



FINAL PROJECT REPORT 2022

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Problem I. Maximal Maximal K-clique

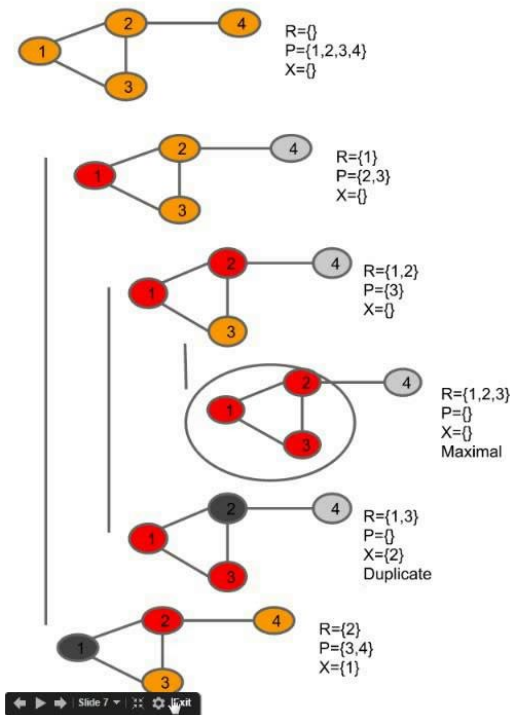
想法：

因為一開始並沒有甚麼頭緒

所以我就上網Google了“Algorithm for finding clique”

找到了一個演算法叫作 Bron-Kerbosch Algorithm

並決定使用它來完成第一題



Bron–Kerbosch Algorithm

利用回溯法，一層一層紀錄，找出所有解

理論數值：

時間複雜度 $O(n \cdot 3^{n/3})$ ，選擇適當的 pivot，讓各階段列舉的點都是最少，時間複雜度加速為 $O(3^{n/3})$ 。
點的列舉順序採用 degeneracy order，時間複雜度加速為 $O(d \cdot n \cdot 3^{d/3})$ ，d 是原圖的 degeneracy

總共有三個集合用來存放 Vertices，分別是

R(all): 目前的 Clique。

P(some): 可以增大目前 Clique 的點集合。接下來要列舉的點。

（與目前 Clique 上所有點皆相鄰的點，構成的集合）

X(none): 可以增大目前 Clique 的點集合，但是先前已經列舉過。用來避免重複列舉。

所以一開始 P 包含所有 Vertices，R、X 皆為 empty

接下來會選用其中一個 Vertex 作為 Pivot，將其放入 R，

P 則會剩下所有和 R(Clique) 相鄰的 Vertices

接著，繼續再將 P 中的點放入 R，並再次更新 P，直到 **P 為空集合、X 也為空集合時**，我們就能找到一個 Maximal Clique

最後會逆推，將 P 中一個不為 Pivot 的 Vertex 丟入 X，並更新 R、P，直到 X 數為 pivot edge 數時完成

完成後，則會繼續使用另一個 Vertex 作為 Pivot，並重複上述步驟，找出所有 Maximal Clique

Code - Algorithm

```
void max_cliq(int d, int an, int sn, int nn)
```

```
{
```

```
    int u = some[d][0];
```

← Pivot

```
    for(size_t i = 0; i < sn; ++i)
```

← 目前P數量，為0時代表結束

```
    {
```

```
        int v = some[d][i];
```

```
        if(graph[u][v])  
            continue;
```

← u v相連，直接換下一個vertex

```
        for(size_t j = 0; j < an; ++j)
```

```
            all[d+1][j] = all[d][j];
```

```
        all[d+1][an] = v;
```

← 將取出的vertex加入下一層的R

```
        int nextsn, nextnn;
```

```
        nextsn = nextnn = 0;
```

```
        for(size_t j = 0; j < sn; ++j) |
```

```
            if(graph[v][some[d][j]])
```

```
                some[d+1][nextsn++] = some[d][j];
```

```
        for(size_t j = 0; j < nn; ++j)
```

```
            if(graph[v][none[d][j]])
```

```
                none[d+1][nextnn++] = none[d][j];
```

```
        if(!nextsn && !nextnn)
```

```
            clique.push_back(vector<int>(all[d+1], all[d+1] + an + 1));
```

