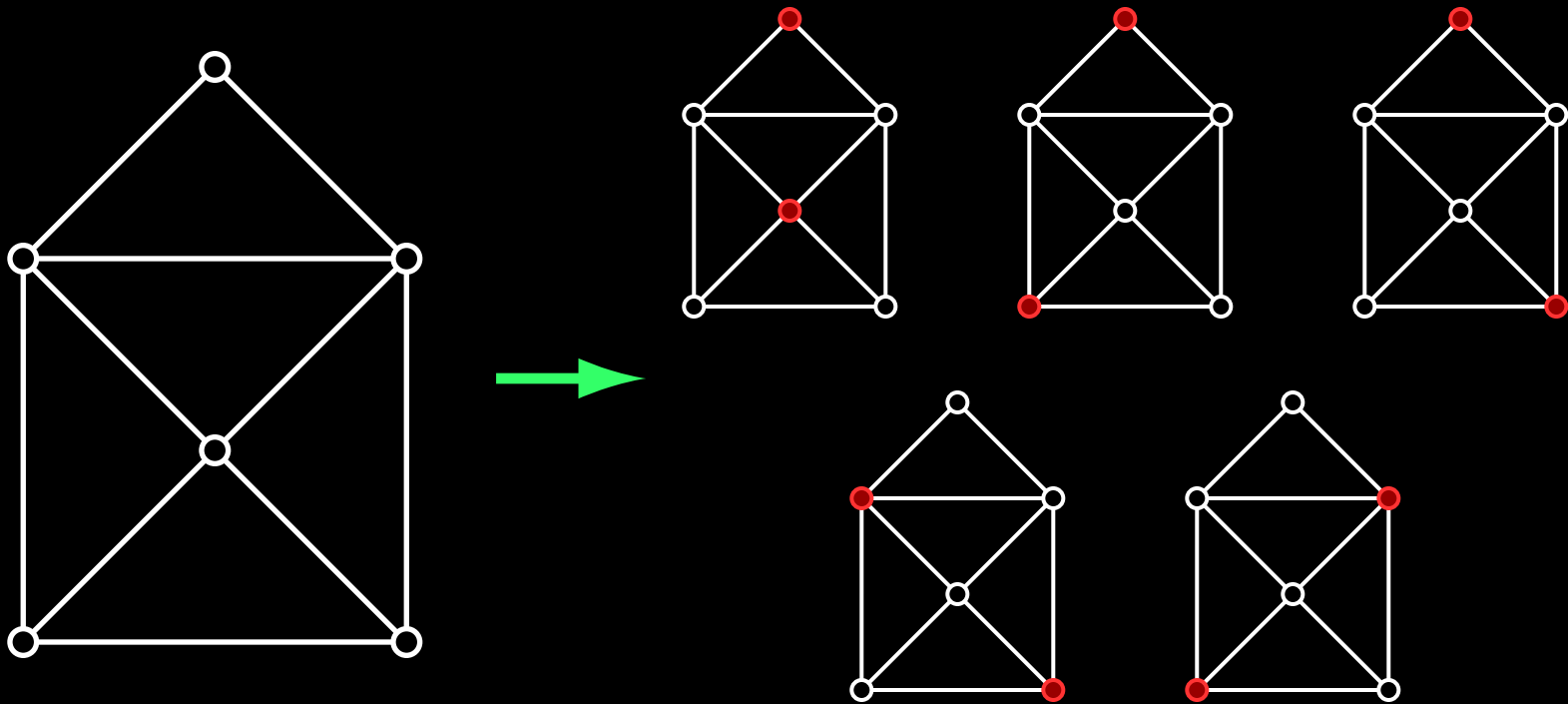


# All Maximal Independent Sets and Dynamic Dominance for Sparse Graphs

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**Problem: list all maximal independent sets of an undirected graph**  
(equivalently, list all cliques in the graph complement)



## Previously known results

$$O(3^{n/3})$$

matches lower bound on max possible output size

[Moon, Moser 1965; Lawler 1976]

$O(mn)$  per generated independent set

[Tsukiyama, Ide, Ariyoshi, Shirakawa 1977; Johnson, Yannakakis, Papadimitriou 1988]

$O(n^{2.376})$  per generated independent set

[Makino, Uno 2004]

Many additional heuristics

Many algorithms for special graph classes...

