



**Geolmaging Accelerator  
Pansharp Test Results**

## Executive Summary

After demonstrating the exceptional performance improvement in the orthorectification module (approximately fourteen-fold – see GXL Ortho Performance Whitepaper), the same approach has been applied to the pansharp module by taking advantage of newly developed code, modern, multi-core processor architecture and nVidia Graphical Processing Units (GPUs).

Based on test results with five different datasets, an optimized server using newly developed code and two GPUs is capable of creating fused, pansharpened data at the rate of 730GB to 1.70TB per day, depending on pixel size and datatype.

This production rate represents an eightfold improvement over the equivalent computation using previous-generation pansharp algorithms. Further to this, an off-the-shelf desktop machine with less memory and a slower, single GPU is still over six times faster than software-only methods.

The above results come from a combination of optimization, multithreading and GPU performance, but fine tuning the algorithm itself can increase system performance a further 46%, which corresponds to a speed up factor of 11.63. It is possible to further improve the performance by an estimated 20% if alternative image statistic computations are used, leading to a total estimated improvement of 13.96 times.

Similar to the high-speed ortho module, this demo once again shows the potential of the GPU and multithreaded processing in addressing operations that are computationally intensive in PCI's field of business (DEM creation, image matching, pansharpening). The end result is faster production and lower operational costs.

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## 1 Introduction

Building on the success of the Ortho Demonstrator, the Pansharp demonstrator is a new module for the high-performance system developed by PCI Geomatics. It takes advantage of modern computer hardware (multi-core processors and Graphical Processing Units) and multithreaded programming techniques to achieve much higher pansharp throughput than is possible with PCI's existing commercial offering of Pluggable Functions (PPFs) and desktop software (Geomatica).

In order to maintain high-quality output, the implemented pansharp algorithm is based on the PCI Geomatics Pansharp PPF (PCI Pluggable Function). Minor changes were made for image background handling and computation steps to improve the API and the performance. Based on previous experience, all possible processing is performed by the GPU, with the exception of the computation of raster statistics, which uses a parallel processing technique called *reduction*. A custom thread-pool implementation is used to link individual threads to specific GPUs.

This report describes the pansharpening performance obtained from both a high-performance, two-GPU server and a less powerful, single-GPU desktop machine. The results also provide insight about the tradeoff between the system cost and performance. Finally, this report discusses some issues that are unique to the pansharp operation and suggests possible improvements.

## 2 Project Description

### 2.1 Background

Given the impressive performance of the Ortho Demonstrator, PCI has developed a commercial, high-performance, image processing system called the Geolmaging Accelerator (GXL). The GXL is based on the latest GPU and multi-thread processing technology, with its main applications being orthorectification, DEM extraction, pansharpening and mosaic creation. The GXL employs high performance ortho and pansharp processing, with planned upgrades to mosaic, DEM and other functions. In this way we can measure and investigate the impact on performance of various hardware and software approaches.

## **2.2 System Hardware**

The pansharp system is similar to that of the Ortho Demonstrator, but with updated GPUs and CPUs in the machine. It features an Intel® Core2™ Extreme Quad-Core 3.2GHz X9775 CPU, 8 GB RAM and two NVIDIA GeForce Telsa C1060 GPUs with 4GB of GDDR3 SDRAM. A less powerful desktop machine with Intel® Core2™ Extreme Quad-Core 2.66GHz Q6700 CPU, 8 GB RAM and one NVIDIA GeForce GTX 280 GPU with 1GB of GDDR3 SDRAM is also used to evaluate the performance.



*Figure 1: Original orthorectification workstation, now upgraded for pansharp*

## **2.3 Development Environment and Tools**

The development environment is openSUSE Linux 10.3 (64-bit). All development was done using the GCC (version 4.2.1) and Intel C++ compiler (version 11.0), using the OpenMP 2.5 libraries for multithreading and NVIDIA's CUDA SDK release 2.1 for programming the GPUs.

## 2.4 Test Datasets

Table 1 (below) lists the five datasets that were included in the test procedures. Each dataset contains a high resolution panchromatic image and a lower resolution multi-spectral image. The output is a fused image comprising the overlap region of both input images. The output image matches the higher-resolution panchromatic input, but with full colour. Output images are stored in TIFF format, which has a file-size limitation of 4GB. While spectral response is ensured to be the same as the PPF version, output images larger than 4GB is not stored properly, although they can still be used to evaluate performance while other formats are added (e.g. binary format that supports file size larger than 4GB is planned and will be used when available). For performance testing, the first three channels in the multispectral images are used as reference channels. The images are were grouped by common bit depth, processing level and number of channels.

