

# IE531: Algorithms for Data Analytics

Spring, 2018

## Homework 1: Review of Linear Algebra, Probability & Statistics and Computing

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1. **Linear Algebra:** Consider the following set of linear equations involving six equations in five unknowns  $x_1, x_2, \dots, x_5$ .

$$\underbrace{\begin{pmatrix} 2 & 0 & 0 & 6 & 2 \\ 1 & -1 & -1 & 4 & 0 \\ 2 & -2 & 2 & 4 & 0 \\ 2 & -2 & 0 & 6 & 0 \\ -4 & 4 & -8 & -4 & 0 \\ 4 & 0 & -2 & 14 & 4 \end{pmatrix}}_A \underbrace{\begin{pmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \\ x_5 \end{pmatrix}}_x = \underbrace{\begin{pmatrix} 2 \\ 7 \\ 18 \\ 16 \\ -40 \\ 2 \end{pmatrix}}_y$$

- (a) Show that there a solution to these equations.

```
>> A = [2 0 0 6 2; 1 -1 -1 4 0; 2 -2 2 4 0; 2 -2 0 6 0; -4 4 -8 -4 0; 4 0 -2 14 4];
>> y = [2; 7; 18; 16; -40; 2];
>> x = A \ y;
Warning: Rank deficient, rank = 3, tol = 2.368291e-14.
>> x
```

x =

```
0
0
3.6667
2.6667
-7.0000
```

- (b) Present a general formula for the set of all solutions that satisfy these equations.

The Reduced Row Echelon Form of Matrix  $(A | y)$  is as follows:

Reduced\_A =

```
1      0      0      3      1      1
0      1      0      0      1     -7
0      0      1     -1      0      1
0      0      0      0      0      0
0      0      0      0      0      0
0      0      0      0      0      0
```

So the general formula for the solutions will be:

$$x^T = [8-3x+y, y, 1+x, x, -7-y]^T$$

(c) Verify the general formula using MATLAB.

Define  $x=0$  and  $y=1$ , using MATLAB to calculate the matrix multiplication of  $Ax$ , the result is:

2
7
18
16
-40
2

So this is the general formula for this equation.

(d) Show that

$$\begin{pmatrix} -7\lambda_1 - 4\lambda_2 + 8 \\ -7\lambda_1 - 7\lambda_2 \\ 1 - \lambda_2 \\ -\lambda_2 \\ -7 + 7\lambda_1 + 7\lambda_2 \end{pmatrix} \quad (1)$$

and

$$\begin{pmatrix} a \\ -7a - 7b \\ -\frac{8}{3}a - \frac{7}{3}b + \frac{11}{3} \\ -\frac{8}{3}a - \frac{7}{3}b + \frac{8}{3} \\ -7 + 7a + 7b \end{pmatrix}. \quad (2)$$

are solutions to the equation  $Ax = y$  identified earlier.

According to the Reduced Row Echelon Form of  $A \mid y$ , we can extract three equations from it:

$$\begin{aligned} x_1 + 3x_4 + x_5 &= 1 \\ x_2 + x_5 &= -7 \\ x_3 - x_4 &= 1 \end{aligned}$$

Applying both of the solutions to  $Ax=y$ , and we can get that both (1) and (2) are correct solutions to the matrix multiplication.

(e) Present a cogent argument in support of the claim that even though the solution identified by equations (1) and (2) look different, they are in effect the same.

$$\begin{aligned} \lambda_1 &= \frac{-1}{7}, & \lambda_2 &= 0 \\ a &= 9, & b &= \frac{-19}{7} \end{aligned}$$

