# Finding All Cliques of an Undirected Graph

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• How to put as much left-over stuff as possible in a tasty meal before everything will go off?











# Outline

- Introduction to cliques
- The Bron-Kerbosch algorithm
- Applications
- Conclusion

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#### Cliques (according to Bron and Kerbosch 1973)

- complete subgraph of a graph: part of a graph in which all nodes are connected to each other
- cliques: maximal complete subgraphs (not subsumed by any other complete subgraph)



# A graph



#### How many cliques?

# The cliques



#### How can we find them efficiently?

Finding Cliques

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# The Bron-Kerbosch algorithm

- finding all cliques is expensive
- the number of cliques can grow exponentially with every node added
- Bron and Kerbosch (1973):
  - An algorithm to compute all cliques in linear time (relative to the number of cliques)
  - still widely used and referred to as one of the fastest algorithms (cf. Stix 2004)

# Different sets and types of nodes

- the nodes already defined as part of the clique (*compsub*) ( (initially empty)
- the *candidates*, connected with all nodes of *compsub* (C)
- not, the nodes already processed which lead to a valid extensions for compsub and which shouldn't be touched
- a selected candidate s
- nodes which are not considered in the current step

# A clique is found if (and only if)...



 there are no candidates anymore AND

 there are no nodes in not (otherwise, the recent clique is not maximal!)



- let the *not* set consist of one node (the extension leading to the clique seen before)
- three nodes in *compsub* (known part of the clique)
- two candidates left



1. select a candidate



1. select a candidate

#### 2. add it to *compsub*



- 1. select a candidate
- 2. add it to *compsub*
- 3. compute new candidates and ,not set' for the next recursion step (but store the old sets) by removing the nodes not connected to the selected candidate

4. start at 1 with the new sets



5. back from recursion, restore the old sets and add the candidate selected before to *not* 

# Termination conditions



- 1. no candidates left or
- 2. there is an element in *not* which is connected to every candidate left

(if 2 holds, the addition of a candidate cannot lead to a clique which is maximal, because the node in *not* would be missing)

# Optimizing candidate selection

- terminate as early as possible (minimize number of recursion steps)
- aiming at having a node in *not* connected to all candidates
- the trick:
  - nodes in *not* get a counter indicating to how many candidates they are not connected
  - pick the node in not with the fewest disconnections
  - in each step, pick a new candidate disconnected to this node

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# Solving the maximum independent set problem

- maximum independent set of a graph: the largest set of nodes which are all connected to each other
- a ,famous' application of this: compute the trunk capacity of a car
- the question here: how many blocks (of a fixed volume) fit in the trunk?



**Finding Cliques** 

# Solving the maximum independent set problem (cont.)

- nodes represent a brick and its coordinates
- an edge between two nodes means that the two bricks overlap



# Solving the maximum independent set problem (cont.)

- the idea: bricks can be placed in the trunk at certain coordinates at the same time, if the corresponding nodes are not connected in the graph
- if we invert the edges, an edge means "not connected"



# Solving the maximum independent set problem (cont.)

- now we only have to check the cliques and find the largest one(s)
- the number of nodes is the maximal number of blocks fitting



### Finding different word senses?



...inspired by Widdows and Dorow (2002)

# **Other Applications**

- several applications in bioinformatics and drug design (similarity of proteins or chemical formulas in general)
- McDonald et al.  $(2005) \rightarrow$  next talk

# Conclusion

- problem: finding all cliques of a graph efficiently
- hard task (in terms of memory and runtime)
- Bron-Kerbosch algorithm is one efficient solution
- several applications perhaps some more could be invented (operating on ontologies e.g.)

#### Literature

- Coen Bron and Joep Kerbosch (1973): Algorithm 457: Finding All Cliques of an Undirected Graph. Communications of the ACM Vol. 16, Issue 9. ACM Press: New York, USA.
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- Volker Stix (2004): Finding All Maximal Cliques in Dynamic Graphs. Computational Optimization and Applications Vol. 7, Issue 2. Kluwer Academic Publishers: Norwell, USA.