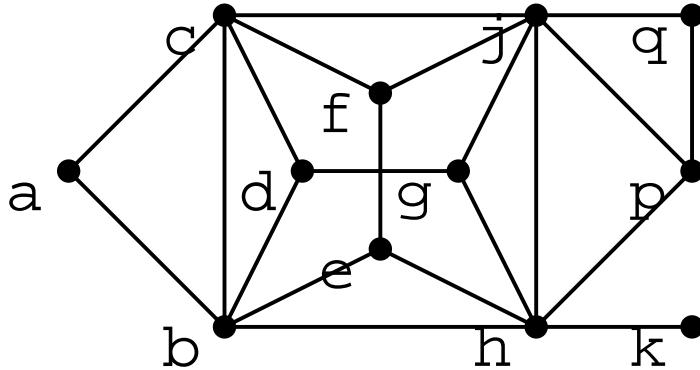


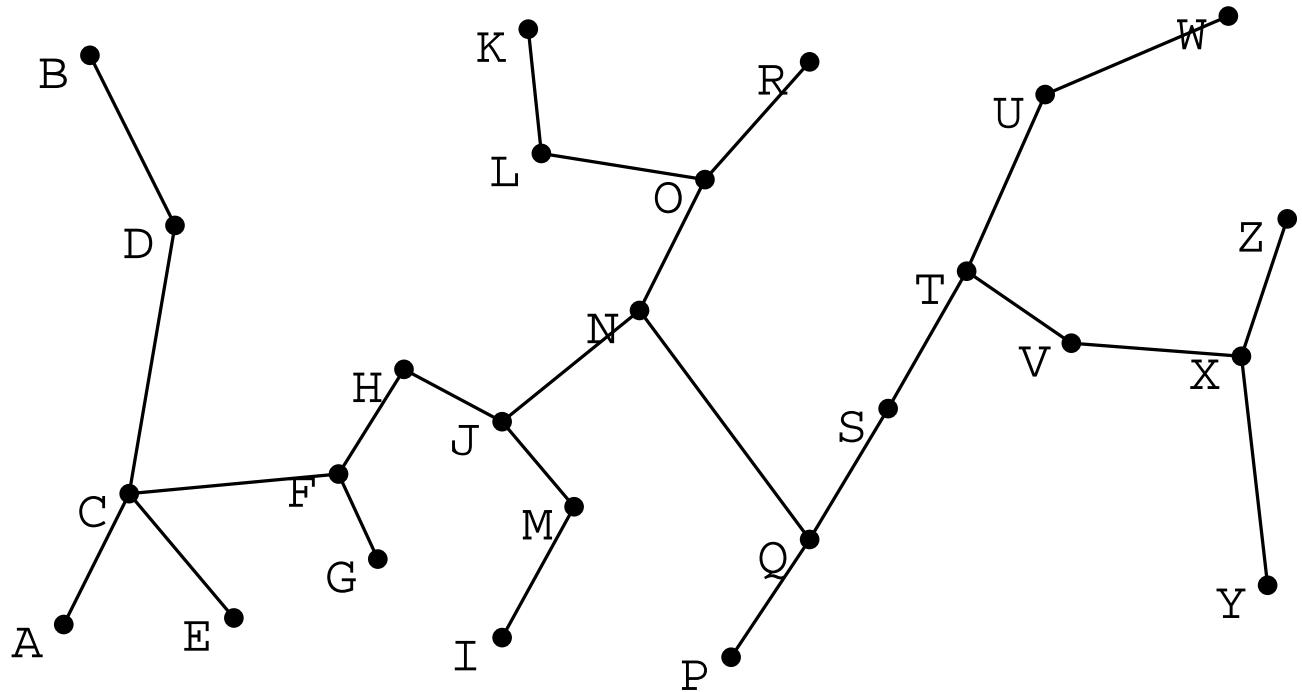
$k$ -independent set ( $k$ -IS)

- \* instance graph G
- query independent set size  $k$ ?
- \* also called max IS problem (why?)
- \* NP-complete (from  $k$ -clique)



how to find max independent set?

