

# **Real-Time Sonar Beamforming on a Unix Workstation using Process Networks and POSIX Threads**

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# Motivation

- Beamforming is computationally intensive (GFLOPS).
- Traditionally limited to expensive custom hardware.
- Real-time software implementation on a workstation.
  - Multi-processor workstations.
  - Real-time threads supported by modern operating systems.
  - Native signal processing.

# **Objectives**

- Implement a 4 GFLOP sonar beamformer in software.
  - Evaluate the performance of sonar beamforming algorithms.
  - Capture parallelism and guarantee determinate bounded execution.
  - Use lightweight threads on a multiprocessor workstation.
- Assess feasibility of replacing a real-time custom hardware beamformer with a Unix workstation.

# Time-Domain Beamforming

- Delay and sum weighted sensor outputs.
- Geometrically project the sensor elements onto a line to compute the time delays.

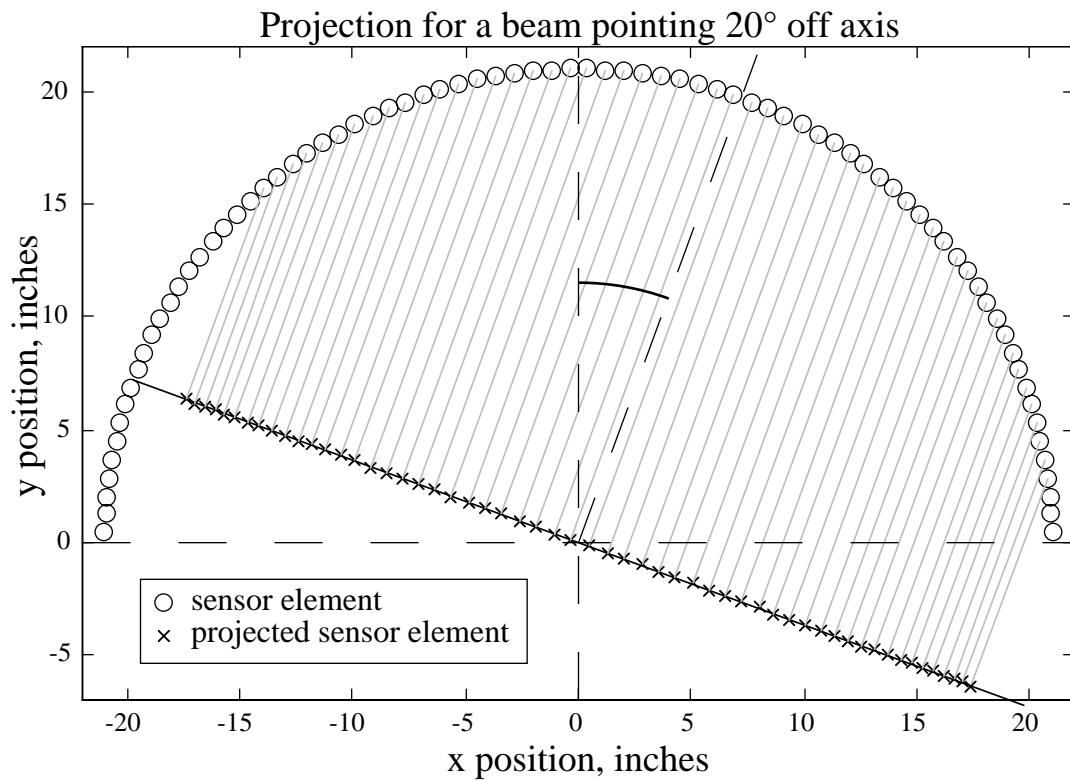
$$b(t) = \sum_{i=1}^M \alpha_i x_i(t-\tau_i)$$