## Main new results: faster generation for sparse graphs

$O(1)$  per generated independent set  
for bounded degree graphs

$O(n)$  per generated independent set  
for minor-closed graph families  
including planar graphs

$O(n^{2-1/k})$  per generated independent set  
for  $k$ -orientable graphs  
(each subgraph with  $q$  vertices has  $\leq kq$  edges;  
e.g. planar graphs are 3-orientable)

## Additional new results: dynamic domination

Maintain dynamic subset of graph vertices  
Updates: insert or delete vertex into subset  
Query: does subset dominate all remaining vertices?

$O(1)$  time per update for bounded degree graphs (trivial)

$O(1)$  time per update  
for minor-closed graph families  
including planar graphs

$O(n^{1-1/k})$  time per update  
for  $k$ -orientable graphs

## Main idea: **Reverse Search** [Avis, Fukuda 1992]

Given a family of objects to be enumerated

Find transformation  $f$ : object  $\rightarrow$  object  
s.t. repeatedly applying  $f$  eventually leads to a **canonical object**

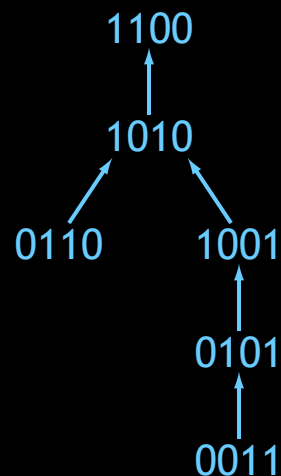
Form tree: nodes = objects    parent =  $f$ (child)

Perform **depth-first traversal** of tree starting from canonical object

### Example: $n$ -bit words with $k$ ones

$f$ : replace leftmost 01 by 10

canonical object:  $1^k 0^{n-k}$

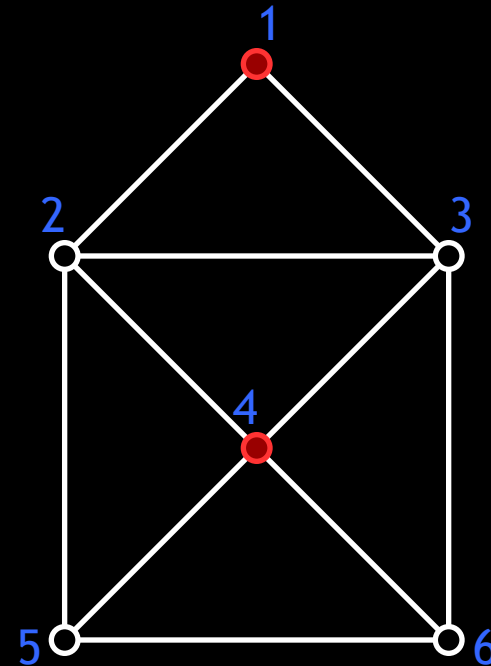


# Canonical object for maximal independent sets: Lexicographically First Maximal Independent Set (LFMIS)

Number the vertices arbitrarily

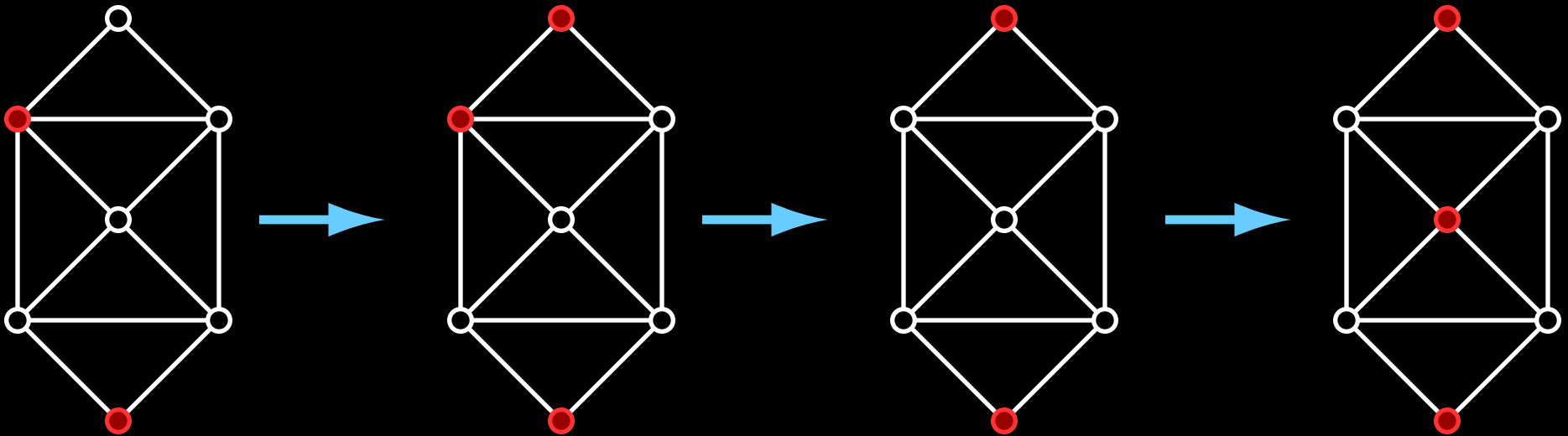
Include a vertex in the LFMIS  
iff no lower-numbered neighbors  
are included

