

# Course Notes

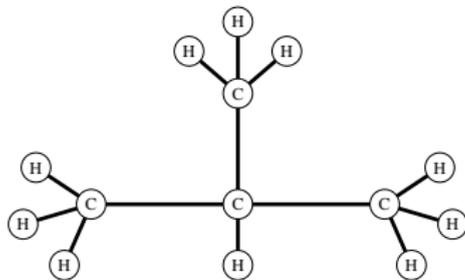
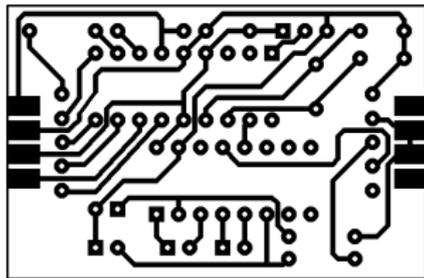
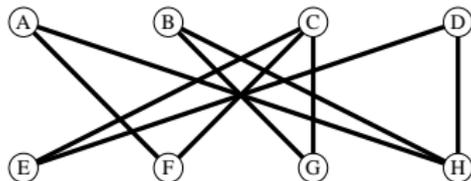
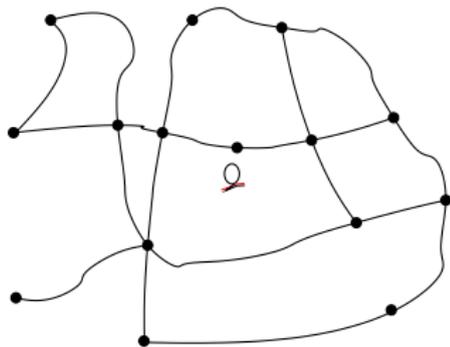
Graph Theory, Spring 2014

Queens College, Math 634

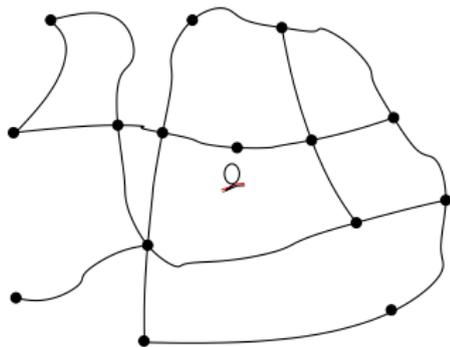
Prof. Christopher Hanusa

<http://qcpages.qc.edu/~chanusa/courses/634sp14/>

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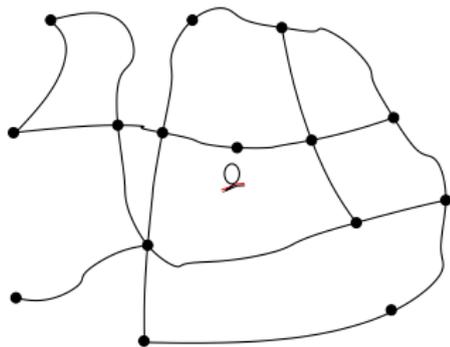


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A “dot” is called a **vertex** (or **node**, **point**, **junction**)

One **vertex** — Two **vertices**.

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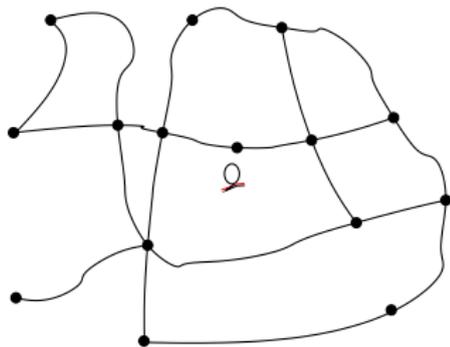
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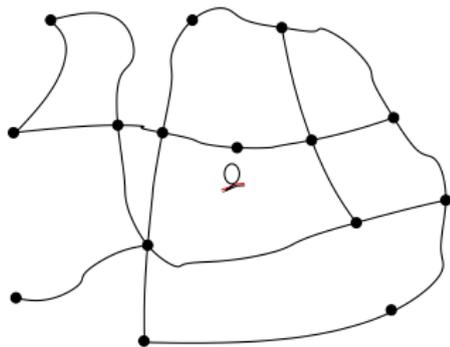
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A road map can be thought of as a graph.

