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# Vitis HLS and CORDIC arithmetic

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# Last Lectures

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- ❑ Before Fall Break – Vitis HLS flows
- ❑ Help Session on Project 3

# Today

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- ❑ Begin Computer Arithmetic for CORDIC
  - ⇒ Sine and Cosine functions in hardware
  - ⇒ Vector or Givens rotations of a vector in hardware
  - ⇒ Useful for communication systems “up converters” and for matrix linear algebra functions

# Vitis HLS Example on Canvas

- ❑ The Vectoradd\_Vitis\_HLS\_MC in CAD\_Tool\_Examples
  - ⇒ vectoradd.cpp
  - ⇒ vectoradd.h
  - ⇒ vectoradd\_test.cpp - Functions for Vitis HLS
  - ⇒ vectoradd\_MC\_HLS\_default.slx - Model Composer file that can include the output of Vitis HLS. The Vitis HLS block needs to load the solution1 from your area instead of my default location.
  - ⇒ loadvector.m - Matlab script to run to provide data for the Model Composer file.

# Computer Arithmetic

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- ❑ Addition and Multiplication well studied.
  - ⇒ Fixed point and Floating point flavors
  - ⇒ Subtraction fits nicely with addition
- ❑ Division is problematic
  - ⇒ Often avoided through algorithm modification
- ❑ Square Root also problematic
  - ⇒ Often done in “software” or specialized “seed” instructions as in TI DSPs.
- ❑ Elementary Functions
  - ⇒ Not so elementary.....
  - ⇒ Sine, Cosine, Tangent, Hyperbolic, Logarithm...

# CORDIC Arithmetic

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- ❑ Similar to multiplication and division with shift and add or shift and subtract.
- ❑ Iterative method for “coordinate rotation” in a “digital computer.”
- ❑ Can help to find sine, cosine, inverse tangent, and vector rotation.
- ❑ Useful later on for “Givens rotations”
  
- ❑ Model Composer had multiple blocks, general and specialized. Currently, only CORDIC 6.0 appears in the library.

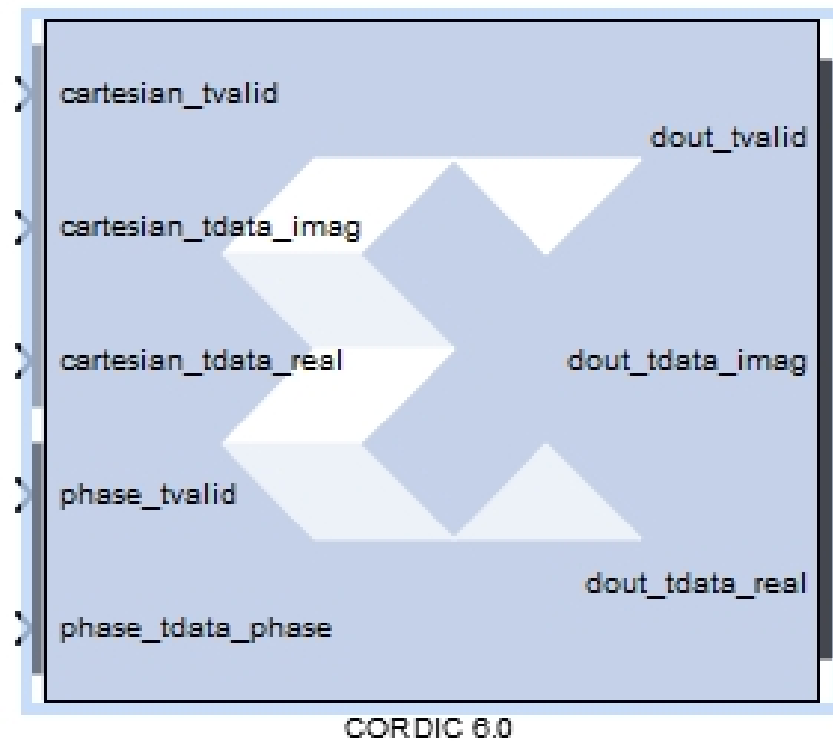
# Readings on CORDIC Algorithm and Xilinx Versions

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- ❑ Algorithm paper:
- ❑ W08\_Walther\_CORDIC.pdf
- ❑ Xilinx versions in CAD\_Tools\_Examples\CORDIC\_Model\_Composer:
- ❑ pg105-cordic.pdf
- ❑ CORDIC 6.0 is the current module in Model Composer

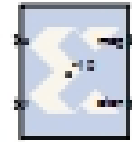
# CORDIC Arithmetic in Model Composer

- ❑ Xilinx Math Library for Model Composer contains multi-purpose CORDIC 6 Module