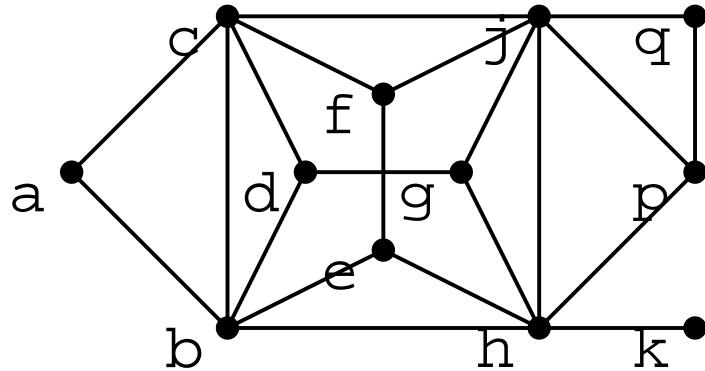
- \* NP-complete :(
- \* restrict instances ?
- \* trees?     k-IS in P :)
  - method 1:     dynamic programming
  - forest has isolated node or leaf (1 nbr)
  - method 2: transform IS-to-LP
    - not necessarily answer-preserving:  
can have non-integer solution :(
    - trees ?
      - \* integer solution guaranteed :)
      - \* size of LP polynomial in size of graph,
    - perfect graphs ?
      - \* integer solution guaranteed :)
      - \* size of LP can be non-poly in size of graph



find max IS?

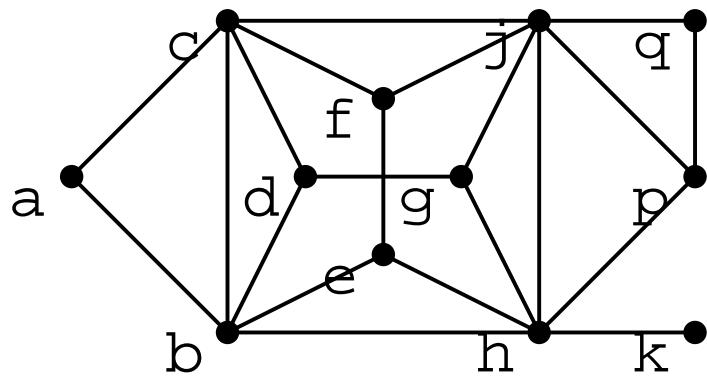
- \* dynamic programming ?
  - \* leaf: neighborhood has size 1
  - \* lemma: for each leaf  $x$ ,
- $$\{x\} \text{ union } \maxIS(T - x - \text{nbr}(x))$$

$\maxIS(T)$



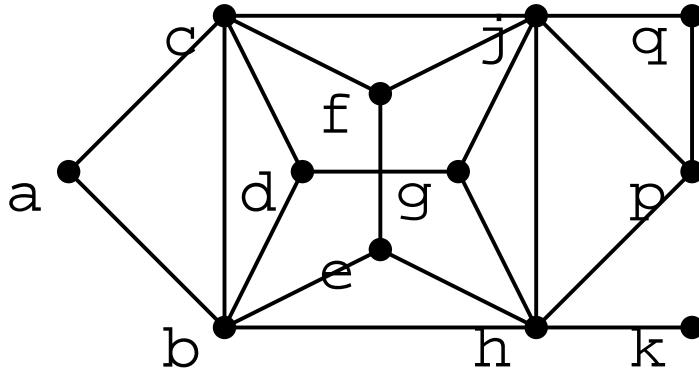
find max IS?

- \* dynamic programming ?
  - \* simplicial node: neighborhood is clique
  - \* lemma: for each simplicial node  $y$ ,
- $$\{y\} \cup \text{maxIS}(G - y - \text{nbr}(y))$$
- is  $\text{maxIS}(G)$



nodes x\_1 .. x\_12      max'l cliques y\_1 .. y\_10  
 abc bcd beh cfj dg ef ghj hk hjp jpq  
 max [1 1 .. 1] X s.t. AX <= [1 1 .. 1]^t  
 a b c d e f g h j k p q

