



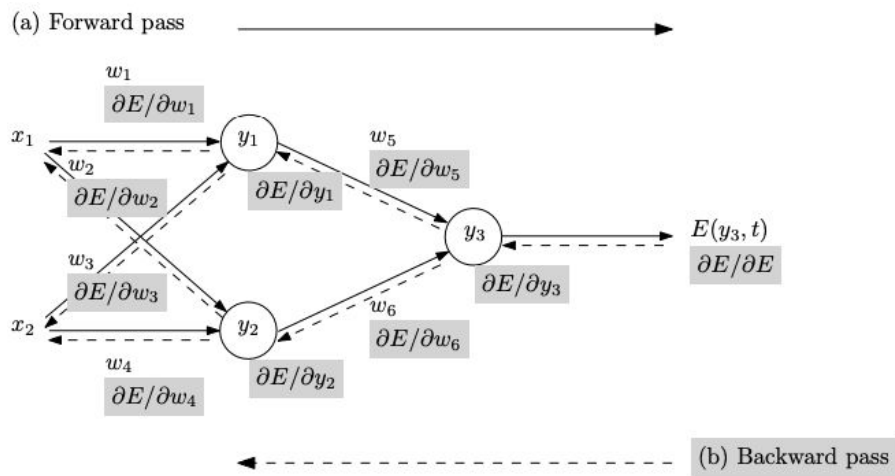
# To-Be-Recorded Analysis In Clad. Summary

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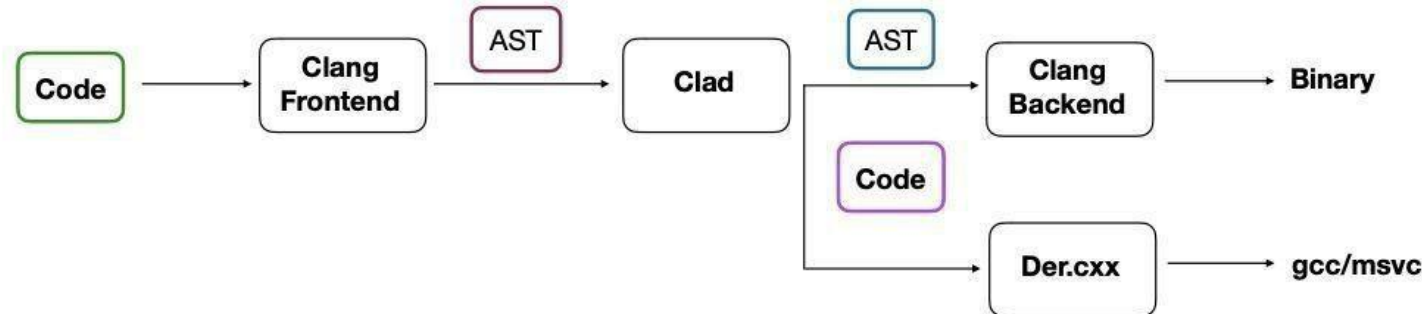
# Introduction: Automatic Differentiation

Automatic differentiation is a method of differentiation of functions expressed as procedures. It involves breaking up the function into simple operations and applying chain rule to each one of them. This can be done both ways: from the input to the output (forward mode) and vice versa (reverse mode). This project focuses on the second approach which is more efficient for computing gradients. In reverse mode, we need two passes: a forward pass to store the intermediate values of all the variables and a backward pass to compute derivatives.



