Assignment #2

Yamakawa's Fuzzy Controller



INSTRUCTIONS



DOCUMENTATION GUIDE



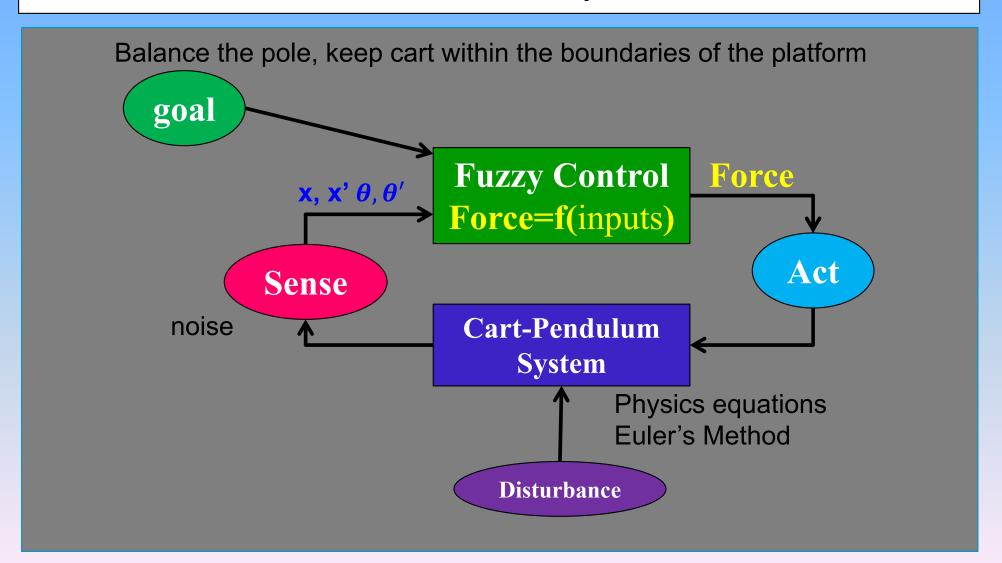
MEMBERSHIP FUNCTION VIEWER



CHECKLIST

Feedback Control/Closed Loop Control

 Closed-loop control allows for uncertainty in the model as well as noise and disturbances in the system under control



Solve the tutorial first, before studying this lecture.

Fuzzy Logic Tutorial

2 Inputs, 9 rules

Fuzzy Controller

Start-up codes

SEARCH

Cross-platform Start-up Code: makefile

Executable filename

Windows support

macOS support

Linux support

endif

```
makefile
                                      The start-up system is comprised of multiple files.
     CC := g++
     TARGET := main
     # Detect the operating system
     ifeq ($(OS),Windows_NT)
         CFLAGS := -02 -std=c++14 -Wall -c -fpermissive -fconserve-space -Wno-write-strings
         LFLAGS := -lgdi32
         EXTENSION := .exe
         CLEANUP := del
                                                                                          Indented statements
         CLEANUP OBJS := del *.o
                                                                                          are preceded by a
         # Find all source files (.cpp) and header files (.h)
         SRCS := main.cpp graphics.cpp transform.cpp sprites.cpp fuzzylogic.cpp
                                                                                          tab.
         HDRS := graphics.h transform.h sprites.h fuzzylogic.h
     else
         UNAME S := \$(shell uname -s)
         ifeq ($(UNAME_S),Darwin)
             # macOS
             EXTENSION := .out
22
23
24
25
26
27
             CFLAGS := -02 -std=c++14 -Wall -I/usr/local/include -L/usr/local/lib -c -Wno-write-strings
             LFLAGS := -L/usr/local/lib -lSDL bgi -lSDL2
             CLEANUP := rm -f
                                                                                              The program
             CLEANUP OBJS := rm -f *.o
                                                                                           requires that you
             # Find all source files (.cpp) and header files (.h)
28
29
             SRCS := main.cpp transform.cpp sprites.cpp fuzzylogic.cpp
                                                                                            "build" it using a
             HDRS := transform.h sprites.h fuzzylogic.h
                                                                                                makefile.
         else ifeq ($(UNAME_S),Linux)
             # Linux
             EXTENSION := .out
             CFLAGS := -02 -std=c++14 -Wall -I/usr/local/include -L/usr/local/lib -c -Wno-write-strings
             LFLAGS := -1SDL bgi -1SDL2
36
37
38
             CLEANUP := rm -f
             CLEANUP_OBJS := rm -f *.o
             # Find all source files (.cpp) and header files (.h)
             SRCS := main.cpp transform.cpp sprites.cpp fuzzylogic.cpp
             HDRS := transform.h sprites.h fuzzylogic.h
         endif
```

