

# Perbandingan kinerja algoritma dalam beberapa bahasa pemrograman dengan paradigma pemrograman berbeda

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**Abstract**—Algoritma *Gaussian-Elimination* merupakan algoritma untuk menyelesaikan sistem persamaan linear dari suatu matriks. Meskipun dengan alur metode yang sama, namun bahasa pemrograman berbeda akan menghasilkan kinerja yang berbeda pula, Makalah ini akan membandingkan kinerja beberapa bahasa pemrograman untuk mengaplikasikan salah satu algoritma Aljabar Geometri.

**Keywords**— *Fungsional, Imperatif, Python, Lisp, Java, Gaussian*

## I. PENDAHULUAN

Algoritma *Gaussian-Elimination* merupakan algoritma untuk menyelesaikan sistem persamaan linear dari suatu matriks. Meskipun dengan alur metode yang sama, namun bahasa pemrograman berbeda akan menghasilkan kinerja yang berbeda pula, faktor perbedaan paradigma, fungsi primitif, dan kemampuan bahasa pemrograman menjadi faktor yang diduga menyebabkan perbedaan kinerja tersebut.

Makalah ini akan membandingkan kinerja beberapa bahasa pemrograman untuk mengaplikasikan salah satu algoritma Aljabar Geometri.

## II. DASAR TEORI

### A. Pseudo Code

*Pseudo code* Algoritma yang akan digunakan adalah sebagai berikut :

```
Algorithm 1 Gaussian elimination
function GAUSS( $A \in \mathbb{R}^{n \times n+1}$ )
  for ( $i = 1; i \leq n; i++$ ) do
    // Search for maximum in this column
     $maxEI = |A_{i,i}|$ 
     $maxRow = i$ 
    for ( $k = i + 1; k \leq n; k++$ ) do
      if  $|A_{k,i}| > maxEI$  then
         $maxEI = A_{k,i}$ 
         $maxRow = k$ 
      end if
    end for

    // Swap maximum row with current row
    for ( $k = i; k \leq n; k++$ ) do
       $tmp = A_{maxRow,k}$ 
       $A_{maxRow,k} = A_{i,k}$ 
       $A_{i,k} = tmp$ 
    end for

    // Make all rows below this one 0 in current column
    for ( $k = i + 1; k \leq n; k++$ ) do
       $c = -\frac{A_{k,i}}{A_{i,i}}$ 
      for ( $j = i; j \leq n; j++$ ) do
        if  $i == j$  then
           $A_{k,j} = 0$ 
        else
           $A_{k,j} = c \cdot A_{i,j}$ 
        end if
      end for
    end for
  end for

  // Solve equation for an upper triangular matrix
   $x = \{0\} \in \mathbb{R}^n$ 
  for ( $i = n; i \geq 1; i--$ ) do
     $x_i = \frac{A_{i,i+1}}{A_{i,i}}$ 
    for ( $k = i - 1; k \geq 1; k--$ ) do
       $A_{k,i+1} = A_{k,i} \cdot x_i$ 
    end for
  end for

  return  $x$ 
end function
```

### B. Paradigma pemrograman

Bahasa-bahasa yang dipilih untuk dibandingkan adalah bahasa Python, CommonLisp, Haskell, dan Java. Keempatnya dipilih karena mewakili paradigma berbeda, Python mewakili prosedural imperatif, CommonLisp mewakili fungsional list, Haskell mewakili fungsional non lisp, dan Java mewakili imperatif berorientasi objek.

