## CS 163 \& CS 265: Graph Algorithms

## Week 6: Cliques and coloring

## Lecture 6c: Coloring, register allocation, Strahler number, and interval graphs

David Eppstein<br>University of California, Irvine

Winter Quarter, 2024

# Register allocation and Strahler number 

## The register allocation problem

A compiler converts...

- Input: Code you wrote, in a high-level language, using however many local variables is convenient to express your ideas
- Intermediate code: Every subexpression like the " $(x+y)$ " in the expression $(x+y) \times z$ becomes a separate local variable
- Machine code: Only a very small number of local variables can be stored in general-purpose machine registers (e.g. eax, ebc, ecx, edx); everything else is "spilled" into memory and more expensive to access


## Special case: optimally ordering subexpressions

We can choose order to evaluate subexpressions of an expression (even when some operations are not commutative):
$(\mathrm{x}+\mathrm{y}) * \mathrm{z}-(\mathrm{x}-\mathrm{y}) * \mathrm{w}:$


Which ordering can be compiled into code with fewest registers?

## Evaluation of orderings

Suppose we have already calculated

- Subexpression A can be evaluated using a registers
- Subexpression $B$ can be evaluated using $b$ registers
and we want to combine them into a single expression with one more operation
- If we calculate A first, and save it in a register while we calculate $B$, we need $\max (a, b+1)$ registers
- If we calculate B first, we need $\max (b, a+1)$ registers
- It never helps to mix the two calculations

We should try to perform trickier computations first so that the simpler parts are the parts that get the +1 penalty

## Bottom-up calculation of optimal ordering

For each node $x$ of the expression tree, let $R(x)$ be the optimal number of registers needed to calculate the subexpression rooted at $x$

- If $x$ is a leaf then $R(x)=1$
- If $x$ has two children $y$ and $z$ with $R(y) \neq R(z)$, then we want to evaluate the subtree with the larger $R$ first, giving $R(x)=\max (R(y), R(z))$.
- If $x$ has two children $y$ and $z$ with $R(y)=R(z)=r$, then it doesn't matter which order we evaluate them; either order gives $R(x)=r+1$.
[Ershov 1958; Flajolet et al. 1979]


## Strahler number

We can repeat the same calculation abstractly on any rooted tree, not just expression trees and not just binary trees:

- At leaf nodes, $R(x)=1$
- At nodes where one child $y$ has larger $R$ than all other children, $R(x)=R(y)$
- At nodes where two or more children have the max value $r, R(x)=r+1$

Called Strahler number or Horton-Strahler number


## Original application of Strahler numbers

Evaluating the complexity of river networks in geography [Horton 1945; Strahler 1952, 1957]


# Graph coloring 

## Graph coloring

Input: Undirected graph
Output: Assignment of colors to vertices so that each edge has different colors at its endpoints, using as few colors as possible


Special case: graphs needing only two colors are called "bipartite"

## The four color theorem

If you can draw it without crossings in the plane, you can color it using at most four colors [Appel and Haken 1977]

But many other graphs require many more than four colors


## Complexity of graph coloring

It's NP-hard and hard to approximate
Testing whether 2 colors is possible is easy (bipartiteness) but testing whether 3 colors is possible is NP-complete, even for graphs that can be drawn without crossings

Trivial approximation algorithm with approximation ratio $n / 3$ : if it's not bipartite, just give every vertex a different color

For every $\varepsilon>0$ it is NP-hard to approximate better than $n^{1-\varepsilon}$
[Zuckerman 2007]

## Greedy coloring heuristic

Since we can't guarantee an approximation ratio, use a method that always finds a coloring but might be far from optimal

Greedy coloring:

- Order the vertices (somehow)
- Number the available colors 1, 2, 3, 4, ...
- For each vertex in the given ordering, give it the lowest-numbered available color (the smallest number that is not already used for a neighbor)


A bad example: remove a matching from a complete bipartite graph and order the vertices by matched pairs

## Greedy coloring time analysis

Assuming the ordering has already been found (somehow)
Main remaining step: Find first unused color at each vertex

```
def first_unused(v):
    used = { color(w) for w in neighbors of v }
    for c in 1, 2, ...
    if c not in used: return c
```