← 下一層P、X及和數量為0，
則把R的vertices丟到vector儲存
(也就是Maximal Clique)

```
        max_cliq(d+1, an+1, nextsn, nextnn);
```

```
        some[d][i] = -1, none[d][nn++] = v;
```

← 進入下一層

逆推→

```
}
```

Code - Sort

目的：方便輸出

← u v size 一樣，用vector class
operator < 比大小
u v size 不一樣，直接比size大小

```
inline bool compare(const vector<int> &u, const vector<int> &v)
{
    return (u.size() == v.size()) ? u < v : u.size() < v.size();
}
void sort_2d_vec()
{
    for(size_t i = 0; i < clique.size(); ++i)
    {
        sort(clique[i].begin(), clique[i].end());
        sort(clique.begin(), clique.end(), compare);
    }
}
```

二維vector由小排到大
使用內建的sort function

← 一維vector由小排到大
使用內建的sort function

comp - comparison function object (i.e. an object that satisfies the requirements of *Compare*) which returns **true** if the first argument is *less* than (i.e. is ordered *before*) the second.

The signature of the comparison function should be equivalent to the following:

```
bool cmp(const Type1 &a, const Type2 &b);
```

While the signature does not need to have **const &**, the function must not modify the objects passed to it and must be able to accept all values of type (possibly const) Type1 and Type2 regardless of *value category* (thus, **Type1 &** is not allowed, nor is **Type1** unless for Type1 a move is equivalent to a copy (since C++11)).

The types **Type1** and **Type2** must be such that an object of type **RandomIt** can be dereferenced and then implicitly converted to both of them.

std::sort

Defined in header `<algorithm>`

```
template< class RandomIt >                                (until C++20)
```

```
void sort( RandomIt first, RandomIt last );                (1)
```

```
template< class RandomIt >                                (since C++20)
```

```
constexpr void sort( RandomIt first, RandomIt last );
```

```
template< class ExecutionPolicy, class RandomIt >          (2) (since C++17)
```

```
void sort( ExecutionPolicy&& policy,                        RandomIt first, RandomIt last );
```

```
template< class RandomIt, class Compare >                  (until C++20)
```

```
void sort( RandomIt first, RandomIt last, Compare comp ); (3)
```

```
template< class RandomIt, class Compare >                  (since C++20)
```

```
constexpr void sort( RandomIt first, RandomIt last, Compare comp );
```

```
template< class ExecutionPolicy, class RandomIt, class Compare > (4) (since C++17)
```

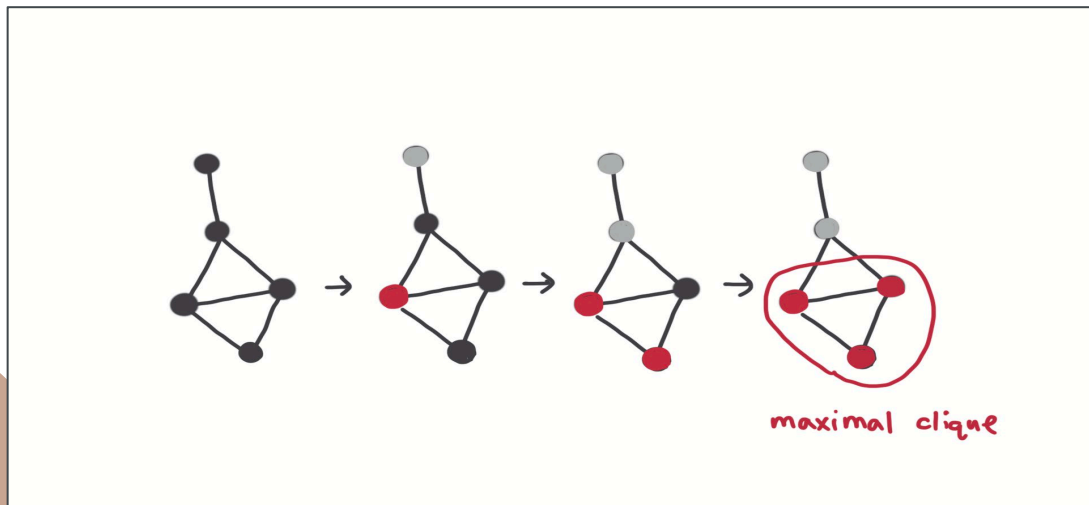
```
void sort( ExecutionPolicy&& policy,                        RandomIt first, RandomIt last, Compare comp );
```

