Big Orange Bramble



August 09, 2016

Overview

Raspberry Pi Enclosure Daughter Card Monitor Node Power Supply LDAP Slurm NFS OrangeFS HPL SPH PiBrot Numeric Integration Parallel Pi Monte Carlo FDS DANNA

Hardware Overview



Figure 1: Hardware Diagram

Raspberry Pi 3

- Broadcom BCM28337 SOC
 - Quad Core Cortex A53 (AArch64, ARMv8 compatible)
 - VideoCore IV GPU
- 1GB LPDDR2 RAM
- 10/100 Ethernet, 4 USB 2.0 Ports



Figure 2: Raspberry Pi 3

- Rack Enclosure on Casters
- 2 custom Plexiglass boxes with 3D printed corner brackets house the worker nodes (dimensions: 17in × 9.25in × 8.75in).
- Multiple rack shelves to hold switches and power supplies.
- Pull-out shelf for computer keyboard.



Figure 3: Custom Box



Figure 4: Rack with Casters



(a) Corner Brace





Figure 5: 3D Printed Parts



Figure 6: Filled Enclosure Front



Figure 7: Filled Enclosure Rear

- Needed a way to measure power input to nodes.
- Convert analog measurements to digital packets.
- Send information to a Monitor Node.



Figure 8: Current Sense Technique



Figure 9: Daughter Card Schematic



Figure 10: Daughter Card 3D Render



Figure 11: Sixteen Populated Daughter Cards

- Altium Designer
- OSH Park
- Tweezers and Patience

- Adafruit has a C++ library for the INA219 that was originally used
- Someone had created a Python port that was much easier to integrate into our usage scenario
 - getShuntVoltage_mV()
 - getBusVoltage_V()
 - getCurrent_mA()
- Originally daughter cards connected through Python Paramiko library ssh connections for ease of access

- This was slow and not the most easily expandable solution

• Now the monitor node handles communication with all daughter cards

Monitor Node Backend

- Separate Raspberry Pi with Touchscreen
- Python monitoring script runs as a service on each node
- Each node sends:
 - CPU temperature
 - CPU load
 - CPU frequency
 - SoC core voltage
- Nodes with daughter cards also send:
 - Supply current
 - Supply voltage
- Information is sent via UDP packets
- Information sent from nodes every 2 seconds

Monitor Node GUI

- Monitoring GUI implemented in Python and GTK and Glade
- GUI can show a map of any of the monitored metrics
- Shows min/max of the measurement metrics

😣 🗐 🗊 monitorgui.py				
Node Selection Menu	piw63 👻	Go to Map	QUIT	
Date & Time	CPU Temperature	CPU Load	CPU Core Voltage	
Mon Aug 1 10:33:33	34.3'C 'C	0.00	1.2 Volts	
ARM Frequency	Supply Current	Supply Voltage	Shunt Voltage	
600.0 MHz	271 mAmps	5.504 Volts	2.670 mVolts	
Max CPU Temperature 🕶	@ Node	Min CPU Temperature 💌	@ Node	
46.2 'C	pim	28.9 'C	piw31	
Max Core Voltage 🔹	@ Node	Min Core Voltage 🔹	@ Node	
1.2 Volts	piw63	1.2 Volts	piw63	
Max ARM Frequency 👻	@ Node	Min ARM Frequency 👻	@ Node	
600.002 MHz	piw34	600.0 MHz	piw63	

Figure 12: Monitor Gui

Monitor Node GUI

- Monitoring GUI implemented in Python and GTK and Glade
- GUI can show a map of any of the monitored metrics
- Shows min/max of the measurement metrics

