# Application Emulators and Simulation Models

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# Our Target

- Large scale data-intensive parallel applications
  - Flexible, accurate, *scalable* models of applications
- Large scale machines
  - Fast and accurate simulation models
- Performance prediction in reasonable amount of time on workstations

# **Application Emulators**

- Exhibits computational and access patterns that resemble patterns observed in the real application
- Provides a parameterized model of the application, for scaling and changing program details
- A simplified version (of both program and data)
- An executable (parallel or sequential) program

# Why do we need application emulators?

- Problems with using traces from actual runs
  - Obtained for a single instance of application and machine configuration
  - Static, hard to represent dynamic nature of the program
  - May become very large
- Problems with running full application on simulator
  - May complicate the task of simulator unnecessarily
  - Execution of real application requires real data
  - Scaling real application for large scale machines may not be possible
- Application emulator
  - Parameterized, not specific to a single instance of application/machine configuration.
  - It is a *program*, so can model dynamic nature of application.
  - Level of abstraction can be controlled, simplifying task of simulator
  - Does not require real data, so can be scaled for large machines

# Data-intensive Scientific Applications Suite

- Titan
  - Satellite data processing
  - peer-to-peer
- Pathfinder
  - Satellite data processing
  - client-server (separate I/O and Compute nodes)
- Virtual Microscope
  - Light microscope image database server
  - data server (multiple simultaneous queries), peer-to-peer

# Titan: Input Data Structure

- Satellite Data
  - Satellite orbits earth in polar orbit
  - Each element (IFOV) is associated with a position (in longitudelatitude) and time of recording
- Input data is partitioned into data-blocks
  - Unit of I/O and communication is a data-block
  - Each block contains the same number of input elements
  - Spatial extent of each block varies
  - More overlapping blocks near the poles
- Data is distributed across disks for I/O parallelism
  - Minimax algorithm (Moon et al. 1996) for declustering

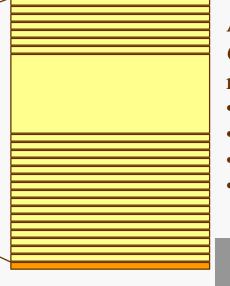
# **Remotely Sensed Data**

NOAA Tiros-N w/ AVHRR sensor

### **AVHRR** Level 1 Data

As the TIROS-N satellite orbits, the Advanced Very High Resolution Radiometer (AVHRR) sensor scans perpendicular to the satellite's track.
At regular intervals along a scan line measurements are gathered to form an *instantaneous field of view* (IFOV).

• Scan lines are aggregated into Level 1 data sets.

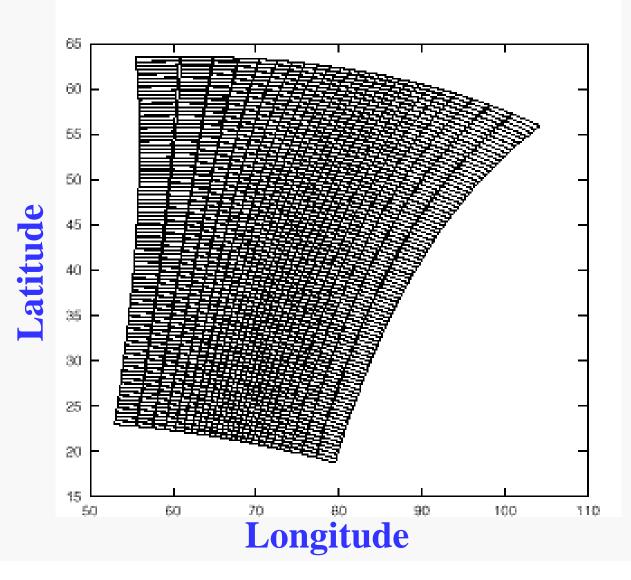


A single file of *Global Area Coverage* (GAC) data represents:

- ~one full earth orbit.
- ~110 minutes.
- ~40 megabytes.
- ~15,000 scan lines.

One scan line is 409 IFOV's

### **Spatial Irregularity** AVHRR Level 1B NOAA-7 Satellite 16x16 IFOV blocks.



# Titan: Output Data Structure

- 2D image (latitude and longitude)
- Partitioned into equal size rectangles among processors
- Each processor is responsible for processing of blocks that map onto its region

# Titan: Processing Loop

#### While (<u>not done</u>) do

**Issue reads Issue receives** Poll reads if (some reads completed) then Map data-block to output data if (mapped to other processors) Issue sends to those processors if (mapped to myself) Enqueue for processing Poll receives if (data-block received) Enqueue for processing Poll sends Process a data-block end while