Perbedaan imperatif dan fungsional adalah sebagai berikut

| Characteristic            | Imperative approach  | Functional approach  |
|---------------------------|--|--|
| Programmer focus          | How to perform tasks (algorithms) and how to track changes in state. | What information is desired and what transformations are required. |
| State changes             | Important.   | Non-existent.  |
| Order of execution        | Important.   | Low importance.  |
| Primary flow control      | Loops, conditionals, and function (method) calls.                    | Function calls, including recursion.                               |
| Primary manipulation unit | Instances of structures or classes.                                  | Functions as first-class objects and data collections.             |

### III. Percobaan

#### A. Kode dalam Python

```
def pprint(A):
    n = len(A)
    for i in range(0, n):
        line = ""
        for j in range(0, n+1):
            line += str(A[i][j]) +
"\t"
            if j == n-1:
                line += "| "
        print(line)
    print("")

def gauss(A):
    n = len(A)

    for i in range(0, n):
        # Search for maximum in this
column
        maxEl = abs(A[i][i])
        maxRow = i
        for k in range(i+1, n):
            if abs(A[k][i]) > maxEl:
                maxEl = abs(A[k][i])
                maxRow = k

        # Swap maximum row with
current row (column by column)
        for k in range(i, n+1):
```

```
tmp = A[maxRow][k]
A[maxRow][k] = A[i][k]
A[i][k] = tmp

# Make all rows below this one
0 in current column
for k in range(i+1, n):
    c = -A[k][i]/A[i][i]
    for j in range(i, n+1):
        if i == j:
            A[k][j] = 0
        else:
            A[k][j] += c *
A[i][j]

# Solve equation Ax=b for an upper
triangular matrix A
x = [0 for i in range(n)]
for i in range(n-1, -1, -1):
    x[i] = A[i][n]/A[i][i]
    for k in range(i-1, -1, -1):
        A[k][n] -= A[k][i] * x[i]
return x
```

```
if __name__ == "__main__":
    A =
[[1.00,0.00,0.00,0.00,0.00,0.00,-0.01]
',
[1.00,0.63,0.39,0.25,0.16,0.10,0.61],
[1.00,1.26,1.58,1.98,2.49,3.13,0.91],
[1.00,1.88,3.55,6.70,12.62,23.80,0.99]
',
[1.00,2.51,6.32,15.88,39.90,100.28,0.6
0 ],
[1.00,3.14,9.87,31.01,97.41,306.02,0.0
2]]

    #b = [[-0.01], [0.61], [0.91],
[0.99],[0.60],[0.02]]

    # Print input
    pprint(A)

    # Calculate solution
    x = gauss(A)

    print (x)
```

#### B. Kode dalam Common Lisp

```
(defmacro mapcar-1 (fn n list)
  "Maps a function of two parameters where the first one
is fixed, over a list"
  `(mapcar #'(lambda (l) (funcall ,fn ,n l)) ,list))

(defun gauss (m)
  (labels
    ((reduc (m) ; Reduce to triangular form
      (if (null (cdr m))
          m
          (cons (car m) (mapcar-1 #'cons 0 (reduc (mapcar
#'cdr (mapcar #'(lambda (r) (mapcar #'- (mapcar-1 #'*
```

```
(caar m) r)

(mapcar-1 #'* (car r) (car m)))) (cdr m)))))) ))
  (rev (m) ; Reverse each row except the last element
    (reverse (mapcar #'(lambda (r) (append (reverse
(butlast r) (last r))) m))) ))
  (catch 'result
    (let ((m1 (redc (rev (redc m))))))
      (reverse (mapcar #'(lambda (r) (let ((pivot (find-if-
not #'zerop r))) (if pivot (/ (car (last r)) pivot) (throw
'result 'singular)))) m1))))))
```