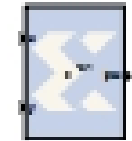




# Previously Specialized CORDIC Functions in Model Composer – Focus on SINCOS



CORDIC ATAN



CORDIC  
DIVIDER



CORDIC LOG



CORDIC  
SINCOS

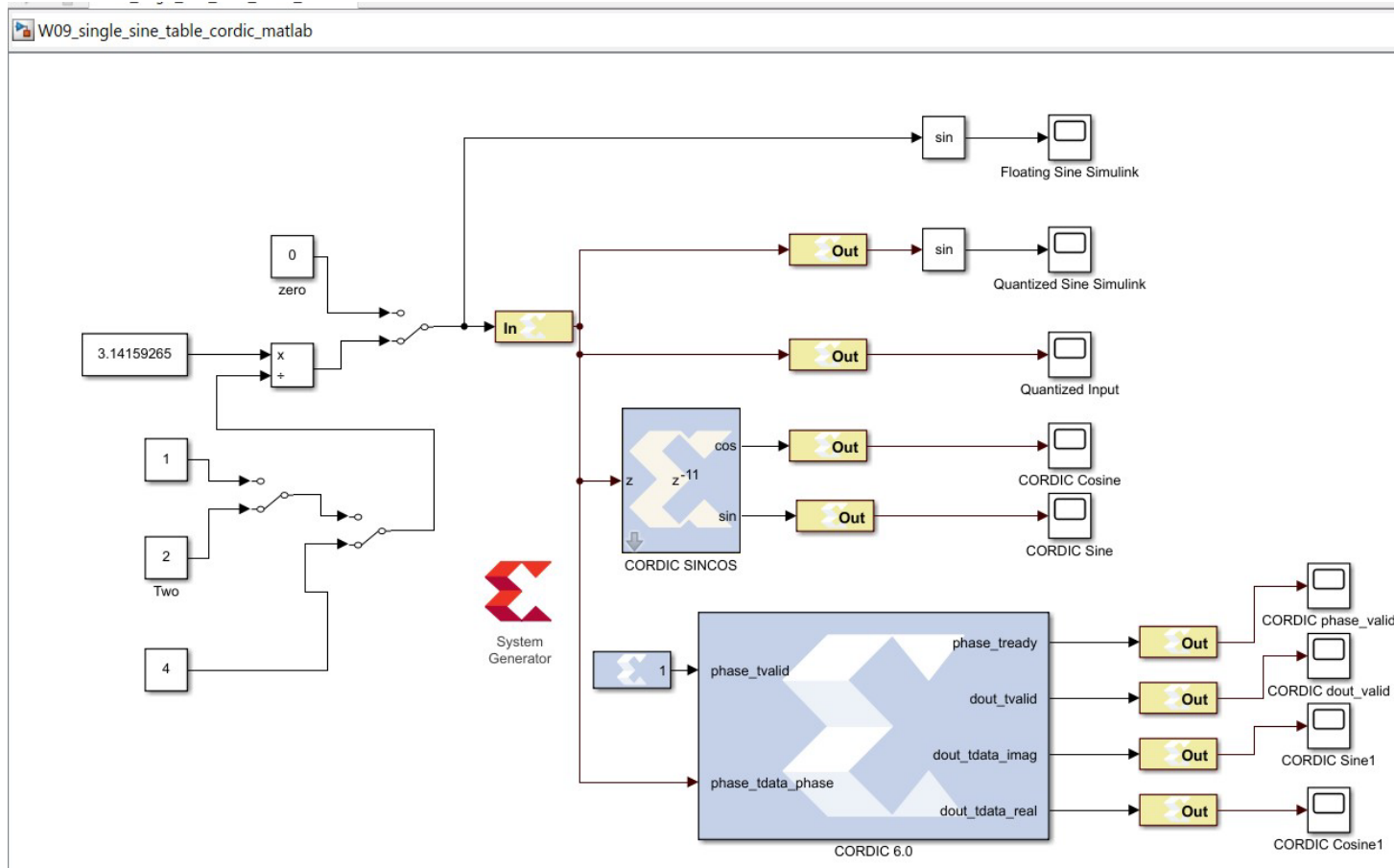


CORDIC SQRT

No Longer  
available in the  
Library

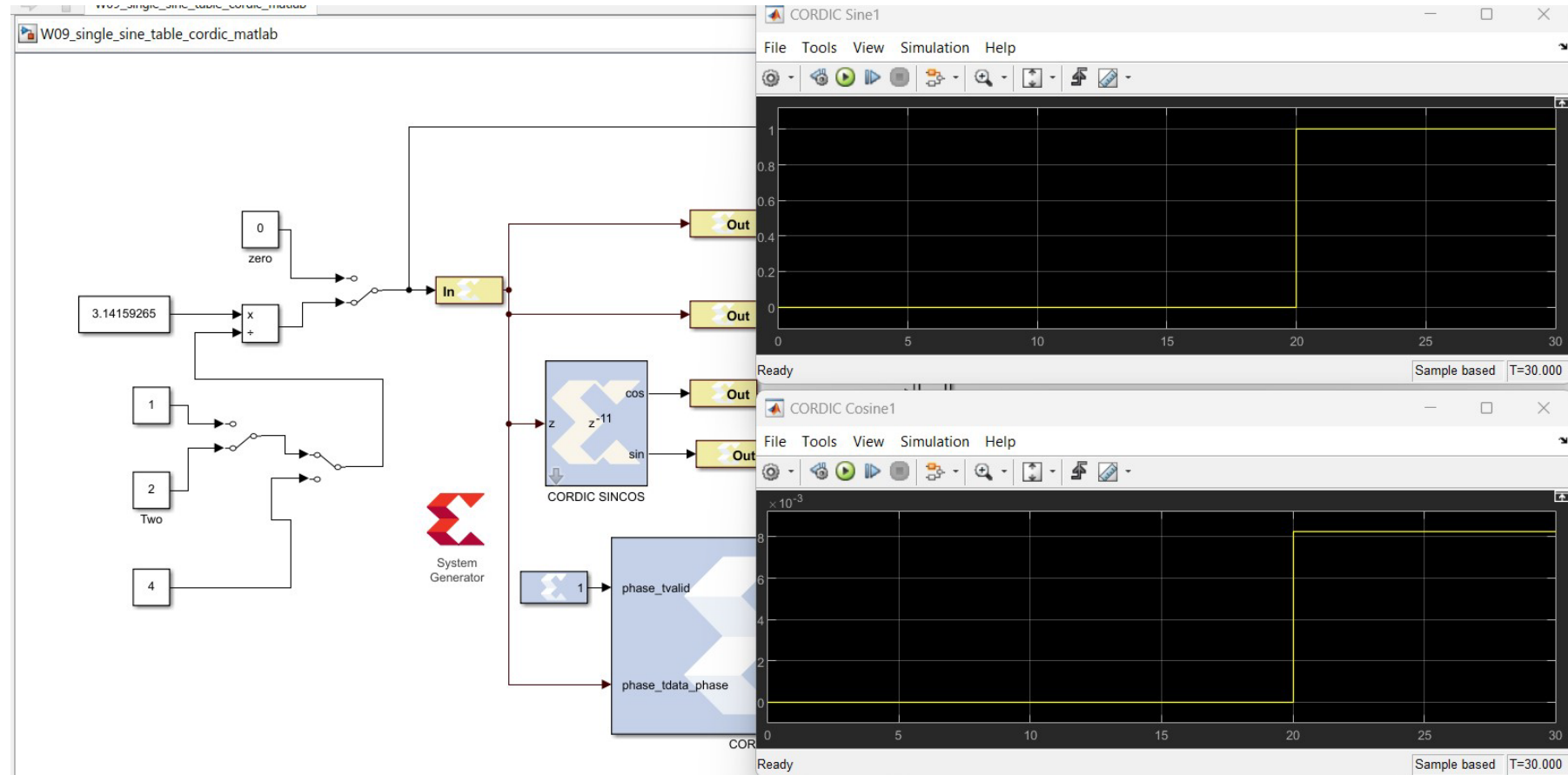
# CORDIC – Test Module Demo – Canvas .slx file

- ❑ CAD\_Example\_Files/W09\_single\_sine\_table\_cordic\_matlab.slx

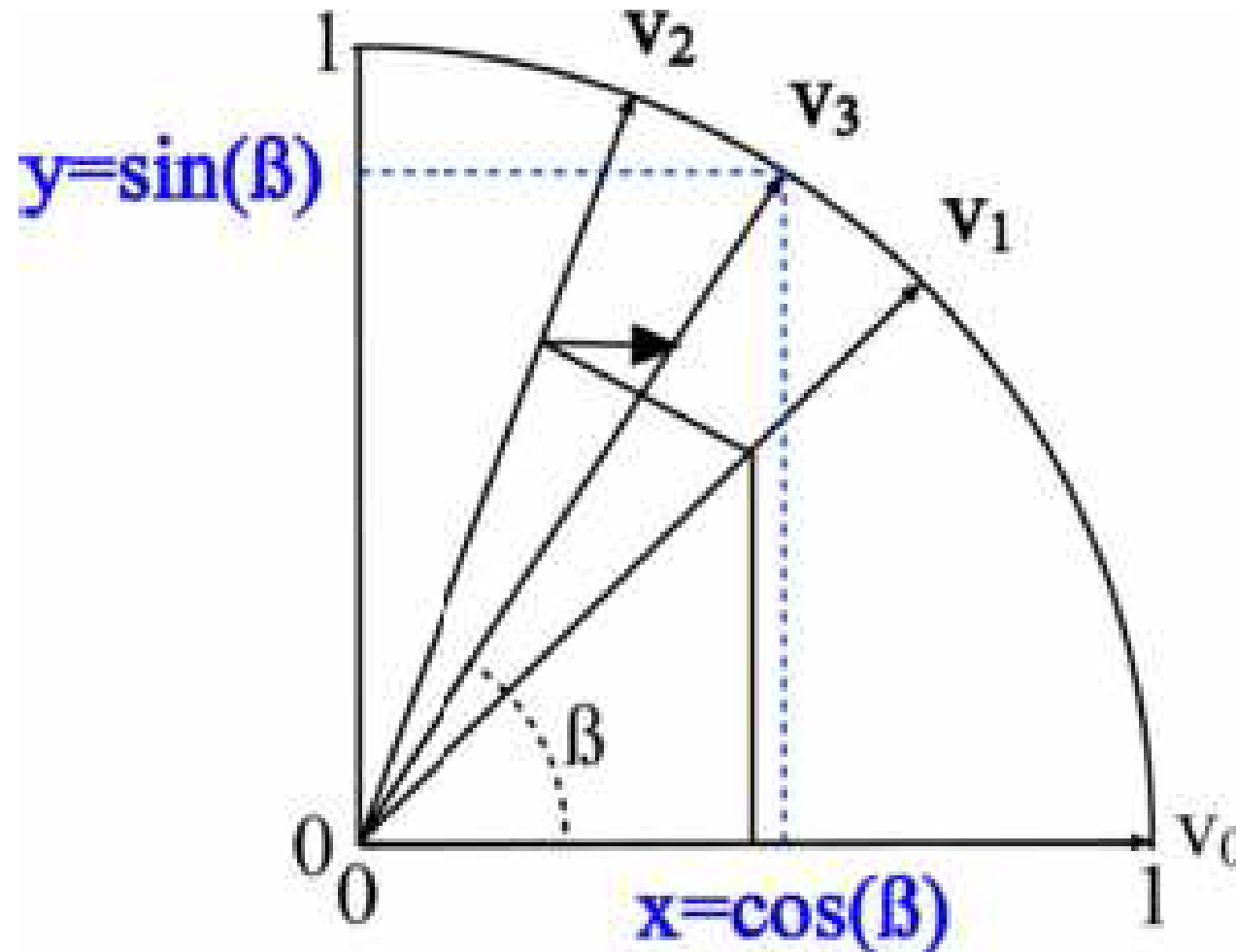


# Pi/2 CORDIC Sine and Cosine

- 16 bit resolution yields about 5 decimal digits of accuracy
- About one bit per iteration
- Module takes 20 time steps in this example
- Sine approaches 1
- Cosine approaches  $8 \times 10^{-3}$



# CORDIC Arithmetic



# CORDIC Equations from Plane Rotation

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$$v_o = \begin{pmatrix} 1 \\ 0 \end{pmatrix}$$

$$v_{i+1} = R_i v_i$$

$$R_i = \begin{pmatrix} \cos \gamma_i & -\sin \gamma_i \\ \sin \gamma_i & \cos \gamma_i \end{pmatrix}$$

$$v_{i+1} = R_i v_i = \cos \gamma_i \begin{pmatrix} 1 & -\sigma_i \tan \gamma_i \\ \sigma_i \tan \gamma_i & 1 \end{pmatrix} \begin{pmatrix} x_i \\ y_i \end{pmatrix}$$