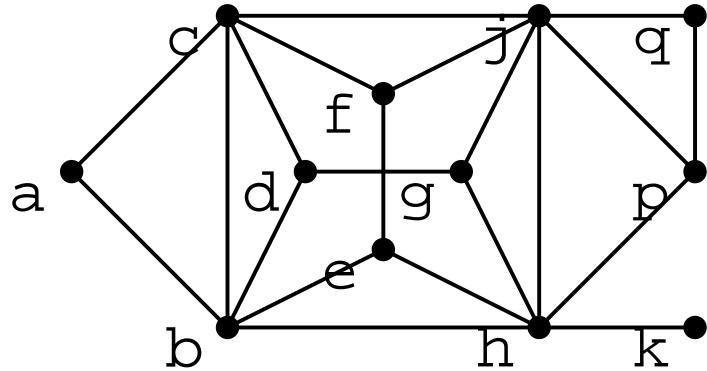
A	1	1	1											
		1	1	1										
		1		1	1									
			1		1	1								
				1		1								
					1	1								
						1	1	1						
							1	1	1					
								1	1	1				
									1	1	1			



```

P = MixedIntegerLinearProgram()
v = P.new_variable(real=True, nonnegative=False)
a,b,c,d,e,f,g,h,j,k,p,q,z=v['a'],v['b'],v['c'],v['d'],v['e'],v['f'],v['g'],v['h'],v['j'],v['k'],v['p'],v['q'],z
P.set_objective(z)
P.add_constraint(z <= a+b+c+d+e+f+g+h+j+k+p+q)
P.add_constraint(a >= 0)
P.add_constraint(b >= 0)
...
P.add_constraint(q >= 0)
P.add_constraint(a+b+c <= 1)
P.add_constraint(b+c+d <= 1)
P.add_constraint(b+e+h <= 1)
P.add_constraint(c+f+j <= 1)
P.add_constraint(d+g <= 1)
P.add_constraint(e+f <= 1)
P.add_constraint(g+h+j <= 1)
P.add_constraint(h+k <= 1)
P.add_constraint(h+j+p <= 1)
P.add_constraint(j+p+q <= 1)
P.solve()
P.get_values(z,a,b,c,d,e,f,g,h,j,k,p,q)

```



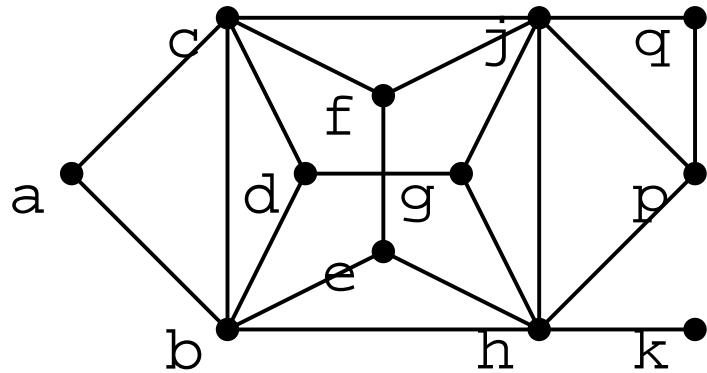
evaluate program at <https://sagecell.sagemath.org/>  
 solution

```
[5.0, 1.0,-0.0,-0.0, 1.0, 1.0,-0.0,
 -0.0,-0.0, 1.0, 1.0,-0.0,-0.0]
```

z	a	b	c	d	e	f
g	h	j	k	p	q	

max IS = {a, d, e, j, k}

can we easily verify this solution? dual !

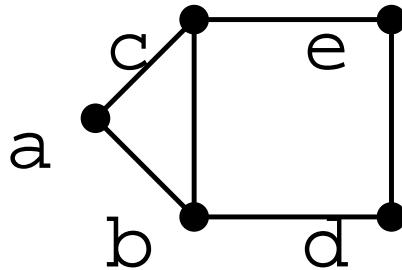


primal:  $\max C^t X \text{ s.t. } AX \leq B$

dual:  $\min B^t Y \text{ s.t. } Y^t A \geq C^t$

dual (max form):

$\max -B^t Y \text{ s.t. } Y^t A \geq C^t$



```

primal      max      [1 1 1 1 1]  X
              st       | 1 1 1 . .|  X  <= | 1 |
                           | . 1 . 1 .|           | 1 |
                           | . . 1 . 1|           | 1 |
                           | . . . 1 1|           | 1 |

```

all-integer solution?

- \*  $\{x_j\}$  (weighted node set) hits each clique  $\leq 1$  time
- \* union $\{x_j\}$  forms an independent set

```

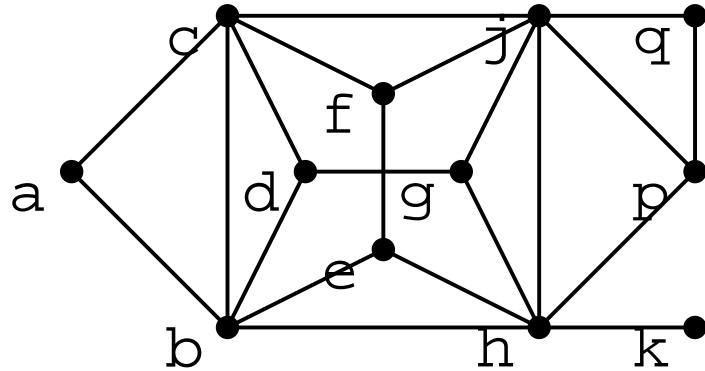
dual      min      [1 1 1 1]  Y
              st  Y^t | 1 1 1 . .|      >= [1 1 1 1 1]
                           | . 1 . 1 .|
                           | . . 1 . 1|
                           | . . . 1 1|

```

all-integer solution?

