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{2,4}, {2,5}, {3,4}, {3,5}, {4,5},
{1,2,3}, {1,2,4}, {1,2,5}, {1,3,4}, {1,3,5},
{1,4,5}, {2,3,4}, {2,3,5}, {2,4,5}, {3,4,5},
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{1,4,5}, {2,3,4}, {2,3,5}, {2,4,5}, {3,4,5},
{1,2,3,4}, {1,2,3,5}, {1,2,4,5}, {1,3,4,5}, {2,3,4,5},
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- 1. For all  $I_1 \in I$ , if  $I_2 \subset I_1$  then  $I_2 \in I$ .
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{1,2,3}, {1,2,4}, {1,2,5}, {1,3,4}, {1,3,5},
{1,4,5}, {2,3,4}, {2,3,5}, {2,4,5}, {3,4,5},
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{2,4}, {2,5}, {3,4}, {3,5}, {4,5}, Max cardinality subset
{1,2,3}, {1,2,4}, {1,2,5}, {1,3,4}, {1,3,5},
{1,4,5}, {2,3,4}, {2,3,5}, {2,4,5}, {3,4,5},
{1,2,3,4}, {1,2,3,5}, {1,2,4,5}, {1,3,4,5}, {2,3,4,5},
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Start with a set of objects, for example:  $E=\{1, 2, 3, 4, 5\}$ Now put weights on elements, subset weight = sum of weights of its elements. {}, {1}[], {2}[5], {3}[6], {4}[12], {5}[8],  $\{1,2\}[], \{1,3\}[], \{1,4\}[], \{1,5\}[], \{2,3\}[11],$  $\{2,4\}[17], \{2,5\}[13], \{3,4\}[18], \{3,5\}[], \{4,5\}[20],$  $\{1,2,3\}[], \{1,2,4\}[], \{1,2,5\}[], \{1,3,4\}[], \{1,3,5\}[],$  $\{1,4,5\}[], \{2,3,4\}[23], \{2,3,5\}[], \{2,4,5\}[25], \{3,4,5\}[],$  $\{1,2,3,4\}[], \{1,2,3,5\}[], \{1,2,4,5\}[], \{1,3,4,5\}[], \{2,3,4,5\}[]$ {1,2,3,4,5}[]

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Start with a set of objects, for example:  $E=\{1, 2, 3, 4, 5\}$  Consider: Find max card subset of min (max) weight

```
{},
{1}[], {2}[5], {3}[6], {4}[12], {5}[8],
{1,2}[], {1,3}[], {1,4}[], {1,5}[], {2,3}[11],
{2,4}[17], {2,5}[13], {3,4}[18], {3,5}[], {4,5}[20],
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How to solve it?

Given: Matroid (E,I) with weights on elements of E
Find: Maximum Cardinality Independent Set of I with
minimum (maximum) weight

Set  $T=\Phi$ ; Order all elements in E by increasing (decreasing) weight; Repeat the following until E is empty: Let e be the first element of E; Remove e from E (pop it off); If  $T \cup \{e\} \in I$  then Set  $T = T \cup \{e\}$ ; Output T;

```
{},
{1}[], {2}[5], {3}[6], {4}[12], {5}[8],
{1,2}[], {1,3}[], {1,4}[], {1,5}[], {2,3}[11],
{2,4}[17], {2,5}[13], {3,4}[18], {3,5}[], {4,5}[20],
{1,2,3}[], {1,2,4}[], {1,2,5}[], {1,3,4}[], {1,3,5}[],
{1,4,5}[], {2,3,4}[23], {2,3,5}[], {2,4,5}[25], {3,4,5}[],
{1,2,3,4}[], {1,2,3,5}[], {1,2,4,5}[], {1,3,4,5}[], {2,3,4,5}[]
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```

Order: {2}[5], {3}[6], {5}[8], {4}[12]

```
{},
{1}[], {2}[5], {3}[6], {4}[12], {5}[8],
{1,2}[], {1,3}[], {1,4}[], {1,5}[], {2,3}[11],
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{1,4,5}[], {2,3,4}[23], {2,3,5}[], {2,4,5}[25], {3,4,5}[],
{1,2,3,4}[], {1,2,3,5}[], {1,2,4,5}[], {1,3,4,5}[], {2,3,4,5}[]
{1,2,3,4,5}[]
```

Order: {2}[5], {3}[6], {5}[8], {4}[12]

Choose:  $\{2\}[5] :: T = \{2\} \text{ since } \{2\} \text{ is in } I$ 

```
{},
{1}[], {2}[5], {3}[6], {4}[12], {5}[8],
{1,2}[], {1,3}[], {1,4}[], {1,5}[], {2,3}[11],
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{1,2,3,4,5}[]
```

