

#### 主題: Branch-and-bound (I)

- 基礎
- 應用
- 作業與自我挑戰



## 基礎

- Brute-force search
- Branch-and-bound

2

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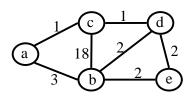
#### **Brute-force Search**

- 把所有的可能都產生出來,加以檢查後找出答案
- 最簡單也是最不得已的最後手段

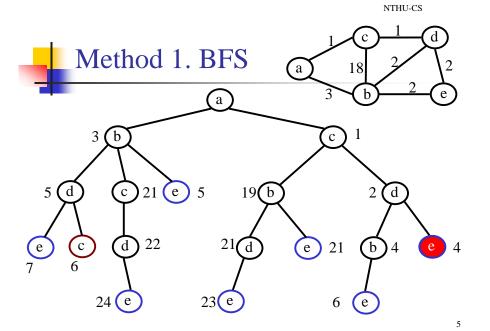


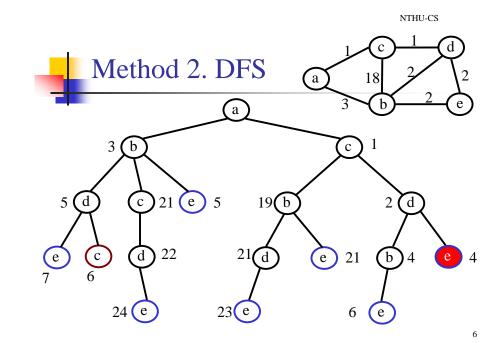


Find a shortest path from a to e



- Brute-force solution: produce all simple paths from a to e and find the best one
- Problem: How to produce all simple paths?





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- 通常使用 DFS,因為比較簡單好寫
  - recursive 的 stack 由系統提供
- smaller storage
- When DFS needs a stack of size  $> 10^6$ 
  - write a non-recursive version (maintain a stack by yourself)
  - use BFS

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# Branch-and-bound Branch-and-bound: Brute-force + intelligent cuts

a cut by 5 c 1

5 d cut by 5

19 b 2 d

7 6 cut by 7

e cut by 7

e cut by 7

e cut by 7

e cut by 5

21 d e 4

22 cut by 5



#### The idea of branch and bound

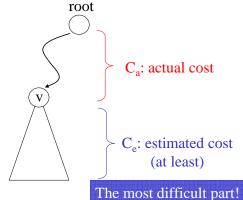
#### (for minimization)

b: current best (initially, b = ∞)

backtrack at v if

v is a leaf, or

 $- C_e + C_a \ge b$ 



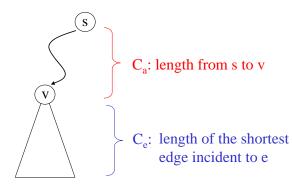
• if a better solution is found, replace b with it.

9

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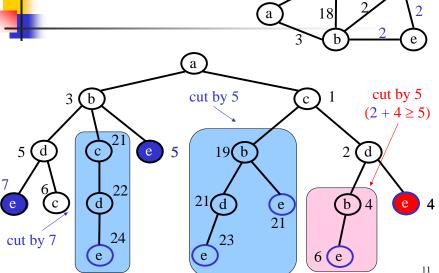
# Example

• Finding the shortest path from s to e



10

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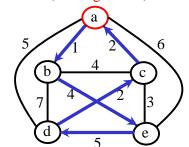


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## Example: TSP

• Find a shortest route which visits every vertex exactly once and returns to the starting vertex.

(starting vertex)

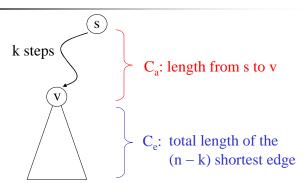


length of shortest route: 14

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## A branch-and-bound solution



- (1, 2, 2, 3, 4, 4, 5, 5, 6, 7):  $C_e = 5$  for k = 2 (or n k = 3)
- (1, 3, 5, 8, 12, 16, 21, 26, 32, 59): prefix sums

14

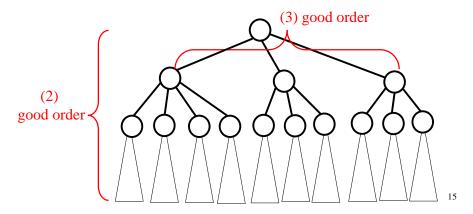
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## Speedup by using heuristics

Three places

(1) get a good initial bound b (instead of  $b = \infty$ ).