$b(t)$  beam output

$x_i(t)$   $i^{\text{th}}$  sensor output

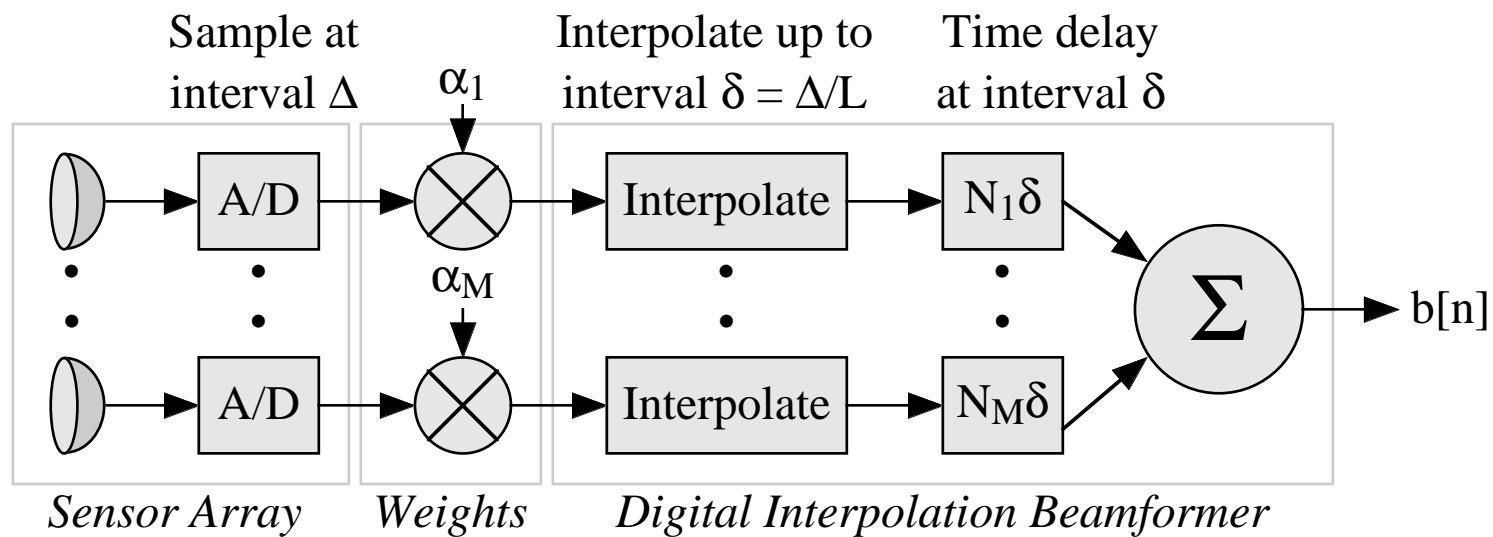
$\tau_i$   $i^{\text{th}}$  sensor delay

$\alpha_i$   $i^{\text{th}}$  sensor weight



# Interpolation Beamforming

- Quantized time delays perturb beam pattern.
- Sample at just above the Nyquist rate.
- Interpolate to obtain desired time-delay resolution.



# Interpolation Beamforming

- Modeled as a sparse FIR filter:

- $M$  total sensors in array (80)
- $S$  sensors used to calculate beam (50)
- $D$  maximum geometry delay (31)
- $P$  points for interpolation filter (2)
- $B$  number of beams calculated (61)

