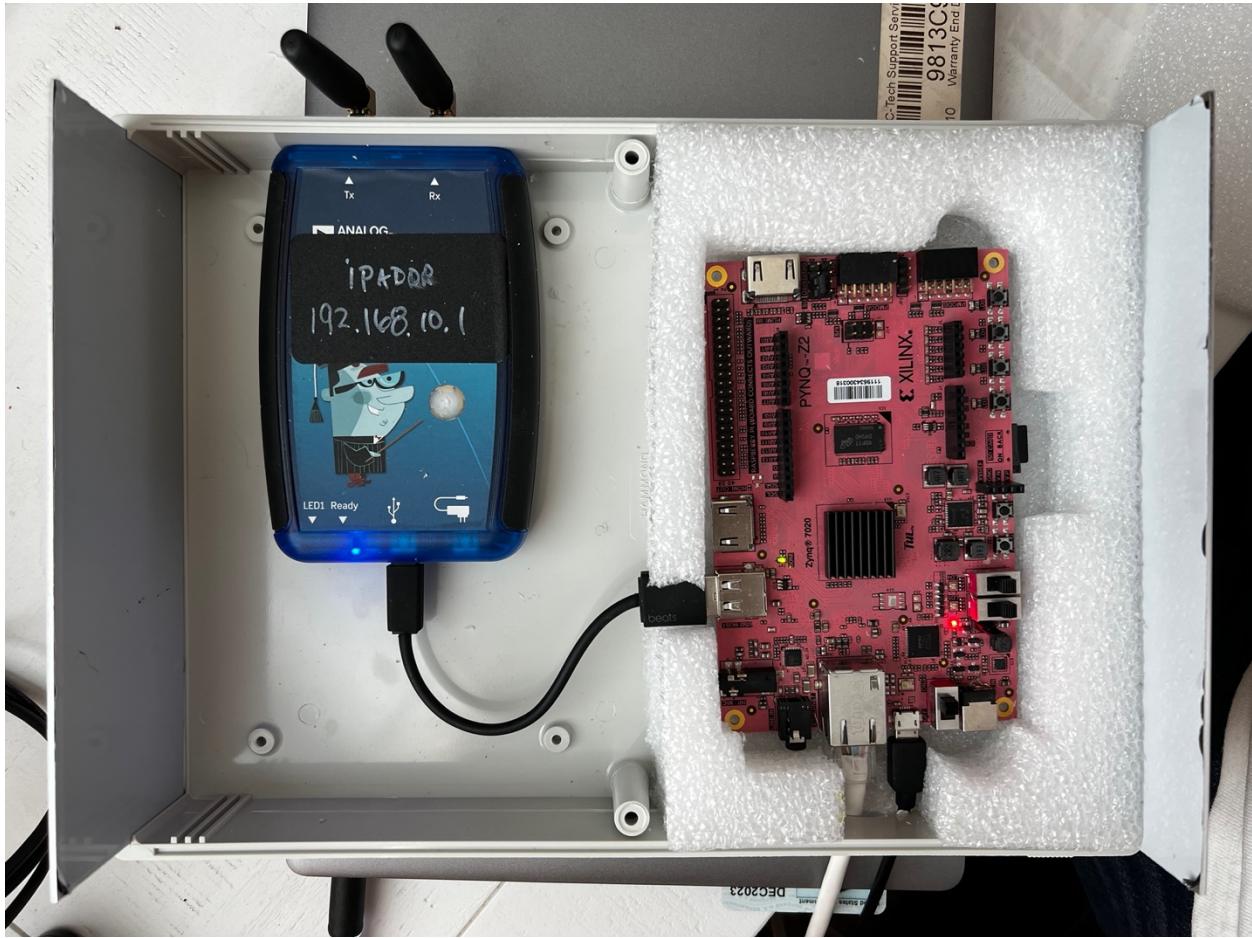


IMAGE PROCESSING ON PYNQ FPGA

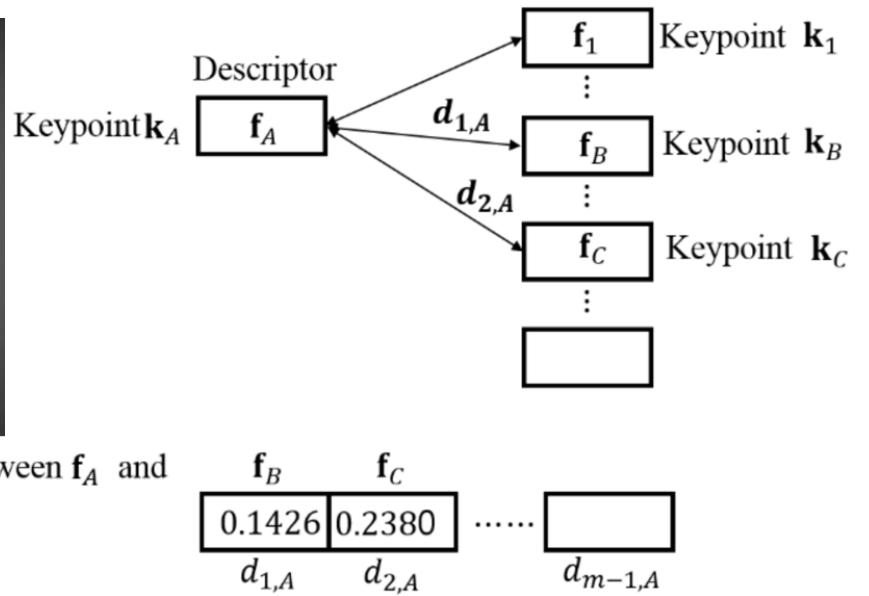


The project: Keypoint Descriptors

For low-level processing, FPGA devices are excellent candidates because they support data parallelism with high data throughput. Most previous keypoint descriptor formulations have inefficient FPGA implementations or deliver relatively poor information about the observed scene. In this work, I implanted a keypoint descriptor algorithm that aims for dense feature matching, due to time and scheduling I took the keypoint step from the overall CMFD process.

So, how does this work?

Keypoint descriptor algorithms will find some “interesting” keypoints (like nose, eyes) in the image by using edge/corner detection techniques and thresholding. So, we have stable keypoints that are scale-invariant and rotation invariant. The detection of key points in an image is nothing but selecting the points on the image which are good features, and the descriptors are the representation of a point’s local neighborhood



$$\frac{d_{1,A}}{d_{2,A}} = \frac{0.1426}{0.2380} = 0.59 < t \Rightarrow \text{Matching}$$

Figure 1 Example of correct keypoint matching using the proposed descriptor, Found 413 matches

The FGPA

Field Programmable Gate Arrays (FPGAs) are semiconductor devices that are based around a matrix of configurable logic blocks (CLBs) connected via programmable interconnects. FPGAs can be reprogrammed to desired application or functionality requirements after manufacturing.

System Overview

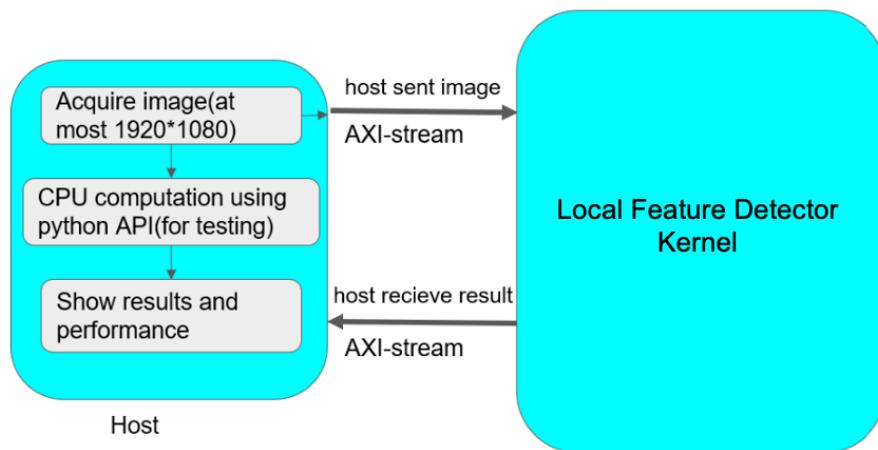


Figure 2 the image flow is through AXI-stream interface from host to kernel back to host

Vitis and Vivado HLS