*Table 1: Test datasets*

Scene	1 (Madrid)	2 (Toronto)	3 (Castle Rock)	4 (Nigeria)	5 (Seoul)
Product	Ikonos	Ikonos	QuickBird	Spot5	Spot5
MS File Size (MB)	710	520	440	210	260
MS Resolution	4m	2.4m	2.4m	10m	10m
Number of MS Channels	3	4	4	4	4
Data Type	16U	16U	16U	8U	8U
PAN File Size (MB)	1,210	1,980	1,730	210	1,010
PAN Resolution	1m	0.6m	0.6m	5m	2.5m
Fusion File Size (MB)	3,660	5,570	5,150	650	3,060

### **3 Test Results**

In order to evaluate the impact of different hardware settings and implementation details on the system, as well as understand the impact of different hardware and software condition, performance was observed using several configurations. After the initial findings, two major software improvements were carried out to improve the system throughout incrementally. After each software modification, further tests were conducted under different hardware settings based on the number of GPUs employed. In the server, three processor configurations were used (0, 1 and 2 GPUs); one the desktop workstation two settings were used (CPU-only and 1-GPU).



### 3.1 System Throughput

The system performance is measured in terms of i) the processing throughput and ii) the speed-up factor compared to the original pansharp PPF. Since the pansharp operation always converts input data to floating point variables, an accurate measured of throughput is the number of pixels processed per day, as opposed to MB or GB directly. The speed-up factor is also reported to provide a reference for comparison.

For the server, the highest throughputs were obtained with 2-GPUs as expected. Averaging across all datasets, the system could process  $750 \times 10^9$ , or 750 giga-pixels (GP) per day, which equates to 1.5 TB of 16-bit data or 750 GB of 8-bit data. The average performance is approximately 8 times faster than the pansharp PPF (which processes about 95GP per day). Using zero or one GPU, the daily system throughput is 583GP and 592GP respectively, or 6.24 and 6.30 time faster. Table 2 (below) shows the comparison results between the best approach and the pansharp PPF, and that the speed up factor is lower when background mask is used.

*Table 2: Scene throughput and speed-up factor*

Scene	Mask	Processing Time*		Speed-up Factor
		pansharp PPF	2-GPUs w/OpenMP	
Madrid	No	24 min 10 sec	2 min 49 sec	8.57x
	Yes	25 min 41 sec	3 min 14 sec	7.92x
Toronto	No	39 min 17 sec	5 min 16 sec	7.45x
	Yes	41 min 43 sec	5 min 59 sec	6.96x
Castle Rock	No	<b>40 min 49 sec</b>	<b>4 min 40 sec</b>	<b>8.75x</b>
	Yes	38 min 43 sec	5 min 18 sec	7.30x
Nigeria	No	8 min 37 sec	1 min 10 sec	7.37x
	Yes	6 min 56 sec	1 min 14 sec	5.56x
Seoul	No	41 min 3 sec	5 min 15 sec	7.82x
	Yes	35 min 13 sec	5 min 32 sec	6.36x

\* Due to time constraint, results for the pansharp PPF represent a single run; the results of the GPU version are the mean of 10 runs.

### 3.1.1 Performance Gain from the Hardware

There is no from the above results that more and faster CPU and GPU processors can process more data in a given time frame, but there is a trade-off between the system cost and the performance gain. To study the trade off, tests were done on the server and the desktop workstation described in Section 2.2. As expected, the server with two GPUs provides the highest performance with an average speed-up factor of 8 times. Using a single GPU, both machines have similar speed up factors of 6.3 (server) and 6.6 (desktop) as the GPU in both cases handles the majority of the processing. When no GPU is used, the server components have higher performance compared to the desktop, with an average speed-up factor of 6.24 compared to 4.63 for the desktop – a 35% increase.

For the server alone, based on the test results of five datasets a performance gain of 27% was obtained when using two GPUs instead of one.

The above observations suggest that a high-end server benefits from multiple GPUs, but that a significant performance increase can be gained by adding a GPU to a desktop workstation at modest cost.