- ▶ Represent each city or intersection as a vertex
- ▶ Roads correspond to edges.

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A road map can be thought of as a graph.

- ▶ Represent each city or intersection as a vertex
- ▶ Roads correspond to edges.

However, a graph is an abstract concept.

- ▶ It doesn't matter whether the edge is straight or curved.
- ▶ All we care about is which vertices are connected.

## Concept: Matchings

Suppose that:

Erika likes cherries and dates.

Frank likes apples and cherries.

Greg likes bananas and cherries.

Helen likes apples, bananas, dates.

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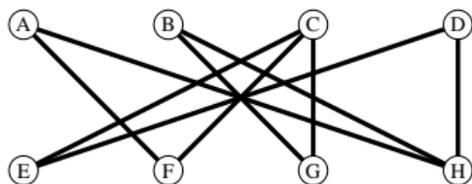
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A graph can illustrate these relationships.

- ▶ Create one vertex for each person and one vertex for each fruit.
- ▶ Create an edge between person vertex  $v$  and fruit vertex  $w$  if person  $v$  likes fruit  $w$ .

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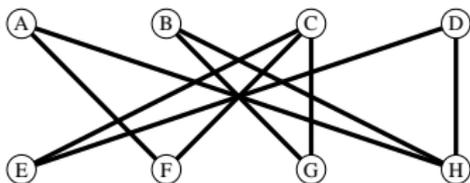
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*Answer.*

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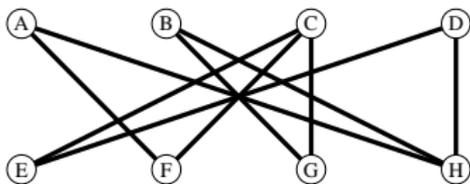
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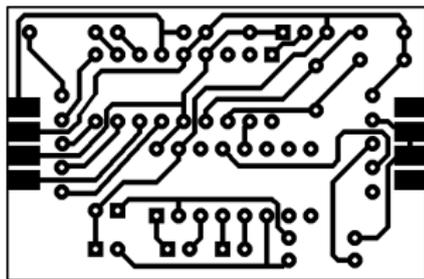
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**Related topics:** assignments, perfect matchings, counting questions.

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Why does a circuit board look like this?

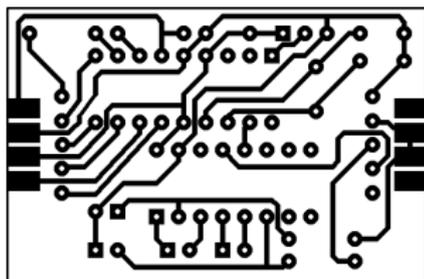


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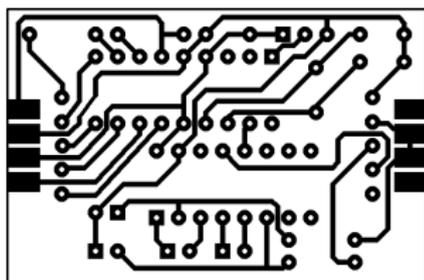
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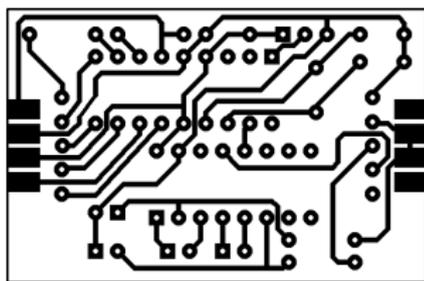
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- ▶ Where to drill the holes?
- ▶ How to drill them as fast as possible?