$$\text{Coefficient filter length: } K = (D+P-1) M \quad (2560)$$

$$\text{Non-zero coefficients: } C = P S \quad (100)$$

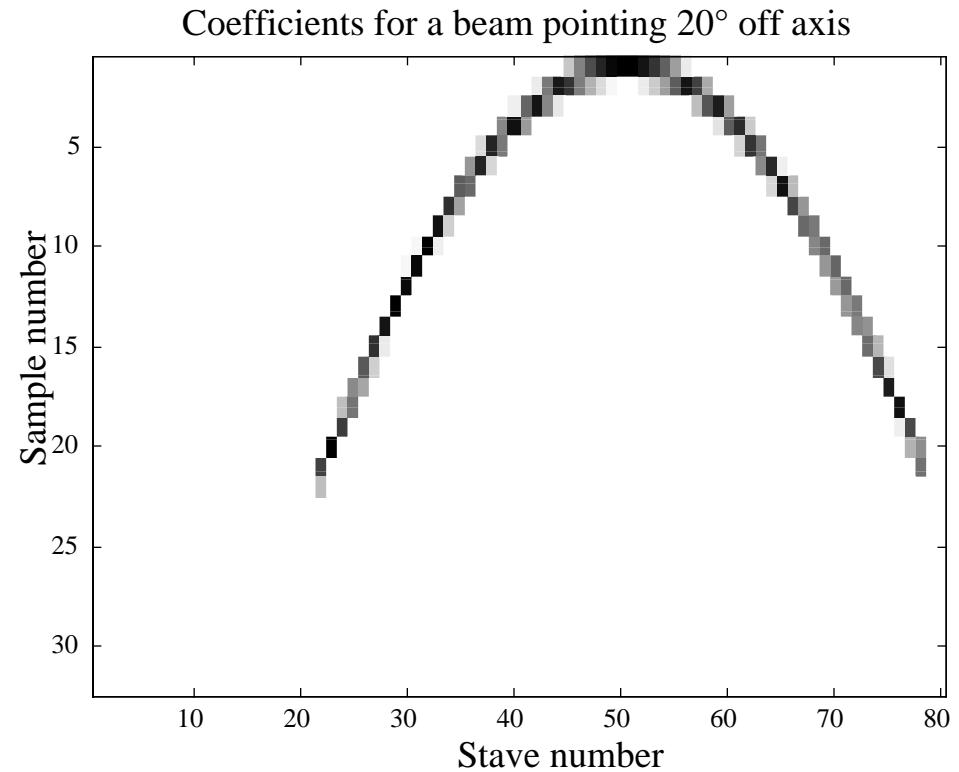
$$\text{Sparsity} = 1 - C/K \quad (96\%)$$

$$\text{MACs per sample} = \mathbf{B} \mathbf{C} \quad (6100)$$

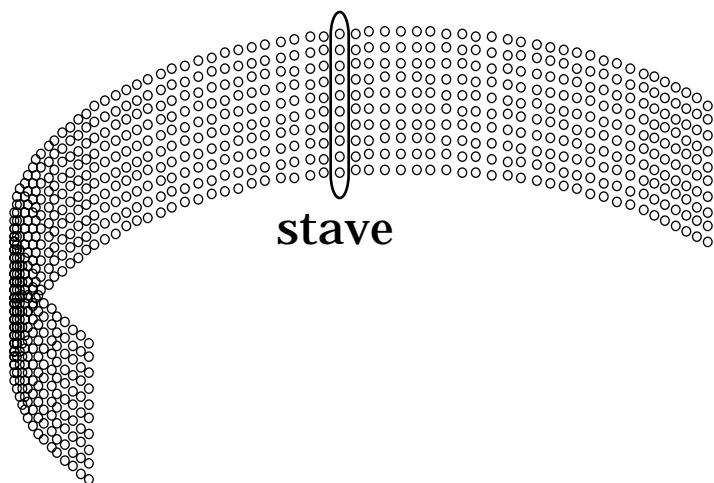
$$\begin{bmatrix} \text{Incoming Data} \end{bmatrix}_{(1 \text{ by } K)} \times \begin{bmatrix} \text{Beam} & \cdots & \text{Beam} \\ 1 & \cdots & B \\ \text{coefs} & & \text{coefs} \end{bmatrix}_{(K \text{ by } B)} = \begin{bmatrix} \text{Beam Data} \\ (1 \text{ sample}) \end{bmatrix}_{(1 \text{ by } B)}$$

# Interpolation Beamformer

- Performed in floating-point to preserve dynamic range.
- Generate sparse FIR beam coefficients using Matlab.
  - 2560-point sparse FIR filter viewed in 2-D.
  - Zero-valued coefficients are white, non-zero coefficients are black.
  - Array shape is visible in beam coefficients.