8 🔿 🕞	monit	orgui.py								
piw0	piw8	piw16	piw24	piw32	piw40	piw48	piw56	pih0	CPU Temp	erature 🝷
piw1	piw9	piw17	piw25	piw33	piw41	piw49	piw57	pinfs	51.7 'C	85.0 'C
piw2	piw10	piw18	piw26	piw34	piw42	piw50	piw58	pios0	45.0 'C	78.3 'C
piw3	piw11	piw19	piw27	piw35	piw43	piw51	piw59	pim	38.3 'C	71.7 'C
piw4	piw12	piw20	piw28	piw36	piw44	piw52	piw60	rel	31.7 'C	65.0 'C
piw5	piw13	piw21	piw29	piw37	piw45	piw53	piw61	re2	25.0 'C	58.3 'C
piw6	piw14	piw22	piw30	piw38	piw46	piw54	piw62	Map Shows :	CPU Temp	erature
piw7	piw15	piw23	piw31	piw39	piw47	piw55	piw63	Mon Aug 1 10:32:28	QL	JIT

Figure 13: Monitor Map

Power Supply

- Discovered power delivery issue when HPL tests showed CPU frequency throttling
- Voltage dropout was primarily due to cable loss from cables and board-level power management devices (up to 1.5Ω)
- Power distribution system has 10 Switch Mode Power Supply (SMPS) units rated at 20 A current capacity at 5 V (100W)
- Each SMPS drives a single 7-port USB hub, modified to accommodate approximately 4A per port.



Figure 14: Sliced Power Bus

- 100mil trace only sufficient for up to 4A current load.
- Find optimum location to split trace in order to fan out current load.
- Slice trace with repeated scoring of Exacto-knife.



Figure 15: Power Rail Connections

• Choose fanning locations and solder 16AWG stranded wire to points.



Figure 16: Ground connection and Heat-shrink

- Remove solder mask by scoring from Printed Circuit Board (PCB) to reveal Ground (GND) Plane.
- Solder 16AWG stranded wire to exposed GND plane.
- Twist pairs to establish electromagnetic coupling between transmission and return path.

Success!



Figure 17: Power Supply

Software Overview



Figure 18: Software Stack

LDAP

- Used to store Users and Groups
- Made easier to use with LDAP Scripts



Figure 19: LDAP Structure

Slurm

• Used for resource management



Figure 20: Slurm Architecture

NFS

- Network File System
 - Distributed file system Protocol
- Native component of the Linux Kernel
 - Current version NFSv4
- MPI and NFS
 - Message Passing Interface only supported under no attribute caching disabled
- NFS on BOB
 - Only used for storing users home directories
 - does not support MPI

What is OrangeFS?

- Parallel Virtual File System
- Object based design
- Client/Server Architecture
- Metadata and data services
- BMI TCP/IP network communication



Figure 21: File Distribution

How OrangeFS Works



Figure 22: File Distribution

OrangeFS on B.O.B.

- 1 Server
 - Mounted to 4 TB external hard drive
 - Provides highest throughput given 100Mbit/s Ethernet
 - 3 more servers available to integrate
- 64 clients
 - FUSE
 - MPICH2
 - 262,144 Byte transfer buffers with 8 buffers per bulk transfer
 - Metadata and data files synchronized with every write operation
 - Uses a thread based implementation of Asynchronous IO
 - Additional 64 GB of unused storage space available on SD card of each client
- Provides no methods of security

OrangeFS vs NFS

5.6 GB file, 1 MB block, 8 Nodes/32 Tasks, POSIX API

Xfer Size	NFS	OFS	Xfer Size	NFS	OFS
10 KB	10.41	10.78	10 KB	11.42	9.73
100 KB	9.16	11.46	100 KB	11.25	11.31
1 MB	9.65	11.12	1 MB	11.34	11.44

 Table 1: Read Rate (MB/s)

Table 2: Write Rate (MB/s)

5.6 GB file, 1 MB block, 64 nodes/256 tasks, POSIX API

Xfer Size	NFS	OFS	Xfer Size	NFS	OFS
10 KB	8.4	5.64	10 KB	11.59	10.05
100 KB	8.7	6.96	100 KB	11.57	11.51
1 MB	8.5	7.85	1 MB	11.64	11.54