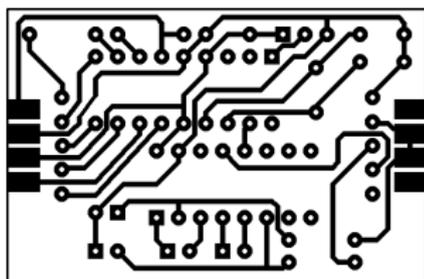
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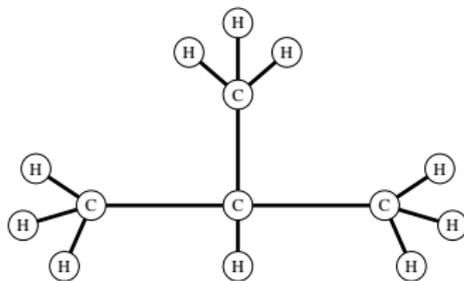
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**Related topics:** Traveling Salesman, computer algorithms, optimization

# Chemis-Tree

Graphs are used in Chemistry to draw molecules. (isobutane)

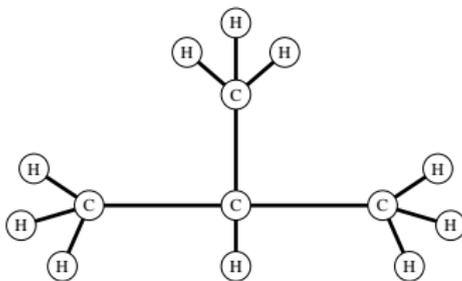


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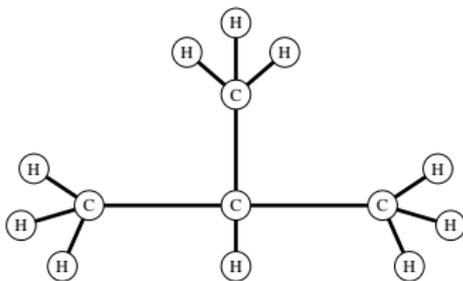
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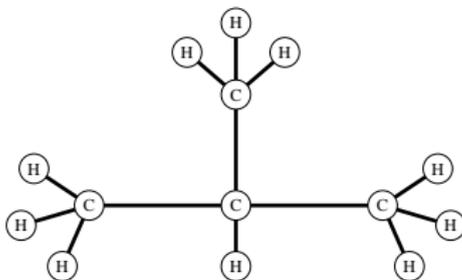
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Connected graphs with no cycles are called **trees**.

Trees are some of the nicest graphs.

We will work to understand some of their properties.



## To do well in this class:

- ▶ **Come to class prepared.**
  - ▶ Print out and read over course notes.
  - ▶ Read sections before class.
- ▶ **Form good study groups.**
  - ▶ Discuss homework and classwork.
  - ▶ Bounce proof ideas around.
  - ▶ You will depend on this group.
- ▶ **Put in the time.**
  - ▶ Three credits = (at least) nine hours / week out of class.
  - ▶ Homework stresses key concepts from class; learning takes time.
- ▶ **Stay in contact.**
  - ▶ If you are confused, ask questions (in class and out).
  - ▶ Don't fall behind in coursework or project.
  - ▶ I need to understand your concerns.

Mini-assignments due daily; homeworks posted the week before.  
Please fill out the notecard: Name, something related to name, picture.

## What is a graph?

*Definition.* A **graph**  $G$  is a pair of sets  $(V, E)$ , where

- ▶  $V$  is the set of *vertices*.
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*Example.* Let  $G = (V, E)$ , where

$$V = \{v_1, v_2, v_3, v_4\},$$

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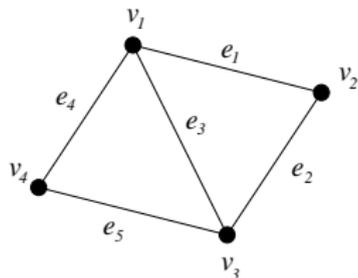
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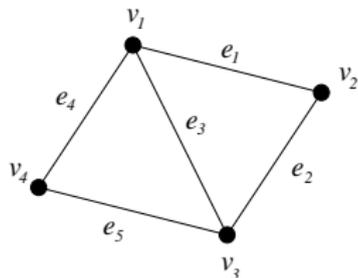
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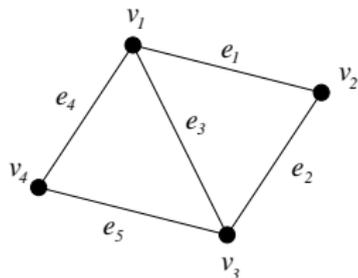
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**Notation:** # vertices =  $|V| = \underline{\quad} = \underline{\quad}$ . # edges =  $|E| = \underline{\quad} = \underline{\quad}$ .