SEARCH

Cross-platform Start-up Code: makefile

```
makefile
                             CC := g++
                             TARGET := main
                             # Detect the operating system
                             ifeq ($(OS),Windows_NT)
                                 CFLAGS := 02 -std=c++14 -Wall -c -fpermissive -fconserve-space -Wno-write-strings
                                 LFLAGS
                                          -lgdi32
Windows support
                                 EXTENSION := .exe
                                 CLEANUP := del
                                 CLEANUP OBJS := del *.o
                                 # Find all source files (.cpp) and header files (.h)
                                 SRCS := main.cpp graphics.cpp transform.cpp sprites.cpp fuzzylogic.cpp
                                 HDRS := graphics.h transform.h sprites.h fuzzylogic.h
                             else
                                 UNAME S := \$(shell uname -s)
                                 ifeq ($(UNAME_S),Darwin)
                                     # macOS
                                     EXTENSION := .out
                                     CFLAGS := -02 -std=c++14 -Wali -l/usr/local/include -L/usr/local/lib -c -Wno-write-strings
                                     LFLAGS := -L/usr/local/lib -lSDL bgi -lSDL2
                       24
25
26
27
                                     CLEANUP := rm -f
                                                                                                           SDL2 and SDL bgi
                                     CLEANUP OBJS := rm -f *.o
                                                                                                       libraries require separate
                                     # Find all source files (.cpp) and header files (.h)
                       28
29
                                     SRCS := main.cpp transform.cpp sprites.cpp fuzzylogic.cpp
                                                                                                     installation steps for macOS
                                     HDRS := transform.h sprites.h fuzzylogic.h
                                                                                                            and Linux systems
                                 else ifeq ($(UNAME_S),Linux)
                                     # Linux
                                     EXTENSION := .out
                                     CFLAGS := _92 -5td=c++14 -Wall -I/usr/local/include -L/usr/local/lib -c -Wno-write-strings
                                     LFLAGS : < -1SDL bgi -1SDL2
                       36
37
38
                                     CLEANUP := TIT - F
                                     CLEANUP_OBJS := rm -f *.o
                                     # Find all source files (.cpp) and header files (.h)
                                                                                                                                   6
                                     SRCS := main.cpp transform.cpp sprites.cpp fuzzylogic.cpp
                                     HDRS := transform.h sprites.h fuzzylogic.h
```

Linux support

endif

endif

macOS support

Fuzzy Logic Engine

C/C++ version

Neural Network and Fuzzy Logic Applications in C/C++ (Wiley Professional Computing) by Stephen Welstead

Fuzzy Inference System

A function that can execute a complete fuzzy inference system.

We would like a function that feeds on an array of inputs and a complete specification of a fuzzy system, and in turn returns the final crisp output.



Linguistic Terms

Enumerated data types – for easy indexing

fuzzylogic.h

typedef enum {in_angle, in_distance}; //input indices

//indices of fuzzy sets for angle input

typedef **enum** {in_negatively_small, in_negatively_medium, in_negatively_large, in_zero, in_positively_small, in_positively_medium, ip_______

//indices of fuzzy sets for distance input typedef enum {in_near, in_medium, in_fater.

//indices for output steering angle

typedef enum {out_ze_turn, out_negativ
out_negatively_sharp_turn, out_negativel
out_positively_very_mild_turn, out_positi
out_positively_very_sharp_turn
};

Define **enum** variables for the linguistic terms.

