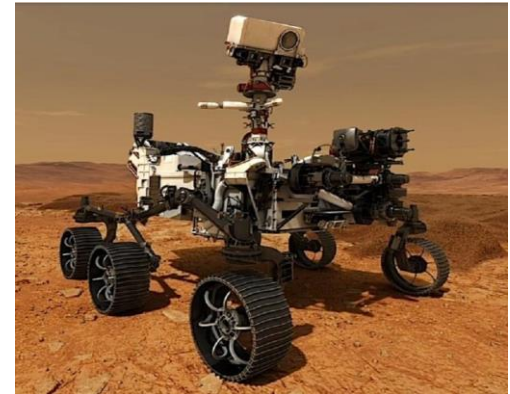
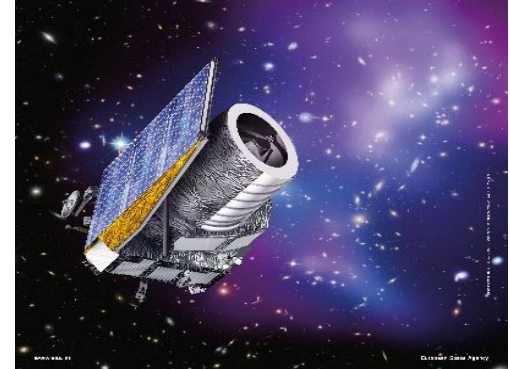


GPU4S (GPUs for Space): Are we there yet?

Leonidas Kosmidis, Iván Rodríguez, Alvaro Jover-Alvarez, Guillem Cabo, Sergi Alcaide, Jérôme Lachaize, Olivier Notebaert, Antoine Certain, David Steenari

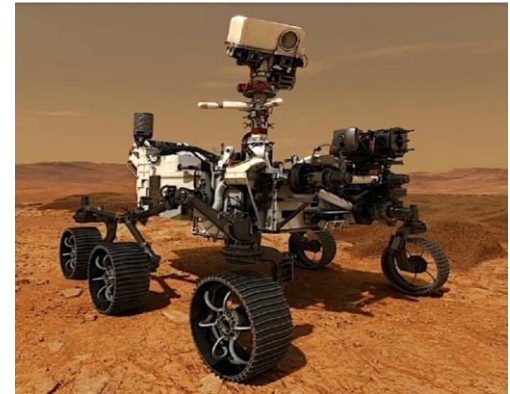
Introduction

- ⌘ Increased need for computing power in on-board computers for satellites, rovers and spacecraft
- ⌘ Bigger sensors sizes and more complex tasks
 - ⌘ Vision-based Navigation
 - ⌘ Autonomous Operation
- ⌘ Radhard processors are limited in their processing performance
- ⌘ Dedicated FPGA designs are used when additional compute performance is needed



Introduction

- « Embedded GPUs can provide high performance, with low power consumption
 - « Effectively allowing the use of software for processing tasks on-board
 - « More flexibility, easier reconfiguration and can support several different processing tasks through reuse of compute resources
 - « Easy access to specialised developers, widely used programming models
 - « Overall lower development cost



GPU4S (GPU for Space) ESA AO/1- 9010/17/NL/AF Overview

⌘ Goal:

- ⌘ Evaluation of GPU IP for possible future space processors
- ⌘ Evaluation of COTS GPUs

⌘ Tasks:

- ⌘ Perform a survey of the state of the art in
 - ⌘ Existing embedded GPU, mainly European and major US (Nvidia, AMD)
 - ⌘ Existing and future space algorithms amenable to GPGPU acceleration
- ⌘ Select promising embedded GPUs
 - ⌘ benchmark and compare them with existing on-board technologies
- ⌘ Build a demo of a space application on the most appropriate candidate
- ⌘ Define the roadmap for the adoption of embedded GPUs in space

GPU4S (GPU for Space) CCN1 Overview

- ❧ Extend GPU4S Benchmarking to AMD Devices (Embedded Ryzen, Unibap DDX-i5)
 - ❧ originally not available during GPU4S
 - ❧ Promising radiation results
- ❧ Extend the demonstrator
 - ❧ Implement image processing 1.1 OBPMark in CUDA and OpenCL
 - ❧ Port Euclid NIR in OpenCL
 - ❧ Evaluate both of them on all platforms, including the new ones
- ❧ Perform detailed power measurements of all boards
 - ❧ During GPU4S we conservatively used the manufacturer's TDP for computing energy efficiency