## How to talk about a graph

We say  $v_1$  is **adjacent** to  $v_2$  if there is an edge between  $v_1$  and  $v_2$ .

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When multiple edges are allowed (but not loops): called **multigraphs**.  
When loops (& mult. edge) are allowed: called **pseudographs**.

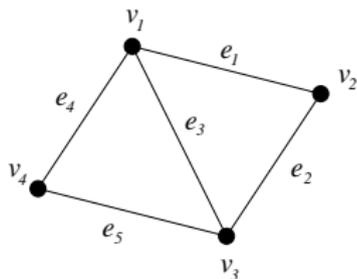
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The **degree** of a vertex  $v$  is the number of edges incident with  $v$ , and denoted  $\deg(v)$ .

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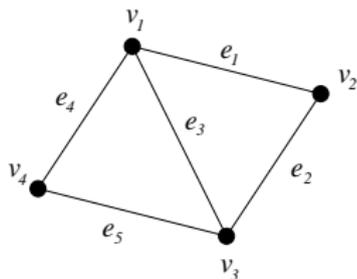
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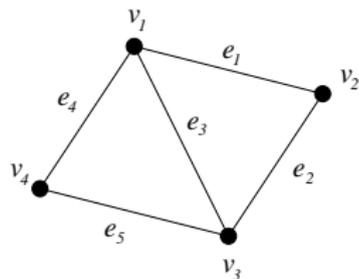
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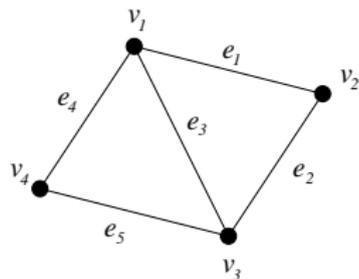
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A.  $\sum_{v \in V} \deg(v) =$

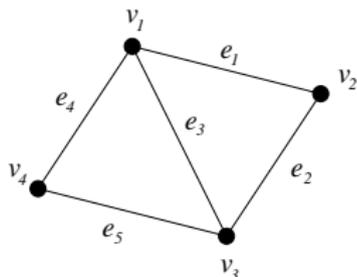
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Q. How many edges in  $G$ ?

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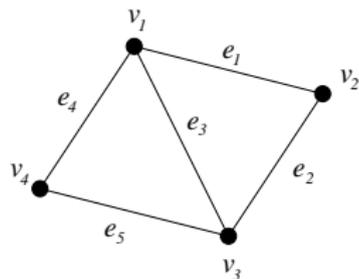
## Degree of a vertex

The **degree** of a vertex  $v$  is the number of edges incident with  $v$ , and denoted  $\deg(v)$ .

In our example,

$$\deg(v_1) = \underline{\quad}, \quad \deg(v_2) = \underline{\quad},$$

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If  $\deg(v) = 0$ , we call  $v$  an **isolated vertex**.

If  $\deg(v) = 1$ , we call  $v$  an **end vertex** or **leaf**.

If  $\deg(v) = k$  for all  $v$ , we call  $G$  a  **$k$ -regular graph**.

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*Corollary:* *The degree sum of a graph is always even.*

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*Answer.*

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**Examples:** 7765333110 and 6644442

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*Notation:* Define the degree sequences to be:

$$\mathcal{S}_1 = (s, t_1, t_2, \dots, t_s, d_1, \dots, d_k).$$

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*Question:* Can this argument work in reverse?