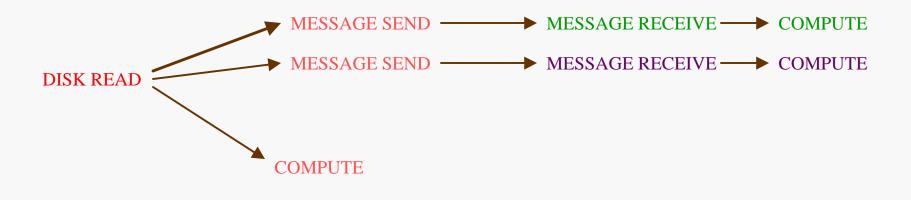
#### not done when there are

- \* reads yet to be issued
- \* pending reads
- \* receives yet to be issued
- \* pending receives
- \* pending sends
- \* blocks yet to be processed

# Processing Loop

\* All communication and I/O are non-blocking operations
\* There are dependencies between operations on a data-block

Life cycle of a data-block



# An Emulator for Titan

- Input Data Structure
  - I/O, Communication, Computation patterns
- Output Data Structure (Work load partitioning)
  - Communication, Computation patterns
- Processing Loop
  - I/O, Communication, Computation patterns

# An Emulator for Titan

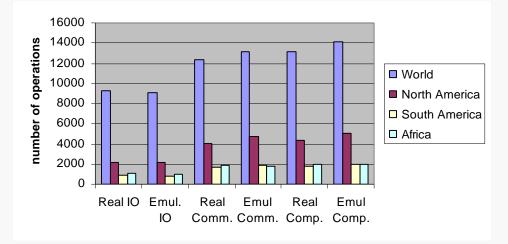
- Description of the machine
  - number of processors and disks
  - machine description file
- Input Data Structure
  - A data-block is represented by a 2D rectangle
  - Controlled generation of data-blocks using functions
  - Parameterized generation of blocks
    - number of blocks
    - size of a block
  - Simple block-cyclic distribution of blocks to disks

### An Emulator for Titan

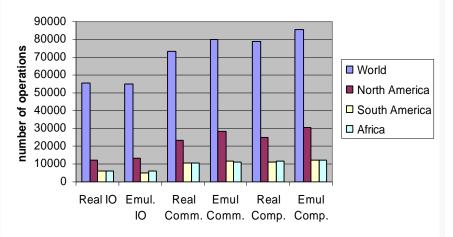
- Output Data Structure
  - Represented by a 2D rectangle
  - Parameterized 2D processor mesh
    - number of processors in x and y dimensions
- Processing Loop
  - Retain non-blocking nature of operations
  - Retain dependencies between operations on a block
  - Parameterization of some operations
    - number of maximum pending reads, receives
    - number of blocks processed per iteration of loop
  - Each block is assumed to take the same amount of time
    - computation time of a block can be changed

### Comparison of Real Application and Emulator (Maryland 16 processor IBM SP2)

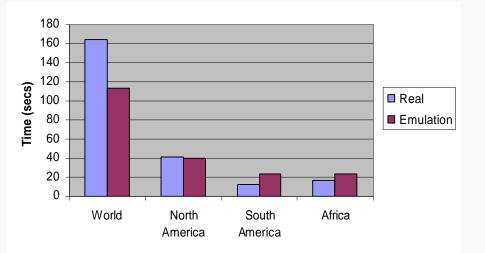
#### Number of operations, 10-day data



#### Number of operations, 60-day data

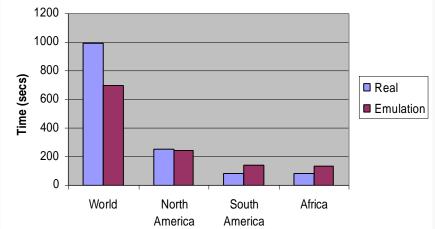


### Comparison of Real Application and Emulator



Execution Times, 10-day data

#### Execution Times, 60-day data



# Simulation Models (Interaction between Emulators and Simulators)

- Tightly-coupled Simulation
  - Similar to running on real machine
    - a thread is created for each application emulator process
    - emulator performs calls to simulator API for
      - initiating I/O, communication, and computation operations (events)
      - checking their completion
  - Simulator schedules emulator threads to ensure correct logical order of operations
  - Emulator and simulator interacts for each event (e.g., disk read request)
  - Emulator keeps track of dependencies between operations

# Simulation Models

# Tightly-coupled simulation is not suitable for simulating large scale machines

- Number of emulator threads increases with increasing number of processors
  - Scheduling these threads becomes very costly
- Message and I/O tables for outstanding non-blocking operations become very large
  - Need for large memory to store these tables
  - Very costly to manage these tables
- Each emulator thread has to keep track of non-blocking operations
  - Needs its local data structures (tables) for these operations
  - Replicates the work of simulator.