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HPL

- High Performance Linpack is a benchmark for clusters
- Created here at the University of Tennessee
- Solves a dense linear algebra system (highly parallel process)
- Used to determine the Top 500 supercomputers in the world
- Requires ARM optimized BLAS library
 - ATLAS looks good on paper, not effective in practice on ARMv7 due to the compiler's inability to automatically vectorize
 - OpenBLAS offered a hand tooled ARMv7 VFP implementation which avoids the compiler issue

HPL Algorithm

- Ax = b solved by LU Decomposition
- Matrix is of order N, divided into submatrices of order NB
- Process grid of P rows by Q columns



Figure 23: HPL Matrix

HPL Parameters

- Matrix Size
 - $-N = \sqrt{10500^2 \times \text{nodes}}$
 - Maximize matrix size while still fitting into RAM
- Block Size
 - -NB = 100
 - Interesting performance implications
- Broadcast Algorithm
 - Bandwidth Reducing variant (Lng)
- Process Grid $P \times Q$
 - Mostly aimed for square grids
- Lookahead Depth
 - Used DEPTH = 0
 - Enabling caused performance regression

HPL Broadcast





HPL Results

- R_{peak} for the cluster is 441.6 GFLOP/s
- R_{max} for the cluster is 148.8 GFLOP/s
- Scaling Efficiency at 64 nodes is approximately 37%
- Generally poor scaling as the node count increases due to low interconnect bandwidth (100 Mbit Ethernet)
- Fastest in the world in June of 1994
- Top 500 in the world in June of 2002

HPL Results



HPCG

- High Performance Conjugate Gradient
- Complementary to HPL to evaluate performance
- Greater emphasis on memory access speed
- Intends to model more realistic workloads, not peak performance
- Provides a "lower bound" to go with HPL's "upper bound" on performance
- Solves Ax = b with an sparse matrix conjugate gradient method
- BOB achieved 5.08 GFLOP/s on reference implementation

HPCG Algorithm



Figure 24: HPCG Algorithm Overview

HPCG Results



SPH

- In multi-particle simulations, interactions can be approximated with local only interactions.
- By distributing the particles over many nodes, an entire scene can be calculated with low latency.
- One master node manages the particles, while the remaining N 1 nodes perform interaction calculations.

PiBrot

- Given $c \in \mathbb{C}$, c can be verified to be in a given Mandelbrot Set.
- For a given display area, each pixel is treated as a complex number *c*.
- Distributing the rows across multiple nodes allows for parallel Mandelbrot testing.
- PiBrot uses 1 node on the left render and N 2 nodes on the right render.

Numeric Integration



Figure 25: f(x) = x from [0, 5]

- Area under curve can be approximated using Riemann Sums
- This application uses right Riemann Sums
- Adapted from Tiny Tiny Numeric Integration program

Numeric Integration: How It Works

- 1. User inputs function, domain, and # samples
- 2. MPI gets # available cores
- 3. Width of each rectangle calculated
- 4. Domain start and end points calculated for current core
- 5. Areas are calculated
- 6. MPI sums and reduces all areas into one variable
- 7. Error is calculated using scipy.integrate.quad()

Numeric Integration: Example

```
#DEFINE YOUR FUNCTION HERE!
def func(x):
    y = numpy.cos(x)
    return y
def main():
    #SET THE DOMAIN BEGINNING AND END
    xStart = 0.0
    xEnd = 1.0 * scipy.pi
    #SET NUMBER OF SAMPLES (rectangles & accuracy)
    samplesPerRank = 10
```

Figure 26: Parameters defined by user

On 128 nodes/cores: actualArea = 0.00000 riemannArea = 0.00245 error = -0.0024543693 time = 0.28306

Figure 27: Output printed to command line

Parallel Pi

- What?
 - Approximate the value of pi in parallel.
- Why?
 - Demonstrate BOB's ability to efficiently scale embarrassingly parallel tasks.
 - Discover any remaining issues with mpi4py, Slurm.