Can be constructed by simple  
linear-time greedy algorithm



# Transforming a maximal independent set towards the LFMS

1. Find first missing LFMS vertex  $v$
2. Add  $v$  to set, make independent by removing neighbors of  $v$
3. Complete to new maximal independent set greedily



Each transformation increases length of common prefix between set and LFMS



## Basic reverse search algorithm (recursive version)

```
def search(MIS):  
    output MIS  
    for each v in common prefix of MIS and LFMIS:  
        S = higher-numbered neighbors of v  
        for each nonempty independent subset I of S:  
            child = (MIS union I) \ (neighbors of I)  
            if child is a maximal independent set:  
                search(child)  
  
choose an ordering for graph's vertices  
compute LFMIS  
search(LFMIS)
```

Order by greedily removing min-degree vertices:  $|S| = O(1)$  for sparse graphs  
therefore, can list independent subsets of  $S$  in time  $O(1)$

Nonrecursive version uses storage for  $O(1)$  sets, avoids call stack

# Speeding up the basic algorithm

Basic algorithm time:  $O(n^2)$  per output  
n potential children checked,  $O(n)$  per check  
**slow when many non-maximal children** per maximal child

Bounded degree graphs:

Maintain dynamic set of triples  $(v, I, S)$   
leading only to children that are maximal independent sets

Each step of algorithm adds/removes  $O(1)$  triples from set  
Children don't need checking,  $O(1)$  time per child

Minor-closed and more general sparse graphs:

Bottleneck is maximality test

An independent set is maximal iff it is dominating  
Apply dynamic domination data structure

# Dynamic domination for sparse graphs

Orient graph so outdegree =  $k = O(1)$

Set degree threshold

“high degree”:  $\text{degree} \geq n^{1-1/k}$

Maintain easy dominance information

$\text{lowdom}(v) = \# \text{dominating in-neighbors}$   
+  $\# \text{dominating low-degree out-neighbors}$

Group vertices according to their set of high-degree out-neighbors

Each high-degree vertex is adjacent to  $O(n^{1-1/k})$  groups

Maintain dominance information about groups

$\# \text{members with lowdom}=0$

$\# \text{dominating high-degree out-neighbors}$

Set is dominating iff no group has

$\# \text{undominated members} > 0$  and  $\# \text{dominating neighbors} = 0$

## Dynamic domination for minor-closed graph families

Similar idea of grouping according to high-degree neighbors

$\#groups = O(\# \text{ high degree})$

With **constant degree threshold**, subgraph of groups is smaller by a constant factor than original graph

Continue grouping recursively to form **hierarchical grouping structure**

Each original vertex belongs to  $O(1)$  groups in hierarchical structure so can maintain counts in all levels affected by update in  $O(1)$  time

# Conclusions

Efficient reverse search for all maximal independent sets in sparse graphs

Complementary problem: cliques in dense graphs

(cliques in sparse, independent in dense are much easier)

Key subroutine: **dynamic dominance data structure**

Improved dynamic dominance for other sparse graph classes  
would also improve independent set listing for those classes

Maybe can be extended to some **non-sparse classes e.g. chordal graphs?**