# ANALISIS ALGORITME Pengantar Teknik Divide and Conquer

Kuliah ke-8

#### Terdapat 2 aspek dalam algoritma:

- Analisis:
  - Kriteria kebaikan algoritma
  - Kompleksitas algoritma → laju pertumbuhan fungsi
- Design:
  - teknik-teknik perancangan algoritma
    - Divide and conquer
    - Dynamic programming
    - Greedy
    - Backtracking
    - Graph

#### Teknik Divide and Conquer

- Divide :
  - Membagi masalah menjadi sub-sub masalah yang lebih kecil sehingga lebih mudah diselesaikan
- Conquer:
  - Menyelesaikan sub-sub masalah tersebut secara rekursif
- Combine:
  - Solusi masalah awal dibentuk dari solusisolusi sub masalah (original problem)

```
function Solution(I); \\ begin \\ if size(I) \leq small\_size then \\ Solution := DirectSolution(I); \\ else \\ Decompose(I, I_1, I_2, ..., I_k); \\ for i := 1 to k do \\ Si := Solution(I_i) \\ end \{for\} \\ Solution := Combine(S_1, S_2, ..., S_k) \\ end \{if\} \\ end \{Solution\} \\ \\
```

#### Andaikan:

•S(n): banyaknya langkah yang dikerjakan Direct Solution

•D(n): banyaknya langkah yang dikerjakan Decompose

•C(n): banyaknya langkah yang dikerjakan Combine

untuk ukuran input = n

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maka bentuk umum relasi berulang yang menggambarkan banyaknya langkah yang dilakukan algoritma di atas adalah :

$$T(n) = \begin{cases} S(n) & \text{; untuk } n \leq \text{small size} \\ D(n) + \sum_{i=1}^{k} T(\text{size}(I_i)) + C(n) & \text{; untuk } n \text{ selainnya} \end{cases}$$

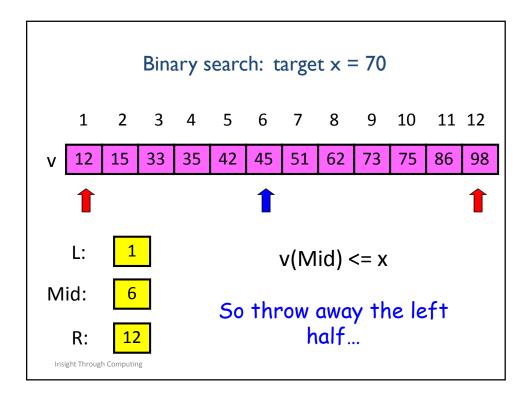
# Contoh beberapa masalah yang dapat diselesaikan menggunakan teknik D&C

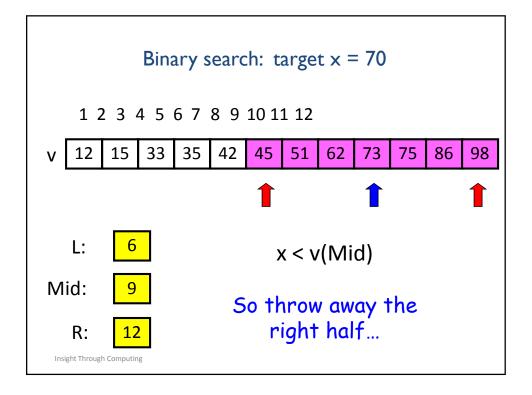
#### Masalah Binary Search:

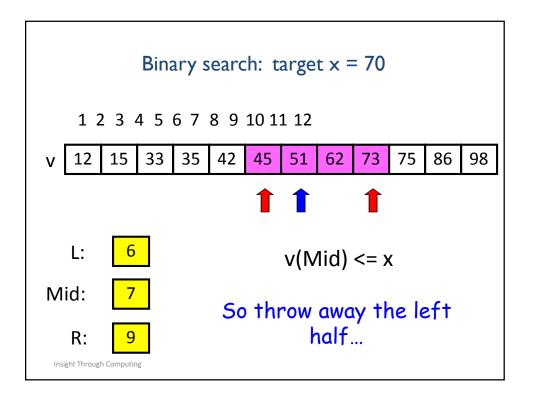
Mencari sebuah elemen dalam *list*. Pertama, dicek elemen di tengah *list*, dibandingkan dengan elemen yang dicari. Jika sama, selesai. Jika tidak sama, pada bagian yang bersesuaian dikerjakan *binary search*. Pada setiap tahap dari 2 sub masalah, hanya dikerjakan satu saja.

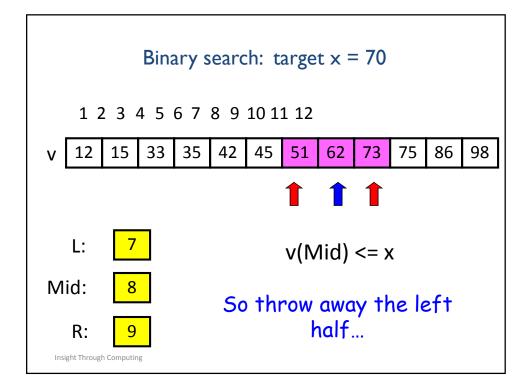
#### Masalah Merge Sort:

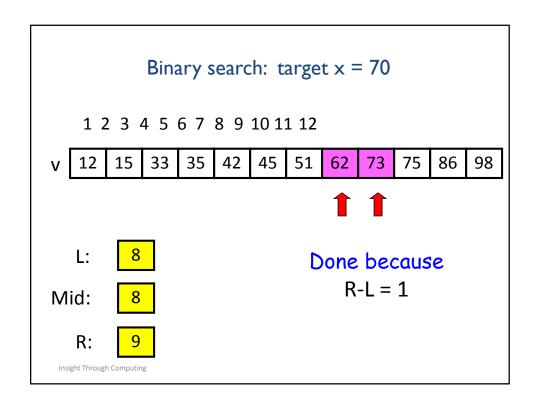
Mengurutkan elemen dalam *list* dengan menggunakan teknik *merge sort*. Mula-mula *list* dipecah menjadi dua bagian. Secara rekursif, pada setiap bagian diurutkan dengan *merge sort*. Setelah diurutkan, dua bagian tersebut digabungkan kembali.