# Vertical Beamforming

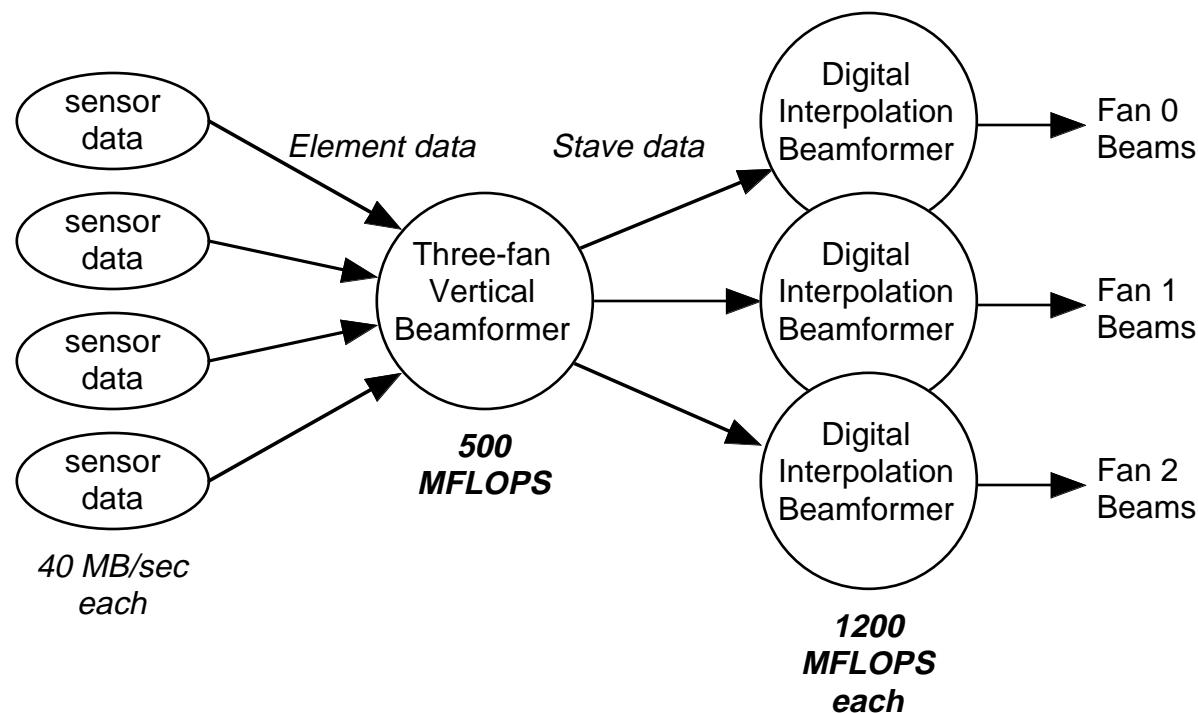


Multiple vertical transducers  
for every horizontal position.

- Each vertical sensor column is combined into a *stave*.
  - No time delay or interpolation is required.
  - Staves are calculated by a simple dot product.
  - Integer-to-float conversion must be performed.
  - Output data must be interleaved.

# System Block Diagram

- Vertical beamformer forms 3 sets of 80 staves from 10 vertical elements each.
- Each horizontal beamformer forms 61 beams from the 80 staves, using a two-point interpolation filter.

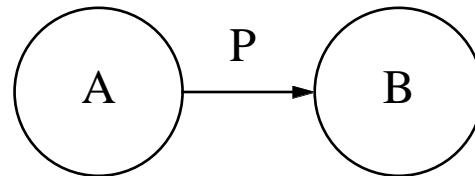


# **Formal Design Methodology**

- The *Process Network* model [Kahn, 1974].
- Superset of dataflow models of computation.
- Captures concurrency and parallelism.
- Provides correctness.
- Guarantees determinate execution of the program.

# The Process Network Model

- A program is represented as a directed graph
  - Each node represents an independent process.
  - Each edge represents a one-way FIFO queue of data.



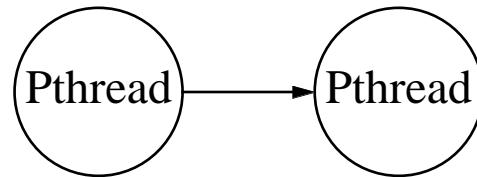
- A node may have any number of input or output edges, and may communicate only via these edges.
- A node suspends execution when it tries to consume data from an empty queue (blocking reads).
- A node is never suspended for producing, so queues can grow without bound (non-blocking writes).

# Bounded Scheduling

- Infinitely large queues cannot be implemented.
- The following scheduling policy will execute the program in bounded memory if it is possible [Parks, 1995]
  1. Block when attempting to read from an empty queue.
  2. Block when attempting to write to a full queue.
  3. On *artificial deadlock*, increase the capacity of the smallest full queue until the producer associated with it can fire.
- Fits the thread model of concurrent programming.