(f) Show that if add the constraints

$$\begin{aligned} 7x_4 + x_5 &= 7 \\ x_2 + 2x_5 &= 7, \end{aligned}$$

in addition to those already in the requirement that  $Ax = y$  as described in problem 1, there can be only one solution to the combined set of equations/constraints.

```
>> AA = [2 0 0 6 2; 1 -1 -1 4 0; 2 -2 2 4 0; 2 -2 0 6 0; -4 4 -8 -4 0; 4 0 -2 14 4; 0 0 0 7 1; 0 1 0 0 2];
>> yy = [2; 7; 18; 16; -40; 2; 7; 7];
>> xx = AA \ yy;
>> rank(AA)

ans =

     5

>> xx

xx =

-10.0000
-21.0000
-0.0000
-1.0000
14.0000
```

Because the rank of  $(A \mid y)$  is 5, which is the number of unknown variables. There is only one solution to this equation.

**2. Generating RVs using the Inverse Transform Technique:** You may want to use the various C++ code samples on Compass (along with some graphing/plotting software) to verify/experiment-with things before you put your answers down for this problem.

(a) The triangular distribution has a probability density function

$$f(x) = \begin{cases} x & 0 \leq x \leq 1 \\ 2 - x & 1 < x \leq 2 \\ 0 & \text{otherwise.} \end{cases} \quad (3)$$

In three/four sentences describe how you can generate i.i.d. r.v's that are distributed according to equation 3.

First, you should find a formula for the quantile function  $F_X^{-1}$ . Then, you need generate a uniform random number  $u$ . Via Inverse Transform Method, we can return the random number  $x = F_X^{-1}(u)$

$$f(x) = \begin{cases} x & (0 \leq x \leq 1) \\ 2 - x & (1 \leq x \leq 2) \\ 0 & \text{otherwise} \end{cases}$$

$$F(x) = \begin{cases} \frac{x^2}{2} & (0 \leq x \leq 1) \\ 1 - \frac{(2-x)^2}{2} & (1 \leq x \leq 2) \\ 0 & (x < 0) \\ 1 & (x > 2) \end{cases}$$

(b) What is the i.i.d. distribution generated by repeated calls to the code shown below?

```
double blah1( )
{
  (double) x = get_uniform();
  if (x <= 0.5)
    return (1 + sqrt(2x));
  else
    return (1 - sqrt(2 - 2x));
}
```

$$F(x) = \begin{cases} 1 & (x \geq 2) \\ \frac{1}{2}(x-1)^2 & (1 \leq x \leq 2) \\ 1 - \frac{1}{2}(x-1)^2 & (0 \leq x \leq 1) \\ 0 & (x \leq 0) \end{cases}$$

(c) What is the i.i.d. distribution generated by repeated calls to the code shown below?

```
double blah2( )
{
  (double) x = get_uniform();
  if (x <= 0.5)
    return (2 - sqrt(1 - 2x));
  else
    return (sqrt(2x - 1));
}
```

$$F(x) = \begin{cases} 1 & (x \geq 2) \\ 1 - \frac{1}{2}(2-x)^2 & (1 \leq x \leq 2) \\ \frac{1}{2}x^2 & (0 \leq x \leq 1) \\ 0 & (x \leq 0) \end{cases}$$

### 3. General Programming Concepts:

(a) Consider the two versions of the code shown in figure 1. Suppose I type the string “kablooey” as input, give me the reasoning behind the output each of the programs generate. This is a straightforward exercise in programming.

```
#include <iostream>
#include <cmath>
using namespace std ;
void f()
{
    char c;
    cin.get(c);
    // this line reads character "c"
    if ('\n' == c)
        // '\n' is "return/newline"
        return;
    cout << c;
    f();
}
int main()
{
    f();
    cout << endl;
}
```

(a) Problem 3a(I)

```
#include <iostream>
#include <cmath>
using namespace std ;
void f()
{
    char c;
    cin.get(c);
    // this line reads character "c"
    if ('\n' == c)
        // '\n' is "return/newline"
        return;
    f();
    cout << c;
}
int main()
{
    f();
    cout << endl;
}
```

(b) Problem 3a(II)

Figure 1: (Two versions of the) Code for problem 3a.