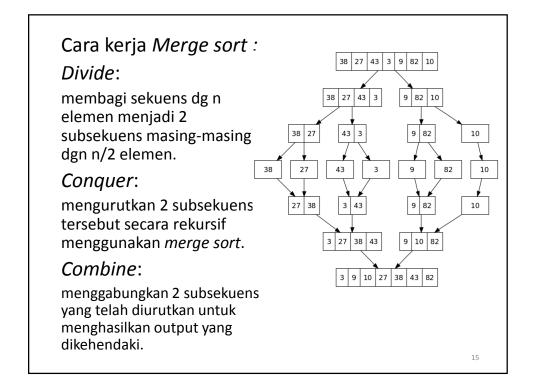


```
function L = BinarySearch(a,x)
% x is a row n-vector with x(1) < ... < x(n)
% where x(1) \le a \le x(n)
% L is the index such that x(L) \le a \le x(L+1)
L = 1; R = length(x);
% x(L) \le a \le x(R)
while R-L > 1
    mid = floor((L+R)/2);
    \mbox{\%} Note that mid does not equal L or R.
    if a < x (mid)
         % x(L) \le a \le x(mid)
         R = mid;
    else
         % x (mid) <= a <== x (R)
         L = mid;
    end
end
 Insight Through Computing
```

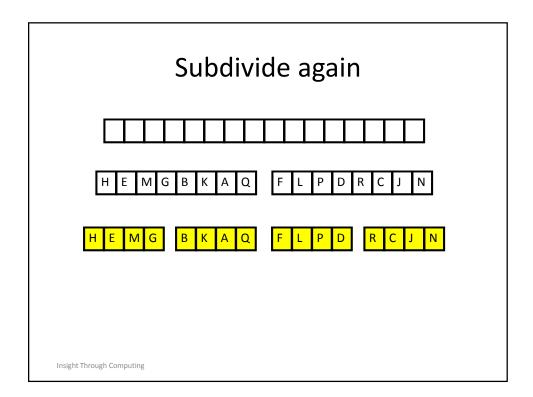
Binary search is efficient, but how do we sort a vector in the first place so that we can use binary search?

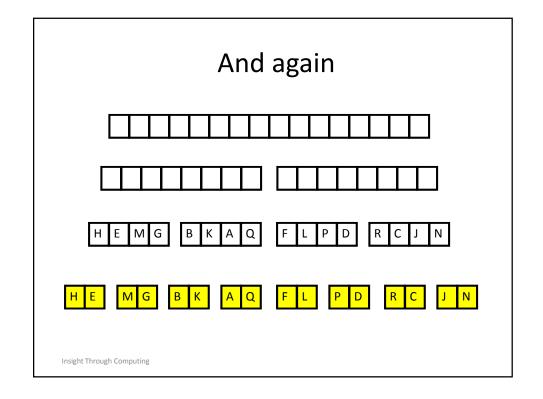
- Many different algorithms out there...
- Let's look at merge sort
- An example of the "divide and conquer" approach

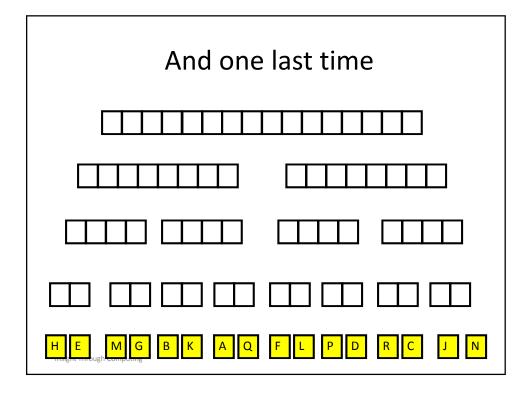
Insight Through Computing

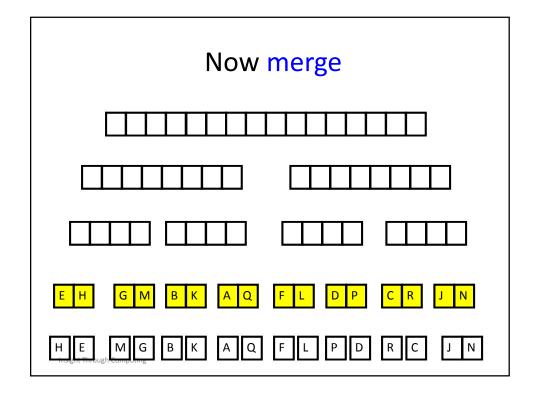


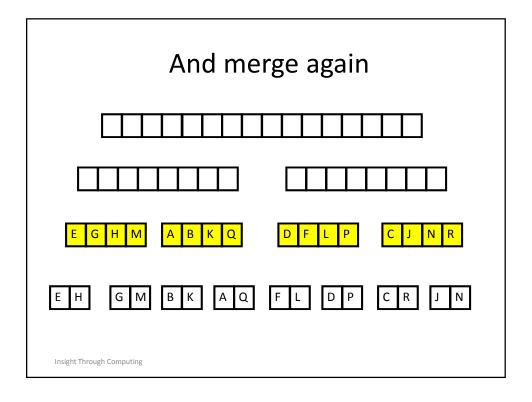
# Subdivide the sorting task HEMGBKAQFLPDRCJN HEMGBKAQ FLPDRCJN