# Process Network Implementation

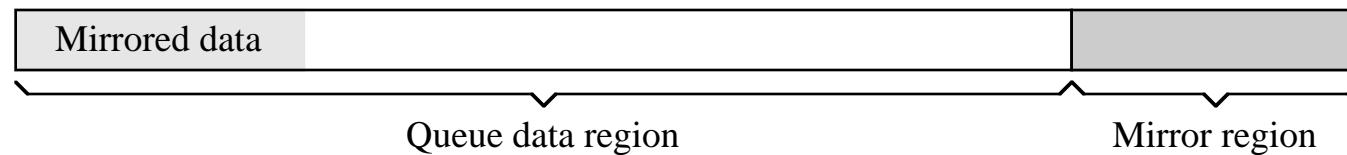
- Implemented in C++ using POSIX Pthreads.
- Each node corresponds to a thread.



- Low-overhead, high-performance, scalable.
- Granularity larger than a thread context switch.
- Symmetric multiprocessing operating system dynamically schedules threads.
- Efficient utilization of multiple processors.

# Process Network Queues

- Nodes operate directly on queue memory, avoiding unnecessary copying.
- Queues use mirroring to keep data contiguous.



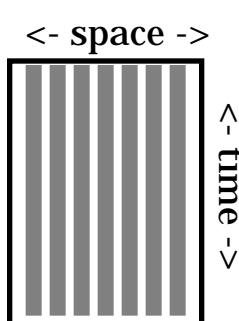
- Compensates for the lack of circular address buffers.
- Queues tradeoff memory usage for overhead.
- Virtual memory manager maintains data circularity.

# Exploiting Parallelism

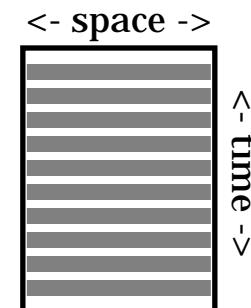
divide by beam

vs.

divide by time



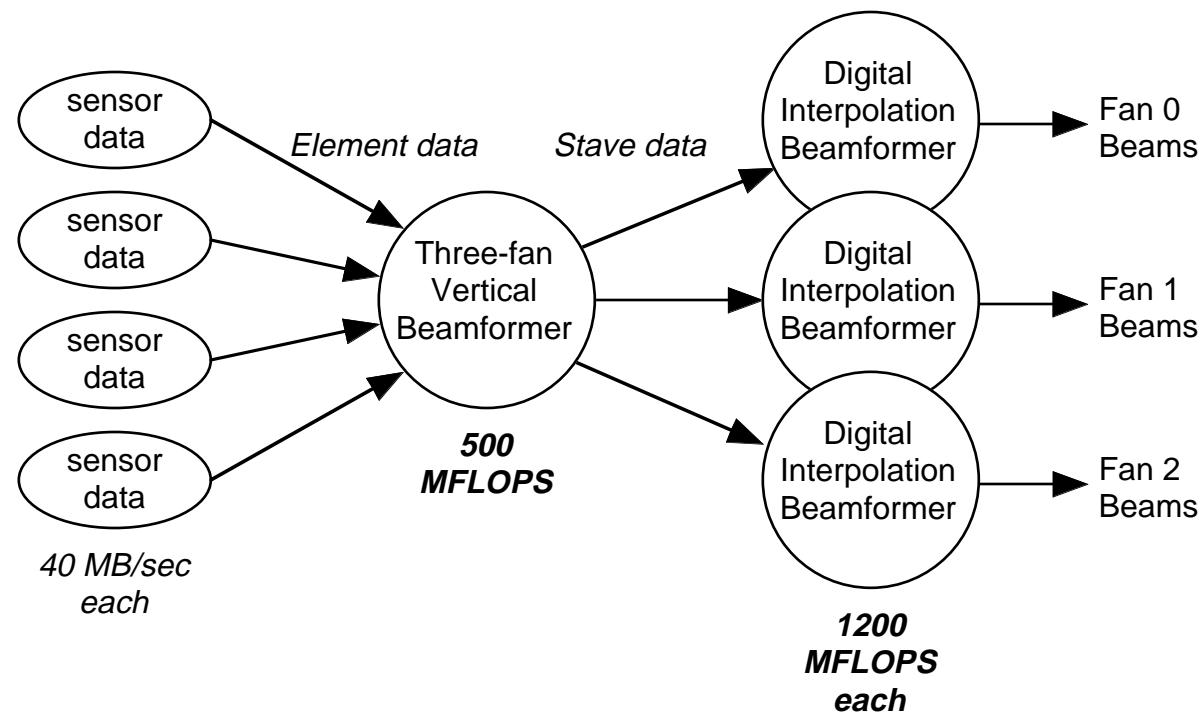
|          |                     |             |
|----------|---------------------|-------------|
| low      | <i>Latency</i>      | high        |
| low      | <i>Memory Usage</i> | high        |
| poor     | <i>Cache Usage</i>  | good        |
| partial  | <i>Style</i>        | batch       |
| embedded | <i>Target</i>       | workstation |