*Table 3: System setup and performance*

System	Daily Throughput (Gigapixels)			Speed Up Factor**		
	2 GPU	1 GPU	CPU	2 GPU	1 GPU	CPU
<b>Server</b> CPU: X9775 GPU: Telsa C1060	750.4	591.7	583.4	7.99x	6.30x	6.24x
<b>Desktop</b> CPU: Q6700 GPU: GeForce 8800 GTX	N/A	606.6	435.6	N/A	6.63x	4.46x

\*\* Speed up factor is measured against the processing time using the pansharp PPF

### 3.1.2 Performance Gain from Software Enhancement

Based on the logic flow from the pansharp PPF, the pansharp algorithm was implemented using the GPU and OpenMP technology as described above. The overall speed increase was due to several incremental enhancements – the three enhancements can be found in Table 4 (below).

**Table 4: Software enhancements**

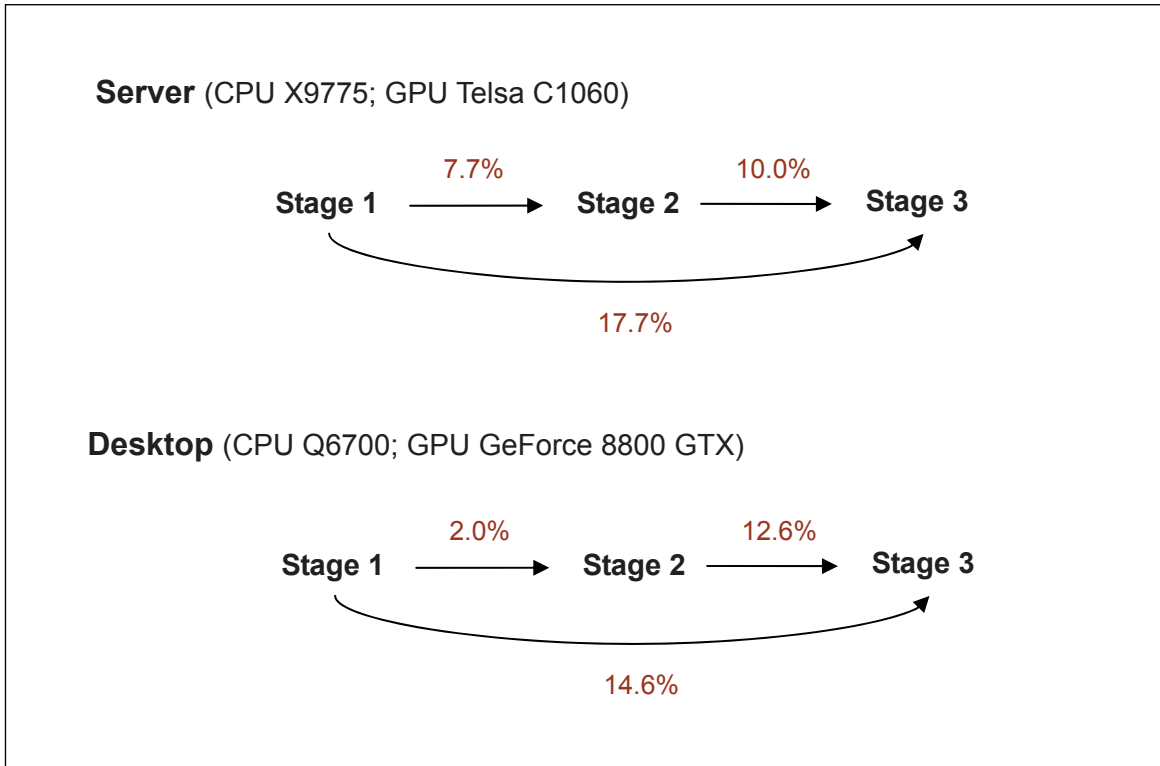
<b>Enhancement</b>	<b>Definition</b>
Stage 1: GPU & OpenMP	Uses the same logic flow as the PPF version but with GPU and OpenMP technology.
Stage 2: Buffer Load Ahead	Load and resample each raster buffer ahead of time to reduce processor idling.
Stage 3: Minimize memory transfer	Combine several resampling processes to minimize the number of host-to-device memory transfers

The incremental software enhancements represent three stages of software development applied in the demonstrator. The first stage uses the same logic flow of the pansharp PPF with GPU and OpenMP - This stage reflects the direct performance gain from the GPU and multi-thread processing with no fine tuning of the programming logic. The second and third stages refine the logic to take advantage of the GPUs and CPU utilizations. In the second stage, each upcoming raster block in the queue was loaded ahead of time, which allowed the GPUs and CPU to perform different tasks simultaneously. In the third stage, an enhancement of the GPU operations was made to minimize time-consuming, host-to-device memory transfers. Results from these tests provide information about what development affected performance gains in what way. The system throughput and speed up factor are listed in Table 5 (below).