Order: {2}[5], {3}[6], {5}[8], {4}[12]

Choose:  $\{2\}[5] :: T = \{2\} \text{ since } \{2\} \text{ is in } I$ 

Choose:  $\{3\}[6] :: T = \{2,3\} \text{ since } \{2,3\} \text{ is in } I$ 

```
{},
{1}[], {2}[5], {3}[6], {4}[12], {5}[8],
\{1,2\}[], \{1,3\}[], \{1,4\}[], \{1,5\}[], \{2,3\}[11],
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\{1,2,3,4\}[], \{1,2,3,5\}[], \{1,2,4,5\}[], \{1,3,4,5\}[], \{2,3,4,5\}[]
{1,2,3,4,5}[]
Order: {2}[5], {3}[6], {5}[8], {4}[12]
```

Choose:  $\{2\}[5] :: T = \{2\} \text{ since } \{2\} \text{ is in } I$ 

Choose:  $\{3\}[6] :: T = \{2,3\} \text{ since } \{2,3\} \text{ is in } I$ 

Choose:  $\{5\}[8] :: T = \{2,3\} \text{ since } \{2,3,5\} \text{ is not in } I$ 

```
{},
\{1\}[], \{2\}[5], \{3\}[6], \{4\}[12], \{5\}[8],
\{1,2\}[], \{1,3\}[], \{1,4\}[], \{1,5\}[], \{2,3\}[11],
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\{1,4,5\}[], \{2,3,4\}[23], \{2,3,5\}[], \{2,4,5\}[25], \{3,4,5\}[],
\{1,2,3,4\}[], \{1,2,3,5\}[], \{1,2,4,5\}[], \{1,3,4,5\}[], \{2,3,4,5\}[]
{1,2,3,4,5}[]
Order: {2}[5], {3}[6], {5}[8], {4}[12]
Choose: \{2\}[5] :: T = \{2\} \text{ since } \{2\} \text{ is in } I
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Choose:  $\{3\}[6] :: T = \{2,3\} \text{ since } \{2,3\} \text{ is in } I$ 

Choose:  $\{5\}[8] :: T = \{2,3\} \text{ since } \{2,3,5\} \text{ is not in } I$ 

Choose:  $\{4\}[12] :: T = \{2,3,4\} \text{ since } \{2,3,4\} \text{ is in } I$ 

But how does one do the test  $T \cup \{e\} \in I$ ????

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Interesting question since the size of the matroid is humongous!!!

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Let's consider some examples:

1. Minimum Cost Network:

Given: a graph (vertices, edges) and costs on the edges Find: a least cost subset of edges s.t. for all pairs of vertices <x,y> there is a path going solely through edges in the subset

Is this a matroid???

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What should the elements of E be?

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Right, edges!!!

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What should the elements of E be? Right, edges!!!

Are the appropriate subsets independent sets?

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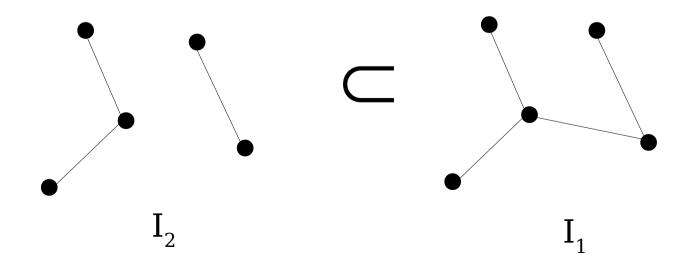
1. Is "For all  $I_1 \in I$ , if  $I_2 \subset I_1$  then  $I_2 \in I$ ." good?

Is this a matroid???

What should the elements of E be? Right, edges!!!

Are the appropriate subsets independent sets? Let's see:

1. Is "For all  $I_1 \in I$ , if  $I_2 \subset I_1$  then  $I_2 \in I$ ." good? Each subset is a forest



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What should the elements of E be? Right, edges!!!

Are the appropriate subsets independent sets? Let's see:

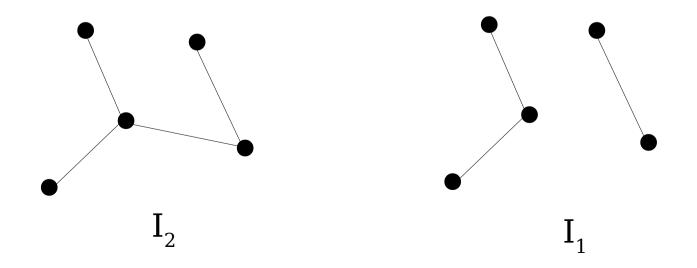