- Strategies for high performance on a workstation
  - Throughput is more important than memory usage or latency.
  - Keep kernel calculations smaller than the cache.
  - Calculate as much as possible while the data is in cache.

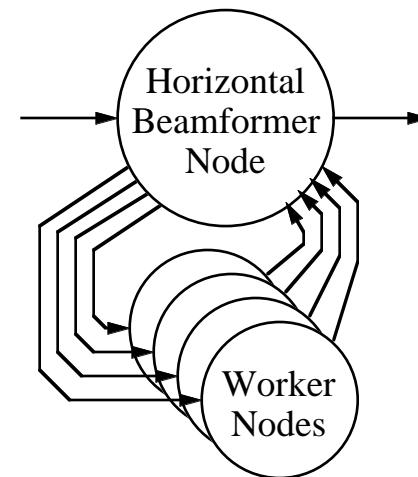
# System Implementation

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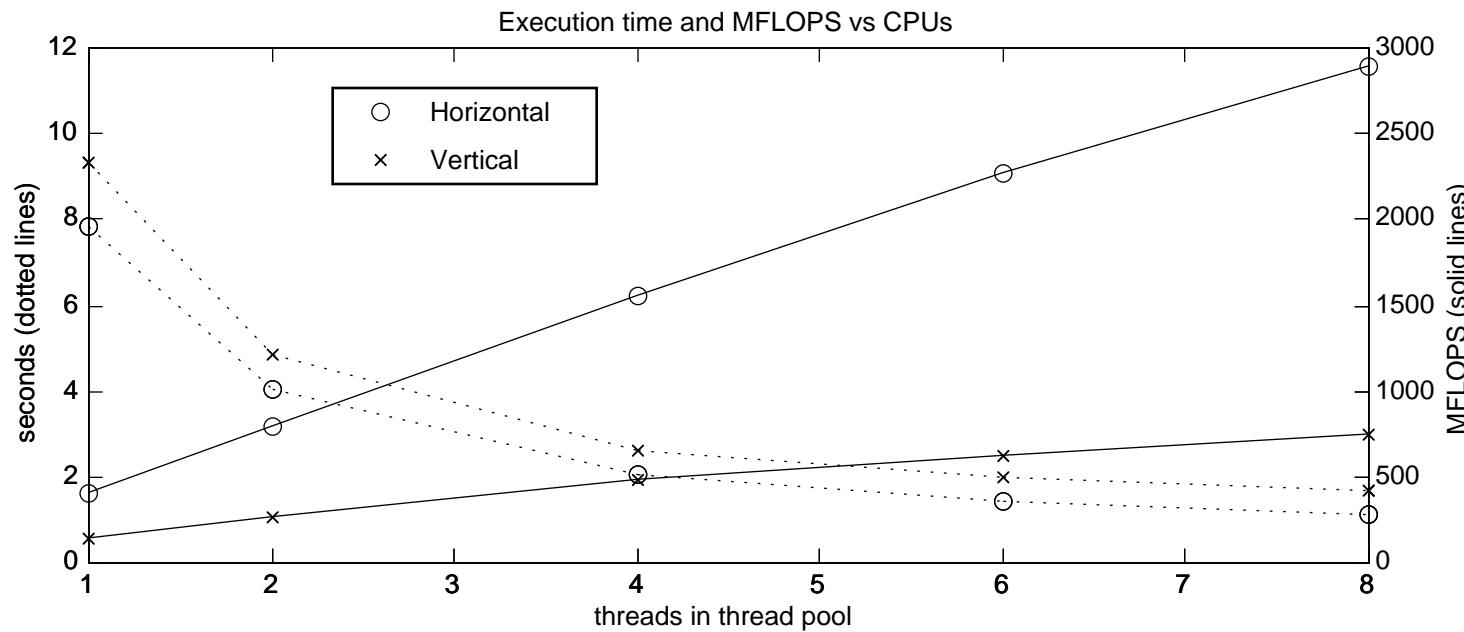
# Integration with Process Networks