We would like to refer to the different fuzzy sets and input parameters using descriptive names (e.g. {in_angle, in_position}, {in_negatively_small, in_negatively_large, etc.), instead of numbers whenever we use them.

//indices for output speed

typedef **enum** {out_very_slow, out_slow, out_medium, out_fast, out_very_fast, out_wicked_fast};



Add linguistic terms tailored to the problem domain

```
//Trapezoidal membership function types
```

typedef enum { regular_trapezoid, left_trapezoid, right_trapezoid } trapz_type;

- struct trapezoid {
 - trapz_type tp; //type of trapezd
 - float a, b, c, d, l_slope, r_slope;

};

Define a structure for holding the properties of the membership functions to use.

Here we have a structure implementing the trapezoidal membership function.



Fuzzy Rule

fuzzylogic.h

```
typedef struct {
             inp_index[MAX_NO_OF_INPUTS], //input index
      short
             inp_fuzzy_set[MAX_NO_OF_INPUTS], //input fuzzy set index
             out_fuzzy_set; //output index
                            Define a structure for holding the components of
      rule;
                            a fuzzy rule.
                            Note that we are only storing the indices of the
                            components of a rule.
                        inp_index[1]: in_distance
  inp_index[0]: in_angle
                                                        out_fuzzy_set
If (angle is small) AND (distance is VERY_FAR) Then output is VERY_FAST.
   inp_fuzzy_set[0]: in_small
                             inp_fuzzy_set[1]: in_very_far
```

```
Define a structure for holding the complete
// The complete Fuzzy System /////
                                   description of a fuzzy inference system.
typedef struct fuzzy_system_rec {
                                   Here we have a structure implementing a Zero-
                                   Order Sugeno Fuzzy inference system.
  bool allocated;
  trapezoid inp_mem_fns [MAX_NO_OF_INPUTS] [MAX_NO_OF_INP_REGIONS];
  rule* rules; //note that we need to allocate memory for the rules
        no_of_inputs, //number of inputs
  int
         no_of_inp_regions, //number of fuzzy sets associated with each input
         no_of_rules, //number of rules
         no_of_outputs; //number of fuzzy outputs
  float output_values[MAX_NO_OF_OUTPUT_VALUES]; //the values of the outputs
```

Defining the Fuzzy Rule

If (angle is small) AND (distance is VERY_FAR) Then output is VERY_FAST.

```
fuzzy_system_rec *fl;
//...allocate memory
//...initialise fuzzy parameters

fl->rules[0].inp_index[0] = in_angle;
 fl->rules[0].inp_index[1] = in_distance

fl->rules[0].inp_fuzzy_set[0] = in_sm
 fl->rules[0].inp_fuzzy_set[1] = in_ver
 fl->rules[0].out fuzzy set = out_ver
```

How to customise a fuzzy rule?

Here is an example of how we can define a rule with two inputs.

SMALL	Med Speed	Fast Sp.		
MEDIUM	Slow Speed	Med Speed	Fa	
LARGE	Very Slow	Slow Speed	Sl	

v Fast

Defining the Fuzzy Rule

Main.cpp

out_fuzzy_set

▶If (angle is small) AND (distance is VERY_FAR) Then output is VERY_FAST.

```
fuzzy_system_rec *fl;
//...allocate memory
//...initialise fuzzy parameters
```

We are only storing the indices in the rule.

```
fl->rules[0].inp_index[0] = in_angle;
fl->rules[0].inp_index[1] = in_distance;
```

```
fl->rules[0].inp_fuzzy_set[0] = in_small;
fl->rules[0].inp_fuzzy_set[1] = in_very_far;
fl->rules[0].out_fuzzy_set = out_very_fast;
```

```
// Fuzzy Rule ///////////////////
typedef struct {
  short inp_index[MAX_NO_OF_INPUTS],
        inp_fuzzy_set[MAX_NO_OF_INPUTS],
        out_fuzzy_set; //output index
} rule;
```

FAMM

	NEAR	FAR	VERY FAR	
SMALL	Med Speed	Fast Speed	Very Fast	
MEDIUM	Slow Speed	Med Speed	Fast Speed	
LARGE	Very Slow	Slow Speed	Slow Speed	

Membership Function

If (angle is small) AND (distance is VERY_FAR) Then output is VERY_FAST.

