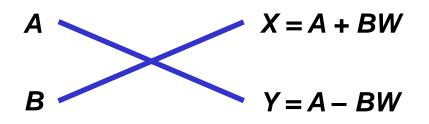
## FFT

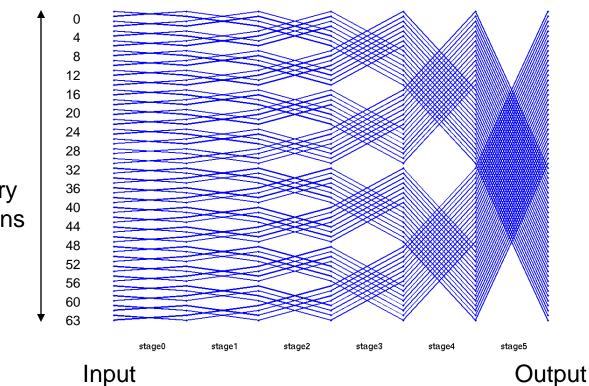
- There are many ways to decompose an FFT [Rabiner and Gold]
- The simplest ones are radix-2
- Computation made up of radix-2 butterflies



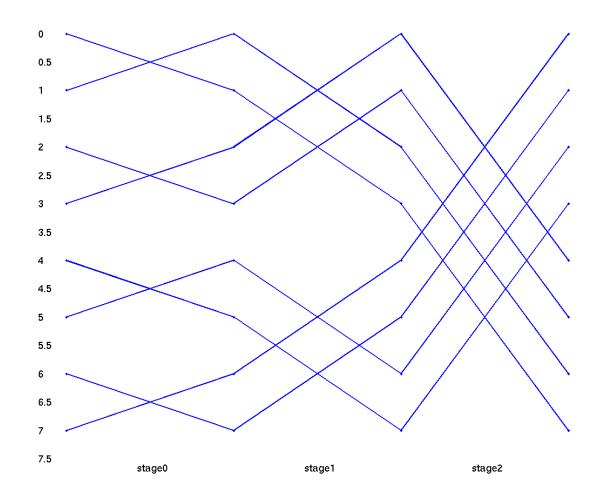
# FFT Dataflow Diagram

- Dataflow diagram
  - N = 64
  - radix-2
  - 6 stages of computation

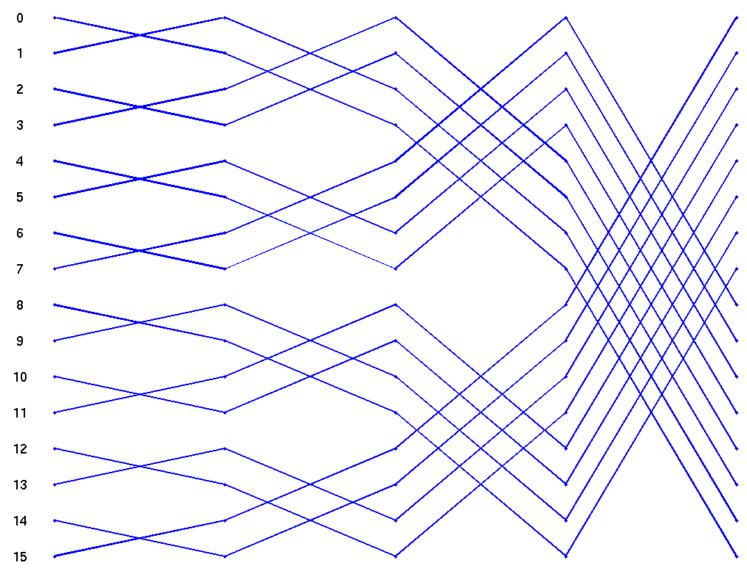
Memory Locations



## Radix 2, 8-point FFT



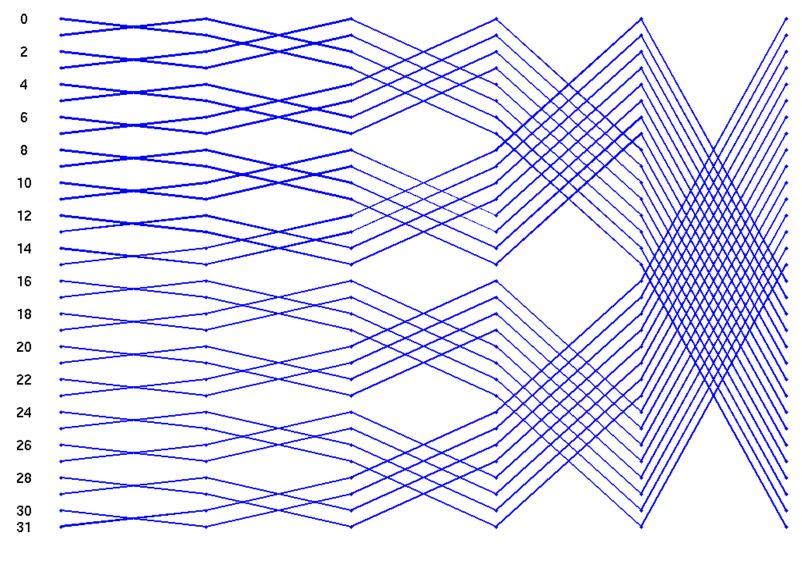
#### Radix 2, 16-point FFT



stage0

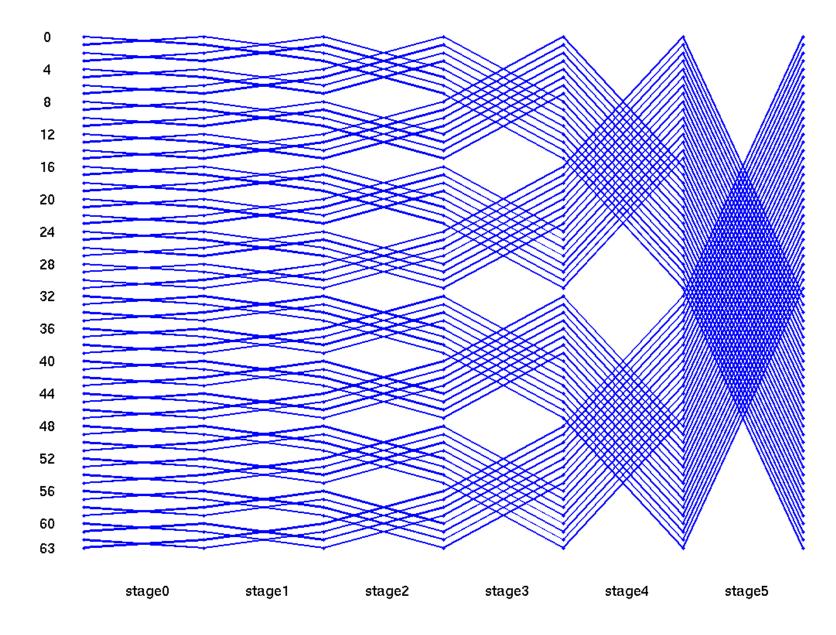
stage1

#### Radix 2, 32-point FFT

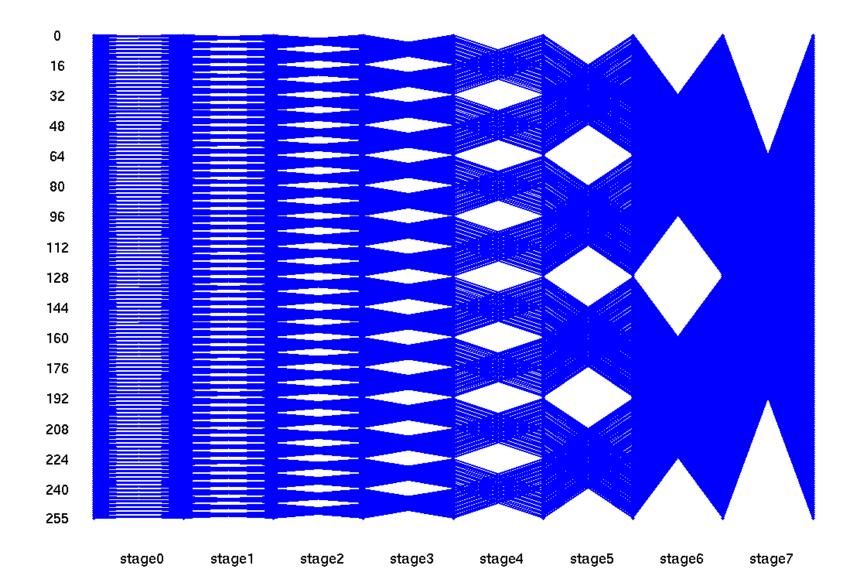


stage0 stage1 stage2 stage3