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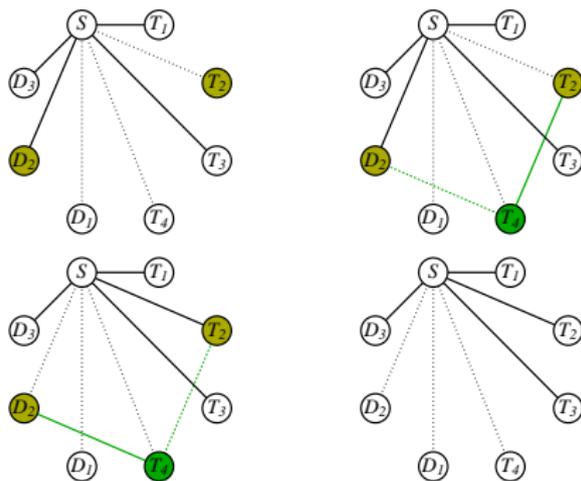
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- ▶ After some number of iterations, the vertex of highest degree  $s$  in  $G_a$  will be adjacent to the next  $s$  highest degree vertices.
- ▶ Peel off vertex  $S$  to reveal a graph with degree sequence  $\mathcal{S}_2$ .

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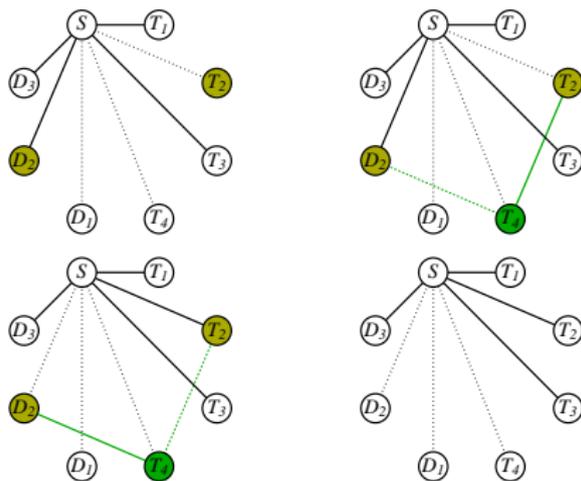


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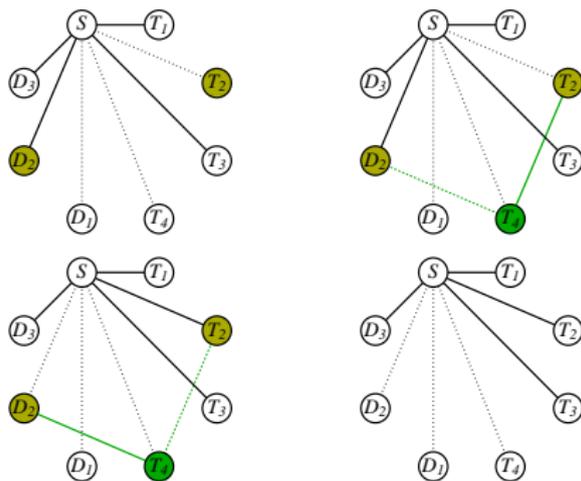
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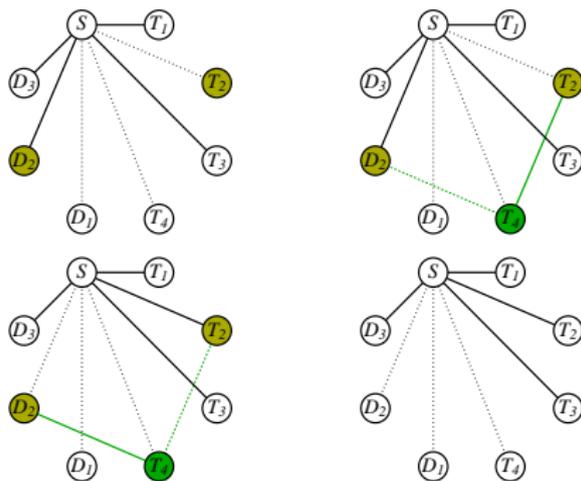
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(d) The degree sequence of the new graph is the same. (Why?) **AND**  $S$  is now adjacent to more  $T$  vertices. (Why?) Repeat as necessary.