# CORDIC Equation for Hardware

$$v_{i+1} = R_i v_i = \cos(\arctan(2^{-i})) \begin{pmatrix} 1 & -\sigma_i 2^{-i} \\ \sigma_i 2^{-i} & 1 \end{pmatrix} \begin{pmatrix} x_i \\ y_i \end{pmatrix} = K_i \begin{pmatrix} x_i - \sigma_i 2^{-i} y_i \\ x_i \sigma_i 2^{-i} + y_i \end{pmatrix}$$

$$K_i = \cos(\arctan(2^{-i}))$$

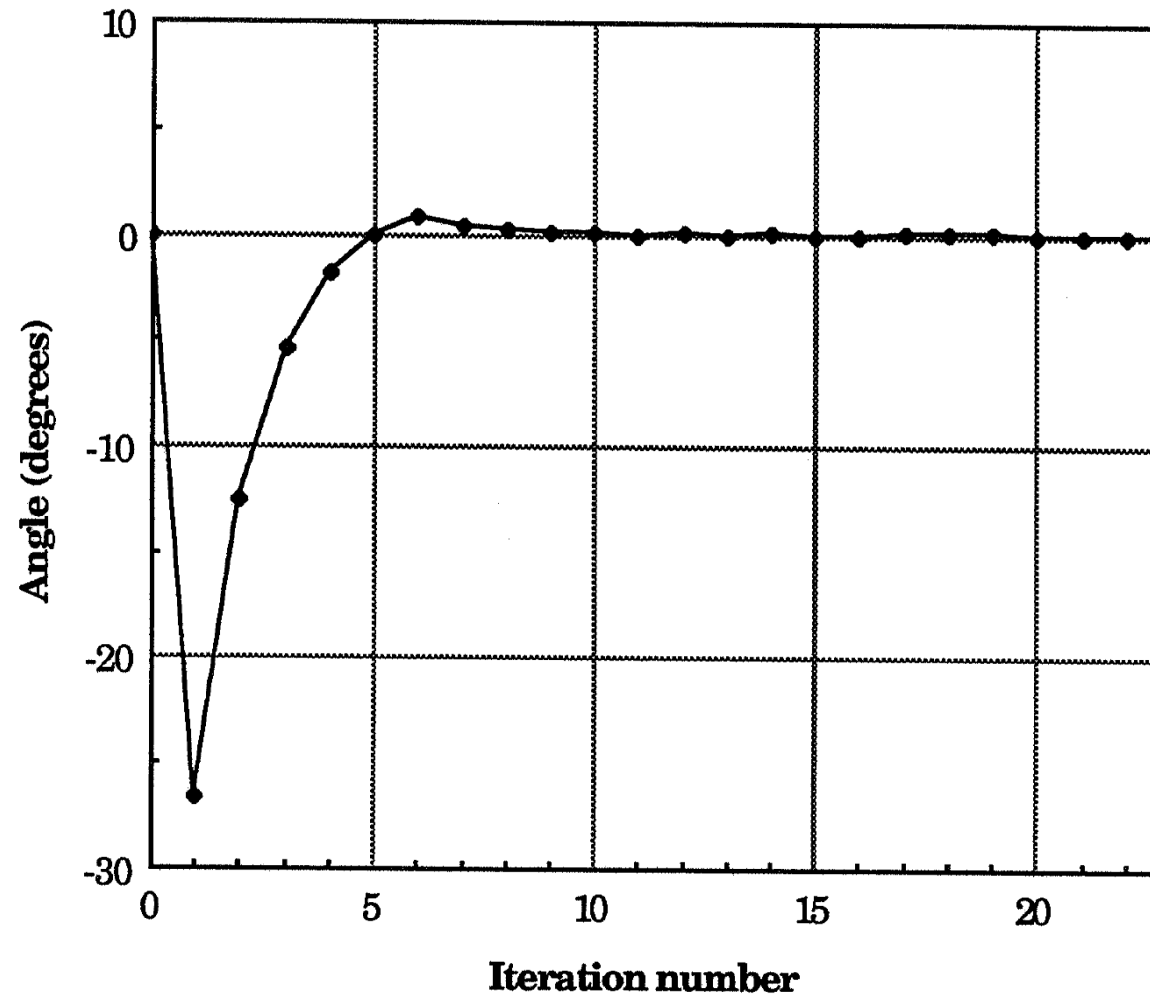
$$K(n) = \prod_{i=0}^{n-1} K_i = \prod_{i=0}^{n-1} \cos(\arctan(2^{-i})) = \prod_{i=0}^{n-1} 1/\sqrt{1+2^{-2i}}$$

$$K = \lim_{n \rightarrow \infty} K(n) \approx 0.607252935$$

# CORDIC Rotation Angle Table

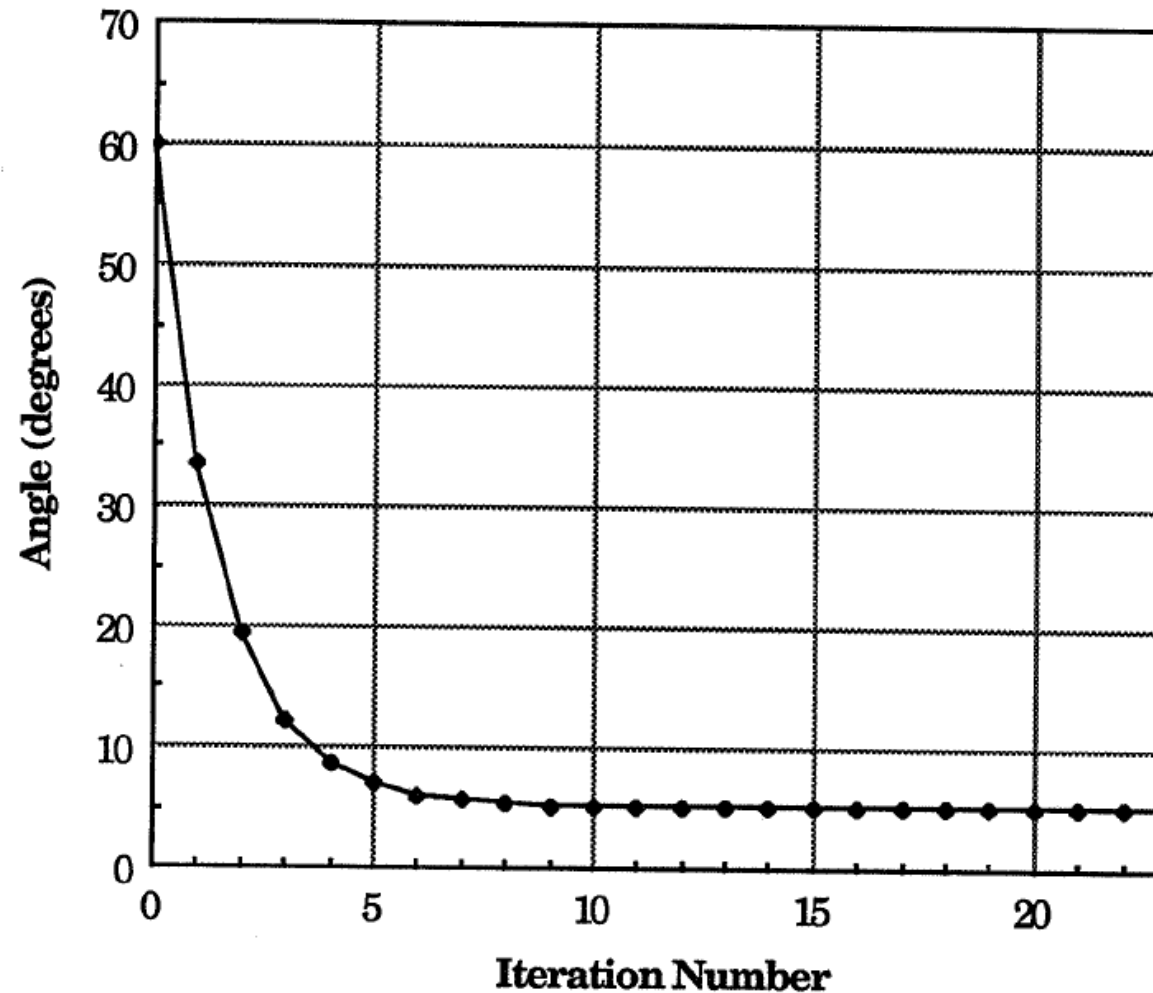
Rotation Angles for Circular Mode, $n = 24$	
Iteration	Angle
0	44.9999999999
1	26.5650511770
2	14.0362434679
3	7.1250163489
4	3.5763343750
5	1.7899106082
6	0.8951737102
7	0.4476141709
8	0.2238105004
9	0.1119056771
10	0.0559528919
11	0.0279764526
12	0.0139882271
13	0.0069941137
14	0.0034970569
15	0.0017485284
16	0.0008742642
17	0.0004371321
18	0.0002185661
19	0.0001092830
20	0.0000546415
21	0.0000273208
22	0.0000136604
23	0.0000068302