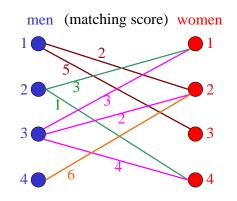


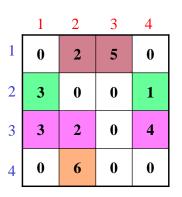
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## Example: Optimal matching

• Input: A[i, j]: the weight of matching man i and woman j



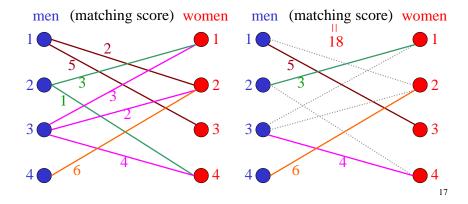


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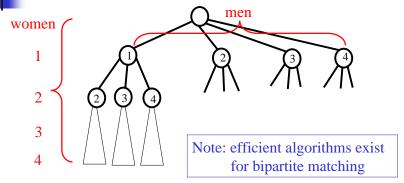
#### Example: Optimal matching

• **Problem**: Find a matching that maximizes the matching scores.



4

## Example: Optimal matching



• (1): get a good b initially

• (2), (3): sort men and women according to popularity

■ C<sub>e</sub>: ???

18

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#### When to use brute-force search?

- 題目要求「列出所有的可能解」
- Problem size 很小,檢查所有可能的時間不會很長
- 國內辦的比賽每一題都可以試試看,因為 problem size 大多騙人, test case 通常很小 (即使題目上說 n 是 infinite ???!!!)

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#### When to use branch-and-bound?

- Optimization problems
- 除暴力法,想不出任何方法
- 單純暴力法時間一定會超過



#### 應用

- 應用一: A.10098 Generating Fast, Sorted Permutation
- 應用二: A.441 Lotto
- 應用三: A.167 The Sultan's Successors
- 應用四: H.91.6 專題選課
- 應用五: A. 10318 Security panel
- 應用六: 整數的分割方式
- 應用七: A.574 Sum it Up

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# 應用一: A. 10098 Generating Fast, Sorted Permutation

給 n 個英文字母,請條列出所有能由這 n 個英文字母 排列成的字串

- 以 lexicographical 順序輸出
  - $\{ \emptyset \}$ : acfd (n = 4)acdf  $\Rightarrow$  acfd  $\Rightarrow$  adcf  $\Rightarrow$  afcd  $\Rightarrow$  afdc  $\Rightarrow \dots$
- n ≤ 10
  - 有 n! ≈ 106 組解
- Solution: brute-force (recursive DFS)

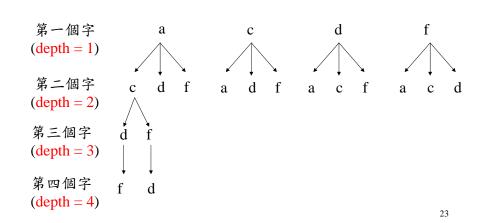
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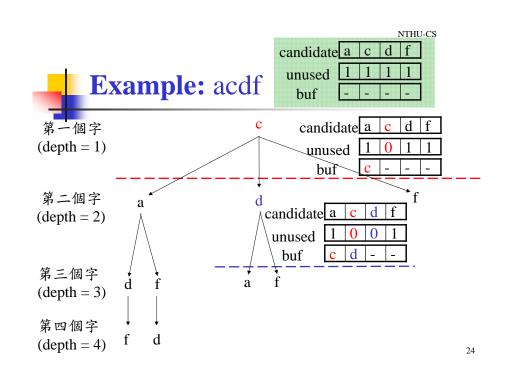
22

