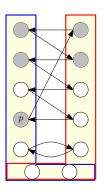
$$\sum_{p \in A_{\mathsf{long}}} \frac{w(A)}{n^2} > \sum_{p \in A_{\mathsf{long}}} w(H_p \cap B) - w(H_p \cap A)$$



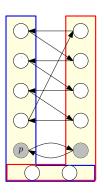
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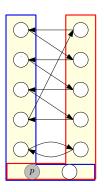


$$\begin{split} \sum_{p \in A_{\mathsf{long}}} \frac{w(A)}{n^2} &> \sum_{p \in A_{\mathsf{long}}} w(H_p \cap B) - w(H_p \cap A) \\ &= (t-1) \, w(B_{\mathsf{long}}) - t \, w(A_{\mathsf{long}}). \end{split}$$



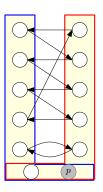
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$$\sum_{\rho \in A_{\text{rest}}} \frac{w(A)}{n^2} > \sum_{\rho \in A_{\text{rest}}} w(H_{\rho} \cap B) - w(H_{\rho} \cap A)$$



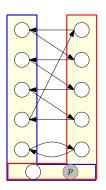
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ight)\ &+t\left(w(B_{\mathsf{rest}})-w(A_{\mathsf{rest}})
ight)\ &<rac{w(A)}{n^2}\left(|A_{\mathsf{long}}|+t|A_{\mathsf{rest}}|
ight)\leq w(A). \quad \Box \end{aligned}$$

# Summary

#### **Conclusions**

First PTAS for Weighted Matroid Matching on Strongly Orderable Matroids.

### **Open Problems**

- Can we get a PTAS for general matroids?
- Can we get a FPTAS for this class?