# Circular Mode Convergence for 45 Degrees





# Circular Mode Non-convergence for 105 Degrees



# CORDIC Results in Traditional Circular Mode

## CIRCULAR MODE

X
Y
Z

$$K(X\cos Z - Y\sin Z)$$

$$K(Y\cos Z + X\sin Z)$$

$$0$$

X
Y
Z

$$K(X^2 + Y^2)^{1/2}$$

$$0$$

$$Z + \arctan(Y/X)$$

# CORDIC Results in Linear Mode

## – Limited Range

### LINEAR MODE

X	X
Y	$Y + XZ$
Z	0

X	X
Y	0
Z	$Z + (Y/X)$

# CORDIC Results in Hyperbolic Mode

## – based on Hyperbolic Tangent

### HYPERBOLIC MODE

X
Y
Z

$$K(X \cosh Z + Y \sinh Z)$$

$$K(Y \cosh Z + X \sinh Z)$$

$$0$$

Z Reduction to 0

X
Y
Z

$$K(X^2 - Y^2)^{1/2}$$

$$0$$

$$Z + \operatorname{arctanh}(Y/X)$$

Y Reduction to 0

# Y-Reduction to Find Inverse Tangent

- Scale factor cancels out in finding Inverse Tangent.

$$x_n = K_n(x_0 + y_0 \tan \theta),$$

$$y_n = K_n(y_0 - x_0 \tan \theta),$$

$$z_n = z_0 + \theta.$$

If, after  $n$  iterations,  $y_n = 0$ , and if  $z_0 = 0$ , then  $\tan \theta = (y_0 / x_0)$  and

$$z_n = \tan^{-1} \left[ \frac{y_0}{x_0} \right].$$

# Y-Reduction C-code Declarations

**yreduction** (x, y, z, m, numiter)

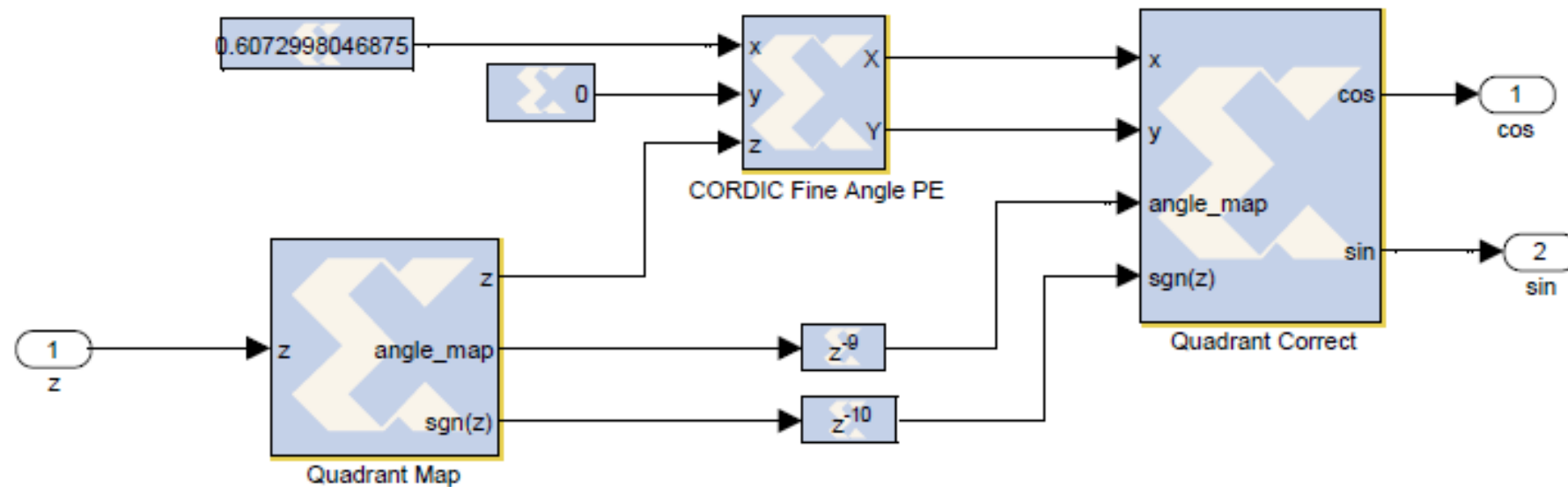
```
double    *x;
double    *y;
double    *z;
double    m;          /* Mode: 1=circular; 0=linear; -1=hyperbolic */
int       numiter;    /* Number of iterations. */

{
extern    double angles[wordlength];
extern    double shifts[wordlength];
double    delta;
double    xnew;
double    ynew;
int       i;
```

# Y-Reduction C-Code Loop Body

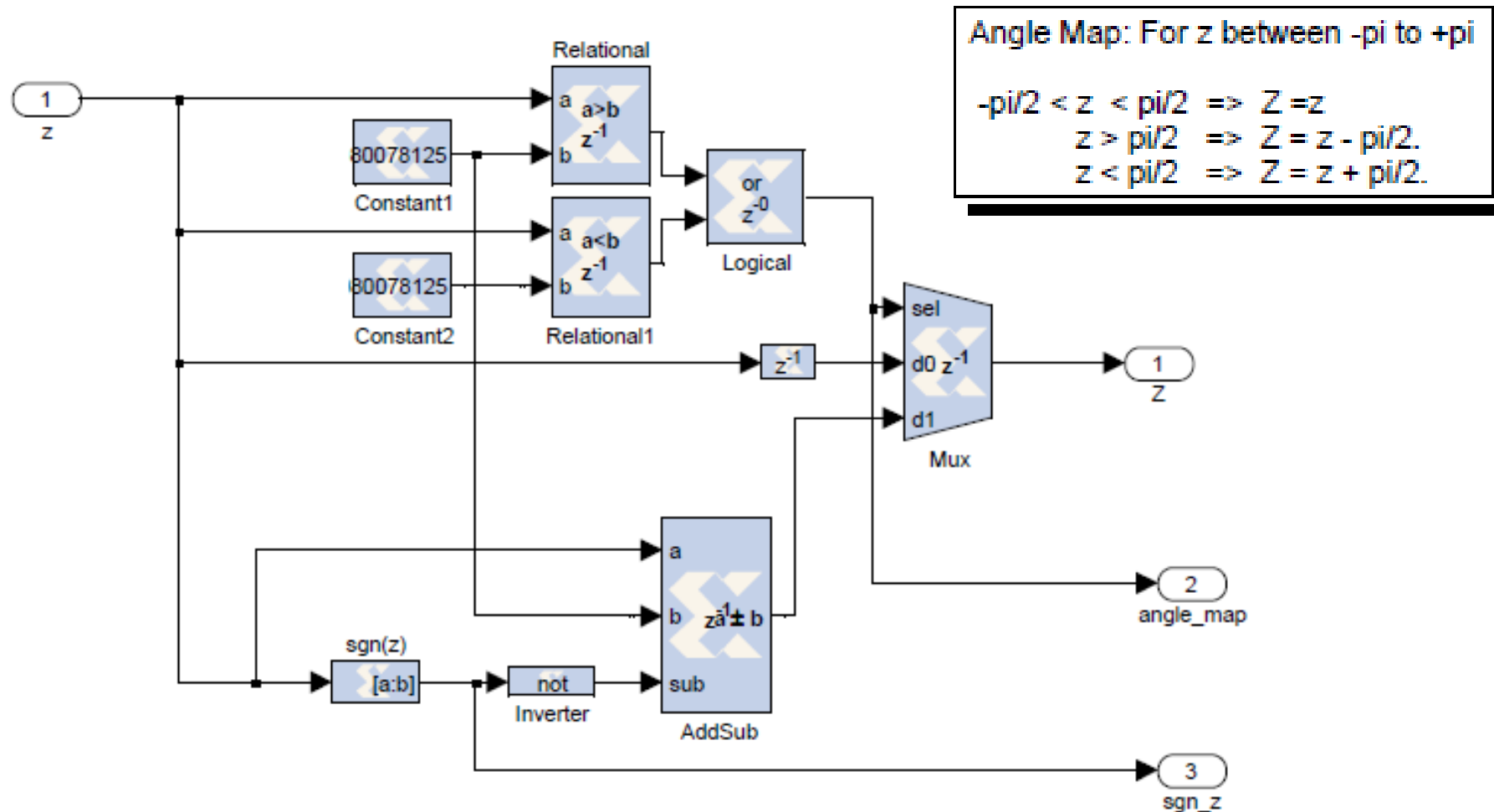
```
if (((*x < 0)&&(*y < 0)) || ((*x < 0)&&(*y > 0)))
{
    *x = -*x;
    *y = -*y;
}
for ( i = 0; i < numiter; i++)
{
    if ( *y >= 0.0)
        delta = 1.0;
    else
        delta = -1.0;
    /* Calculate new x, y, and z. */
    /* Basic CORDIC Rotations. */
    xnew = *x + (m * (delta * (shifts[i] * *y)));
    ynew = *y - (delta * (shifts[i] * *x));
    *x = xnew;
    *y = ynew;
    *z = *z + (delta * angles[i]);
}
}
```

