

1. (a) variables: amounts to ship from each producer to each consumer:
 - x_1 = number of shnupells to ship from Mexico to New York
 - x_2 = number of shnupells to ship from Mexico to California
 - x_3 = number of shnupells to ship from Kansas to New York
 - x_4 = number of shnupells to ship from Kansas to California
 - (b) objective function: minimize total shipping cost:

$$\text{minimize } 4x_1 + x_2 + 2x_3 + 3x_4$$
 - (c) constraints:
 - subject to
 - $x_1 + x_2 \leq 8$ (production from Mexico)
 - $x_3 + x_4 \leq 15$ (production from Kansas)
 - $x_1 + x_3 \geq 10$ (consumption in New York)
 - $x_2 + x_4 \geq 13$ (consumption in California)
 - $x_1, x_2, x_3, x_4 \geq 0$ (can't ship negative amounts)
2. - Use variable $x_{\{i,j\}}$ for each pair c_i, s_j close enough.
 - Maximize $\sum_{\{i,j\}} x_{\{i,j\}}$ (total number of clients connected)
subject to:
 - A. $\sum_j x_{\{i,j\}} \leq 1$ for all i
(c_i connected to at most one base station)
 - B. $\sum_i x_{\{i,j\}} \leq L$ for all j
(s_j has at most L clients connected)
 - C. $x_{\{i,j\}} \in \{0,1\}$ for all $x_{\{i,j\}}$
(either c_i connected to s_j or not)
 - Any set of connections yields a feasible solution by setting $x_{\{i,j\}} = 1$ if c_i is connected to s_j ($x_{\{i,j\}} = 0$ otherwise): constraints C automatically satisfied, constraints A satisfied since each client is connected to at most one station, and constraints B satisfied since each station connected to at most L clients. This implies the maximum objective value is at least as large as the maximum number of clients that can be connected.
 - Any feasible solution yields a set of connections by connecting c_i to s_j iff $x_{\{i,j\}} = 1$. By constraints A, each client is connected to at most one station and by constraints B, each station is connected to at most L clients. And since variables $x_{\{i,j\}}$ are either 0 or 1 (by constraints C) and are defined only for pairs c_i, s_j close enough, the range constraint is satisfied. This implies the maximum number of clients that can be connected is at least as large as the maximum objective value.
 - Hence, maximum objective value = maximum number of clients that can be connected, and any optimal solution to the linear program yields an optimal set of connections.
 - BUT, constraints C make this an instance of *Integer Programming* (IP), not general Linear Programming (LP). In general, IP problems cannot be solved in polytime!
 - If we relax constraints C to turn this back into LP,

$C'. 0 \leq x_{\{i,j\}} \leq 1$ for all $x_{\{i,j\}}$
 then we can find an optimal solution in polytime. However, the solution is not guaranteed to be integer-valued! And if values $x_{\{i,j\}}$ take on fractional values in $[0,1]$, it's not clear what that means for assigning clients to base stations anymore... In this case, the problem *does* have an integer solution (from network flows, for example), but in general this does not have to be the case -- you will see examples later.

3. Show that the following UNARY-PRIMES decision problem belongs to P.
 Input: 1^n (i.e., a string of '1's of length n).
 Question: Is n prime?

The following algorithm decides UNARY-PRIMES.

```
On input  $1^n$ :
  For  $k = 2, 3, \dots, n-1$ :
    If  $k$  divides  $n$ , return False
  Return True if no value of  $k$  worked.
```

The algorithm returns True iff n is prime, by definition.
 The division can be carried out by repeated subtraction, which takes time $O(n^2)$ for each value of k , so the entire algorithm runs in time $O(n^3)$.

NOTE: This works because n is the *size* of the input at the same time as the *value* of the input: for any other base, this would not work because the value m would be represented using $n = \log m$ many digits so the size would be proportional to $n = \log m$ and the running time would become exponential (as a function of n).

4. Show that the following TRIANGLE decision problem belongs to P.
 Input: An undirected graph $G = (V, E)$.
 Question: Does G contain a "triangle", i.e., a subset of three vertices with all edges between them present in the graph?

The following algorithm decides TRIANGLE.

```
On input  $G$ :
  For each triplet of vertices  $(u, v, w)$  in  $G$ :
    Return True if  $G$  contains each edge  $(u, v)$ ,  $(v, w)$ ,  $(w, u)$ .
  Return False if no triplet checked out.
```

By definition of TRIANGLE, the algorithm will return True iff G contains a triangle.

Let $n = |V|$ (number of vertices) and $m = |E|$ (number of edges) in G .
 There are $\binom{n}{3} = \Theta(n^3)$ many triplets of vertices in G , and it is possible to enumerate them one by one in time $O(n^3)$. For each triplet, it takes time $O(m)$ to verify the presence of the three edges (depending on how G is encoded, this could be reduced). So the algorithm runs in time $O(m n^3)$.

5. Show that the following CLIQUE decision problem belongs to NP.
 Input: An undirected graph $G = (V, E)$ and a positive integer k .
 Question: Does G contain a k -clique, i.e., a subset of k vertices with all edges between them present in the graph?

$ \begin{array}{c} a \text{---} b \\ \left \begin{array}{cc} \backslash & / \\ c & \\ / & \backslash \end{array} \right \\ d \text{---} e \end{array} $	<p>For example, the graph pictured on the left contains a 3-clique (there are sets of 3 vertices with all edges between them, e.g., $\{a,b,c\}$), but it does not contain a 4-clique (every set of 4 vertices is missing at least one edge, e.g., $\{a,b,c,d\}$ is missing (b,d)).</p>
---	---

Verifier for CLIQUE:

On input $\langle G, k, c \rangle$, where c is a subset of vertices:

Return True if c contains k vertices and G contains edges between all pairs of vertices in c ; return False otherwise.

Verifier runs in polytime (where $n = |V|$, $m = |E|$): checking all pairs of vertices in c takes time $O(k^2 m)$ ($O(k^2)$ pairs in c , time $O(m)$ for each one).

If $\langle G, k \rangle \in \text{CLIQUE}$, then verifier returns True when $c =$ a k -clique of G ; if verifier returns True for some c , then $\langle G, k \rangle \in \text{CLIQUE}$ (c is a k -clique).

CLIQUE (\in P? Unknown (checking all possible subsets not polytime because k not fixed, part of input)).

* Contrast CLIQUE with TRIANGLE: TRIANGLE (\in NP (on input $\langle G, c \rangle$, check c encodes a triangle in G), but TRIANGLE (\in P as well).

What's the difference? Same algorithm to decide CLIQUE takes time $O(n^{k+1})$, except that k is part of the input (instead of being fixed) so this could be as bad as, e.g., $O(n^{n/2})$ -- not polytime.

6. Show that the following SUBSET-SUM decision problem belongs to NP.

Input: A set of positive integers S and a positive integer t .

Question: Is there some subset of S whose sum is exactly t ?

For example, $S = \{4, 22, 10, 8\}$, $t = 14$ belongs to SUBSET-SUM, but $S = \{4, 22, 10, 8\}$, $t = 13$ does not belong to SUBSET-SUM.

Verivier for SUBSET-SUM:

On input $\langle S, t, c \rangle$, where c is a subset of S :

Return True if $\sum_{y \in c} y = t$; return False otherwise.

Clearly runs in polytime (addition of numbers is polytime), and if $\langle S, t \rangle \in \text{SUBSET-SUM}$, then there is some value of c such that verifier returns True ($c =$ subset whose sum equals t); if verifier returns True for some c , then $\langle S, t \rangle \in \text{SUBSET-SUM}$ (c is subset with sum t).