### C. Kode dalam Haskell

```
type Row = [Float]
type Matrix = [Row]

gaussianReduce :: Matrix -> Matrix
gaussianReduce matrix = fixlastrow $ foldl reduceRow
matrix [0..length matrix-1] where

--swaps element at position a with element at position
b.
swap xs a b
| a > b = swap xs b a
| a == b = xs
| a < b = let
(p1,p2) = splitAt a xs
(p3,p4) = splitAt (b-a-1) (tail p2)
in p1 ++ [xs!!b] ++ p3 ++ [xs!!a] ++ (tail p4)

reduceRow matrix1 r = let
--first non-zero element on or below (r,r).
firstnonzero = head $ filter (\x -> matrix1 !! x !! r /=
0) [r..length matrix1-1]

--matrix with row swapped (if needed)
matrix2 = swap matrix1 r firstnonzero

--row we're working with
row = matrix2 !! r

--make it have 1 as the leading coefficient
row1 = map (\x -> x / (row !! r)) row

--subtract nr from row1 while multiplying
subrow nr = let k = nr!!r in zipWith (\a b -> k*a - b)
row1 nr

--apply subrow to all rows below
nextrows = map subrow $ drop (r+1) matrix2

--concat the lists and repeat
in take r matrix2 ++ [row1] ++ nextrows

fixlastrow matrix' = let
a = init matrix'; row = last matrix'; z = last row; nz =
last (init row)
in a ++ [init (init row) ++ [1, z / nz]]
```

### D. Kode dalam JAVA

GaussianElimination.java

Below is the syntax highlighted version of GaussianElimination.java from §9.5 Numerical Linear Algebra.

```
/
*****
*****
* Compilation: javac GaussianElimination.java
* Execution: java GaussianElimination
*
* Gaussian elimination with partial pivoting.
*
* % java GaussianElimination
* -1.0
* 2.0
* 2.0
*
*****
*****/

public class GaussianElimination {
    private static final double EPSILON = 1e-10;

    // Gaussian elimination with partial pivoting
    public static double[] lsolve(double[][] A, double[]
b) {
        int N = b.length;

        for (int p = 0; p < N; p++) {

            // find pivot row and swap
            int max = p;
            for (int i = p + 1; i < N; i++) {
                if (Math.abs(A[i][p]) > Math.abs(A[max]
[p])) {
                    max = i;
                }
            }
            double[] temp = A[p]; A[p] = A[max]; A[max]
= temp;
            double t = b[p]; b[p] = b[max]; b[max] = t;

            // singular or nearly singular
            if (Math.abs(A[p][p]) <= EPSILON) {
                throw new RuntimeException("Matrix is
singular or nearly singular");
            }

            // pivot within A and b
            for (int i = p + 1; i < N; i++) {
                double alpha = A[i][p] / A[p][p];
                b[i] -= alpha * b[p];
                for (int j = p; j < N; j++) {
                    A[i][j] -= alpha * A[p][j];
                }
            }
        }
    }
}
```

```
}
```

```
}
```



```
}
```

```
}
```

```
//  
b a c k
```

#### IV. HASIL PERCOBAAN

Seluruh percobaan dilakukan dengan spesifikasi :

```
Dimass-MacBook-Pro:src dimassaputra$ python -mtimeit -s'import main' 'main.gau
[[[1.00,0.00,0.00,0.00,0.00,0.00,-0.01], [1.00,0.63,0.39,0.25,0.16,0.10,0.61]
1.00,1.26,1.58,1.98,2.49,3.13,0.91], [1.00,1.08,3.55,6.70,12.62,23.00,0.99], [1
,2.51,6.32,15.08,39.90,100.20,0.60 ], [1.00,3.14,9.87,31.01,97.41,306.02,0.02]

10000 loops, best of 3: 53.5 usec per loop
Dimass-MacBook-Pro:src dimassaputra$
```