**Table 5: Performance gain with software enhancement**

<b>System</b>	<b>Daily Throughput (Gigapixels)</b>			<b>Speed-up Factor</b>		
	<b>Stage 1</b>	<b>Stage 2</b>	<b>Stage 3</b>	<b>Stage 1</b>	<b>Stage 2</b>	<b>Stage 3</b>
<b>Server</b> CPU: X9775 GPU: Telsa C1060	633.1	682.3	750.9	6.74x	7.26x	7.99x
<b>Desktop</b> CPU: Q6700 GPU: GeForce 8800 GTX	528.1	538.5	606.6	5.60x	5.71x	6.40x

The relative gains can be more easily seen in Figure 2 (below), which shows the system throughput gains for different stages of software enhancement using maximum GPUs.



*Figure 2: System throughput improvement by stage*

Depending on the systems, the performance improvements through software modification are quite different. By better utilization both GPU and CPU at the same time, the server was able to gain 7.7% increase of throughput, while the desktop only gains about 1.9% increase. The result indicates that the server was significantly underutilized compared to the desktop. By minimizing the host-to-device memory transfer, both machines see similar increases of 10% and 12.6%, with the desktop seeing the slightly greater increase. This shows the importance of host-to-device memory transfers for performance gains on less powerful machines.

## 4 Further Improvements

The performance improvements discussed above are based on the taking advantage of GPU, multithreading, buffer and memory-handling technologies. Further improvements are possible with minor changes of logic flow, with the caveat that the spectral distribution of the output imagery may differ from the original, proven pansharp PPF. In reality, the fusion results are similar enough to be identical to the naked eye, meaning the results are visually indistinguishable, but with significant performance gains, as presented in Table 6 (below). The additional logic improvement is denoted as ‘Stage 4’ of the performance enhancements.

*Table 6: Performance gain with logic enhancement*

	Daily Throughput (Gigapixels)				Speed Up Factor			
	Stage 1	Stage 2	Stage 3	Stage 4	Stage 1	Stage 2	Stage 3	Stage 4
<b>Server</b> CPU: X9775 GPU: Telsa C1060	633.1	682.3	750.9	1092.7	6.74x	7.26x	7.99x	11.63x
<b>Desktop</b> CPU: Q6700 GPU: GeForce 8800 GTX	528.1	538.5	606.6	843.4	5.60x	5.71x	6.40x	8.90x

At three different times in the process, the pansharp operation loads and resamples the images from the disk. The Stage 4 logic enhancement eliminates the second loading instance by deriving the spectral mean and standard deviation from the original pixels sampled. Based on the five test datasets and using 250,000 sample pixels, removing this load operation can improve the throughput by 46%, corresponding to a total speed-up of 11.63 times. The average system throughput for the 2-GPU server is increased to 1.1 Terapixels, the spectral mean and standard deviation are maintained and visual inspection finds no significant difference between the fusion results before and after the modification. The approach has been implemented and can be enabled or disabled by the operator.

Another possible improvement addresses the resampling used when statistical information about the images is computed. Instead of using the higher-resolution, resampled multispectral image, processing time can be reduced by using the statistical information from the original, lower-resolution image. This approach avoids the time consuming resampling operation and reduces the amount of data processed in the early steps of the pansharp operation. As the higher-resolution, panchromatic data is typically ¼ the pixel size of the colour images, this approach could reduce data handling by factor of 16. It is expected that the resampling step can be sped-up by 50%, which translates to approximately 20% higher throughput.

## 5 Conclusion

With GPU, multi-threading, buffer and memory-handling technologies, the pansharp operation can be performed 6.4 to 8 times faster than the original pansharp PPF on a 1-GPU desktop and 2-GPU server respectively. For the desktop, the system throughput is 0.63TB per day for 8-bit data and 1.17TB per day for 16-bit data. On the 2-GPU server, the throughput is 0.75TB per day and 1.51TB per day for the 8-bit and 16-bit data respectively. While further hardware improvement is possible by adding GPUs or memory, performance gains are difficult to predict. Conversely, software and logic enhancements are possible without additional hardware costs, as demonstrated by the speed-up factor of 11.63 times. It is possible to significantly improve speed and performance by carefully fine-tuning the algorithm, with an additional 20% increase in throughput by eliminating a resampling step. Due to project constraints, this last improvement was not tested or implemented, but remains for future development of the pansharp operation.



Geolmaging Accelerator Pansharpen Test Results  
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