# Introduction: Clad

Clad is an automatic differentiation Clang plugin for C++. It automatically generates code that computes derivatives of functions given by the user.



```
double f(double x) {
    return x * x;
}
```

```
FunctionDecl f 'double (double)'  
  -ParmVarDecl x 'double'  
  -CompoundStmt  
  -ReturnStmt  
    -BinaryOperator 'double' '*'  
      -ImplicitCastExpr 'double' <LValueToRValue>  
        -DeclRefExpr 'double' lvalue ParmVar 'x' 'double'  
      -ImplicitCastExpr 'double' <LValueToRValue>  
        -DeclRefExpr 'double' lvalue ParmVar 'x' 'double'
```

```
FunctionDecl 0x7f7f801d0f00 <<invalid sloc> <<invalid sloc> f_darg0 'double (double)'  
  -ParmVarDecl 0x7f7f801d0d00 <<invalid sloc> <<invalid sloc> 'double' 'd_x'  
  -CompoundStmt 0x7f7f801d0c00 <<invalid sloc>  
    -DeclRefExpr 0x7f7f801d0b00 <<invalid sloc>  
      -VarDecl 0x7f7f801d0a00 <<invalid sloc> <<invalid sloc> used '_d_x' 'double' 'const'  
        -ImplicitCastExpr 0x7f7f801d0900 <<invalid sloc> 'double' <<integralToInteger>  
          -IntegerLiteral 0x7f7f801d0800 <<invalid sloc> 'int' 1  
        -ReturnStmt 0x7f7f801d0700 <<invalid sloc>  
          -BinaryOperator 0x7f7f801d0600 <<invalid sloc> 'double' '*'  
            -BinaryOperator 0x7f7f801d0500 <<invalid sloc> 'double' '+'  
              -ImplicitCastExpr 0x7f7f801d0400 <<invalid sloc> 'double' <<LValueToRValue>  
                -DeclRefExpr 0x7f7f801d0300 <<invalid sloc> 'double' 'd_x'  
              -DeclRefExpr 0x7f7f801d0200 <<invalid sloc> 'double' 'd_x'  
            -DeclRefExpr 0x7f7f801d0100 <<invalid sloc> 'double' 'd_x'  
          -DeclRefExpr 0x7f7f801d0000 <<invalid sloc> 'double' 'd_x'  
        -DeclRefExpr 0x7f7f801d0f00 <<invalid sloc> 'double' 'd_x'  
      -DeclRefExpr 0x7f7f801d0e00 <<invalid sloc> 'double' 'd_x'  
    -DeclRefExpr 0x7f7f801d0d00 <<invalid sloc> 'double' 'd_x'
```

```
double f_darg0(double x) {
    double _d_x = 1;
    return _d_x * x + x * _d_x;
}
```

# A quick reminder of how TBR analysis works

History of usage of a variable x

DECLARED → USED → USED → CHANGED → CHANGED → CHANGED → USED

# A quick reminder of how TBR analysis works

History of usage of a variable x



# A quick reminder of how TBR analysis works

History of usage of a variable x



# Overview

## Modes

used for analysing  
expressions and finding  
used variables (data-flow)

## VarData

stores the information  
about one variable

## CFG

used to handle control-flow

# Modes

marking mode

**y;**

no variables are changed,  
therefore, the marking  
mode is off

**y = x \* x;**

because of assignment, the  
marking mode is turned on  
for RHS



## Linear analysis

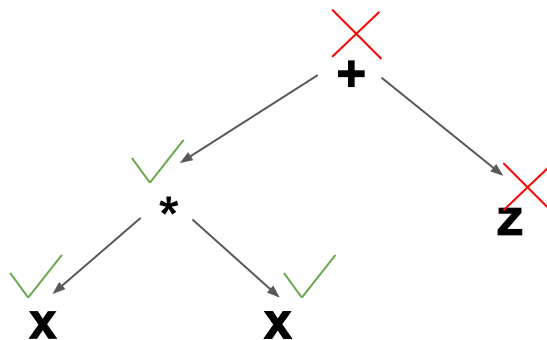
$y = x * x;$   $\longrightarrow$   $\_d\_x += \_d\_y * x + x * \_d\_y;$   
 $\_d\_y = 0;$

$y = 2 * x + 3 * z;$   $\longrightarrow$   $\_d\_x += 2 * \_d\_y;$   
 $\_d\_z += 3 * \_d\_y;$   
 $\_d\_y = 0;$