# Model Composer “Old” CORDIC Block - Top

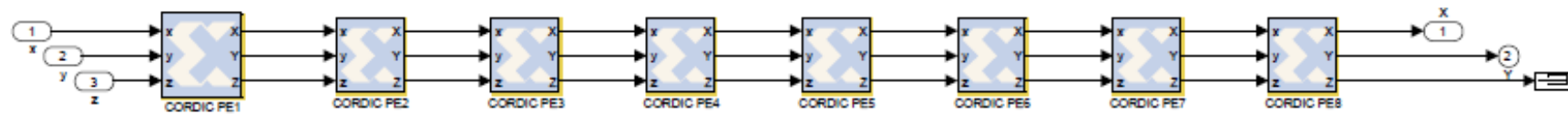




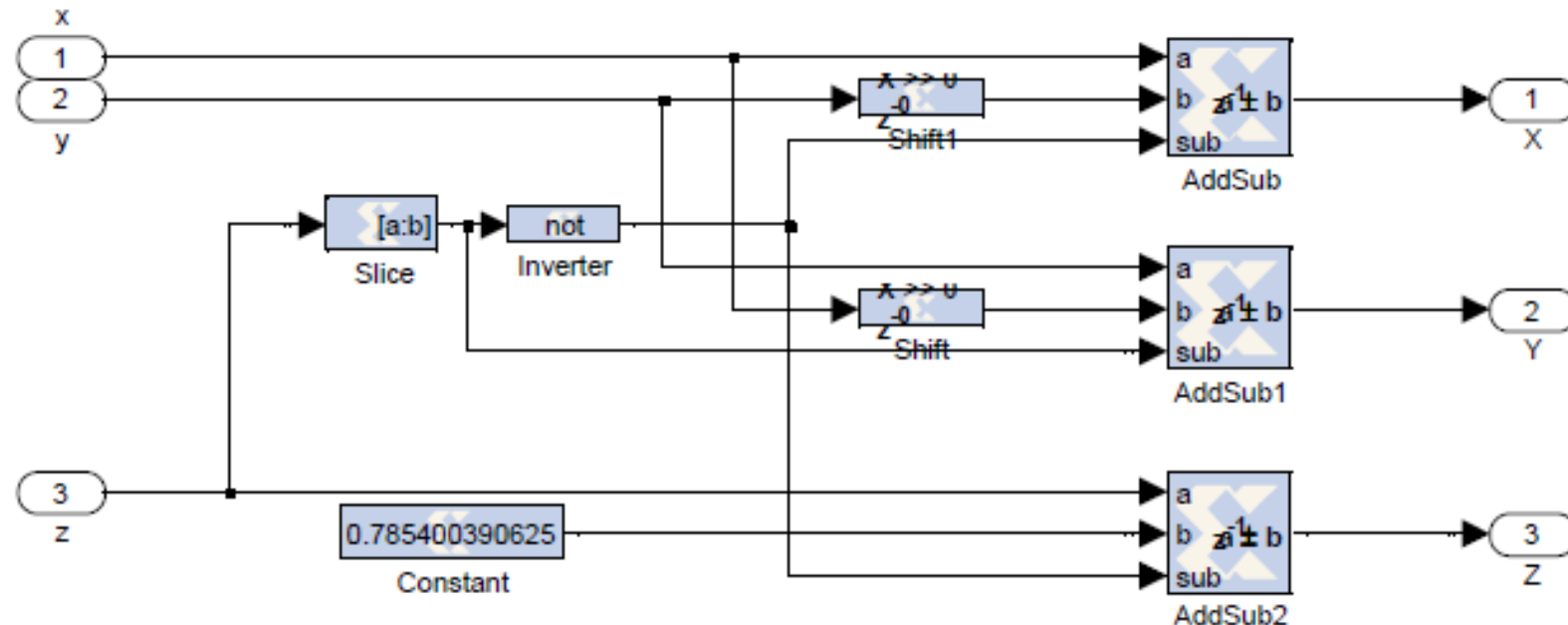
# CORDIC Pre-Processing for Sign and Angle Quadrant