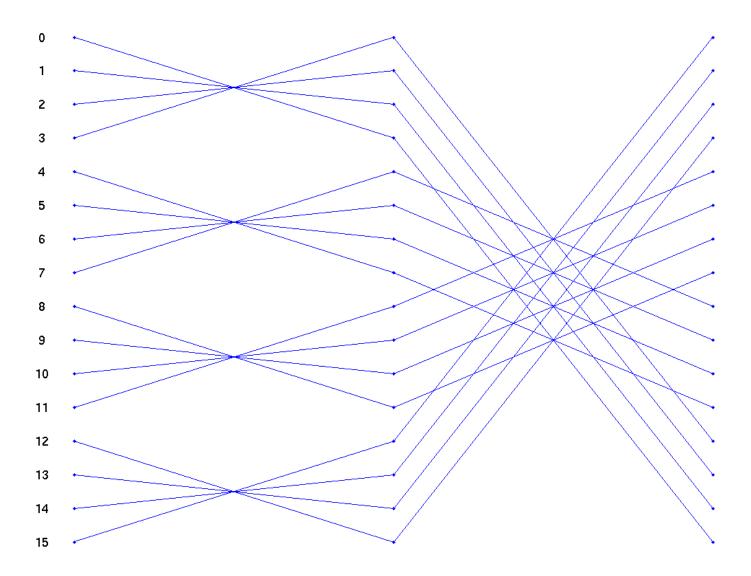
#### Radix 2, 64-point FFT



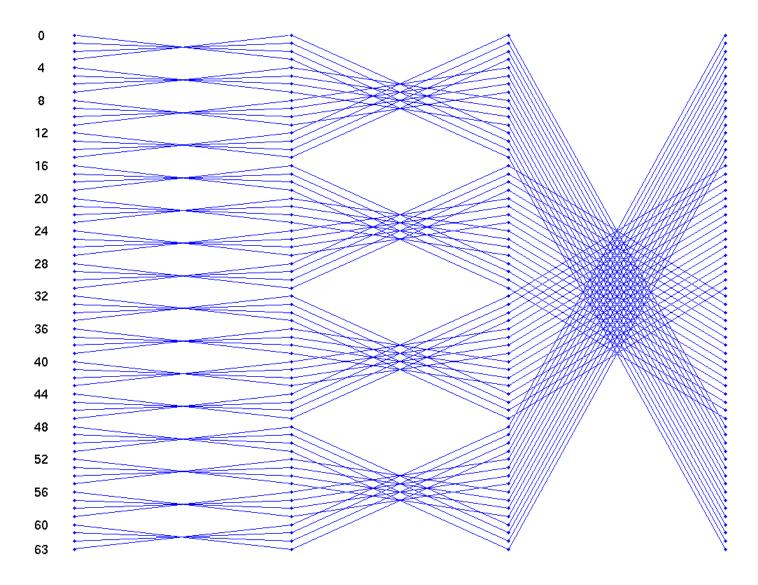
#### Radix 2, 256-point FFT



## Radix 4, 16-point FFT



## Radix 4, 64-point FFT



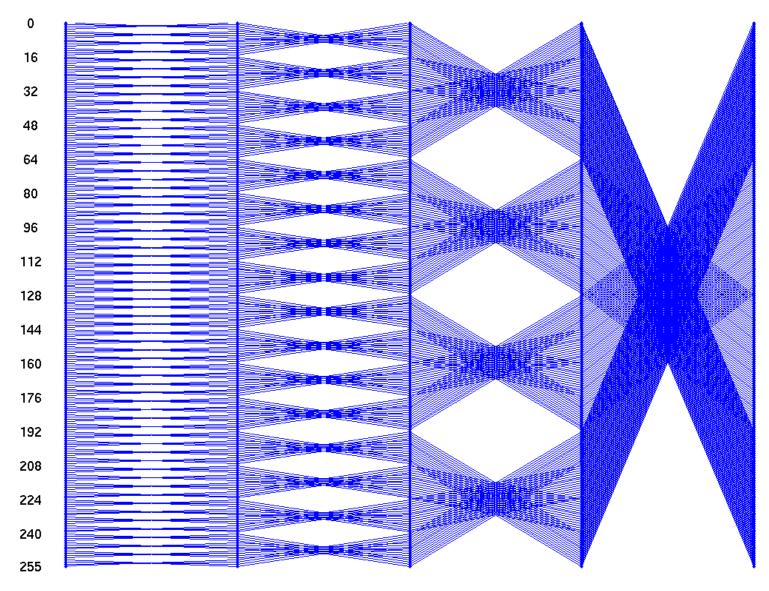
stage0

E

stage1

stage2

## Radix 4, 256-point FFT



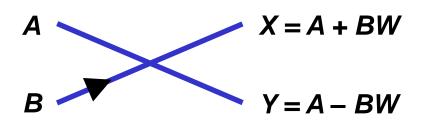
stage1

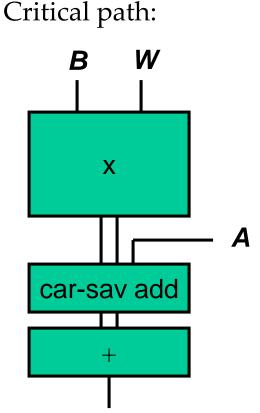
stage0

stage2

## Radix 2, Decimation-In-Time (DIT)

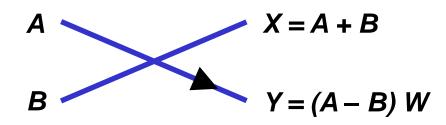
- Input order "decimated" needs bit reversal
- Output in order
- Butterfly:

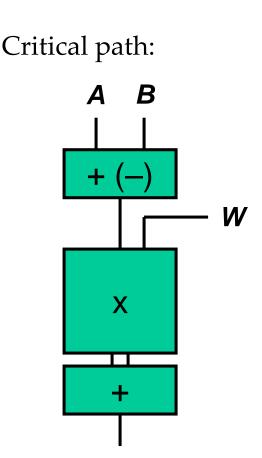




## Radix 2, Decimation In Frequency (DIF)

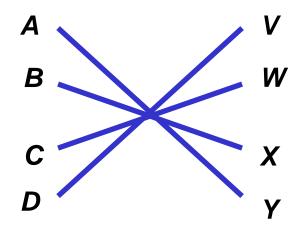
- Input in order