Other Method - Greedy

任選一Vertex開始不斷延伸，將共同連接點加入，直到沒有共同連接點為止時，會得到一個Maximal Clique

從不同Vertex開始，得到的Clique可能不同；將所有Vertices run過一輪可以得到所有Maximal Clique

時間複雜度： $\Theta(n^2)$



Speed Up Runtime

参考 : [optimize.pdf](#)

Tips for Optimizing C/C++ Code

1. *Remember Abbdal's Law: $Speedup = \frac{f_{runtime}}{f_{runtime} - f_{overhead} \times f_{overhead} / f_{overhead}}$*
 - Where $f_{overhead}$ is the percentage of the program runtime used by the function $f_{overhead}$, and $f_{overhead}$ is the factor by which you speedup the function.
 - Thus, if you optimize the function `TriangleIntersect()`, which is 40% of the runtime, so that it runs twice as fast, your program will run 25% faster ($\frac{1}{(1-0.4) \times 2} = 1.25$).
 - This means infrequently used code (e.g., the scene loader) probably should be optimized little (if at all).
 - This is often phrased as: "make the common case fast and the rare case correct"
2. *Code for correctness first, then optimize!*
 - This does not mean write a fully functional ray tracer for 8 weeks, then optimize for 8 weeks!
 - Perform optimizations on your ray tracer in multiple steps.
 - Write for correctness, then if you know the function will be called frequently, perform obvious optimizations.
 - Then profile to find bottlenecks, and remove the bottlenecks (by optimization or by improving the algorithm). Often improving the algorithm drastically changes the bottleneck – perhaps to a function you might not expect. This is a good reason to perform obvious optimizations on all functions you know will be frequently used.
3. *People I know who write very efficient code say they spend at least twice as long optimizing code as they spend writing code.*
4. *Jumps/branches are expensive. Minimize their use whenever possible.*
 - Function calls require two jumps, in addition to stack memory manipulation.
 - Prefer iteration over recursion.
 - Use inline functions for short functions to eliminate function overhead.
 - Move loops inside function calls (e.g., change `for(i=0; i<100; i++) DoSomething();` into `DoSomething()` { `for(i=0; i<100; i++) { ... }` }).
 - Long if...else if...else if... chains require lots of jumps for cases near the end of the chain (in addition to testing each condition). If possible, convert to a `switch` statement, which the compiler sometimes optimizes into a table lookup with a single jump. If a `switch` statement is not possible, put the most common clauses at the beginning of the if chain.
5. *Think about the order of array indices.*
 - Two and higher dimensional arrays are still stored in one dimensional memory. This means (for C/C++ arrays) `array[i][j]` and `array[i][j+1]` are adjacent to each other, whereas `array[i][j]` and `array[i+1][j]` may be arbitrarily far apart.
 - Accessing data in a more-or-less sequential fashion, as stored in physical memory, can dramatically speed up your code (sometimes by an order of magnitude, or more).
 - When modern CPUs load data from main memory into processor cache, they fetch more than a single value. Instead they fetch a block of memory containing the requested data and adjacent data (a *cache line*). This means after `array[i][j]` is in the CPU cache, `array[i][j+1]` has a good chance of already being in cache, whereas `array[i+1][j]` is likely to still be in main memory.