# CORDIC Micro-rotation Core for 8 Iterations

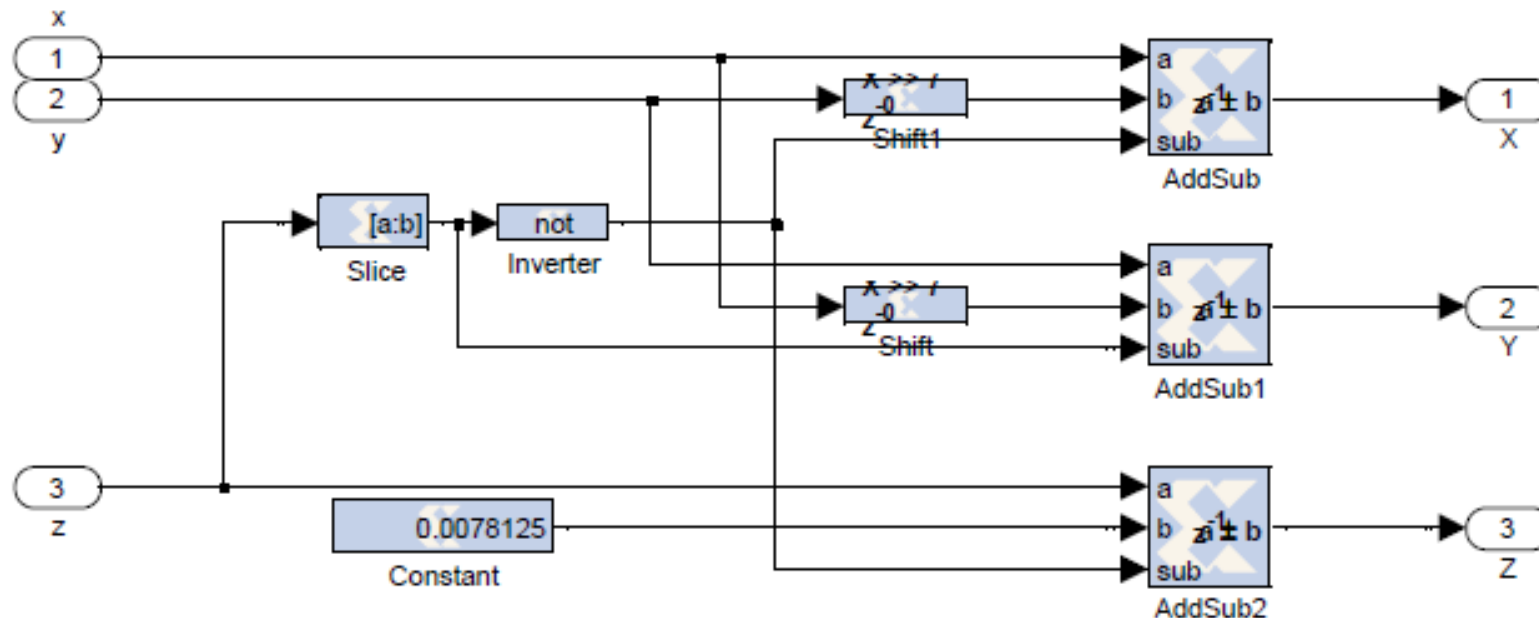


# CORDIC – First Micro-rotation and Decision Logic



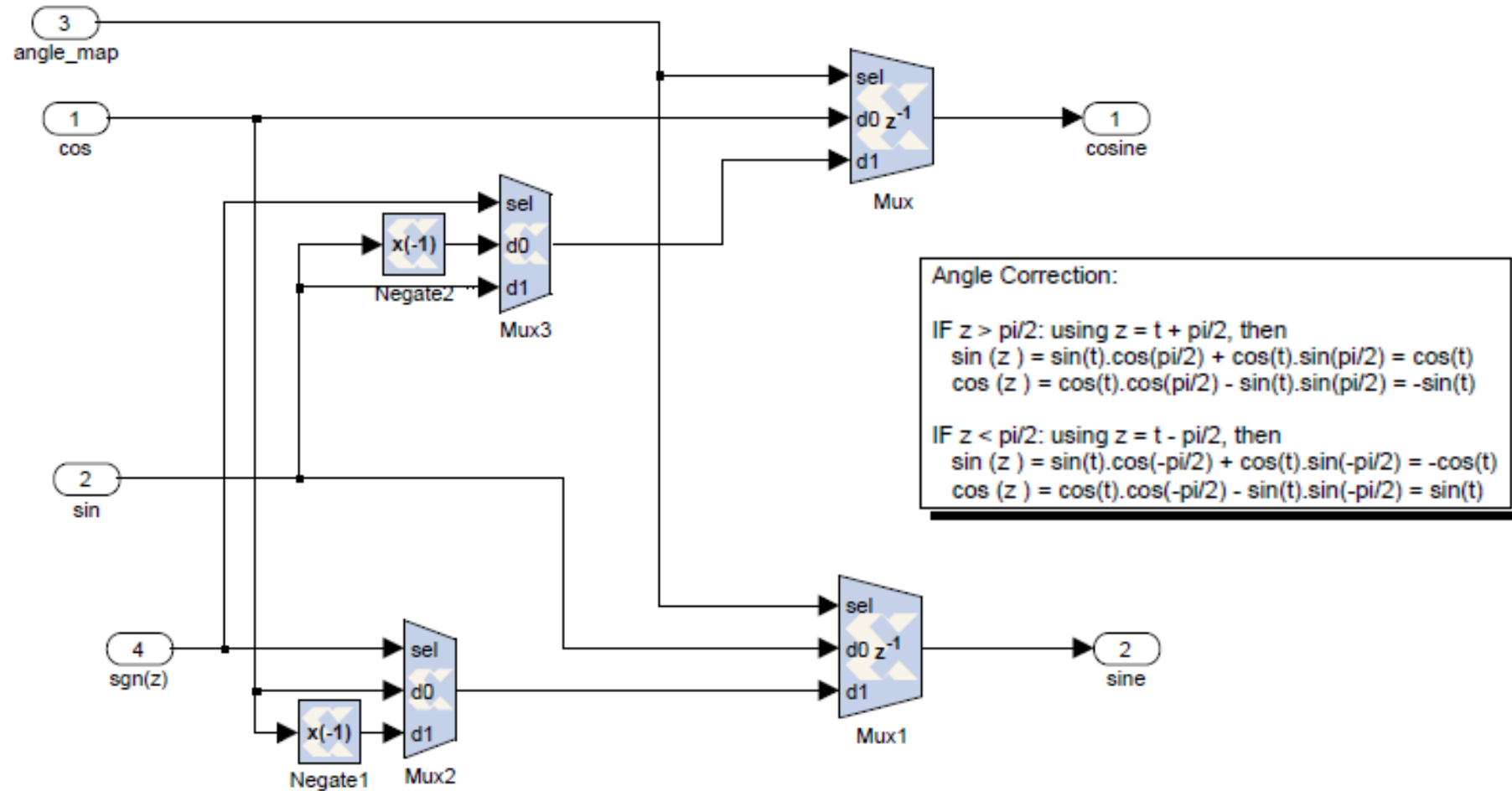
$X = x + y$  if  $z < 0$ , otherwise  
 $= x - y$   
 $Y = y - x$  if  $z < 0$ , otherwise  
 $= y + x$   
 $Z = z + \text{atan}(1/2^i)$  if  $z < 0$ , otherwise  
 $= z - \text{atan}(1/2^i)$

# CORDIC - 8<sup>th</sup> Final Rotation in Example



$X = x + y$  if  $z < 0$ , otherwise  
 $= x - y$   
 $Y = y - x$  if  $z < 0$ , otherwise  
 $= y + x$   
 $Z = z + \text{atan}(1/2^i)$  if  $z < 0$ , otherwise  
 $= z - \text{atan}(1/2^i)$

# CORDIC – Final Correction Step



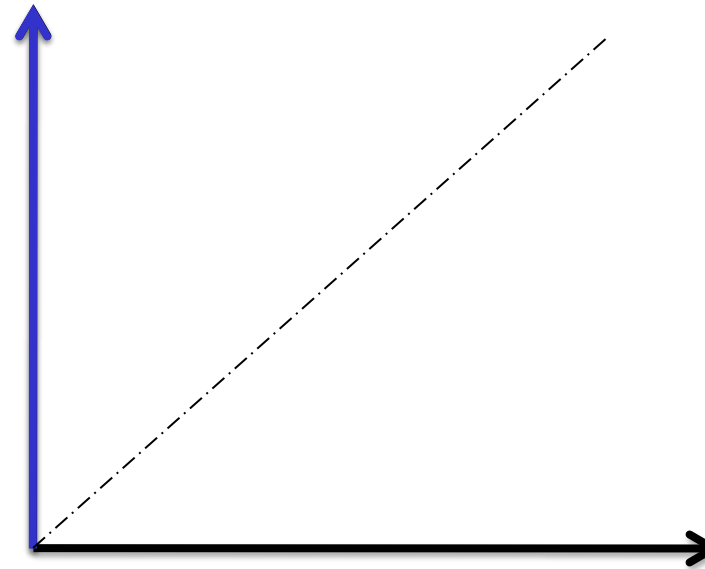
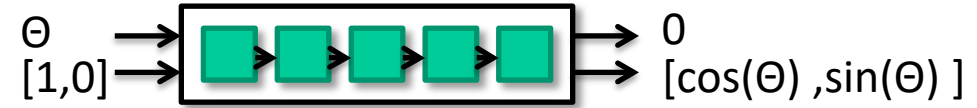
# Modes of CORDIC algorithm

- ❑ Cheap iterative algorithm – iterative successive unitary micro-rotations
- ❑ Modes useful to us:
  - ⇒ ATAN – “find” the angle between a pair of x and y values
  - ⇒ COS/SIN – then able to also “rotate” a vector by an angle
  - ⇒ Scale Factor Correction or Compensation complicates the use of CORDIC.
  - ⇒ Model Composer modules can apply compensation iterations
  - ⇒ If done in Vitis HLS then extra iterations need to be coded
  - ⇒ The output x and y variables will need correction for vector rotation
    - Exceptions occur if preloading for COS/SIN or ATAN

# Review of CORDIC algorithm

## □ COS/SIN Block

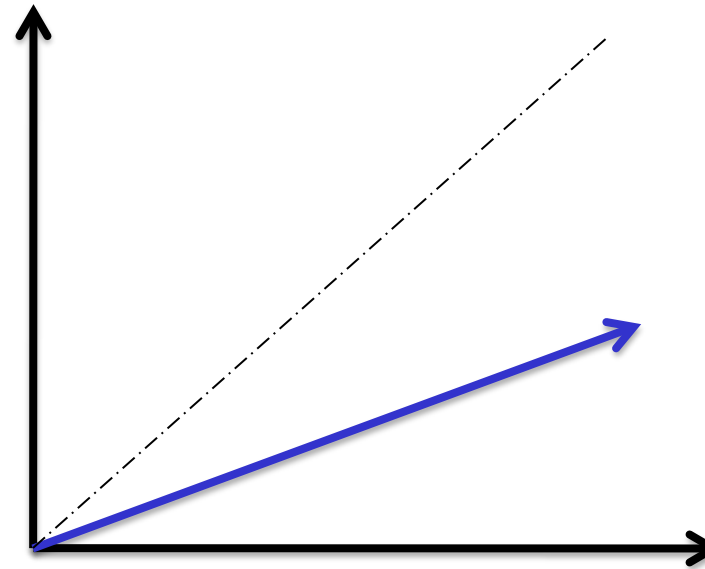
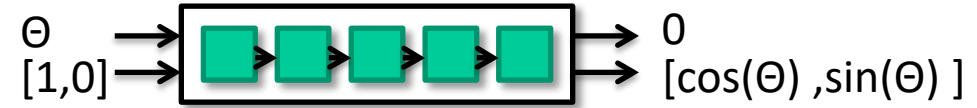
- ⇒ Input:  $\Theta$ , Initial vector  $[1,0]$
- ⇒ Output:  $\sin(\Theta)$ ,  $\cos(\Theta)$
- ⇒ Apply successively smaller unitary micro-rotations