- A single CPU cannot achieve real-time performance.
- A horizontal beamformer node manages multiple worker nodes.
- The number of worker nodes is set as performance requirements dictate.
- Similar to the traditional thread pool model.



# Kernel Performance Results

- Ten trial mean execution time for 2.6 seconds of data.
- Sun Ultra Enterprise 4000 with 8 UltraSPARC-II CPUs at 336 MHz, running Solaris 2.6.

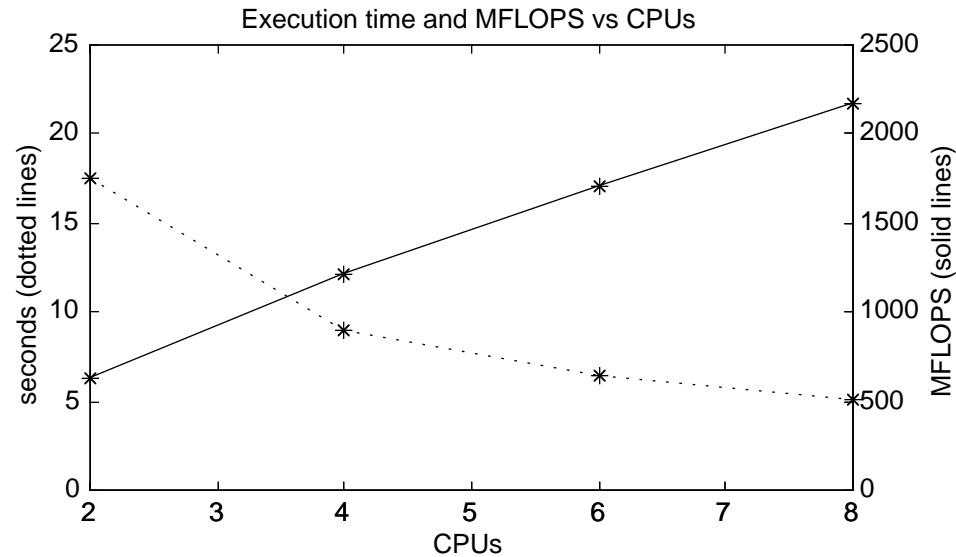


|            | kernel performance           | scalability |
|------------|------------------------------|-------------|
| Horizontal | good at 1.22 FLOPS per cycle | good        |
| Vertical   | poor at 0.40 FLOPS per cycle | poor        |

# System Performance Results

- Process network and thread pool results are within 1%, overhead is small.
- Process network uses 25% less memory with lower latency.
- Scalability is evaluated by disabling CPUs.
- Process network scalability is good.
- Will continue to scale as more CPUs are added.

| Type            | Seconds | MFLOPS |
|-----------------|---------|--------|
| thread pool     | 5.053   | 2159.0 |
| process network | 5.024   | 2171.5 |



# Conclusion

- Implemented a 4 GFLOP software sonar beamformer.
  - Divide the computation by time and not by beam.
  - Use the Process Network model of computation.
  - POSIX Pthreads and a symmetric multiprocessing workstation.
- This 4 GFLOP beamforming system could execute in real time with 16 UltraSPARC-II CPUs at 336 MHz.
- We achieve real-time beamforming at a substantial savings in development cost and time.