#### Version 1 (LHS):

It will return the same string as input ‘kablooey’. The reason is that even there is recursion in the program. It will output first then re-call the function again. So it will return every character in the input string first, then use the rest of characters to call f() again.

#### Version 2 (RHS):

It will return the reverse order of the input string – ‘yeoolbak’. This function is different from the LHS one. Because it calls itself first so it will kind of calling a stack to save each character then when it is done, output each character in the stack. So it will return the reverse order of the input string.

(b) The greatest common divisor (GCD) of two positive numbers  $m$  and  $n$  is the largest number  $k$  that divides  $m$  and  $n$ . That is,  $m/k$  and  $n/k$  leaves no remainder. Consider the C++ code shown in figure 2. Using the fact that the GCD of two numbers does not change if the smaller number is subtracted from the larger number, show that the recursive function  $\text{gcd}(m, n)$  in the code shown in figure 2 implements the GCD computation.

(Note: Please do not give me an illustrative example as a “proof” of that the code does what it is supposed to do. I am looking for a rigorous attempt at showing the correctness of the code for any pair of numbers.)

```
#include <iostream>
using namespace std;
long gcd(long m, long n)
{
    if (m == n)
        return n;
    else if (m < n)
        return gcd(m, n-m);
    else
        return gcd(m-n, n);
}
int main()
{
    cout << gcd(259, 111) << endl;
}
```

Figure 2: Problem 3b.

**Proof:**

The case  $n = m$  is clear.

Every time,  $n-m$  (or  $m-n$ ) can be written like  $n-qm$ . Assume that at least one of  $n$  and  $m$  is nonzero. Now  $\text{gcd}(n, m)$  divides  $n$ ,  $m$  and  $n - qm$ , hence

$$\text{gcd}(n, m) \leq \text{gcd}(m, n - qm).$$

On the other hand,  $\text{gcd}(m, n - qm)$  divides  $m$ ,  $n - qm$  and  $n = (n - qm) + qm$ . so

$$\text{gcd}(m, n - qm) \leq \text{gcd}(n, m).$$

So, in every recursion, it will give the right answer because  $\text{gcd}(m, n - qm) = \text{gcd}(n, m)$  at the end.

(c) What is the output of the C++ code shown in figure 3. Make sure you give me your reasoning for your answer.

```
#include <iostream>
using namespace std;
void print_integer (int num)
{
    putchar (num % 10 + 'A');
    if (num / 10)
        print_integer(num / 10);
}
int main()
{
    print_integer (1234); cout << endl;
}
```

Figure 3: Problem 3c.

What is the output of the above program? What is the reasoning behind the output that this program generates?

**Output:** 'EDCB'

**Reason:**

It recursively call the function print\_integer() and every time it is divided by 10. So argument in print\_integer() function is divided by 10 every time and leaves the digit behind point. num % 10 + 'A' means that extract the last digit in num and add it to the ASCII number of character 'A' so we will get B, C, D, E, F and G etc..

(d) My review of computing contains the Frame-Stewart solution to the k-peg version of the Tower of Hanoi problem. Consider the following solution to the 4-peg version of the problem.

**Alternate Solution to 4-Peg Tower of Hanoi Problem**

```
1: int k =  $\lfloor \sqrt{2 * n} \rfloor$ ;
2: Move_Using_Four_Pegs (n - k, source, intermediate_1, intermediate_2, destination);
3: Move_Using_Four_Pegs (k - 1, source, intermediate_2, destination, intermediate_1);
4: cout << "Move the top disk from peg " << source << " to peg " << destination << endl;
5: Move_Using_Four_Pegs (k - 1, intermediate_2, destination, intermediate_1, source);
6: Move_Using_Four_Pegs (n - k, intermediate_1, destination, intermediate_2, source);
```

Comment on the correctness of this algorithm. Will this work?