Speed Up Runtime

1. Better Algorithm

Greedy -> Bron-Kerbosch Algorithm

2. Better Sorting Method

自定義函數排序 -> 使用內建函數sort()

3. Loop

- I. 減少不必要的for迴圈
- II. 使用++i 代替 i++，因為i++會額外儲存value
- III. 使用size_t代替int

4. If else

使用conditional operator(?:)代替if else，可以加快速度

5. Operator

盡量使用++、--、+=、*= ...

6. Scanf/Printf

much more faster than cin/cout

7. Memory usage

- I. static array分配的空間盡量小一點
- II. 減少不必要的Variable
- III. 使用Global variable避免多次Pass by Value
(但不用全部都使用Global Variable)

8. Inline function

適合較小型的function，呼叫時間減短

9. 簡化部分code寫法

10. Pass by reference/pointer instead of value

測試Runtime: 360 – 600

Problem II.

Chromatic Number & Graph Coloring

想法：因為上課有提過，所以想直接使用Greedy暴力解出

時間複雜度： $O(V^2 + E)$

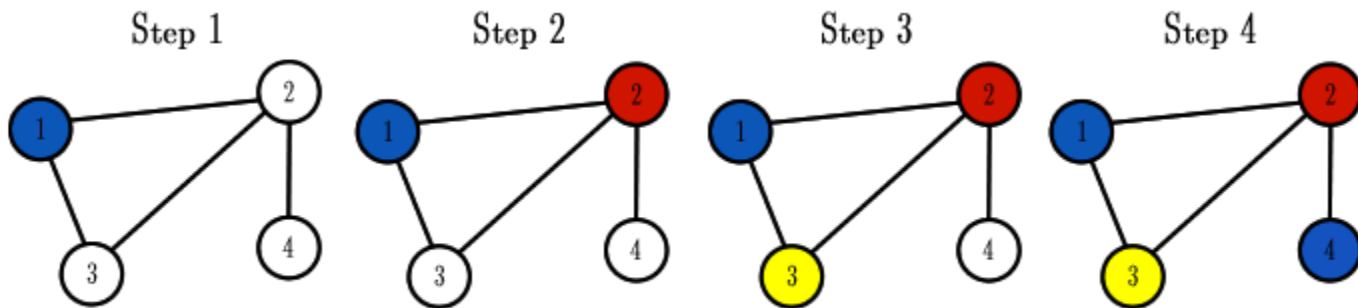


Figure 2: step-by-step process to color the vertices of a graph.

Code - Greedy

```
void gdc()
{
    bool used[n+1];
    int uncol = n;

    memset(used, false, sizeof used);
    fill(color.begin(), color.end(), -1);

    while(uncol)
    {
        int target, ddeg = 0;
        for(int i = 0; i < degree.size(); i++)
            if(!used[i])
            {
                if(degree[i] > ddeg)
                {
                    ddeg = degree[i];
                    target = i;
                }
                /*else if(degree[i] == ddeg)
                {
                    int a = 0, b = 0;
                    for(int j = 0; j < graph[i].size(); ++j)
                        if(!used[graph[i][j]])
                            a++;
                    for(int j = 0; j < graph[target].size(); ++j)
                        if(!used[graph[target][j]])
                            b++;
                    if(a > b)
                        target = i;
                }*/
            }
    }
}
```

```
used[target] = true;
int cr = 1;
if(uncol == n)
{
    color[target] = cr;
    max_color = max(max_color, cr);
    uncol--;
    continue;
}
while(1)
{
    bool next = false;
    for(int i = 0; i < graph[target].size(); ++i)
        if(cr == color[graph[target][i]])
            next = true;
    if(next)
        cr++;
    else
    {
        color[target] = cr;
        break;
    }
}
//if(target == 0)
// printf("%d %d\n", color[0], color[36]);
max_color = max(max_color, cr);
uncol--;
```