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## Example: acdf (sorted)







```
candidate \begin{bmatrix} a & c & d & f \end{bmatrix}
unused \begin{bmatrix} 1 & 1 & 1 & 1 \\ - & - & - & - \end{bmatrix}
```

```
void perm(int depth) ← recursive depth=1, 2, ..., n

{
    int i;
    for (i = 0; i < n; i++) ← 按字母順序加入每一個可能的字母
        if (unused[i] == 1) { ← 檢查這個字母是否還沒有被使用過
        buf[depth - 1] = candidate[i]; ← 把字母加到目前的解中
        unused[i] = 0; ← 這字母已經使用,設定 flag
        if (depth == length) myoutput(buf); ← 如果已經夠長就輸出
        else perm(depth + 1); ← recursive call,深度加一
        unused[i] = 1; ← 這字母在這位置的所有解已經列出,
            要換成別的字母,reset flag
```

- 給 n 個整數,請列出由這 n 個數字中挑 m 個數字的 所有組合方式
- 以 lexicographical 順序輸出
- n≤12C(n, m) 組解
- Solution: brute-force (recursive DFS)
- 困難: 怎樣避免重複的組合?

26

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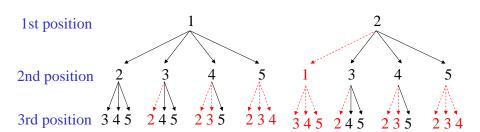
25



## Example: {1, 2, 3, 4, 5} 取 3 個

- Three positions
  - select a number for each position

#### 如何避免重複:數字越選越大



4

#### Pseudo code for small m

 $\mathbf{m} = 2$ 

Assume that inputs are sorted in num[n].

```
int i, j;
for (i = 0; i < n; i++)
for (j = i + 1; j < n; j++)
printf("%d %d\n", num[i], num[j]);
```

m = 3

```
int i, j, k;

for (i = 0; i < n; i++)

for (j = i + 1; j < n; j++)

for (k = j + 1; k < n; j++)

printf("%d %d %d\n", num[i], num[j], num[k]);
```

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#### Pseudo code for all m

應用三: A.167



■ 在一個 N×N 的棋盤上,要放置 N 個 queens

- 每一格有一個 number ,表示分數
- 請找出使這N個 queens 吃不到彼此 (每一行、每一列及每一對角線上都最多只有一個 queen) 而且得分最高的擺法
- N = 8
- 每個 column 只能放一個,只有 8! ≈ 40000 個擺法要檢查
- Solution: brute-force search (recursive DFS)

30

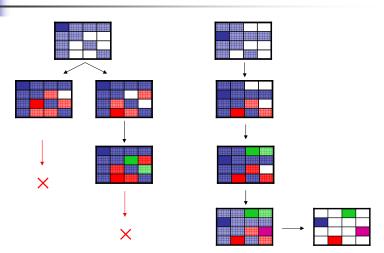
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29

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#### Example: N = 4





#### 應用四: H.91.6 專題選課

- 有 n 位老師與 m 位同學 (m 是 n 的整數倍),每位同學 需要選專題老師,每位老師收一樣多的學生
- 現在每個同學以選填志願的方式將老師排序,請找出 所有排法中平均志願最佳(志願總和最小)的組合
- $n \le 6, m \le 12$

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#### **Solutions**

- - 可看成有 12 個不同的球,要丟入6個不同的箱子中, 每個箱子要丟兩個球
  - 有 12! / (2!)6 < 107 種可能
- Brute-force search is enough



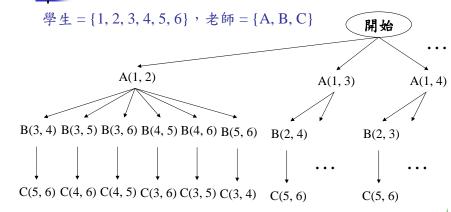
- B&B
  - b: current best
  - C<sub>e</sub>: ???