- Output "decimated" needs bit reversal
- Butterfly:
  - Two CPAs
  - Wider multiplier





# Radix 4, DIT Butterfly

• Decimation in Time (DIT) or Decimation in Frequency (DIF)

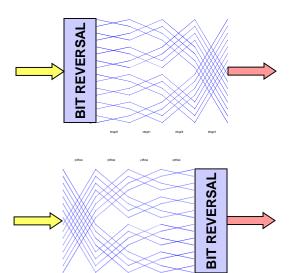


## **Bit-Reversed Addressing**

- Normally:
  - DIT: bit-reverse inputs before processing

- DIF: bit-reverse outputs after processing

- 111 (7) **→** 111 (7)



#### • Reverse addressing bits for read/write of data

- $-000(0) \rightarrow 000(0)$  # Word 0 does not move location
- $-001(1) \rightarrow 100(4)$  # Original word 1 goes to location 4
- $-010(2) \rightarrow 010(2)$  # Word 2 does not move location
- 011 (3)  $\rightarrow$  110 (6) # Original word 3 goes to location 6
- 100 (4)  $\rightarrow$  001 (1) # Original word 4 goes to location 1
- 101 (5) → 101 (5) # Word 5 does not move location
- 110 (6)  $\rightarrow$  011 (3) # Original word 6 goes to location 3
  - # Word 7 does not move location

B. Baas

# Addressing In Matlab (Especially helpful for FFTs)

- Matlab
  - Matlab can not index arrays with index zero!
- In matlab, do address calculations normally
  - $\begin{array}{ll} & AddrA & = 0, \, 2, \, 4, \, \dots \\ & AddrB & = 1, \, 3, \, 5, \, \dots \end{array}$
- then use pointers with an offset of one whenever indexing arrays
  - AddrA = .....; AddrB = .....; A = data(AddrA+1); B = data(AddrA+1); ... data(AddrA+1) = X; data(AddrA+1) = Y;