>fl->inp_mem_fns[variable_index][fuzzy_set]

fl->rules[i].inp_index[0] = in_angle; fl->rules[i].inp_index[1] = in_distance

fl->rules[0].inp_fuzzy_set[0] = in_sma
fl->rules[0].inp_fuzzy_set[1] = in_very
fl->rules[0].out_fuzzy_set = out_very

How to specify which **membership function** we want to use?

Using the index of the rule input, and index of the fuzzy set, we can easily identify the membership function.

SMALL	Med Speed	Fast Speed	Fast
MEDIUM	Slow Speed	Med Speed	Fau Canad
LARGE	Very Slow	Slow Speed	SI SI

Membership Function

```
inp_index[0]: in_angle inp_index[1]: in_distance ou
```

out_fuzzy_set

If (angle is small) AND (distance is VERY_FAR) Then output is VERY_FAST.

fl->inp_mem_fns[variable_index][fuzzy_set]

```
fl->rules[i].inp_index[0] = in_angle;
fl->rules[i].inp_index[1] = in_distance;
```

fl->rules[0].inp_fuzzy_set[0] = in_small; fl->rules[0].inp_fuzzy_set[1] = in_very_far; fl->rules[0].out_fuzzy_set = out_very_fast;

	NEAR	FAR	VERY FAR
- SMALL	Med Speed	Fast Speed	Very Fast
MEDIUM	Slow Speed	Med Speed	Fast Speed
LARGE	Very Slow	Slow Speed	Slow Speed

Membership Function data structure

Declaration:



trapezoid inp_mem_fns [MAX_NO_OF_INPUTS] [MAX_NO_OF_INP_REGIONS];

inp_mem_fns is a structure containing all the parameters of a membership function.

fl->inp_mem_fns[variable_index][fuzzy_set]

```
fl->rules[i].inp_index[0] = in_angle;
fl->rules[i].inp_index[1] = in_distance;

fl->rules[0].inp_fuzzy_set[0] = in_small;
fl->rules[0].inp_fuzzy_set[1] = in_very_far;
fl->rules[0].out_fuzzy_set = out_very_fast;
```

Membership Function Initialisation

inp_mem_fns is a structure containing all the parameters of a membership function.

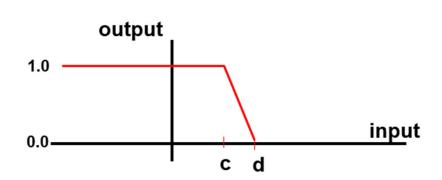
The init_trapz() function is used to initialize inp_mem_fns.

```
→ fl->inp_mem_fns[in_angle][in_small] =

→ init_trapz(0.0f, 0.0f, 14.0f, 20.0f, left_trapezoid);
```

```
fl->rules[i].inp_index[0] = in_angle;
fl->rules[i].inp_index[1] = in_distance;

fl->rules[0].inp_fuzzy_set[0] = in_small;
fl->rules[0].inp_fuzzy_set[1] = in_very_far;
fl->rules[0].out_fuzzy_set = out_very_fast;
```



Calculation of degree of Membership

inp_mem_fns is a structure containing all the parameters of a membership function.

The **trapz** function calculates the <u>actual degree of membership</u> of a given input value in a fuzzy set.

which input

which membership function

trapz(inputs[variable_index],fl.inp_mem_fns[variable_index][fuzzy_set])

```
fl->rules[i].inp_index[0] = in_angle;
fl->rules[i].inp_index[1] = in_distance;

fl->rules[0].inp_fuzzy_set[0] = in_small;
fl->rules[0].inp_fuzzy_set[1] = in_very_far;
fl->rules[0].out_fuzzy_set = out_very_fast;
```