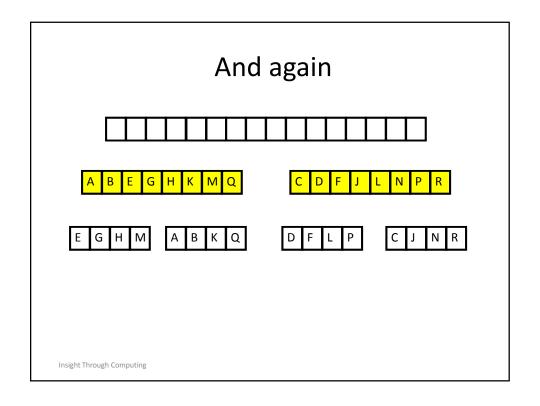




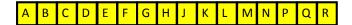








# And one last time







Insight Through Computing

# Done!



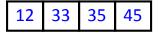
Insight Through Computing

```
function y = mergeSort(x)
% x is a vector. y is a vector
% consisting of the values in x
% sorted from smallest to largest.

n = length(x);
if n==1
    y = x;
else
    m = floor(n/2);
    yL = mergeSortL(x(1:m));
    yR = mergeSortR(x(m+1:n));
    y = merge(yL,yR);
end

InsightThrough Computing
```

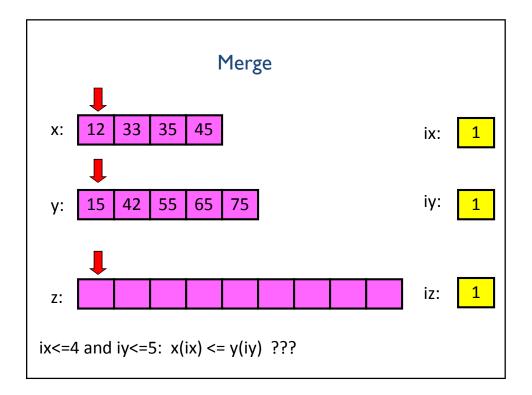
The central sub-problem is the merging of two sorted arrays into one single sorted array

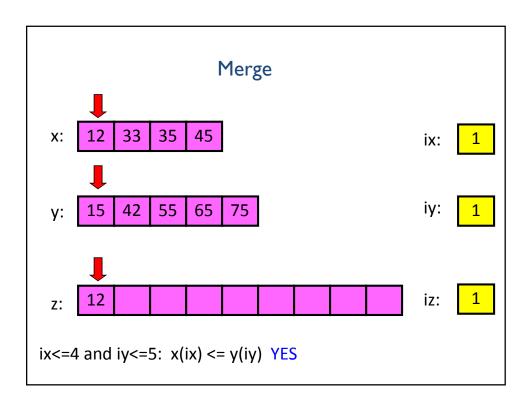


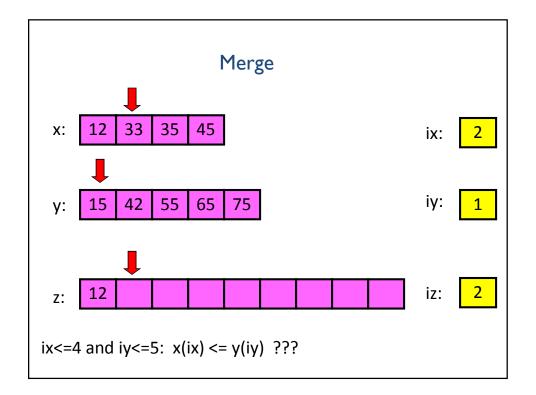


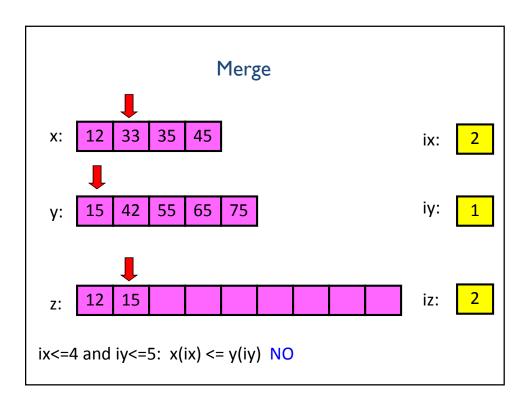


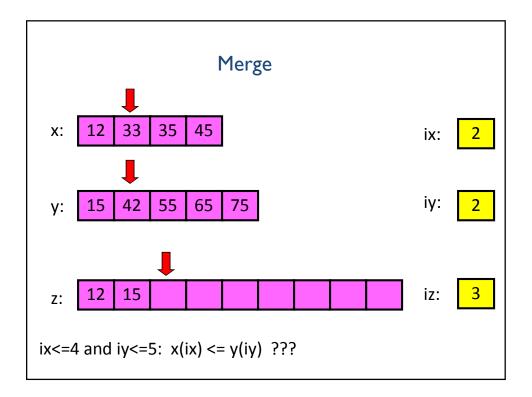
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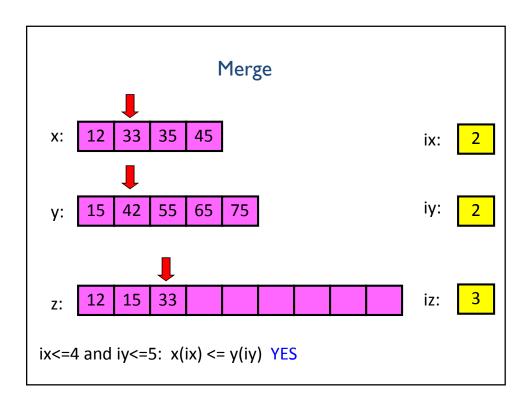