Time: $O$ (degree) per vertex, $O(m)$ total

Same "minimum excluded value" computation also comes up frequently in combinatorial game theory

## Coloring by degeneracy

Suppose $G$ has degeneracy $d$
Use greedy coloring algorithm with the reverse of a degeneracy order (so each vertex has $\leq d$ earlier neighbors, rather than later neighbors)
$\Rightarrow$ uses at most $d+1$ colors

This is why degeneracy is also called coloring number

# Register allocation and graph coloring 

## Register allocation as a graph coloring problem

Vertices: The local variables of the intermediate code
Edges: Two local variables that both need to be stored at the same time (their lifetimes, obtained from use-definition analysis, overlap)

Colors: Available registers

Try to color as much of the graph as possible using \# colors = \# registers, and then spill the remaining variables

## Register assignment for straight-line code

Suppose that we have code that is just expressions and assignments no if-then-else, no loops, no subroutines

Expression trees already been ordered, so we just have a sequence of instructions var ${ }_{i}$ $=\operatorname{var}_{j}$ op $\operatorname{var}_{k}$, one assignment/variable

Lifetime of each variable is an interval from assignment to last use


Graph of conflicting vars (overlapping intervals) is an interval graph

## Greedy coloring for interval graphs

Order vertices left-to-right by left endpoint
Give each vertex first available color (standard greedy coloring)


A: first free color is 1
E : color is 1
B : color is 2 ( A has 1 )
F : color is 1
$C$ : color is $3(A, B$ have 1,2$)$
$D$ : color is 2 (A has 1 )

G: color is 2 ( F has 1 )

Total: 3 colors used

## Greedy is optimal for interval graphs



If the algorithm uses color $k$ for interval $X$, then:

- $X$ already has neighbors colored $1,2, \ldots k-1$
- Because these neighbors are already colored, they have earlier left endpoints, and all overlap $X$ at the left endpoint of $X$
- They also overlap each other at the same point
- We have a clique, a set of vertices all adjacent to each other
- Within the clique, we can only use one color per vertex
- So the whole graph needs at least $k$ colors


## The morals of the story

Graph coloring is hard, and hard to approximate

Applications include register allocation in compilers

Two easy special cases for register allocation: optimally ordering expression trees (Strahler number), and straight-line code (greedy coloring of interval graphs)

## References I

Kenneth Appel and Wolfgang Haken. Solution of the four color map problem. Scientific American, 237(4):108-121, October 1977. doi:10.1038/scientificamerican1077-108.
A. P. Ershov. On programming of arithmetic operations. Communications of the ACM, 1(8):3-6, 1958. doi:10.1145/368892.368907.
P. Flajolet, J. C. Raoult, and J. Vuillemin. The number of registers required for evaluating arithmetic expressions. Theoretical Computer Science, 9(1):99-125, 1979. doi:10.1016/0304-3975(79) 90009-4.
Robert E. Horton. Erosional development of streams and their drainage basins: hydro-physical approach to quantitative morphology. Geological Society of America Bulletin, 56(3):275-370, 1945. doi:10.1130/0016-7606(1945)56[275:EDOSAT] 2.0.CO;2.

## References II

Shannon1. Map of the Newport Bay watershed. CC-BY-SA image, January 112016. URL
https://commons.wikimedia.org/wiki/File:NEWPORT_WATERSHED_MAP.png.
Arthur Newell Strahler. Hypsometric (area-altitude) analysis of erosional topology. Geological Society of America Bulletin, 63(11):1117-1142, 1952. doi:10.1130/0016-7606(1952)63[1117:HAAOET] 2.0.CO;2.
Arthur Newell Strahler. Quantitative analysis of watershed geomorphology. Transactions of the American Geophysical Union, 38(6):913-920, 1957. doi:10.1029/tr038i006p00913.
D. Zuckerman. Linear degree extractors and the inapproximability of Max Clique and Chromatic Number. Theory of Computing, 3:103-128, 2007. doi:10.4086/toc.2007.v003a006.