2. Is "for all  $I_1, I_2 \in I$  s.t.  $|I_2| = |I_1| + 1$ ,  $\exists e \in I_2 \text{ s.t. } I_1 \cup \{e\} \in I$ " good?

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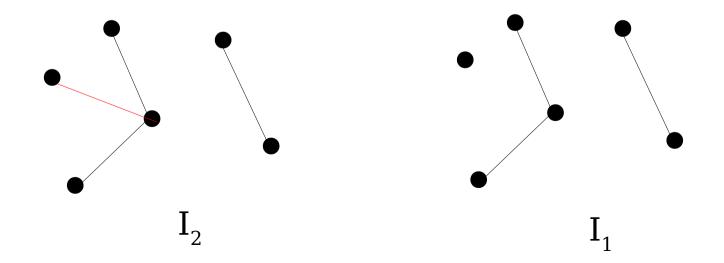
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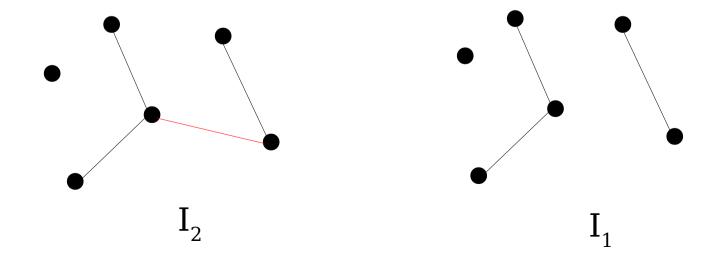
#### Three cases:

1. There is an edge of the larger subset which has at most one vertex that is an endpoint of an edge of the smaller set.



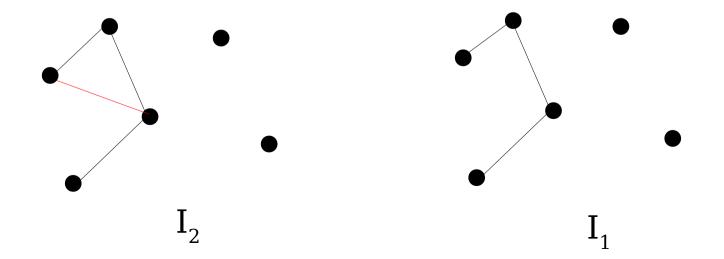
#### Three cases:

2. There is an edge of the larger subset which has one endpoint in one connected component of the smaller subset and the other endpoint in another connected component of the smaller set.



#### Three cases:

3. What's left: all edges of the larger subset are in the same connected component of the smaller subset



So it is a matroid and the greedy method can be applied!!!

But how to check that  $T \cup \{e\} \in I$ ?

So it is a matroid and the greedy method can be applied!!!

But how to check that  $T \cup \{e\} \in I$ ?

Need only check whether all the edges comprise a forest (that is, no cycles) – we discussed already ways to do this

Here is another example:

Integer Deadline Scheduling Problem:

Given: Set of jobs, each with deadline and profit with unit processing time

Find: A schedule of lowest cost such that total profit is maximized (no profit for job completed after its deadline)

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Identify elements of E: Right, the jobs!!

Identify the Independent sets:

This is a toughie!!!

Try this: Any set of jobs that <u>can</u> be scheduled so that all can be completed before their deadlines

Is this a matroid???

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Job Dead Profit			Job	Job Dead Profit		
8	2	501	8	2	501	
3	3	623	3	3	623	
0	4	532	5	4	441	
5	4	441	4	6	278	
1	5	321				
4	6	278				
${\rm I}_1$					${\rm I_2}$	

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2. Is "For all 
$$I_1, I_2 \in I$$
 s.t.  $|I_2| = |I_1| + 1$ ,  $\exists e \in I_2 \text{ s.t. } I_1 \cup \{e\} \in I$ " good?

Job De	Job	_Job Dead Profit		
8 2	501	8	2	501
3 3	623	3	3	623
0 4	532	2	3	321
5 4	441	5	4	441
1 5	321	9	6	112
4 6	278			
	${\rm I}_1$			

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_ Job Dead	Job Dead Profit			
8 2	501	8	2	501
3 3	623	3	3	623
0 4	532	2	3	321
5 4	441	5	4	441
1 5	321			
4 6	278	9	6	112
${ m I}_2$	${\rm I}_1$			

So what weight should we use for elements?

So what weight should we use for elements? Right, the profit

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So how do we determine whether  $T \cup \{e\} \in I$ ?

So what weight should we use for elements? Right, the profit

So how do we determine whether  $T \cup \{e\} \in I$ ? Right, keep 'em ordered by increasing deadline in T and add 'em at the highest "open" deadline slot