# **Tightly-coupled Simulation**

- Predicted execution time and simulation time for tightly-coupled simulation
- Measurements done on Digital Alpha 2100 4/275 workstations
- All results are in seconds
- Machine parameters for simulator are the same as Maryland IBM SP2

Emulator	Dataset	Р	Predicted Application	Execution Time
			Execution Time	of Simulator
	27K blocks	32	211	3426
Titan	55K blocks	64	285	13154
	110K blocks	128	604	116224
	55K blocks	32	551	11595
Pathfinder	110K blocks	64	718	30446
	220K blocks	128	1020	97992
	500 K blocks	32	135	7155
Virtual Microscope	1000K blocks	64	145	14097
	2000K blocks	128	158	37534

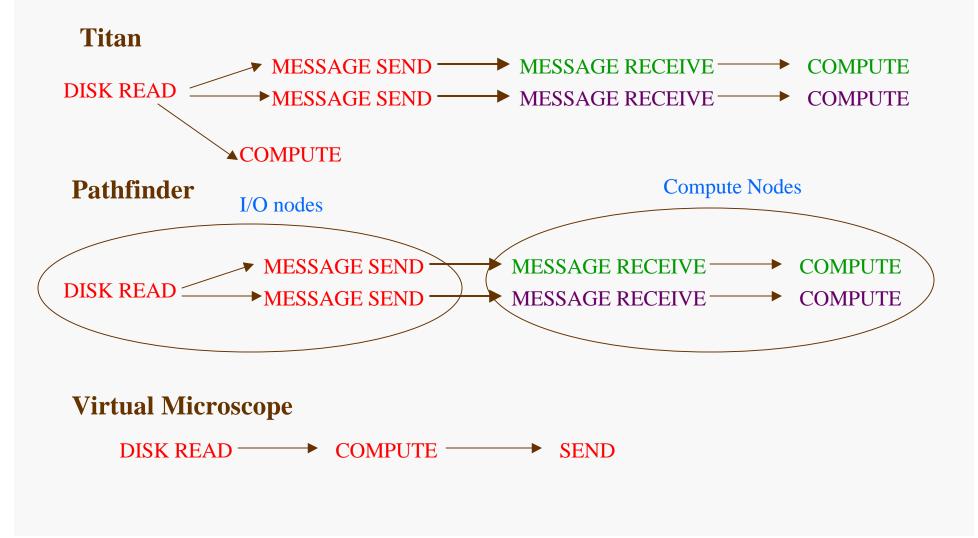
# Simulation Models

- Loosely-coupled Simulation
  - Idea: Embed application processing loop into simulator
    - Dependency information of processing loop is embedded in the simulator
  - A Model of the application processing structure
    - Work flow graphs
  - Two separate processes one for emulator, one for simulator
  - Emulator and simulator interact in distinct phases
    - Epoch-based interaction

# Simulation Models (Modeling Dependencies: Work Flow Graphs)

- Describes the dependencies between operations performed on a datablock
  - Nodes are the operations performed on the data-block
  - Directed edges are the dependencies between these operations
  - Imposes a partial order of events.
- Basic skeleton of the work flow graph depends on the characteristics of the application
- Parameterized by the emulator to reflect specific instance of
  - input data
  - output data
  - machine configuration

# Simulation Models (Work Flow Graphs for Current Applications Suite)



# Simulation Models (Epoch-based interaction)

- The emulator and the simulator interact in distinct phases
  - Emulator sends a set of events (for a set of blocks) to the simulator
  - Simulator processes these events
  - Simulator asks for another set of events from emulator
- For each block in a set for each processor, emulator passes to simulator
  - disk id
    - indicates a read operation from that disk
  - length of the block
    - used to estimate I/O and communication time
  - list of consumers
    - indicates communication (sends and receives)
  - computation time of the block

### **Conclusions and Future Work**

- Emulators for Data-intensive scientific applications
  - Simple and parameterized model of applications
  - Enables performance prediction studies for large scale applications on large scale machines
- Loosely-coupled simulation
  - Enables simulation of large scale machines
- We were able to
  - model application datasets up to 384 terabytes in size
  - run simulations for machines up to 8K processors and 32K disks on workstations

# **Conclusions and Future Work**

- Ongoing and Future Work
  - Different simulators
    - Howsim, Gigasim (Mustafa Uysal, University of Maryland)
    - Dumbsim, Fastsim (Jeff Hollingsworth and Hyeonsang Eom, University of Maryland)
    - Petasim (Geoffrey Fox and Yuhong Wen, Syracuse University)
  - Generalizing Work Flow Graphs
    - Application emulators for different classes of applications
  - Automated generation of application emulators/work flow graphs (Apostolos Gerasoulis, Rutgers University)