- \*  $\{y_k\}$  (weighted clq set) hits each node  $\geq 1$  time
- \* union $\{y_k\}$  forms a clique cover

all-integer solution? duality theorem says  
exist same size independent set, clique cover :)



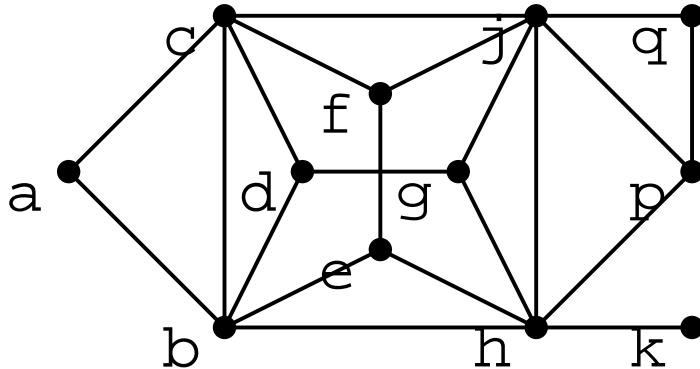
```

D = MixedIntegerLinearProgram()
v = D.new_variable(real=True, nonnegative=False)
a,b,c,d,e,f,g,h,j,k,z=v['a'],v['b'],v['c'],v['d'],v['e'],
D.set_objective(z)
D.add_constraint(z <=a+b+c+d+e+f+g+h+j+k)
D.add_constraint(a >= 0)

..
D.add_constraint(k >= 0)
D.add_constraint(a >= 1)
D.add_constraint(a+b+c >= 1)
D.add_constraint(a+b+d >= 1)
D.add_constraint(b+e >= 1)
D.add_constraint(c+f >= 1)
D.add_constraint(d+f >= 1)
D.add_constraint(e+g >= 1)
D.add_constraint(c+g+h+j >= 1)
D.add_constraint(d+g+j+k >= 1)
D.add_constraint(h >= 1)
D.add_constraint(j+k >= 1)
D.add_constraint(k >= 1)

..

```



evaluate dual program [https://sagecell.sagemath.org/dual\\_solution](https://sagecell.sagemath.org/dual_solution)

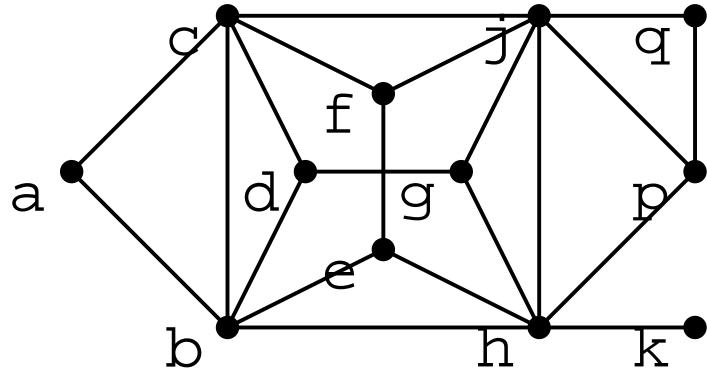
```
[-5.0,1.0,-0.0,-0.0,-0.0,1.0,1.0,-0.0,1.0,-0.0,1.0]
      *          *      *          *
z   a   b   c   d   e   f   g   h   j   k
```

min clique cover = {abc, dg, ef, hk, jpq}

we have found

- \* IS hitting every maximal clique, size 5
- \* set of cliques hitting every node, size 5
  - so every IS set has size  $\leq 5$

clique cover easily verifies IS-is-max :)



for this graph,

how did we know that IS-to-LP solution

would be all-integer?

answer:

graph is in a class called \*perfect\*

perfect graphs have this property:

solution to IS-to-LP always all-int :)