GPGPU Development Frameworks Overview

Programming Framework	Type of API	Proprietary/ Vendor	Programmability/ Easy to use for Compute	Performance	Safety Certified/ Certifiable	Remarks
CUDA	Compute	Yes (NVIDIA)	++++	++++	No	
OpenCL	Compute	No	+++	++++	No	Limited on NVIDIA
OpenMP	Compute	No	+++++	+	No but	Limited support on embedded GPUs
HIP	Compute					Only on few AMD, Unibap
OpenACC	Compute					No support on embedded GPUs
Vulkan	Compute/Graphics	No	++	++++	No	
Brook Auto/SC	Compute	No	++++	++	Yes	Academic, open source
OpenGL SC 2	Graphics but solutions exist for compute too	No	+	++	Yes	Few sw vendors/devices
Vulkan SC	Compute/Graphics	No	++	++++	Yes	Standard not available yet
ComputeCore	library	Yes (CoreAVI)	+++++	++++	Yes	

Only CUDA/OpenCL explored in this study, due to their universal availability

Space Software Survey

- ⌘ Theoretical analysis of algorithms found in several space domains [1][2]
- ⌘ Most of existing space algorithms are a good fit for the GPU programming model
 - ⌘ Especially on-board image-processing
- ⌘ Some algorithms with several dependencies have been initially identified as not good candidates
 - ⌘ Experimental evaluation later has shown speedup

Lesson 1: Modern GPUs can accelerate a wide range of existing and future space algorithms

Lesson 2: Porting an algorithm to a GPU is the only reliable way to find out whether it gets speedup

[1] GPU4S: Embedded GPUs for Space, DSD 2019

[2] GPU4S: Embedded GPUs for Space – Latest Project Updates, MICPRO 2020

Embedded GPUs Hardware Survey

- ⌘ GPU Taxonomy defined [1][2]: Low and High End GPUs, COTS, Soft-GPUs, Many Cores and High-Level Synthesis
- ⌘ Covered extensively the embedded GPU market
- ⌘ NDA agreements signed with several European IP vendors
 - ⌘ Challenge No 1: no vendor shares the price or any non-public information (area, power, number of gates) about their product before an upfront commitment
 - ⌘ Profoundly impacted the project budget and schedule

Lesson3: There is no easy way to cost-effectively select the most appropriate GPU IP from several vendors without detailed tests.

[1] GPU4S: Embedded GPUs for Space, DSD 2019

[2] GPU4S: Embedded GPUs for Space – Latest Project Updates, MICPRO 2020

Embedded Hardware Survey

- ⌘ IP vendors
 - ⌘ Challenge No 2: No FPGA prototype without considerable costs
 - ⌘ Vendor development/integration costs
 - ⌘ Expensive equipment: special FPGAs with cost ~\$50K
 - ⌘ Reduced configurations, slow simulations

Lesson 4: Similar publicly funded projects in the future require considerable budget provisioned for FPGA prototypes of commercial IP designs

[1] GPU4S: Embedded GPUs for Space, DSD 2019

[2] GPU4S: Embedded GPUs for Space – Latest Project Updates, MICPRO 2020

Embedded Hardware Survey

- ❧ Open Source IP GPUs
 - ❧ Limiting capabilities, only GPU subsets, e.g. only integer operations
 - ❧ Mostly non-commercially friendly licensing e.g. GPLv3
- ❧ Situation has changed recently with RISC-V and Open Hardware movements
 - ❧ More capable and commercially viable hardware designs and licenses
 - ❧ Fully open source EDA options: OpenLane, SkyWater 130nm PDK
 - ❧ Identified and started evaluating options

Lesson 5: Existing open-source GPU designs cannot be used for our purpose.