Calculation of degree of Membership

which input

which membership function

trapz(inputs[variable_index],fl.inp_mem_fns[variable_index][fuzzy_set])

```
float trapz (float x, trapezoid trz) {
 switch (trz.tp) {
   case left trapezoid: //opening to the left
              if (x \le trz.c)
                return 1.0;
              if (x \ge trz.d)
                return 0.0;
              /* c < x < d */
              return trz.r slope * (x - trz.d);
   case right trapezoid: //opening to the right
              if (x \le trz.a)
                return 0.0;
              if (x \ge trz.b)
                return 1.0;
              /* a < x < b */
              return trz.l slope * (x - trz.a);
```

```
case regular_trapezoid:
    if ((x <= trz.a) || (x >= trz.d))
        return 0.0;
    if ((x >= trz.b) && (x <= trz.c))
        return 1.0;
    if ((x >= trz.a) && (x <= trz.b))
        return trz.l_slope * (x - trz.a);
    if ((x >= trz.c) && (x <= trz.d))
        return trz.r_slope * (x - trz.d);
    } /* End switch */

return 0.0; /* should not get to this point */
} /* End function */</pre>
```

Fuzzy System – from fuzzification to defuzzification

```
File: fuzzylogic.cpp
float fuzzy system (float inputs[], fuzzy system rec fz) {
 int i, j;
 short variable index, fuzzy set;
 float sum1 = 0.0f, sum2 = 0.0f, weight;
                                                                    vhich input
 float m values[MAX NO OF INPUTS];
 for (i = 0; i < fz.no of rules; i++)
   for (j = 0; j < fz.no of inputs; j++) {
                variable_index = fz.rules[i].inp_index[j];
                fuzzy set = fz.rules[i].inp fuzzy set[i]; //
                m values[j] = trapz(inputs[variable index], fz.inp mem fns[variable index][fuzzy set]);
    } /* end i */
   weight = min of (m values, fz.no of inputs);
   sum1 += weight * fz.output values[fz.rules[i].out fuzzy set];
   sum2 += weight;
 } /* end i */
 if (fabs(sum2) < TOO SMALL) { // TOO SMALL = 1e-6
   cout << "\r\nFLPRCS Error: sum2 in fuzzy system is 0." << endl;
   //exit(1);
   return 0.0;
 return (sum1/sum2);
```



1. Declare a global variable for the fuzzy system.

File: Main.cpp

e.g. **fuzzy_system_rec** g_fuzzy_system;

Define the maximum number of Fuzzy Sets to be used.

File: fuzzylogic.h

#define MAX_NO_OF_INP_REGIONS 7

e.g. 7 Maximum Number of Fuzzy Sets allowed

2. Initialise the fuzzy system.

File: fuzzylogic.cpp

```
void initFuzzySystem (fuzzy_system_rec* fl) {
 fl->no of inputs = 2; //inputs are handled 2 at a time only
 fl->no_of_inp_regions = 7; //number of fuzzy sets per input
 fl->no_of_rules = 49*2; //number of rules
//----
 fl->output_values [out_small_push_left] = -15f; //-15 Newtons
 fl->output_values [out_large_push_left] = -100f; //-100 Newtons
 //... and so on...
 fl->rules = new rule [fl->no of rules]; //allocate memory for the rules
 initFuzzyRules (fl); //initialise the rules; this is user-defined
 initMembershipFunctions(fl); //initialise the membership functions; this is user-
                                //defined
```

3. Initialise fuzzy rules.

File: fuzzylogic.cpp

```
void initFuzzyRules (fuzzy_system_rec* fl) {
 int i;
 for (i = 0;i < fl->no_of_rules;i++) {
    //(*fl).rules[i].inp_index[0] = in_angle; //alternatively
    fl->rules[i].inp_index[0] = in_angle;
    fl->rules[i].inp_index[1] = in_angle_dot;
 fl->rules[0].inp_fuzzy_set[0] = in_negatively_small;
 fl->rules[0].inp_fuzzy_set[1] = in_falling_to_left_fast;
 fl->rules[0].out fuzzy set = out large push left;
// define the other remaining rules next
// and so on...
```

This is an example only. The inputs and rule parameters will depend on your system design.

