CSCI 5451 Fall 2015 Week 8 Notes

Professor Ellen Gethner

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- ► The problem was reduced to one of checking a finite number of graphs (about 2000) for special properties.



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- The number of configurations to check was reduced to about 500, and of course computers had become much faster in the intervening two decades.
- There is still no known computer-free proof of the Four Color Theorem.

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- When Heawood found and could not repair the flaw in Kempe's four color argument,
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- Here is one such problem.

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What about $\chi(G)$ when G is an M-pire graph?

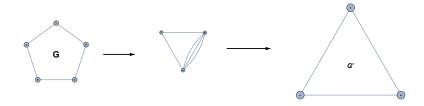
- ▶ **Theorem M.** An M-pire graph G can always be properly vertex-colored with at most 6M colors. That is, if G is an M-pire graph, then $\chi(G) \leq 6m$.
- ▶ **Proof.** Recall that G is a planar graph, and let G* be derived from G by
 - 1. making a single vertex for each of the at most M members of a single M-pire, and
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 - 1. making a single vertex for each of the at most M members of a single M-pire, and
 - 2. maintaining the original adjacencies, but removing multiple edges.
 - 3. There won't be any loops in G^* . Why?

Example of deriving G^* from G

Below G is an example of a 3-pire map; the names of the 3-pires are A, B, and C.



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- ▶ More Notation. Let $n_1^*, n_2^*, \dots, n_{v^*}^*$ be the vertices of G^* .
- ► Then $deg(n_1^*) + deg(n_2^*) + \cdots + deg(n_{v^*}^*) = 2e^*$



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- ▶ In that case, the average vertex degree in graph G^* is

$$\frac{\sum_{i=1}^{v^*} n_i^*}{v^*} = \frac{2e^*}{v^*} \le \frac{2e}{v^*} \le \frac{6v - 12}{v^*} \le \frac{6Mv^*}{v^*} - \frac{12}{v^*}$$
$$= 6M - \frac{12}{v^*}.$$

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- Now proceed inductively in the same manner as the 6-color theorem (last lecture) to produce a proper 6M-coloring of G* and hence of G.
- ▶ Thus if G is an M-pire graph, then $\chi(G) \leq 6M$.
- ▶ We know that the bound is not best possible when M=1 (why?), but it is best possible for all $M \ge 2$ as is shown by the next theorem.

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- http://www.sciencedirect.com/science/article/pii/ S0012365X99002782
- ▶ What exactly *is* Ringel's Earth-Moon question?

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- Disregarding the coloring for the moment, a graph so constructed can be decomposed into at most two planar graphs, each of which uses the same set of vertices.
- ▶ **Definition.** If such an Earth-Moon graph *G* can be decomposed into two, and no fewer, planar graphs, then *G* is said to have thickness two.



Generalizing thickness

▶ **Definition T.** Let G be an undirected graph such that the edges of G can be partitioned into t sets, each of which induces a planar graph, and for which t is smallest possible. Then G is said to have thickness t, denoted by $\theta(G) = t$.

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- ► The notion of the thickness of a graph helps to measure the *near planarity* of a graph, and is a tool used in VLSI design, for example.

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- ... what is $\theta(K_8)$, $\theta(K_9)$?
- ▶ What is $\theta(P)$, where P is the Petersen graph?

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- ► Here is state-of-the-art knowledge:
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- Can anybody reduce the list at all?

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- QED

Sulanke's 9-chromatic thickness-2 graph

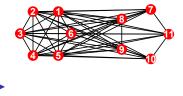


Figure: K_6 joined with C_5

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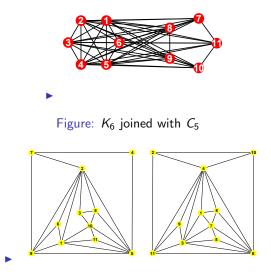


Figure: thickness-2 decomposition

Thickness-2 application to chip testing

► **The Setting.** Test a printed circuit board (PCB) for certain kinds of errors.

Thickness-2 application to chip testing

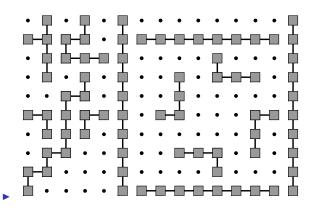
- ► **The Setting.** Test a printed circuit board (PCB) for certain kinds of errors.
- ► This problem was posed by Garey, Johnson, and So of AT&T labs in 1976.