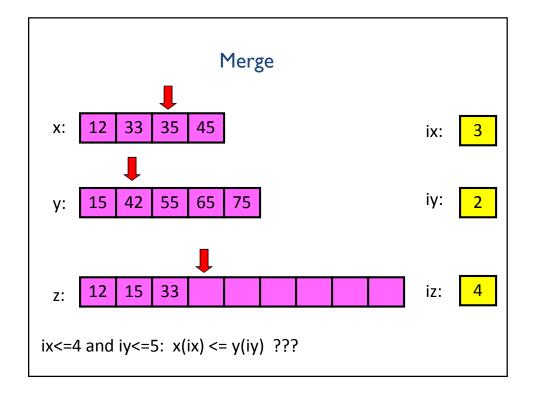


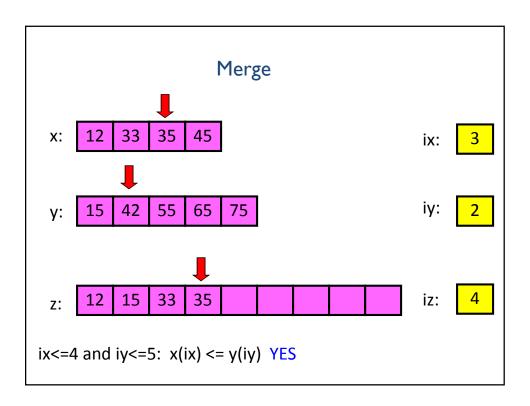


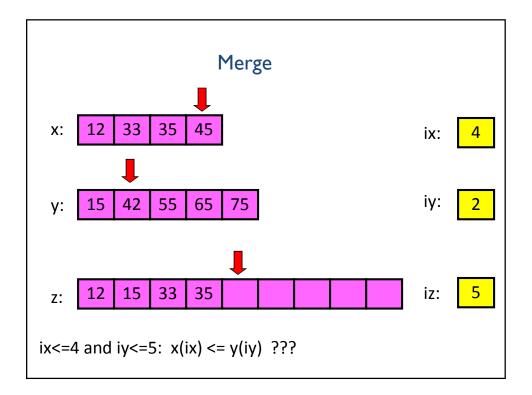


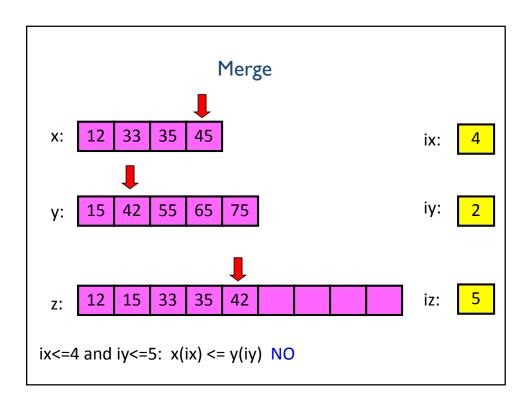


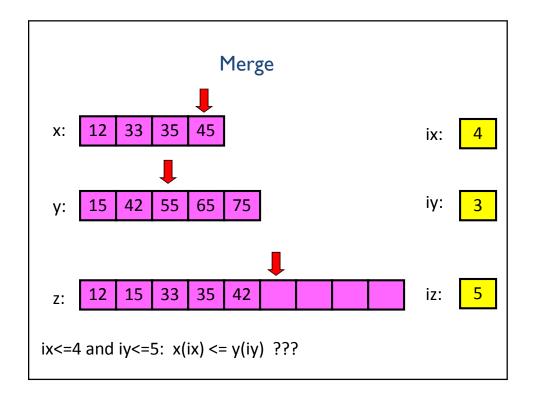


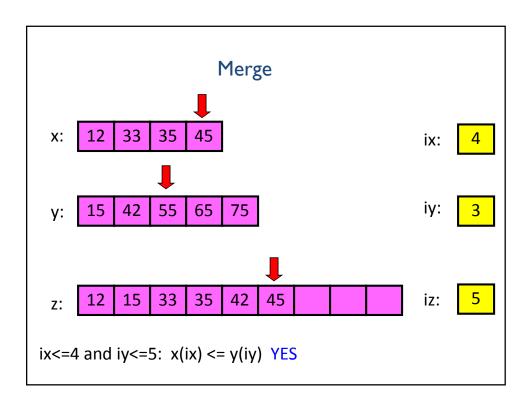


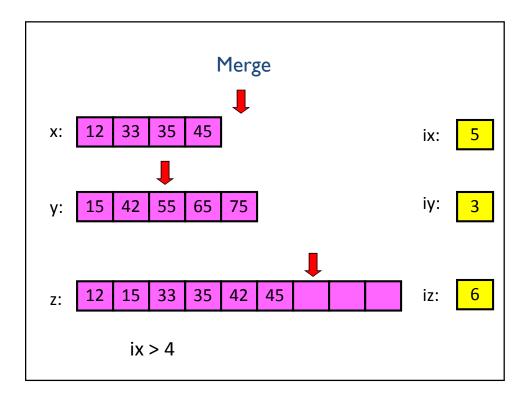


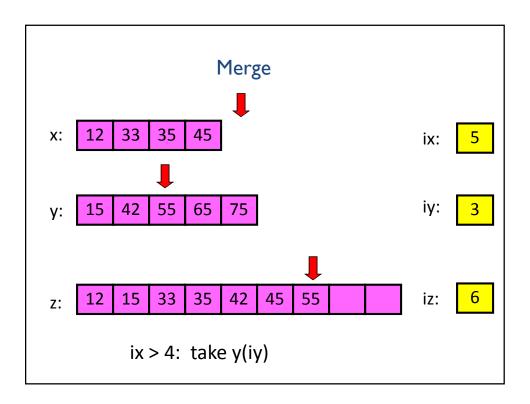


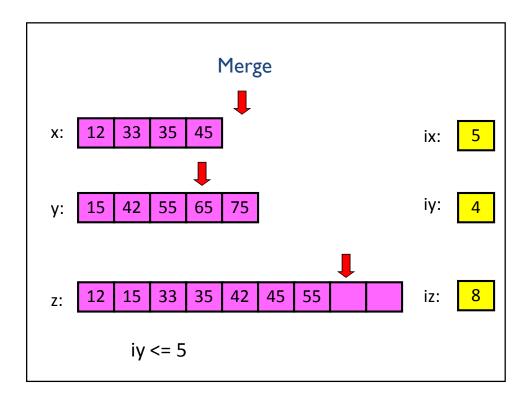


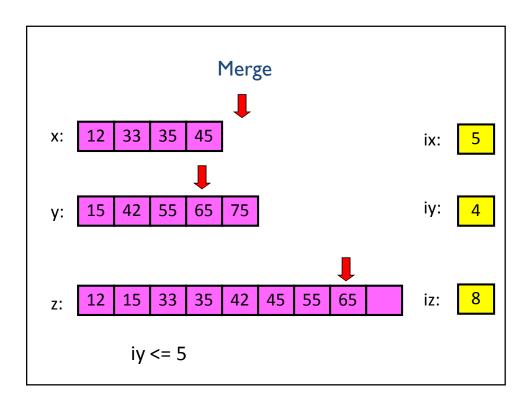


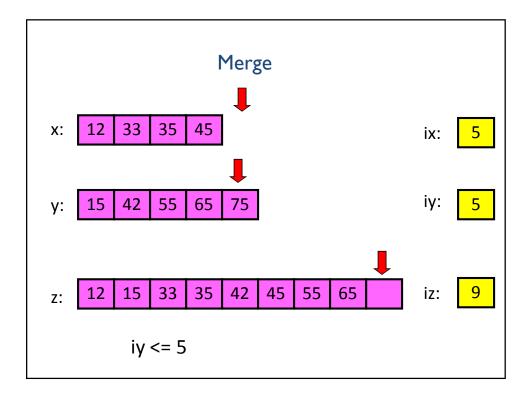


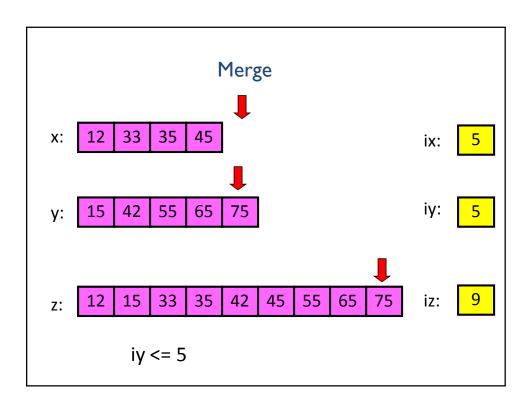












```
function z = merge(x,y)
nx = length(x); ny = length(y);
z = zeros(1,nx+ny);
ix = 1; iy = 1; iz = 1;
```

```
function z = merge(x,y)
nx = length(x); ny = length(y);
z = zeros(1, nx+ny);
ix = 1; iy = 1; iz = 1;
while ix<=nx && iy<=ny</pre>
end
% Deal with remaining values in x or y
```

```
function z = merge(x,y)
nx = length(x); ny = length(y);
z = zeros(1, nx+ny);
ix = 1; iy = 1; iz = 1;
while ix<=nx && iy<=ny
    if x(ix) <= y(iy)
        z(iz) = x(ix); ix=ix+1; iz=iz+1;
else
    z(iz) = y(iy); iy=iy+1; iz=iz+1;
end
end
% Deal with remaining values in x or y</pre>
```

```
function z = merge(x, y)
nx = length(x); ny = length(y);
z = zeros(1, nx+ny);
ix = 1; iy = 1; iz = 1;
while ix<=nx && iy<=ny
    if x(ix) \le y(iy)
        z(iz) = x(ix); ix=ix+1; iz=iz+1;
    else