Lesson 6: The RISC-V and Open Hardware movement can create opportunities for a commercially-friendly open source space GPU

[1] GPU4S: Embedded GPUs for Space, DSD 2019

[2] GPU4S: Embedded GPUs for Space – Latest Project Updates, MICPRO 2020

Embedded Hardware Survey

« COTS

« NVIDIA

- « Higher performance
- « Used in rugged products
- « CUDA:
Popular/**Proprietary**
- « **Shorter product market availability window (7y)**

« AMD

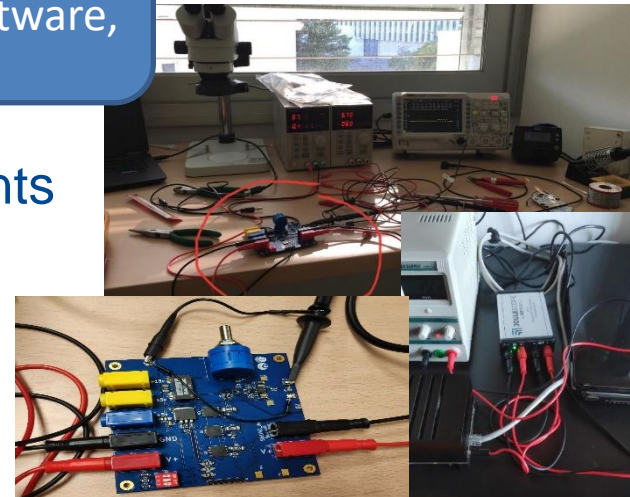
- « Used in rugged products
- « Longer market availability (10y)
- « Better radiation properties
- « More open ecosystem
(hardware and software)
- « **Lower performance**

Lesson 8: NVIDIA GPUs offer higher performance but AMD better properties for space

Embedded GPU Benchmarking: HW

- ⌘ Several selected candidate devices
 - ⌘ NVIDIA Xavier, TX2
 - ⌘ ARM Mali-G72 (HiKey 970)
 - ⌘ AMD Embedded LP (V1005P)
- ⌘ Difficulties to setup
 - ⌘ OS, GPU driver
 - ⌘ Delays in procurement
- ⌘ Manufactured a PCB for the board measurements (CCN1)
- ⌘ In total used 3 different ways to measure power

Lesson 9: NVIDIA's vertical integration results in tighter control of product releases in both hardware and software, but hw/sw is closed



Embedded GPU Benchmarking: SW selection

- ❧ Lack of benchmarks for Space
 - ❧ Proprietary code, export restrictions
- ❧ Lack of GPU benchmarks for critical systems
- ❧ Definition of an open source GPU Benchmark suite: GPU4S Bench[1]
 - ❧ Building blocks from many domains identified in the space survey
 - ❧ ESA GPL-3 compatible license, released together with OBPMark [2]

Lesson 10: Complex Space software is subject to restrictions

Lesson 11: Open Source benchmarks are required to maximise benefit from public funding

[1] GPU4S Bench: Design and Implementation of an Open GPU Benchmarking Suite for Space On-board Processing: https://www.ac.upc.edu/app/research-reports/public/html/research_center_index-CAP-2019,en.html

[2] OBPMark (On-Board Processing Benchmarks) – Open Source Computational Performance Benchmarks for Space Applications, OBDP 2021, <http://OBPMark.org>

Embedded GPU Benchmarking: GPU4S Bench Overview

Identified building blocks and the domains they represent

Domains	Compression	Vision Based Navigation	Image Processing	Neural Network Processing	Signal Processing
Building Block					
Fast Fourier Transform			GENEVIS		ADS-B, NGDSP
Finite Impulse Response Filter					ADS-B, NGDSP
Integer Wavelet Transform	CCSDS 122				
Pairwise Orthogonal Transform	CCSDS 122				
Predictor	CCSDS 123				
Matrix computation		GENEVIS (Solver)		Image classification	
Convolution Kernel		OpenCV	GO3S,GENEVIS	Image classification	
Correlation		OpenCV	GO3S,GENEVIS		ADS-B
Max detection			GO3S	Image classification	ADS-B
Synchronization mechanism		GENEVIS	EUCLID NIR, GO3S	TensorFlow	ADS-B, NGDSP
Memory Allocation		CERES Solver , OpenCV	EUCLID NIR, GO3S	TensorFlow	ADS-B, NGDSP

CCN1

Complex application: Image recognition pipeline, based on CIFAR-10

Euclid NIR (Near InfraRed)

OBPMark Overview and implementation status

src/1.1-image/

src/1.2-radar/

src/2.1-data_compression/

src/2.2-image_compression/

src/2.3-hyperspectral_compression/

src/3.1-aes_compression/

src/4.1-fir_filter/

src/4.2-fft/

src/5.1-object_detection/

src/5.2-cloud_screening/

Done in CCN1, including OpenMP

To be defined (CCN2)