Example of a PCB

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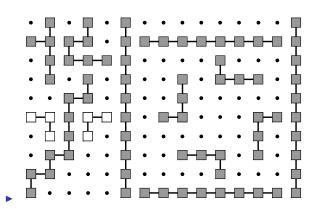


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Question. How can we efficiently check for these types of errors?

▶ **Idea 1.** Suppose our PCB has n nodes (i.e., n connected components). Then check every pair for accidental connections, which will take time $O(n^2)$.

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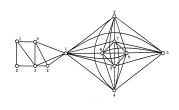


Figure: 8-colored visibility graph of *G*

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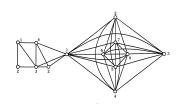
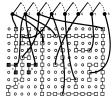
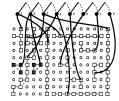


Figure: 8-colored visibility graph of *G*

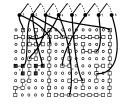
In our example, $\chi(G) = 8$ (why?) and in general we can properly color G with 12 or fewer colors (why?).



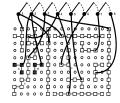
Create a "supernet" with one giant "claw" for each color of G. A claw connects to each node of the PCB of the same color.



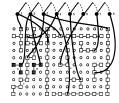
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- ► Engage all possible pairs of Nets 1-8. There are $\frac{8 \times 7}{2} = 28$ possibilities.



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- ▶ **Idea 3.** Use the same supernet.
- ► Connect Net 1. If a circuit is completed, then thee is an error.
- ▶ Otherwise connect Net 1 and Net 2 to form Net $\overline{12}$.

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- ► Connect Net 12 to the PCB; if a circuit is completed, there is an error.

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- ▶ Otherwise connect Net 1 and Net 2 to form Net $\overline{12}$.
- ► Connect Net 12 to the PCB; if a circuit is completed, there is an error.
- ► Keep going until you have made Net 123...12.

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- ► Connect Net 12 to the PCB; if a circuit is completed, there is an error.
- ► Keep going until you have made Net 123...12.
- ▶ Total number of checks: 11. Whew.

See the student webpage for a copy of the journal article that contains the full treatment of the *M*-pire problem, *Coloring Ordinary Maps, Maps of Empires, and Maps of the Moon.*

Next Topic: Graph Algorithms

Single Source Shortest Path Algorithms

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- ► The street-intersections are vertices and the edges are street segments (like blocks).

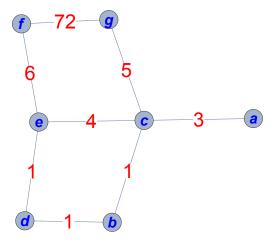
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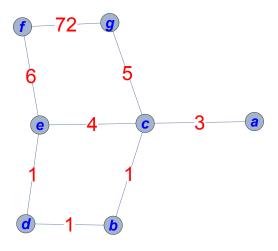
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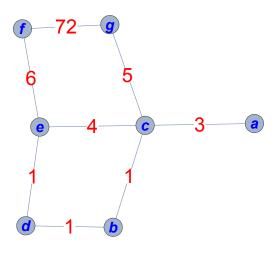


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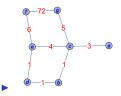


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- ► Total Weight = 12.

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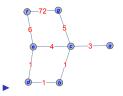
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- ▶ In our example, we have $\omega(ac) = 3$, $\omega(bd) = 1$, $\omega(gf) = 72$, etc.
- ▶ Importantly, if $xy \notin E(G)$ then we define $\omega(xy) = \infty$ so that there is no chance of a non-edge being chosen in a shortest path algorithm.

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- ▶ If there is no path from v_i to v_j define $d(v_i, v_j) = \infty$.

A tool: spanning tree

▶ **Definition.** Let *G* be a simple, connected, undirected graph with *n* vertices. Then a **spanning tree**, *T*, of *G* is any connected acyclic subgraph of *G* with *n* vertices.

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- ► Theorem. Let G be an undirected graph with n vertices. Then T is a spanning tree of G if and only if T is a connected subgraph of G with n − 1 edges.
- ► For a proof of the above theorem, take CSCI 5408 (Applied Graph Theory) in the spring.

Next: A Tree Growing Algorithm