        z(iz) = y(iy); iy=iy+1; iz=iz+1;
    end
end
while ix<=nx % copy remaining x-values</pre>
  z(iz) = x(ix); ix=ix+1; iz=iz+1;
while iy<=ny % copy remaining y-values
  z(iz) = y(iy); iy=iy+1; iz=iz+1;
end
```

```
function y = mergeSort(x)
% x is a vector. y is a vector
% consisting of the values in x
% sorted from smallest to largest.

n = length(x);
if n==1
    y = x;
else
    m = floor(n/2);
    yL = mergeSortL(x(1:m));
    yR = mergeSortR(x(m+1:n));
    y = merge(yL,yR);
end

InsightThroughComputing
```

```
function y = mergeSortL(x)
% x is a vector. y is a vector
% consisting of the values in x
% sorted from smallest to largest.

n = length(x);
if n==1
    y = x;
else
    m = floor(n/2);
    yL = mergeSortL_L(x(1:m));
    yR = mergeSortL_R(x(m+1:n));
    y = merge(yL,yR);
end

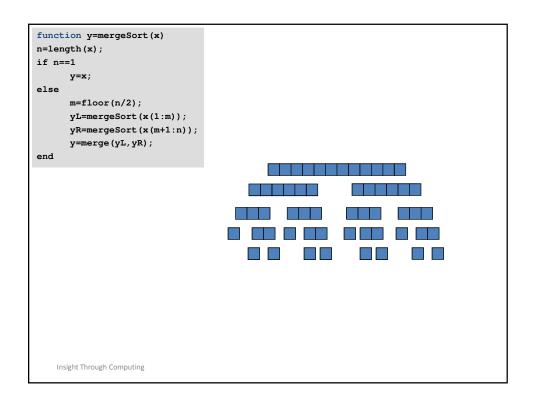
InsightThrough Computing
```

```
function y = mergeSort(x)
% x is a vector. y is a vector
% consisting of the values in x
% sorted from smallest to largest.

n = length(x);
if n==1
    y = x;
else
    m = floor(n/2);
    yL = mergeSort(x(1:m));
    yR = mergeSort(x(m+1:n));
    y = merge(yL,yR);
end

InsightThrough Computing
```

```
function y=mergeSort(x)
n=length(x);
if n==1
    y=x;
else
    m=floor(n/2);
    yL=mergeSort(x(1:m));
    yR=mergeSort(x(m+1:n));
    y=merge(yL,yR);
end
```