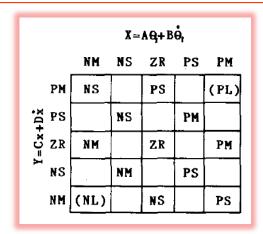
Rule #0



3. Initialise fuzzy rules.

File: fuzzylogic.cpp

```
void initFuzzyRules (fuzzy_system_rec* fl) {
 int i;
 for (i = 0;i < fl->no_of_rules;i++) {
    //(*fl).rules[i].inp_index[0] = in_X; //alternatively
    fl->rules[i].inp index[0] = in X;
    fl->rules[i].inp_index[1] = in_Y;
 fl->rules[0].inp_fuzzy_set[0] = in_NM;
 fl->rules[0].inp_fuzzy_set[1] = in_PM;
 fl->rules[0].out fuzzy set = out NS;
// define the other remaining rules next
// and so on...
```



Rule #0

Yamakawa's strategy



4. Initialise membership functions.

File: fuzzylogic.cpp

```
void initMembershipFunctions ( fuzzy_system_rec* fl ) {
 //angle
 fl->inp_mem_fns[in_angle][in_negatively_large] = init_trapz(14.0f,20.0f,0.0f,0.0f,
                                                                                  left trapezoid);
 fl->inp_mem_fns[in_angle][in_negatively_medium] = init_trapz(14.0f,20.0f,34.0f,40.0f,
                                                                             regular trapezoid);
 //...
 fl->inp_mem_fns[in_angle][in_positively_large] = init_trapz (34.0f, 40.0f, 0.0f, 0.0f,
                                                                                right trapezoid);
 //angular velocity
 //...
 //...
 //...
 //and so on...
```

Inverted Pendulum

4. Modify runInvertedPendulum ().

File: Main.cpp

```
void runInvertedPendulum () {
 //...
 initFuzzySystem(&g_fuzzy_system);
 while((GetAsyncKeyState(VK_ESCAPE)) == 0 ) { //while ESC key is not pressed
   //...
   inputValues [ in_angle ] = prevState.angle;
   inputValues[ in_angle_dot ] = prevState.angle_dot;
    prevState.Force= fuzzy_system(inputValues, g_fuzzy_system);
   //... Calculate new state of the world
    newState.angle_double_dot = calc_angular_acceleration(prevState);
   //and so on...
                                                              Specify the inputs and fuzzy
    cart.setX(newState.x);
    rod.setX(newState.x);
    rod.setAngle(newState.angle);
                                                              function.
    cart.draw(); rod.draw();
  free_fuzzy_rules(&g_fuzzy_system);
 //and so on...
```

system structure, then pass them to the fuzzy_system()



Skeleton of Simulation

void runInvertedPendulum()

```
initPendulumWorld();
initFuzzySystem(&g_fuzzy_system);
while((GetAsyncKeyState(VK_ESCAPE)) == 0 ) {
         setactivepage(page);
         cleardevice();
         senseEnvironment (inputs);
         F = fuzzy_system(inputs, g_fuzzy_system);
         updateWorld(newWorldState)
         drawCartAndRod(newWorldState)
         setvisualpage(page);
         toggle page //switch to another page
```

Input and Output

INPUTS

- 1. Angle of the rod with respect to the vertical axis (in radians)
- 2. Angular velocity of the rod (in radians per second)
- 3. Cart position (in meters)
- 4. Cart velocity (in meters per second)

OUTPUT

OUTPUT

1. Force to apply (in Newtons)

World State

```
struct WorldStateType{
    void init(){
         x=0.0;
         x_dot=0.0;
         x_double_dot = 0.0;
         angle = 0.0;
         angle_dot = 0.0;
         angle_double_dot = 0.0;
         F = 0.0;
    float x;
    float x_dot;
    float x_double_dot;
    float angle;
    float angle_dot;
    float angle_double_dot;
```

```
float const mb=0.1; // mass of broom
float const g=9.8; // pull of gravity
float const m=1.1; // mass of cart & broom
float const l=0.5; // length of broom from
//pivot point to centre of mass

float F;
};
```

WorldStateType prevState, newState;