Done (+omp), to be part of CCN2

Done (+omp), to be part of CCN2

Partially done (+omp), part of CCN2

To be defined (CCN2)

Done (+omp)

Done (+omp)

To be defined (CCN2)

To be defined (CCN2)

Embedded GPU Benchmarking: GPU programmability

- ⌘ Several benchmark versions: naïve, optimized, libraries
 - ⌘ CUDA, HIP, OpenCL
 - ⌘ CUDA/HIP versions faster implementation
 - ⌘ CUDA better support in terms of development tools and libraries
 - ⌘ Run into issues with OpenCL
- ⌘ Power consumption: TDP \leq 15W confirmed experimentally

Lesson 12: Embedded GPUs comply with on Board power requirements

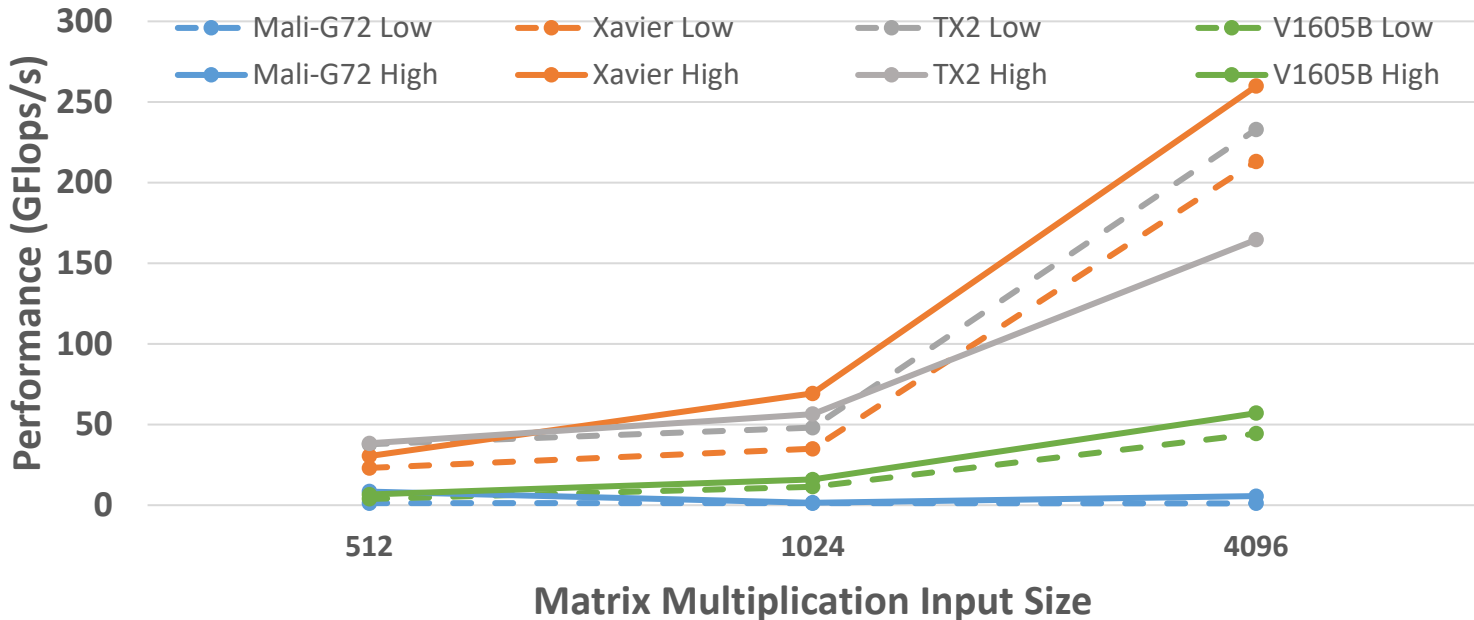
Lesson 13: CUDA and HIP offer easier programmability than OpenCL

[1] GPU4S Bench: Design and Implementation of an Open GPU Benchmarking Suite for Space On-board Processing: https://www.ac.upc.edu/app/research-reports/public/html/research_center_index-CAP-2019,en.html