# **Higher Radices**

- Radix 2 and radix 4 are certainly the most popular
- Radix 4 is on the order of 20% more efficient than radix 2 for large transforms
- Radix 8 is sometimes used, but longer radix butterflies are not common because additional efficiencies are small and added complexity is nontrivial (especially for hardware implementations)

# I. Common-Factor FFTs

- Key characteristics
  - Most common class of FFTs
  - Also called Cooley-Tukey FFTs
  - Factors of *N* used in decomposition have common factor(s)
- A) Radix-*r* 
  - $N = r^k$ , where *k* is a positive integer
  - Butterflies used in each stage are the same
  - Radix-*r* butterflies are used
  - *N*/*r* butterflies per stage
  - $k = \log_r N$  stages

# I. Common-Factor FFTs

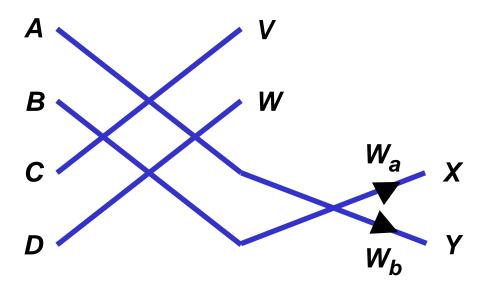
- B) Mixed-radix
  - Radices of component butterflies are not all equal
  - More complex than radix-*r*
  - Is necessary if  $N \neq r^k$
  - Example
    - N = 32
    - Could calculate with two radix-4 stages and one radix-2 stage

# II. Prime-Factor FFTs

- The length of transforms must be the product of relatively prime numbers
- This can be limiting, though it is often possible to find lengths near popular power-of-2 lengths (e.g., 7 x 11 x 13 = 1003)
- Their great advantage is that they have no  $W_N$  twiddle factor multiplications
- Irregular sorting of input and output data
- Irregular addressing for butterflies

# III. Other FFTs

- Split-radix FFT
  - When  $N = p^k$ , where p is a small prime number and k is a positive integer, this method can be more efficient than standard radix-p FFTs
  - "Split-radix Algorithms for Length-p<sup>m</sup> DFT's," Vetterli and Duhamel, *Trans. on Acoustics, Speech, and Signal Processing*, Jan. 1989



# III. Other FFTs

- Winograd Fourier Transform Algorithm (WFTA)
  - Type of prime factor algorithm based on DFT building blocks using a highly efficient convolution algorithm
  - Requires many additions but only order *N* multiplications
  - Has one of the most complex and irregular structures
- FFTW (www.fftw.org)
  - C subroutine libraries highly tuned for specific architectures
- Goertzel DFT
  - Not a "normal" FFT in that its computational complexity is still order  $N^2$
  - It allows a subset of the DFT's *N* output terms to be efficiently calculated

# Signal Growth

- Note in DFT equation signal can grow by *N* times
- This is also seen in the FFT in its growth by *r* times in a radix-*r* butterfly, and log<sub>r</sub>N stages in the entire transform: *r* ^ (log<sub>r</sub>N) = N
- Thus, the FFT processor requires careful scaling
  - Floating point number representation
    - Easiest conceptually, but expensive hardware. Typically not used in efficient DSP systems.
  - Fixed-point with scaling by 1/*r* every stage
    - First stage is a special case. Scaling must be done on the inputs before processing to avoid overflow with large magnitude complex inputs with certain phases.
  - Block floating point

## Efficient Computation of the IFFT

- out = IFFT(in)
- 0) Design a separate processor for IFFTs
- Re-use a forward FFT engine if available
  - 1) Swapping real and imaginary parts:
    a = fft(imag(in) + i\*real(in));
    out = (imag(a) + i\*real(a));
  - 2) Using conjugates:

```
a = fft(conj(in));
```

out = conj(a);

– 3) A simple indexing change:

a = fft(in);

- out = [a(0) a(N-1:-1:1)]; % with normal indices
- out = [a(1) a(N :-1:2)]; % with weird matlab indices