註: (1) use DP: O(m\*2<sup>m</sup>) time

(2) use min-cost max-flow: O(m<sup>4</sup>)-time



#### Example



33

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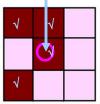


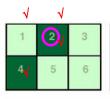
## 應用五: A. 10318 Security panel

 給一個 r×c (r, c≤5) 的矩陣面板,以及按下某格後周圍格子的變化,判斷是否存在能把所有格子都啟動的按法,若有,則輸出最少次的按法(一開始所有格子 都是 off)

按下後的變化 (switch)

2×3的面板,按下2,5,6









A BFS solution • BFS on the state graph ( $|V| = 2^{25}$ ) 按下(5,5) 按下(1,1) 按下(1,2) 按下(2,1)

- $O(E) = O(25 \times 2^{25}) \approx 8 \times 10^8$
- not good enough









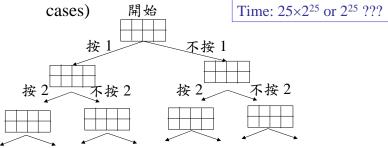
#### Observation

- 最多按 r×c 次
  - 每個格子若按偶數次則等於沒按,奇數次則等於按 一次
  - 每個格子按或不按,與順序無關

4

#### A brute-force solution

- Brute-force:
  - $O(2^{25}) \approx 3 \times 10^7$  combinations
  - not good enough (can not process more than 10



38

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37

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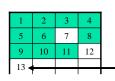


#### A B&B solution

Bound: 目前已知最少按法 b (current best)

其它 C。: ???

- C<sub>e</sub>: ???
  - 以 1, 2, 3, ... 順序
  - 當處理格子 k 時,若離 k 上方超過兩行以上有任何格子未啟動,則此按法必定不是正確按法  $(C_e = \infty)$
  - 因為每個格子的影響範圍只有上下一行



- 接下來沒有格子可以啟動格子7

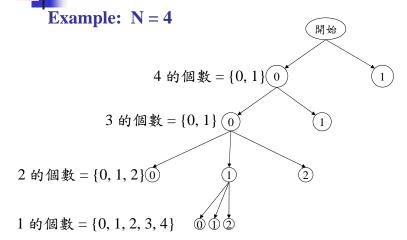


#### 應用六:整數的分割方式

- 給一正整數 N,把所有將 N分解成若干 (1~N) 個正整 數的方法條列出來 (數字由大到小輸出)
- (5): N = 4 = 3 + 1 = 2 + 2 = 2 + 1 + 1 = 1 + 1 + 1 + 1
- 類題:
  - 給 k 種不同的整數 {a<sub>1</sub>, a<sub>2</sub>, ..., a<sub>k</sub>}, 再給定一個目標數 N,請列出所有能湊出 N 的方法



#### A brute-force solution



41

43

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#### 應用七: A.574 Sum it Up

- 給 k 種鈔票的面額,與每一種面額可用張數的限制, 再給定一個目標數 N,請列出所有能湊出 N 的方法
- 與前一個主題類似,只是能用的整數與每個整數的個數有限制
- A brute-force solution: recursive DFS (should be good enough)
- A B&B solution
  - C<sub>e</sub>=剩餘所有鈔票的總金額
  - backtrack if  $C_a + C_e < N$

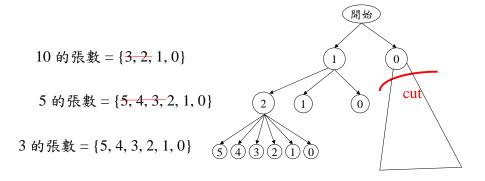
42

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#### N = 37

■ 面額 = {10, 5, 3, 1} (sorted), 張數 = {1, 2, 5, 3}



作業與自我挑戰



#### 作業

- 練習題
  - A. 10318 Security Panel http://uva.onlinejudge.org/external/103/10318.html
- 挑戰題
  - A. 818 Cutting Chains http://uva.onlinejudge.org/external/8/818.html
- 自我挑戰
  - A. 10492 Optimal Mastermind Strategy
- 其它有趣題目
  - A. 10344 23 out of 5 http://uva.onlinejudge.org/external/103/10344.html
  - A. 291 The House Of Santa Claus
  - A. 840 Deadlock Detection
  - A. 10068 The Treasure Hunt
  - A. 838 Worm World (Hint: DFS in (D, R, U, L) order)

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