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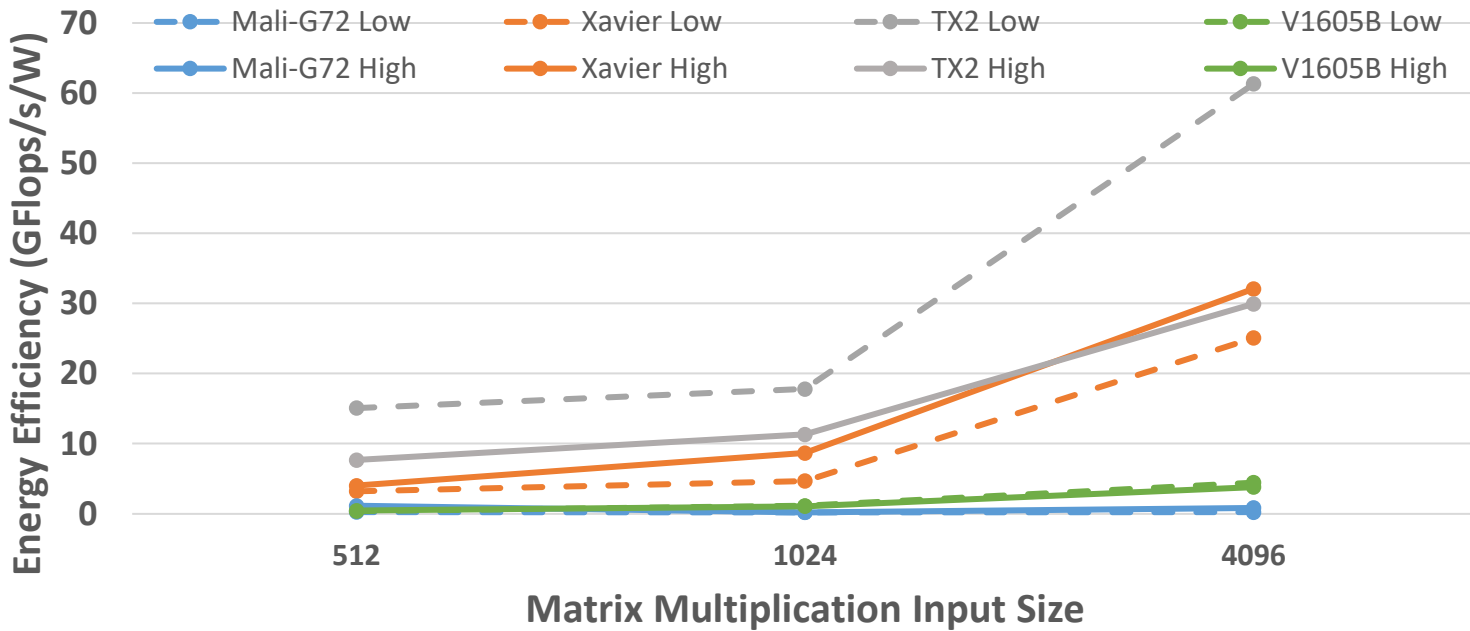
Embedded GPU Benchmarking: Results (Performance)

- ❧ NVIDIA platforms dominated in terms of performance and energy efficiency
 - ❧ Results depend on input size, and benchmark
- ❧ Library versions are not always faster



Embedded GPU Benchmarking: Results (Energy Efficiency)

- ❧ NVIDIA platforms dominated in terms of performance and energy efficiency
 - ❧ Results depend on input size, and benchmark
- ❧ Library versions are not always faster



Embedded GPU Benchmarking: Results

- ⌘ NVIDIA platforms dominated in terms of performance and energy efficiency
 - ⌘ Results depend on input size, and benchmark
- ⌘ Library versions are not always faster

Lesson 14: Vendor optimised libraries have a large initialisation cost, so they are not always the best choice, but it depends on the application scenario

Lesson 15: It is possible to obtain high performance with reasonable GPU development effort