Code performance result as below:

no\_of\_disks = 3

Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegD  
Move the top disk from pegB to pegD

no\_of\_disks = 4

Move the top disk from pegA to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegD to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegD  
Move the top disk from pegB to pegA  
Move the top disk from pegB to pegD  
Move the top disk from pegA to pegD -> illegal here

no\_of\_disks = 5

Move the top disk from pegA to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegD to pegB  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegA



Move the top disk from pegC to pegD  
Move the top disk from pegA to pegD  
Move the top disk from pegB to pegA  
Move the top disk from pegB to pegD  
Move the top disk from pegA to pegD

no\_of\_disks = 6

Move the top disk from pegA to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegD to pegB  
Move the top disk from pegC to pegB  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegD  
Move the top disk from pegA to pegD  
Move the top disk from pegB to pegC  
Move the top disk from pegB to pegA  
Move the top disk from pegB to pegD  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegD

no\_of\_disks = 7

Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegD to pegB  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegB  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegD  
Move the top disk from pegA to pegD  
Move the top disk from pegB to pegD  
Move the top disk from pegB to pegC

Move the top disk from pegD to pegC  
Move the top disk from pegB to pegA  
Move the top disk from pegB to pegD  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegB  
Move the top disk from pegC to pegD  
Move the top disk from pegB to pegD

no\_of\_disks = 8

Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegD to pegB  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegB  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegD to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegB  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegD  
Move the top disk from pegA to pegD  
Move the top disk from pegB to pegD  
Move the top disk from pegB to pegD  
Move the top disk from pegB to pegC  
Move the top disk from pegD to pegC  
Move the top disk from pegB to pegA  
Move the top disk from pegB to pegD  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegB  
Move the top disk from pegC to pegD  
Move the top disk from pegB to pegD

no\_of\_disks = 9

Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegA to pegC

Move the top disk from pegA to pegD  
Move the top disk from pegC to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegD to pegA  
Move the top disk from pegD to pegB  
Move the top disk from pegA to pegB  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegB  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegD to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegB  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegD  
Move the top disk from pegA to pegD  
Move the top disk from pegB to pegD  
Move the top disk from pegB to pegD  
Move the top disk from pegB to pegC  
Move the top disk from pegD to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegB to pegA  
Move the top disk from pegC to pegA  
Move the top disk from pegB to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegD  
Move the top disk from pegB to pegD  
Move the top disk from pegC to pegB  
Move the top disk from pegC to pegD  
Move the top disk from pegB to pegD

no\_of\_disks = 10

Move the top disk from pegA to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegD to pegC  
Move the top disk from pegA to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegD  
Move the top disk from pegA to pegB

Move the top disk from pegD to pegA  
Move the top disk from pegD to pegB  
Move the top disk from pegA to pegB  
Move the top disk from pegC to pegD  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegB  
Move the top disk from pegA to pegB  
Move the top disk from pegD to pegB  
Move the top disk from pegA to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegD to pegC  
Move the top disk from pegA to pegD  
Move the top disk from pegC to pegB  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegD  
Move the top disk from pegA to pegD  
Move the top disk from pegB to pegD  
Move the top disk from pegB to pegA  
Move the top disk from pegB to pegD  
Move the top disk from pegB to pegC  
Move the top disk from pegD to pegC  
Move the top disk from pegA to pegC  
Move the top disk from pegB to pegC  
Move the top disk from pegB to pegA  
Move the top disk from pegC to pegA  
Move the top disk from pegB to pegD  
Move the top disk from pegA to pegB  
Move the top disk from pegA to pegD  
Move the top disk from pegB to pegD  
Move the top disk from pegC to pegA  
Move the top disk from pegC to pegB  
Move the top disk from pegC to pegD  
Move the top disk from pegB to pegD  
Move the top disk from pegA to pegD

There exists some illegal move from peg to peg (large disk on small disk), so this solution is not correct.