#### Running Time

- Masalah berukuran n diselesaikan secara rekursif dengan cara menyelesaikan submasalah berukuran n/b.
- Untuk menggabungkan jawaban dari submasalah2 tersebut perlu waktu sebesar d(n)
- Untuk menyelesaikan pekerjaan sebesar 1 satuan perlu waktu sebesar 1 satuan
- T(n) = a T(n/b) + d(n) untuk n > 1
   = 1 untuk n = 1

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#### Teorema:

Solusi dari persamaan:

$$T(n) = a T(n/b) + \theta(n^k)$$
 untuk  $n > 1$ , dengan  $a \ge 1$  dan  $b > 1$ 

#### adalah:

$$T(n) = O(n^{\log_b a}), \quad \text{jika } a > b^k$$
 
$$O(n^k \log n), \qquad \text{jika } a = b^k$$
 
$$O(n^k), \qquad \text{jika } a < b^k$$

- Binary Search: a = 1, b = 2, k = 0,
   a = b<sup>k</sup> -> O(n<sup>k</sup> log n)
- $T(n) = T(n/2) + c \rightarrow T(n) = O(\lg n)$
- Merge Sort : a = 2, b = 2, k = 1,
   a = b<sup>k -></sup> O(n<sup>k</sup> log n)
- $T(n) = 2T(n/2) + cn \rightarrow T(n) = O(n \lg n)$
- Max-min: a = 2, b = 2, k = 0,  $a > b^k -> O(n^{\log}b^a)$
- $T(n) = 2T(n/2) + c \Rightarrow T(n) = O(n^{\log_2 2})$  $\Rightarrow T(n) = O(n)$

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# **#1 Problem: Counting inversions**

<u>Input:</u> Array A Containing the numbers1, 2, 3,...., n in some arbitrary order

Output: Number of <u>inversions</u> = number of pairs (i,j) of array indices with i < j and A[ i ]> A[ j ]

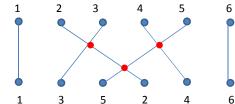
#### **Example and Motivation**

Example: Array A = [ 1 3 5 2 4 6]

[1 3 5 2 4 6]  $\rightarrow$  Inversions: (3,2), (5,2), (5,4)

#### **Motivation**

Numerical similiarity Measure between



Two rank list (quantify how close 2 different rank list with each other)

What is the largest- possible number of inversions that a-6 element array can have?  $O(n) = n^2$ 

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# D&C in counting inversions

- Possible adapt merge sort in counting inversions
- Sort and count
- Example: Misalkan L

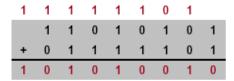
1 3 5 2 4 6

- → Membagi menjadi 2 sublist/subarray L menjadi n/2, misalkan A adalah sublist kiri dengan n/2 integer, B adalah sublist kanan dengan n/2 integer
- → Bagaimana merge sort? Pada saat merge pada operasi banding sisipkan count untuk inversions

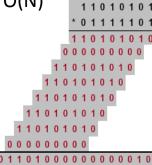
# Masalah Perkalian Bilangan Bulat

Andaikan a dan b adalah 2 buah bilangan bulat masing-masing N-digit:

Operasi penjumlahan: a+b => O(N)



Operasi perkalian : O(N<sup>2</sup>)



# Menggunakan teknik D&C

- Partisi setiap bilangan menjadi 2 @ N/2 digit
- Kalikan 4 bilangan berukuran N/2 digit tersebut
- Tambahkan 2 bilangan berukuran N/2 digit, kemudian dishift utk mendapat hasil akhir

```
123,456 \times 987,654 = (10^3 w + x) \times (10^3 y + z)
                     = 10^6 (wy) + 10^3 (wz + xy) + 10^0 (xz)
                     = 10^6 (121,401) + 10^3 (80,442 + 450,072) + 10^0 (298,224)
         123
                        121,401,299,224
          456
         987
         654
```

# Berapa kompleksitasnya?

$$ab = (10^{N/2}w + x)(10^{N/2}y + z)$$

$$T(N) = \underbrace{4T(N/2)}_{\text{recursive calls}} + \underbrace{\Theta(N)}_{\text{add, shift}} \Rightarrow T(N) = \Theta(N^2)$$