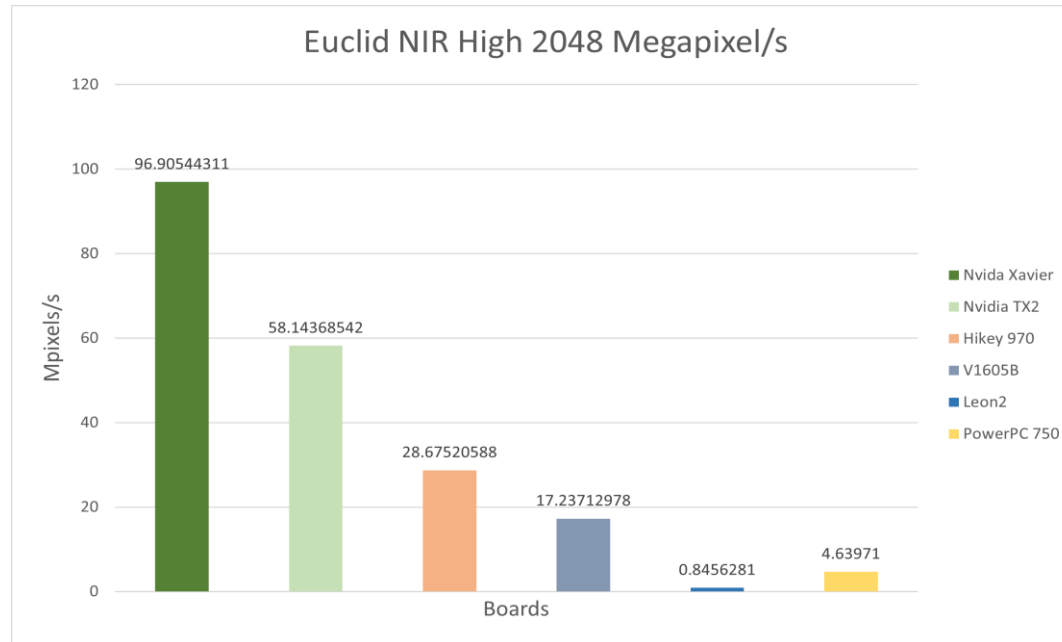
Lesson 16: Performance can only be assessed by actual implementation

[1] GPU4S Bench: Design and Implementation of an Open GPU Benchmarking Suite for Space On-board Processing: https://www.ac.upc.edu/app/research-reports/public/html/research_center_index-CAP-2019,en.html

[2] OBPMark (On-Board Processing Benchmarks) – Open Source Computational Performance Benchmarks for Space Applications, OBDP 2021, <http://OBPMark.org>

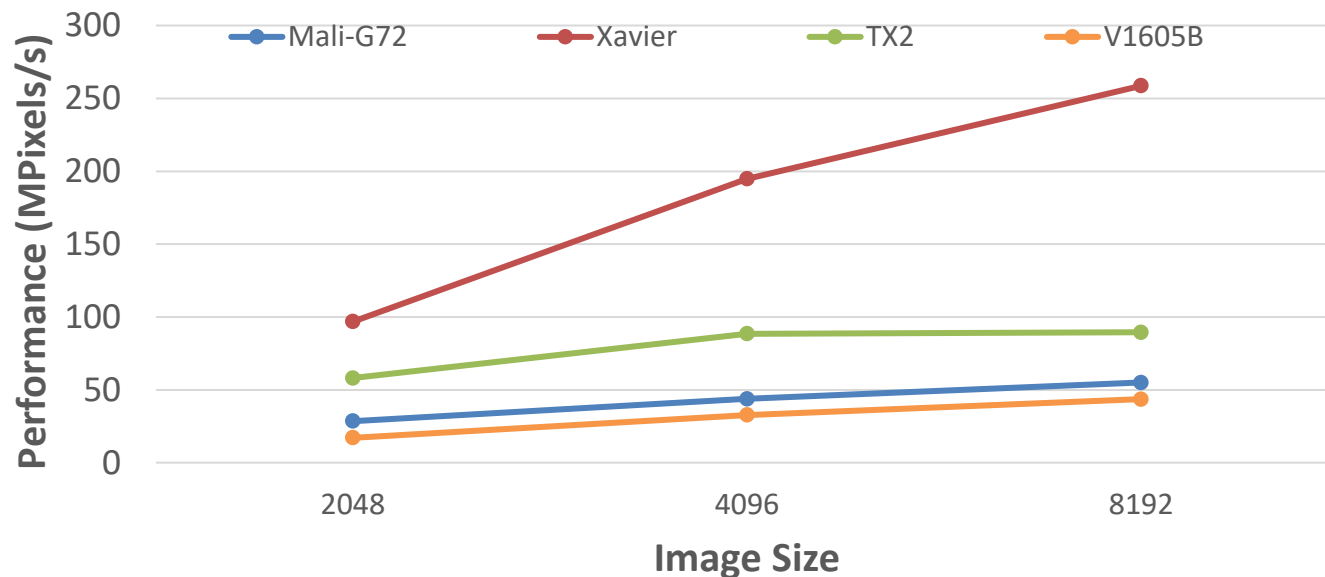
Embedded GPU Benchmarking: Complex applications / Demonstrator