substitution

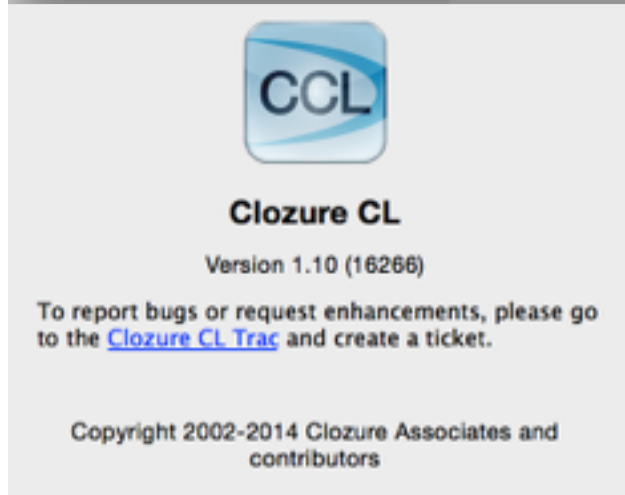
```
double[] x = new double[N];
for (int i = N - 1; i >= 0; i--) {
    double sum = 0.0;
    for (int j = i + 1; j < N; j++) {
        sum += A[i][j] * x[j];
    }
    x[i] = (b[i] - sum) / A[i][i];
}
return x;
}
```

// sample client

```
public static void main(String[] args) {
    int N = 3;
    double[][] A = { { 0, 1, 1 },
                    { 2, 4, -2 },
                    { 0, 3, 15 }
    };
    double[] b = { 4, 2, 36 };
    double[] x = lsolve(A, b);
}
```

// print results

```
for (int i = 0; i < N; i++) {
    System.out.println(x[i]);
}
```



Mesin :

IDE :



GHCI versi 7.10.1

```
{GAUSS M1}
took 820 microseconds (0.000820 seconds) to run.
During that period, and with 4 available CPU cores,
    80 microseconds (0.000080 seconds) were spent in user mode
    872 microseconds (0.000872 seconds) were spent in system mode
16,832 bytes of memory allocated.
0 minor page faults, 10 major page faults, 0 swaps.
[-0.0099999999 1.6027923 -1.6132091 1.2455008 -0.4909925 0.06576109]
```

Bahasa :  
Java 1.8  
Python 2.7

Matriks uji :

```
[1.00,0.00,0.00,0.00,0.00,0.00,-0.01],  
[1.00,0.63,0.39,0.25,0.16,0.10,0.61],  
[1.00,1.26,1.58,1.98,2.49,3.13,0.91],  
[1.00,1.88,3.55,6.70,12.62,23.80,0.99]  
,  
[1.00,2.51,6.32,15.88,39.90,100.28,0.6  
0 ],  
[1.00,3.14,9.87,31.01,97.41,306.02,0.0  
2]
```

Pengukuran :

Dengan commonlisp

Dengan Python

Dengan Java

## REFERENCES

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3. <http://introcs.cs.princeton.edu/java/95linear/GaussianElimination.java.html> Waktu akses 16 desember 2015 11:00
4. <https://luckytoilet.wordpress.com/2010/02/21/solving-systems-of-linear-equations-in-haskell/> Waktu akses 16 desember 2015 11:00

## PERNYATAAN

Dengan ini saya menyatakan bahwa makalah yang saya tulis ini adalah tulisan saya sendiri, bukan saduran, atau terjemahan dari makalah orang lain, dan bukan plagiasi.

Bandung, 27 November 2013

ttd

Nama dan NIM

```
64321  
-0.01  
1.6027903945020974  
-1.6132030599054943
```

Dengan haskell

```
*Main> gaussianReduce [[1.00,0.00,0.00,0.00  
,2.51,6.32,15.88,39.90,100.28,0.60 ], [1.00,  
[[1.0,0.0,0.0,0.0,0.0,0.0,-1.0e-2], [-0.0,1.  
3,9.588836,6.775985e-2], [0.0,0.0,0.0,0.0,1.  
(0.03 secs, 10,361,376 bytes)
```

Jika satuan waktu diubah ke milisecond maka :

Haskell : 30 ms  
Java : 0.006431 ms  
Python : 0.0535ms  
CommonLisp : 0.82 ms

## V. SIMPULAN

Java adalah bahasa pemrograman yang tercepat untuk membandingkan kinerja algoritma Gaussian elimination, namun dari segi jumlah baris, CommonLisp adalah yang tercepat