Parallel Pi: How It Works

• First approach: Leibniz Formula

$$\pi = 4 \sum_{i=0}^{\infty} \frac{(-1)^i}{2i+1}$$

• Second approach: Bailey-Borwein-Plouffe Formula

$$\pi = \sum_{i=0}^{\infty} \frac{1}{16^i} \left(\frac{4}{8i+1} - \frac{2}{8i+4} - \frac{1}{8i+5} - \frac{1}{8i+6} \right)$$

• BBP written in Python with mpi4py, managed using Slurm batch script

Parallel Pi: Scaling Results



Parallel Pi: Scaling Explained

• Amdahl's Law

$$S = \frac{1}{(1-P) + P/N}$$

- $P \approx 99.871\%$
- Solving S for 256 processes (64 nodes) gives us S = 192.64
- Therefore, we can expect a speedup of approximately 193 for 256 processes

Monte Carlo

- Monte Carlo simulations utilize random sampling to create output for analysis
 - Example: Rolling a dice 100,000 times
- Driver program that parallelizes multiple runs of user created executable
 - mc_batch.py
- Simple, user friendly GUI
 - mc_gui.py

Monte Carlo Cont'd

- Currently only runs C/C++ and Python executables
- User parameters Required
 - 1. Input executable file path
 - 2. Output file name
 - 3. Number of runs
 - Optional
 - Maximum run time
 - Deadline
 - Number of CPUs
- A batch file is created and submitted for SLURM to manage

Monte Carlo Example

#!/bin/bash

#SBATCH -N 8
#SBATCH --job-name=montecarlo_dice_roll
#SBATCH --output=d.txt
#SBATCH --open-mode=append
#SBATCH --cpus-per-task=1
#SBATCH -e montecarlo_dice_roll_err.txt
srun -n 4 python dice_roll.py
srun -n 32 python dice_roll.py
srun -n 32 python dice_roll.py

Figure 28: Batch file produced with Monte Carlo application

FDS

- Fire Dynamic Simulator is a large-eddy simulation (LES) code for low-speed flows, with an emphasis on smoke and heat transport from fires.
- Takes advantage of parallel processing by dividing models up into a series of meshes
- Each mesh interacts only with the meshes immediately spatially adjacent to it, monitoring things like air flow and heat transfer
- It is best if one mesh is assigned to one processor, although it is possible to assign multiple meshes to a processor

FDS Previous Work

• The work of Donald Collins of The University of Tennessee served as the basis for our work



Figure 29: Source: "Dividing and Conquering Meshes within the NIST Fire Dynamics Simulator (FDS) on Multicore Computing Systems"

FDS Results



Figure 30: Timing results of tests run on BOB in which a room fire was modeled using a varying number of meshes. It becomes clear that shortly after 16 meshes the overhead begins to outweigh the performance gains.

DANNA

- Dynamic Adaptive Neural Network Arrays
- Neuromorphic Architecture
- Configurable grid of elements (neurons or synapses) with varying parameters
- Fast software based simulator available in addition to FPGA implementation
- Networks are generated by Evolutionary Optimization and tested with the simulator for fitness
- Generated a pole balancing network in just over 3 minutes which can survive for 5 minutes of simulation

DANNA



Figure 31: Visualization of DANNA

Danna Pole Balencer



DANNA EO Results

- Compared performance from 1 to 64 nodes
- Not a great benchmark due to random nature of EO
- Uses a Master-Slave work distribution scheme

# Nodes	Distribution Algorithm	Time (s)	Scaling Factor
1	None	5930	1.00
8	Master-Slave	2105.8	2.82
16	Master-Slave	1244.6	4.76
32	Master-Slave	911.8	6.50
64	Master-Slave	897.8	6.61

Table 5: DANNA EO Performance for Pole Balancing

DANNA EO Results



Distributed TensorFlow

- Modern deep neural networks: using large datasets and large amounts of computation to push boundaries of what is possible in perception and language understanding (Large Datasets + powerful models)
- Large-scale parallelism using distributed systems is the only way
- An open source software library for numerical computation using data flow graphs. Developed in Google Brain Team
- Distributed model? Distributed datasets (data parallelism)?