Code - Greedy

```
void gdc()
{
    bool used[n+1];
    int uncol = n;

    memset(used, false, sizeof used);
    fill(color.begin(), color.end(), -1);

    while(uncol)
    {
        int target, ddeg = 0;
        for(int i = 0; i < degree.size(); i++)
            if(!used[i])
            {
                if(degree[i] > ddeg)
                {
                    ddeg = degree[i];
                    target = i;
                }
                /*else if(degree[i] == ddeg)
                {
                    int a = 0, b = 0;
                    for(int j = 0; j < graph[i].size(); ++j)
                        if(!used[graph[i][j]])
                            a++;
                    for(int j = 0; j < graph[target].size(); ++j)
                        if(!used[graph[target][j]])
                            b++;
                    if(a > b)
                        target = i;
                }*/
            }
    }
}
```

<- used紀錄是否填過，uncol紀錄還有幾個vertex沒填

<- color會存放該點的顏色，-1代表沒填過

<- 先從Deg最大的點開始填顏色

Code - Greedy

```
used[target] = true;
int cr = 1;
if(uncol == n)
{
    color[target] = cr;
    max_color = max(max_color, cr);
    uncol--;
    continue;
}
while(1)
{
    bool next = false;
    for(int i = 0; i < graph[target].size(); ++i)
        if(cr == color[graph[target][i]])
            next = true;
    if(next)
        cr++;
    else
    {
        color[target] = cr;
        break;
    }
}
//if(target == 0)
// printf("%d %d\n", color[0], color[36]);
max_color = max(max_color, cr);
uncol--;
```

<- cr為要填的顏色

<- 如果是第一個被填的點不用判斷相鄰是否填過

<- 之後被填的點要判斷相鄰點是否填過該顏色
如果有，cr往上加；反之，填入

*另外如果有好幾個Vertices的deg相同，
如何決定誰先填會影響結果

code是從數字最小開始填

<- 紀錄Chromatic Number

Code - Input

```
while(scanf("%d",&u) != EOF)
{
    scanf("%d",&v);

    if(!u || !v)
        with_zero = true;

    edge[u][v] = edge[v][u] = 1;

    n = u > n ? u : n;
    n = v > n ? v : n;
    e++;
}
if(with_zero)
    n++;
```

<- 跟上一題使用同個code
將edge用2d bool array紀錄
並且判斷節點是否有0

Code - Input

```
graph.resize(n+1);
degree.resize(n+1);
color.resize(n+1);

fill(degree.begin(), degree.end(), 0);

for(size_t i = 0; i <= n-1 ; ++i)
    for(size_t j = i+1; j <= n; ++j)
        if(edge[i][j])
        {
            graph[i].push_back(j);
            graph[j].push_back(i);
            degree[i]++, degree[j]++;
        }
```

<- 將graph、degree等vector調整至適當大小

Graph為2d vec，負責記錄和誰連接
Degree為1d vec，負責記錄該點的deg大小

<- 如果edge[i][j]為true，代表兩點有連接
所以graph[i]要加入j，graph[j]要加入i
同時，i,j的degree都要增加1

Code - Output

```
void print()
{
    for(int i = 0; i < color.size(); ++i)
        if(color[i] > 0)
            printf("%2d %2d\n", i, color[i]);
}
```

<- 先前有將各點顏色存入陣列
所以直接定義一個function輸出

```
printf("%d\n", max_color);
```

<- Chromatic Number在greedy過程紀錄
跑完gdc()後，直接輸出

NP-Complete Problem

有和幾位朋友一起測試及討論，我們發現在填色時，遇到degree相同的點時，決定誰先填(Order)會影響答案結果

以助教提供的input 2測資為例

Case I: 由小到大

Chromatic Number 為 27

Case II: 由大到小

Chromatic Number 為 28

Case III: 由相鄰最多未填格點的vertex開始填

Chromatic Number 為 27

另外，**同個方法對應不同的graph並不一定能找到最佳解**
在input 3測資中

使用Case I的解為29，而使用Case III的解為32

但在input 2測資中

Case I和Case III兩者卻能找到同樣的答案27

```
/*else if(degree[i] == ddeg)
{
    int a = 0, b = 0;
    for(int j = 0; j < graph[i].size(); ++j)
        if(!used[graph[i][j]])
            a++;
    for(int j = 0; j < graph[target].size(); ++j)
        if(!used[graph[target][j]])
            b++;
    if(a > b)
        target = i;
}*/
```