# Review of CORDIC algorithm

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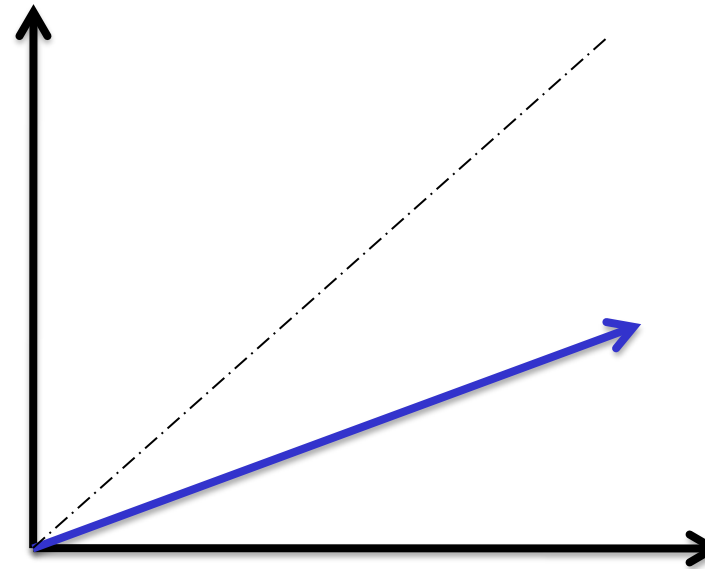
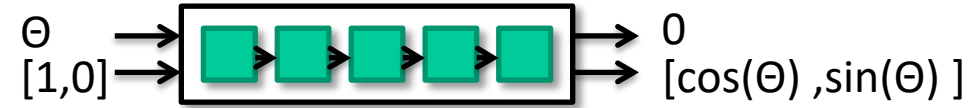




# Review of CORDIC algorithm

## □ COS/SIN Block

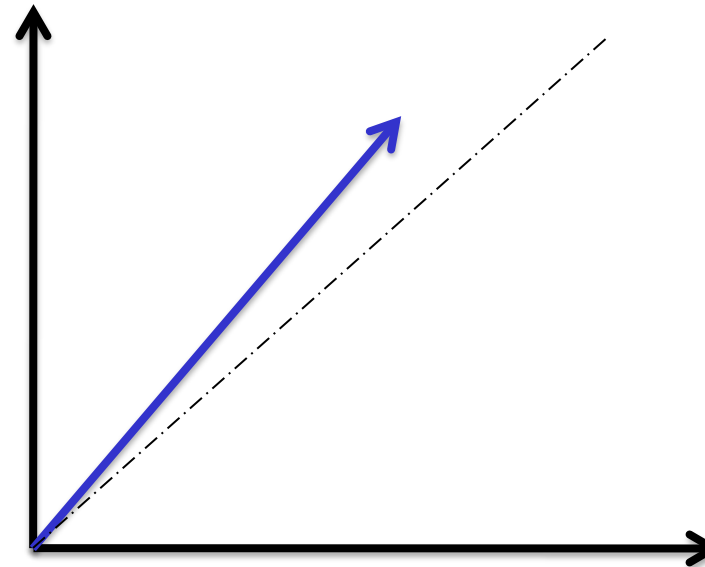
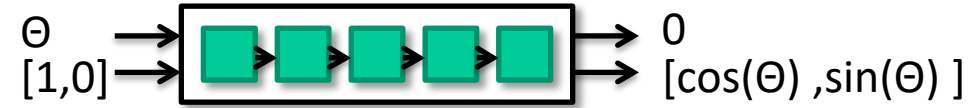
- ⇒ Input:  $\Theta$ , Initial vector  $[1,0]$
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# Review of CORDIC algorithm

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# Review of CORDIC algorithm

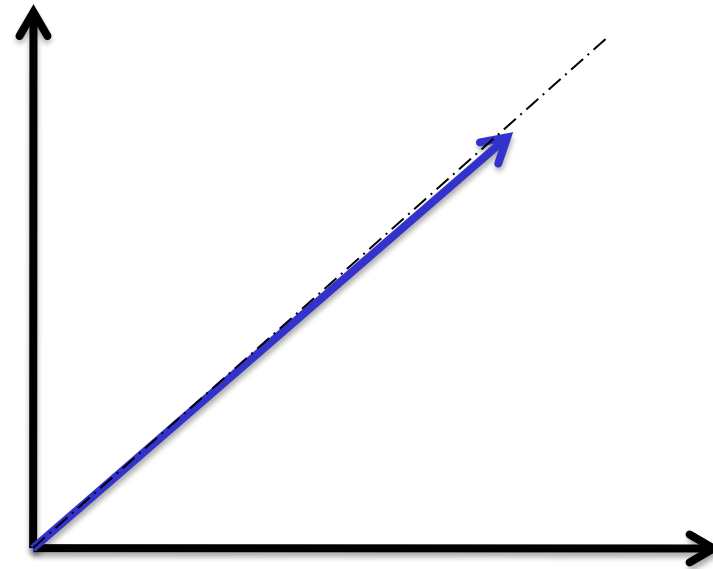
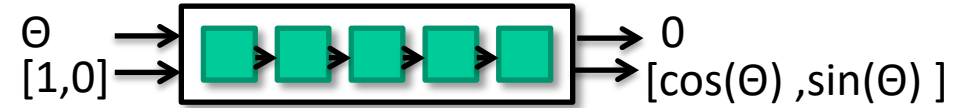
## □ COS/SIN Block

- ⇒ Input:  $\Theta$ , Initial vector  $[1,0]$
- ⇒ Output:  $\sin(\Theta)$ ,  $\cos(\Theta)$
- ⇒ Apply successively smaller unitary micro-rotations

$$v_o = \begin{pmatrix} 1 \\ 0 \end{pmatrix}$$

$$R_i = \begin{pmatrix} \cos \gamma_i & -\sin \gamma_i \\ \sin \gamma_i & \cos \gamma_i \end{pmatrix}$$

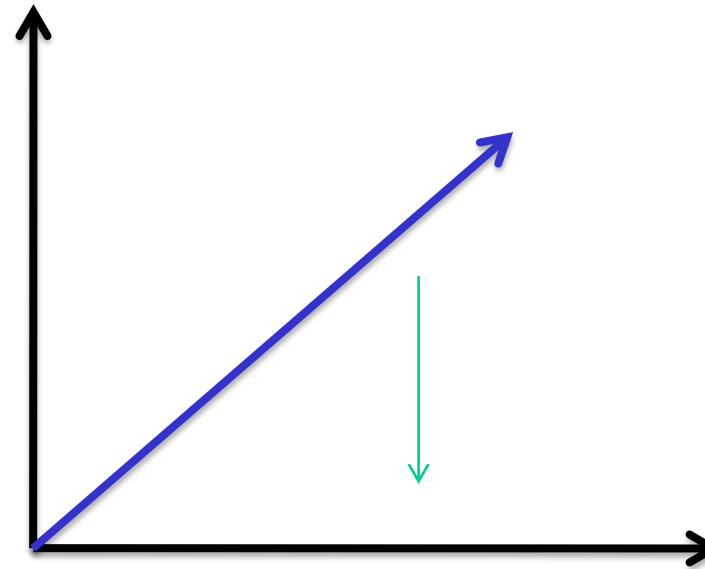
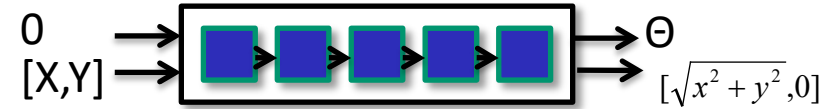
$$v_{i+1} = R_i v_i = \cos \gamma_i \begin{pmatrix} 1 & -\sigma_i \tan \gamma_i \\ \sigma_i \tan \gamma_i & 1 \end{pmatrix} \begin{pmatrix} x_i \\ y_i \end{pmatrix}$$



# Review of CORDIC algorithm

## □ ATAN Block

- ⇒ Input:  $\Theta$ , Initial vector  $[X,Y]$ , initial angle 0
- ⇒ Output:  $\Theta$ ,  $[R,0]$
- ⇒ Apply successively smaller unitary micro-rotations
- ⇒ The vector magnitude or radius will need to be scale factor compensated



# Discussion on Applications of CORDIC

- ❑ CORDIC can be used in isolated Sin and Cos calculations
- ❑ CORDIC use in graphics for Rotations or images
- ❑ CORDIC use in solving systems of linear equations.
- ❑ Can solve  $y = Ax + b$  many ways:
  - ⇒ Gaussian elimination most basic
    - Problems with division and roundoff
    - Especially when matrix is ill-formed.
    - Pivoting is sometimes used.
    - CMOR courses covers much of this
- ❑ Orthogonal rotations are “better” to preserve norm.
  - ⇒ Less fixed-point issues -> QR Decomposition

# CORDIC for Givens Rotations

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- ❑ Givens Rotations
  - ⇒ Conceptually vector rotation
  - ⇒ Based on Sine and Cosine
  - ⇒ Good numerical properties – Norm preserving
  