Dynamics of the System

void runInvertedPendulum()

```
//Set the initial angle of the pole with respect to the vertical
prevState.angle = 8 * (3.14/180); //initial angle = 8 degrees
initFuzzySystem(&g fuzzy system);
while((GetAsyncKeyState(VK ESCAPE)) == 0 ) {
setactivepage(page);
cleardevice();
drawInvertedPendulumWorld();
//retrieve inputs
inputs[in theta] = prevState.angle;
inputs[in theta dot] = prevState.angle dot;
inputs[in x] = prevState.x;
inputs[in x dot] = prevState.x dot;
                                                                                                 Force
//1) Enable this only after your fuzzy system has been completed already.
//Remember, you need to define the rules, membership function parameters and rule outputs.
                                                                                                 to
 //prevState.F = fuzzy system(inputs, g fuzzy system); //call the fuzzy controller
                                                                                                 apply.
externalForce=0.0;
externalForce = getKey(); //manual operation
if(externalForce != 0.0)
    prevState.F = externalForce;
//continued...
```

void runInvertedPendulum()

```
// BEGIN - DYNAMICS OF THE SYSTEM
//Calculate the new state of the world
newState.angle double dot = calc angular acceleration(prevState);
newState.angle dot = prevState.angle dot + (h * newState.angle double dot);
newState.angle = prevState.angle + (h * newState.angle dot);
newState.F = prevState.F;
newState.x double dot = calc horizontal acceleration(prevState);
newState.x dot = prevState.x dot + (h * newState.x double dot);
newState.x = prevState.x + (h * newState.x_dot);
prevState.x = newState.x;
prevState.angle = newState.angle;
prevState.x dot = newState.x dot;
prevState.angle dot = newState.angle dot;
prevState.angle double dot = newState.angle double dot;
prevState.x double dot = newState.x double dot;
cart.setX(newState.x);
rod.setX(newState.x);
rod.setAngle(newState.angle);
cart.draw();
rod.draw();
   END - DYNAMICS OF THE SYSTEM
displayInfo(newState);
setvisualpage(page);
page = !page; //switch to another page
/2) Enable this only after your fuzzy system has been completed already.
//free fuzzy rules(&g fuzzy system);
```

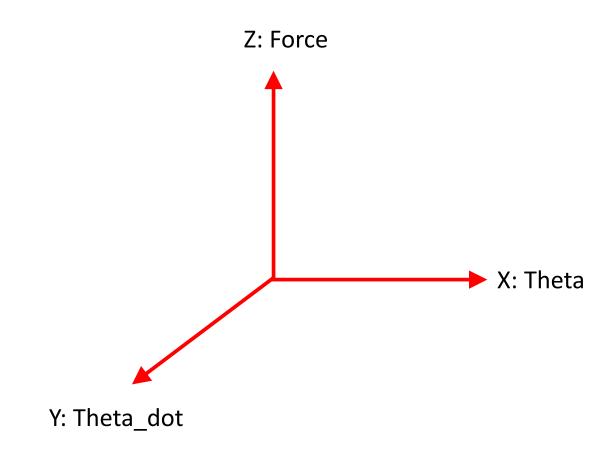
Physics
equations and
Euler's
method
(please do not
modify these
statements)

Control surface generation

int main()

```
int main() {
   int graphDriver = 0,graphMode = 0;
   initgraph(&graphDriver, &graphMode, "", 1280, 1024); // Start Window
   clearDataSet();
   try{
         runInvertedPendulum();
         //3) Enable this only after your fuzzy system has been completed already.
         //generateControlSurface Angle vs Angle Dot();
         //4) Enable this only after your fuzzy system has been completed already.
         //saveDataToFile("data_angle_vs_angle_dot.txt");
   catch(...){
    cout << "Exception caught!\n";</pre>
return 0;
```

Control surface generation



X: Theta [-40 deg., 40 deg] = [-0.7 rad., 0.7 rad.]

Y: Theta_dot = [-3 rad./sec, 3 rad./sec]

World Coordinate to Device Coordinate Transformation

for defining the system of coordinates, scaling and zooming-in or out.