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# Pendekatan Karatsuba

```
123,456 \times 987,654 = (10^{3}w + x) \times (10^{3}y + z)
= 10^{6}(wy) + 10^{3}(wz + xy) + 10^{0}(xz)
= 10^{6}(p) + 10^{3}(r - p - q) + 10^{0}(q)
= 10^{6}(121,401) + 10^{3}(950,139 - 121,401 - 298,224) + 10^{0}(298,224)
z = 654
p = wy
q = xz
r = (w + x)(y + z)
```

# Pendekatan Karatsuba

Untuk mengalikan 2 buah bilangan berukuran N digit:

- Tambahkan 2 bilangan N/2 digit
- Kalikan 3 bilangan N/2 digit
- Kurangkan 2 bilangan N/2 digit, kemudian lakukan shift untuk mendapatkan hasil akhir

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# Berapa kompleksitasnya?

```
ab = (10^{N/2}w + x)(10^{N/2}y + z)
T(N) \leq \underbrace{T(\lfloor N/2 \rfloor) + T(\lceil N/2 \rceil) + T(1+\lceil N/2 \rceil)}_{\text{recursive calls}} + \underbrace{\Theta(N)}_{\text{add, subtract, shift}}
\Rightarrow T(N) = O(N^{\log_2 3})
```

Karatsuba-Ofman (1096) :  $T(n) = O(N^{1.585})$ 

### **Masalah Perkalian matriks**

Hitung C = A.B, dengan A dan B masing-masing berukuran NxN, sebagai contoh:

$$\begin{pmatrix} 26 & 62 & 98 \\ \hline 80 & 224 & 368 \\ \hline 134 & 386 & 638 \end{pmatrix} = \begin{pmatrix} 0 & 2 & 4 \\ \hline 6 & 8 & 10 \\ \hline 12 & 14 & 16 \end{pmatrix} \times \begin{pmatrix} 1 & 7 & 13 \\ \hline 3 & 9 & 15 \\ \hline 5 & 11 & 17 \end{pmatrix}$$

$$\begin{bmatrix} c_{11} & c_{12} & c_{13} & \cdots & c_{1N} \\ c_{21} & c_{22} & c_{23} & \cdots & c_{2N} \\ c_{31} & c_{32} & c_{33} & \cdots & c_{3N} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ c_{N1} & c_{N2} & c_{N3} & \cdots & c_{NN} \end{bmatrix} = \begin{pmatrix} a_{11} & a_{12} & a_{13} & \cdots & a_{1N} \\ a_{21} & a_{22} & a_{23} & \cdots & a_{2N} \\ a_{31} & a_{32} & a_{33} & \cdots & a_{3N} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ a_{N1} & a_{N2} & a_{N3} & \cdots & a_{NN} \end{pmatrix} \times \begin{pmatrix} b_{11} & b_{12} & b_{13} & \cdots & b_{1N} \\ b_{21} & b_{22} & b_{23} & \cdots & b_{2N} \\ b_{31} & b_{32} & b_{33} & \cdots & b_{3N} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ b_{N1} & b_{N2} & b_{N3} & \cdots & b_{NN} \end{pmatrix}$$

Kompleksitas algoritma adalah :  $\theta(N^3)$ 

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#### **Teknik D&C**

Divide: Partisi A dan B menjadi 4 buah N/2 x N/2

Conquer: Kalikan 8 matriks tersebut secara rekursif

**Combine:** Gabungkan hasilnya dengan 4 operasi penjumlahan

$$\begin{pmatrix} C_{11} & C_{12} \\ C_{21} & C_{22} \end{pmatrix} = \begin{pmatrix} A_{11} & A_{12} \\ A_{21} & A_{22} \end{pmatrix} \begin{pmatrix} B_{11} & B_{12} \\ B_{21} & B_{22} \end{pmatrix}$$

$$\begin{array}{rcl} \textbf{\textit{C}}_{11} & = & (\textbf{\textit{A}}_{11} \times \textbf{\textit{B}}_{11}) + (\textbf{\textit{A}}_{12} \times \textbf{\textit{B}}_{21}) \\ \textbf{\textit{C}}_{12} & = & (\textbf{\textit{A}}_{11} \times \textbf{\textit{B}}_{12}) + (\textbf{\textit{A}}_{12} \times \textbf{\textit{B}}_{22}) \\ \textbf{\textit{C}}_{21} & = & (\textbf{\textit{A}}_{21} \times \textbf{\textit{B}}_{11}) + (\textbf{\textit{A}}_{22} \times \textbf{\textit{B}}_{21}) \\ \textbf{\textit{C}}_{22} & = & (\textbf{\textit{A}}_{21} \times \textbf{\textit{B}}_{12}) + (\textbf{\textit{A}}_{22} \times \textbf{\textit{B}}_{22}) \end{array}$$

$$T(N) = \underbrace{8T(N/2)}_{\text{recursive calls}} + \underbrace{\Theta(N^2)}_{\text{add, form submatrices}} \Rightarrow T(N) = \Theta(N^3)$$

# Strassens's Matrix Multiplication

$$\left|\begin{array}{cc} C_{11} & C_{12} \\ C_{21} & C_{22} \end{array}\right| = \left|\begin{array}{cc} A_{11} & A_{12} \\ A_{21} & A_{22} \end{array}\right| \left|\begin{array}{cc} B_{11} & B_{12} \\ B_{21} & B_{22} \end{array}\right|$$

$$\begin{split} &P_1 = (A_{11} + A_{22})^* (B_{11} + B_{22}) & C_{11} = P_1 + P_4 - P_5 + P_7 \\ &P_2 = (A_{21} + A_{22}) * B_{11} & C_{12} = P_3 + P_5 \\ &P_3 = A_{11} * (B_{12} - B_{22}) & C_{21} = P_2 + P_4 \\ &P_4 = A_{22} * (B_{21} - B_{11}) & C_{22} = P_1 + P_3 - P_2 + P_6 \\ &P_5 = (A_{11} + A_{12}) * B_{22} \\ &P_6 = (A_{21} - A_{11}) * (B_{11} + B_{12}) \\ &P_7 = (A_{12} - A_{22}) * (B_{21} + B_{22}) \end{split}$$