Distributed TensorFlow

- In graph replication vs. between-graph replication
- Synchronized training vs. asynchronized training (Figure 32)



Figure 32: Synchronized training vs. asynchronized training

Distributed TensorFlow: LeNet

- A convolutional neural network based on LeNet is deployed on BOB
- Goal: recognize handwritten numbers (MNIST)



Figure 33: LeNet structure

Work Load

mo mo											
DiwD	Ditais	Dirul 6	-								- 5 ×
	PITTE			piw32	piw40	piw48				CPU Load	
piw1	piw9			piw33	piw41	piw49				1.8	40
piw2	piw10			piw34	piw42	pity 50				1.3	3.6
piw3				piw35	piw43	piw51		pim		0.9	3.1
piw4			piw28	piw36	piw44			re1		0.4	2.7
piw5			piw29	piw37				re2		00	2.2
piw6			piw30	piw38				Map Shows :		CPU Load	
piw7	piw15	piw23	piw31	piw39				Wed Aug 3 22:53	8:58	QUI	л
Max Co	ore Volta	ige ·	•	@	Node		Min Cor	e Voltage 🛛 👻		@ Noc	le
1.394 V	/olts) [piw	33			1.2 Volts	5	piv	w63	
Max ARM Frequency			Min ARM Frequency -			@ Node					
1150.0	MHz) [piw	33][599.998	MHz	piv	w39	

Figure 34: 4 nodes vs 16 nodes

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IOR File System Benchmark

- Interleaved or Random (IOR) is a benchmark used for I/O operations on parallel file systems
- POSIX, MPIIO, and HDF5
- Developed by Lawerence Livermore National Laboratory
- Used by National Energy Research Scientific Computing Center (NERSC)
- NERSC8/Trinity Benchmark for sequential reads and writes
 - Fixed 1 MB block sizes
 - 10KB, 100KB, and 1MB transfer sizes
 - Fixed user defined segment count
 - One file per process
 - One shared file
 - POSIX API
 - MPIIO API

MPIIO on NFS and OFS

- 5.6 MB file
- 8 Nodes/32 tasks
- One file per process

File	Reads	Writes
System	(MB/s)	(MB/s)
NFS(noac)	4.21	11.40
OFS	11.67	9.79

Table 6: 10 KB Transfers

Transfer Size	Reads (MB/s)	Writes (MB/s)
10 KB	11.67	9.79
100 KB	11.10	11.30
1 MB	10.44	11.65

Table 7: OrangeFS MPI-IO Read and Write Throughput

8 Client POSIX Test

• 5.6 GB file, 1 MB blocksize

Transfer Size	NFS	OFS	Transfer Size	NFS	OFS
10 KB	10.41	10.78	10 KB	11.42	9.73
100 KB	9.16	11.46	100 KB	11.25	11.31
1 MB	9.65	11.12	1 MB	11.34	11.44

 Table 8: Read Rate (MB/s)

Table 9: Write Rate (MB/s)

Overall OrangeFS outperforms NFS on 8 clients and 1 server

64 Client POSIX Test

One OrangeFS Server								
Xfer Size	NFS	OFS	Xfer Size	NFS	OFS			
10 KB	8.4	5.64	10 KB	11.59	10.05			
100 KB	8.7	6.96	100 KB	11.57	11.51			
1 MB	8.5	7.85	1 MB	11.64	11.54			

 Table 10: Read Rate (MB/s)

Table 11: Write Rate (MB/s)

Two OrangeFS Servers								
Xfer Size	NFS	OFS	Xfer Size	NFS	OFS			
10 KB	8.4	11.79	10 KB	11.59	15.85			
100 KB	8.7	8.93	100 KB	11.57	21.73			
1 MB	8.5	10.18	1 MB	11.64	20.81			

 Table 12: Read Rates (MB/s)

Table 13: Write Rates (MB/s)

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