- ❑ Applied to Matrix Factorization to solve systems of Linear Equations
  - ⇒ QRD, SVD, Eigenvalue Decomposition
  - ⇒ Focus on QRD which factors  $A$  into  $Q$  and  $R$ 
    - $R$  is Right upper triangular
    - $Q$  is Orthogonal and based on collection of  $\sin$ ,  $\cos$

# Givens Rotations Build on CORDIC

$$G(i, k, \theta) = \begin{bmatrix} 1 & \dots & 0 & \dots & 0 & \dots & 0 \\ \vdots & \ddots & \vdots & & \vdots & & \vdots \\ 0 & \dots & c & \dots & s & \dots & 0 \\ \vdots & & \vdots & \ddots & \vdots & & \vdots \\ 0 & \dots & -s & \dots & c & \dots & 0 \\ \vdots & & \vdots & & \vdots & \ddots & \vdots \\ 0 & \dots & 0 & \dots & 0 & \dots & 1 \end{bmatrix}$$

# Givens Rotations

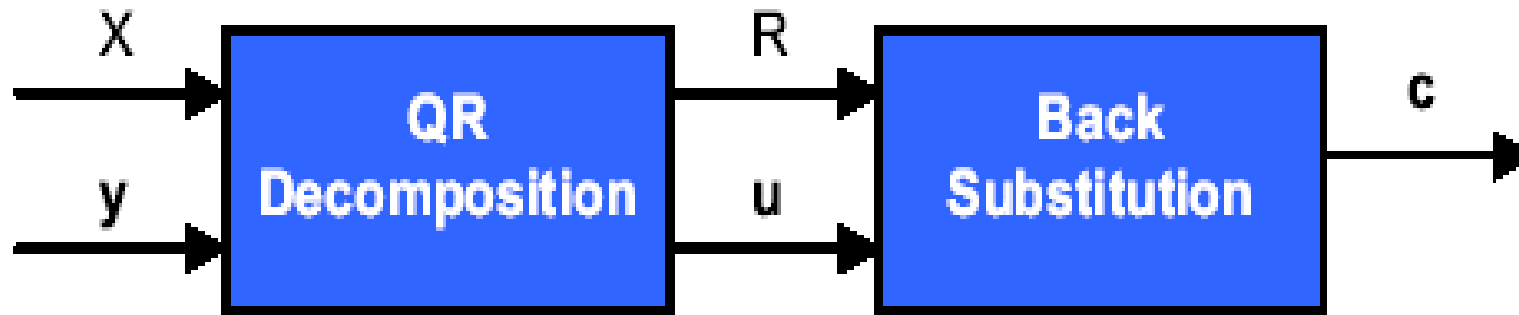
$$A = \begin{pmatrix} 12 & -51 & 4 \\ 6 & 167 & -68 \\ -4 & 24 & -41 \end{pmatrix}.$$

$$G_1 = \begin{pmatrix} 1 & 0 & 0 \\ 0 & \cos(\theta) & \sin(\theta) \\ 0 & -\sin(\theta) & \cos(\theta) \end{pmatrix}$$
$$\approx \begin{pmatrix} 1 & 0 & 0 \\ 0 & 0.83205 & -0.55470 \\ 0 & 0.55470 & 0.83205 \end{pmatrix}$$

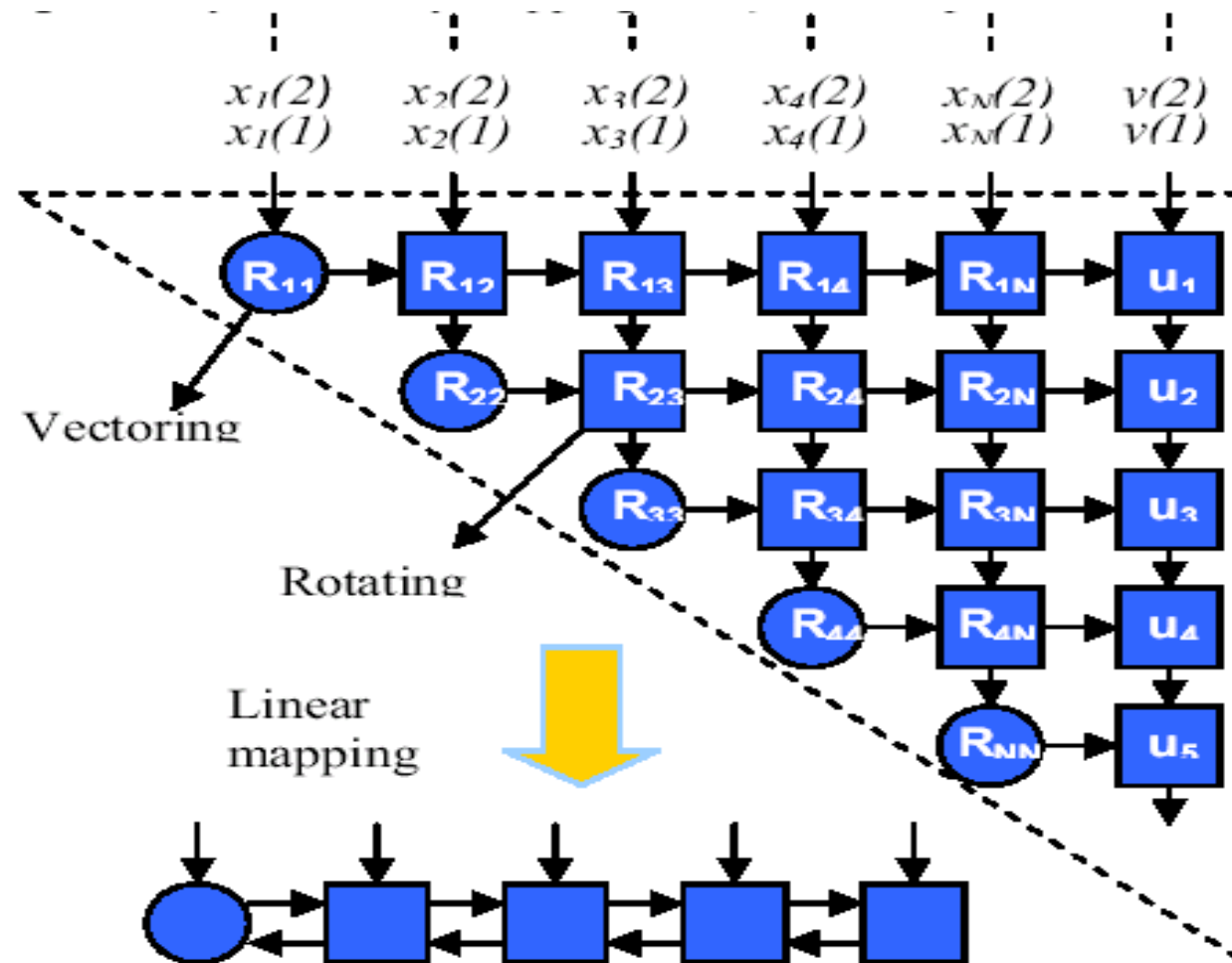


# QRD to Solve Linear System of Equations

$$X\mathbf{c} = \mathbf{y} + \mathbf{e}$$



# QRD Systolic Array



# QRD CORDIC Papers on Canvas

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- ❑ FPGA based paper – Altera Group
- ❑ A High Throughput Systolic Design for QR Algorithm
- ❑ FPGA Implementation of Matrix Inversion using QRD-RLS Algorithm
- ❑ Triangular Systolic Array with Reduced Latency for QR-decomposition of Complex Matrices
- ❑ High-Throughput QR Decomposition for MIMO Detection of OFDM Systems

# Readings on QR Decomposition Arrays and CORDIC

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- ❑ W09\_1982\_Ahmed\_Morf\_Delosme\_01653828.pdf
- ❑ W09\_1984\_Bojanczyk\_Brent\_Kung\_SIAM.pdf
- ❑ W09\_1988\_JPDC\_CORIDC\_SVD\_Cavallaro.pdf
- ❑ W09\_1993\_ISCAS\_QR\_Systolic00693005[1].pdf
- ❑ W09\_2005\_Asilomar\_QRD\_RLS\_Karkooti.pdf
- ❑ W09\_2006\_ISCAS\_QRD\_Tri\_complex.pdf
- ❑ W09\_2010\_ISCAS\_QRD\_MIMO\_05537358.pdf
  
- ❑ In Canvas Papers\_Readings
  - ⇒ Will be helpful background for Projects 4 and 5

# Next Lecture

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- ❑ More on CORDIC Arithmetic
- ❑ Discussion of Project 4 on CORDIC Arithmetic
- ❑ Begin discussion of QR Decomposition using CORDIC