# Modes

non-linear mode

$$y = x * x + z;$$



by default, the RHS of the assignment operator is in linear mode

addition is not able to affect linearity itself

a product becomes non-linear when both terms are no constant



# VarData

**Stores all the necessary information about one variable (in trivial cases, it is represented with bool)**

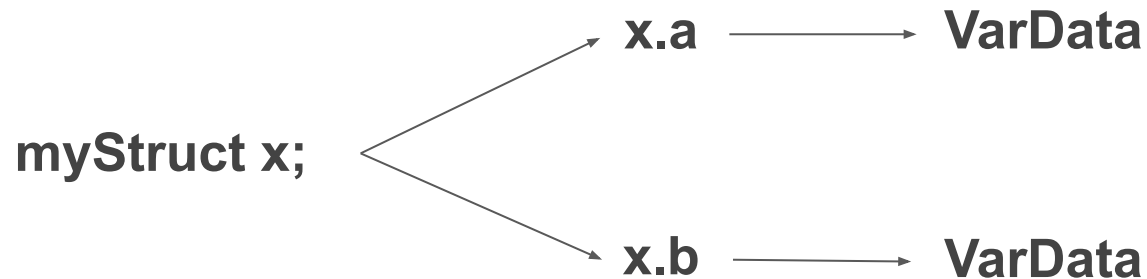


# FundType VarData

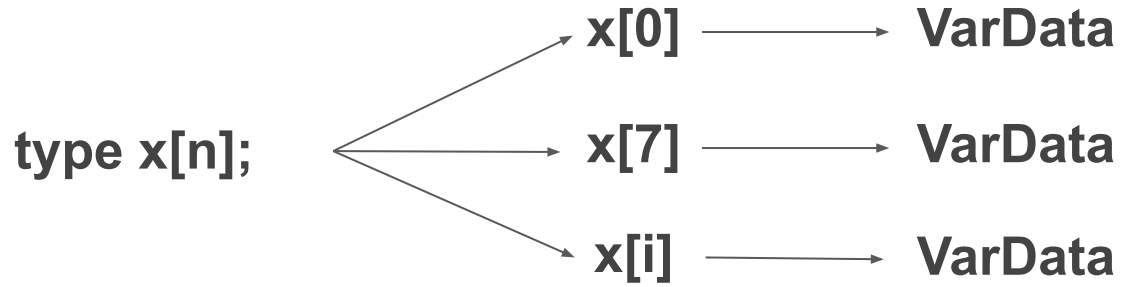
**double x; → bool**

# ObjType VarData

```
struct myStruct {  
  type1 a;  
  type2 b;  
};
```



# ArrayType VarData



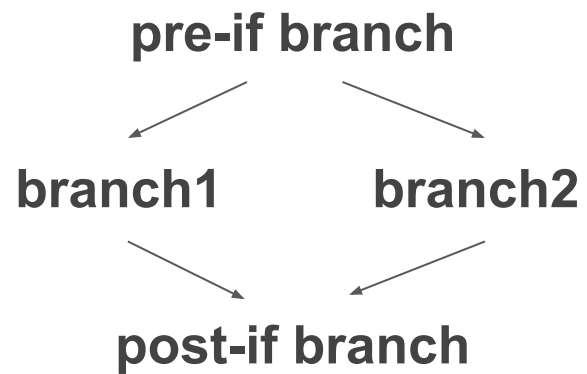
# RefType VarData

`double& x = y;`  $\longrightarrow$  `clang::Expr* Y`  
(corresponds to y)

# Control-flow

analyzed with clang:CFG

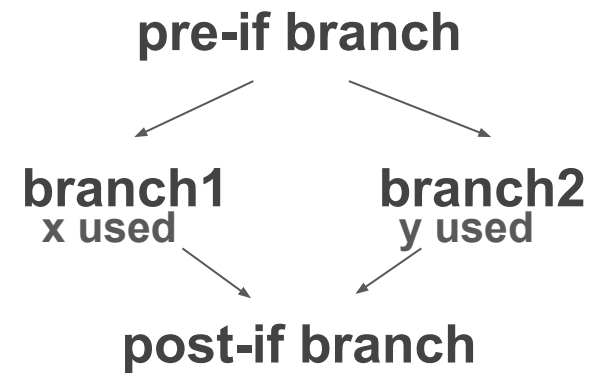
```
if (cond1) {  
    ///part 1  
} else {  
    ///part 2  
}
```





# Merging

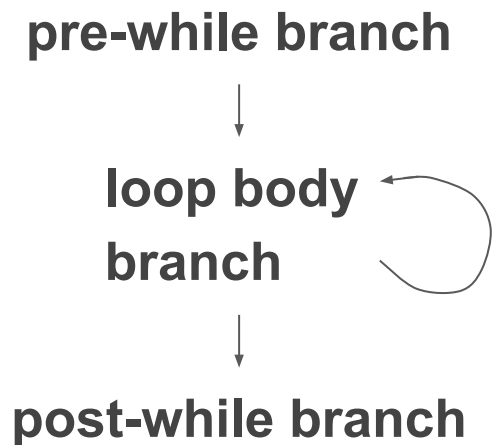
```
if (cond1) {  
    ///x used  
} else {  
    ///y used  
}
```



We have to assume both x and y were used.

# Control-flow. Loops

```
while (cond) {  
  ///some code  
}
```





**Thank you**