- GPU4S: Inference application designed for the CIFAR-10 data set
- CCSDS Space compression standards [1]
- Ported Euclid NIR space case study to GPU [2][3]



Embedded GPU Benchmarking: Complex applications / Demonstrator

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Embedded GPU Benchmarking: Complex applications / Demonstrator

- ⌘ GPU4S: Inference application designed for the CIFAR-10 data set
- ⌘ CCSDS Space compression standards [1]
- ⌘ Ported Euclid NIR space case study to GPU [2][3]
 - ⌘ Significant speedups compared to existing space processors
 - ⌘ 2 orders of magnitude in small sizes (2048x2048)
 - ⌘ Benefit increases with input size

Lesson 17: GPUs can significantly accelerate complex space processing compared to other technologies

- [1] An On-board Algorithm Implementation on an Embedded GPU: A Space Case Study, DATE 2020
[2] I. Rodriguez, Master Thesis, <https://upcommons.upc.edu/handle/2117/344892>
[3] Parallelisation of On-Board CCSDS Compressors: a Benchmarking Approach, ESA OBPDC 2020

Radiation Effects and Future Adoption

- ⌘ Radiation studies are required before GPU adoption in space
- ⌘ Preliminary results available from other projects
- ⌘ Nanosatellites and technology demonstration missions
 - ⌘ Mars Ingenuity (still working!), HyTI Cubesat, Φ -Sat-1, OPS-SAT 1+2 etc.
 - ⌘ Promising results for radiation tolerance of COTS devices
- ⌘ Similar issues faced in the automotive domain
 - ⌘ Built-in reliability required for ASIL-D
 - ⌘ Hardware [1] or software solutions [2]

Lesson 18: GPU reliability solutions from the automotive domain can be adopted for use in space

[1] High-Integrity GPU Designs for Critical Real-Time Automotive Systems, DATE'19

[2] Software-only Diverse Redundancy on GPUs for Autonomous Driving Platforms, IOLTS '19²³

Overview of Tested GPUs

Company	Component	Performance	Software Support	ECC protection	Radiation Results Available	Flight board available
NVIDIA	Xavier	Best	CUDA/Vulkan	Yes	Yes	No
NVIDIA	TX2	High	CUDA/Vulkan	Yes	Yes	Yes
AMD	V1605B	Medium/High	OpenCL/HIP/ Vulkan	Yes	Yes	Yes
ARM Mali-G72	HiKey 970 HiSilicon	Medium	OpenCL	No	No	No
AMD/Unibap	DDX-i5	Medium	OpenCL	Yes	Yes	Yes
AMD/Unibap	DDX-i10	Medium/High	OpenCL/HIP	Yes	Yes	Yes

Conclusions

- ⌘ GPUs in general are a good fit for highly flexibly high-performance on-board processing
- ⌘ Embedded COTS GPU SoCs have high-performance and are suited for New Space applications where component qualification is not critical
 - ⌘ GPUs can offer better time-to-market than FPGAs for New Space
- ⌘ Reliability of COTS GPUs can be increased through HW/SW approaches
 - ⌘ Radiation testing of COTS GPUs is required
 - ⌘ FDIR software is recommended
- ⌘ GPUs could be introduced in institutional missions, but would require significant investment
 - ⌘ A strong industrial consortium, including the GPU IP provider is necessary
 - ⌘ Open source fault-tolerant GPU IPs with commercial-friendly licensing could be a way forward

Acknowledgements

- ⌘ ESA AO/1- 9010/17/NL/AF
- ⌘ Spanish Ministry of Economy and Competitiveness (MINECO) under grants PID2019-107255GB and FJCI-2017-34095
- ⌘ HiPEAC Network of Excellence, Technology Transfer Award 2019
- ⌘ RISC-V Foundation Educator of the Year Award 2019
- ⌘ Airbus Defence and Space, Getafe, Spain, TANIA-GPU ADS (E/200)
- ⌘ CoreAVI
- ⌘ Unibap
- ⌘ UP2DATE H2020, European Community's Horizon 2020 Programme (H2020-ICT-2019-2) grant agreement 871465

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