Total: 7 perkalian, 18 penjumlahan/ pengurangan

#### **Teknik D&C**

**Divide:** Partisi A dan B menjadi 4 buah N/2 x N/2

Conquer: Kalikan 8 matriks tersebut secara rekursif

**Combine:** Gabungkan hasilnya dengan 4 operasi penjumlahan

$$\begin{pmatrix} C_{11} & C_{12} \\ C_{21} & C_{22} \end{pmatrix} = \begin{pmatrix} A_{11} & A_{12} \\ A_{21} & A_{22} \end{pmatrix} \begin{pmatrix} B_{11} & B_{12} \\ B_{21} & B_{22} \end{pmatrix}$$

$$\begin{array}{rcl} C_{11} &=& (A_{11}\!\times\!B_{11})\!+\!(A_{12}\!\times\!B_{21}) \\ C_{12} &=& (A_{11}\!\times\!B_{12})\!+\!(A_{12}\!\times\!B_{22}) \\ C_{21} &=& (A_{21}\!\times\!B_{11})\!+\!(A_{22}\!\times\!B_{21}) \\ C_{22} &=& (A_{21}\!\times\!B_{12})\!+\!(A_{22}\!\times\!B_{22}) \end{array}$$

$$T(\textit{N}) = \underbrace{8T(\textit{N}/2)}_{\text{recursive calls}} + \underbrace{\Theta(\textit{N}^2)}_{\text{add, form submatrices}} \ \Rightarrow \ T(\textit{N}) = \Theta(\textit{N}^3)$$

$$\begin{split} \mathbf{C}_{11} &= \mathbf{P}_1 + \mathbf{P}_4 \cdot \mathbf{P}_5 + \mathbf{P}_7 \\ &= (\mathbf{A}_{11} + \mathbf{A}_{22})(\mathbf{B}_{11} + \mathbf{B}_{22}) + \mathbf{A}_{22} * (\mathbf{B}_{21} \cdot \mathbf{B}_{11}) \cdot (\mathbf{A}_{11} + \mathbf{A}_{12}) * \mathbf{B}_{22} + \\ &\quad (\mathbf{A}_{12} \cdot \mathbf{A}_{22}) * (\mathbf{B}_{21} + \mathbf{B}_{22}) \\ &= \mathbf{A}_{11} \, \mathbf{B}_{11} + \mathbf{A}_{11} \, \mathbf{B}_{22} + \mathbf{A}_{22} \, \mathbf{B}_{11} + \mathbf{A}_{22} \, \mathbf{B}_{22} + \mathbf{A}_{22} \, \mathbf{B}_{21} - \mathbf{A}_{22} \, \mathbf{B}_{11} \cdot \\ &\quad \mathbf{A}_{11} \, \mathbf{B}_{22} \cdot \mathbf{A}_{12} \, \mathbf{B}_{22} + \mathbf{A}_{12} \, \mathbf{B}_{21} + \mathbf{A}_{12} \, \mathbf{B}_{22} - \mathbf{A}_{22} \, \mathbf{B}_{21} - \mathbf{A}_{22} \, \mathbf{B}_{22} \\ &= \mathbf{A}_{11} \, \mathbf{B}_{11} + \mathbf{A}_{12} \, \mathbf{B}_{21} \end{split}$$

#### Metode Strassen

**Divide:** Partisi A dan B menjadi N/2 x N/2 Hitung 14 matriks berukuran N/2 x N/2 dengan 10 operasi penjumlahan/ pengurangan matriks

Conquer: Secara rekursif, hitung Pi = Ai.Bi, untuk i = 1,..7Combine: Gabungkan 7 perkalian menjadi elemen C menggunakan 8 operasi penjumlahan/ pengurangan

$$\begin{pmatrix} \textbf{\textit{C}}_{11} & \textbf{\textit{C}}_{12} \\ \textbf{\textit{C}}_{21} & \textbf{\textit{C}}_{22} \end{pmatrix} = \begin{pmatrix} \textbf{\textit{A}}_{11} & \textbf{\textit{A}}_{12} \\ \textbf{\textit{A}}_{21} & \textbf{\textit{A}}_{22} \end{pmatrix} \begin{pmatrix} \textbf{\textit{B}}_{11} & \textbf{\textit{B}}_{12} \\ \textbf{\textit{B}}_{21} & \textbf{\textit{B}}_{22} \end{pmatrix}$$

$$\mathsf{T}(N) = \underbrace{\mathsf{T}(N/2)}_{\text{recursive calls}} + \underbrace{\Theta(N^2)}_{\text{add, subtract}} \Rightarrow \mathsf{T}(N) = \Theta(N^{\log_2 7}) = O(N^{2.81})$$

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# Latihan

 Gunakan algoritme Strassen untuk menghitung perkalian matriks (cormen et.al 2009 – 4.2-1):

$$\begin{pmatrix} 1 & 3 \\ 7 & 5 \end{pmatrix} \begin{pmatrix} 6 & 8 \\ 4 & 2 \end{pmatrix}$$

#### Tugas:

- 1. Tuliskan algoritme strassen dalam bentuk pseudocode (Cormen *et.al* 2009 4.2-2)
- 2. Modifikasi algoritme pada merge sort, menjadi mergeinversions counting
- 3. Tugas Baca: algoritme karatsuba (tahapan, algoritme dalam konsep divide & conquer)