Vivado is the Hardware Development suite used to create a VHDL, Verilog, or any other HDL design on the latest Xilinx FPGA. In other words, when you need to translate your VHDL design into a configuration file to be downloaded into a Xilinx FPGA, you need Vivado framework.

Vivado is an integrated tool that allows you to perform the complete design flow for a Xilinx FPGA:

- Simulate
- Synthesize
- Map
- Route
- Analyze Timing
- Create a bit-stream FPGA configuration File
- Configure FPGA
- Debug the FPGA using ILA (Integrated Logic Analyzer)

Vitis HLS

In the Vitis application acceleration flow, the Vitis HLS tool automates much of the code modifications required to implement and optimize the C/C++ code in programmable logic and to achieve low latency and high throughput. The inference of required pragmas to produce the right interface for your function arguments and to pipeline loops and functions within your code is the foundation of Vitis HLS in the application acceleration flow. Our project following the Vitis HLS design flow:

- Compile, simulate, and debug the C/C++ algorithm.
- View reports to analyze and optimize the design.
- Synthesize the C algorithm into an RTL design.
- Verify the RTL implementation using RTL co-simulation.
- Package the RTL implementation into a compiled object file (.xo) extension, or export to an RTL IP.

#pragma HLS interface

Vitis HLS pragmas and directives let you configure the synthesis results for your code. HLS Pragmas are added to the source code to enable the optimization or change in the original source code. Every time the code is synthesized, it is implemented according to the specified pragmas.

AXI4-Burst Mode (m_axi)

For fast speeds we use an Optimization Directive Interface called s_axilite, or the set directive commands is associated with a burst mode solution. This is for faster computation results which are stored in a buffer and are written to global memory in a burst.

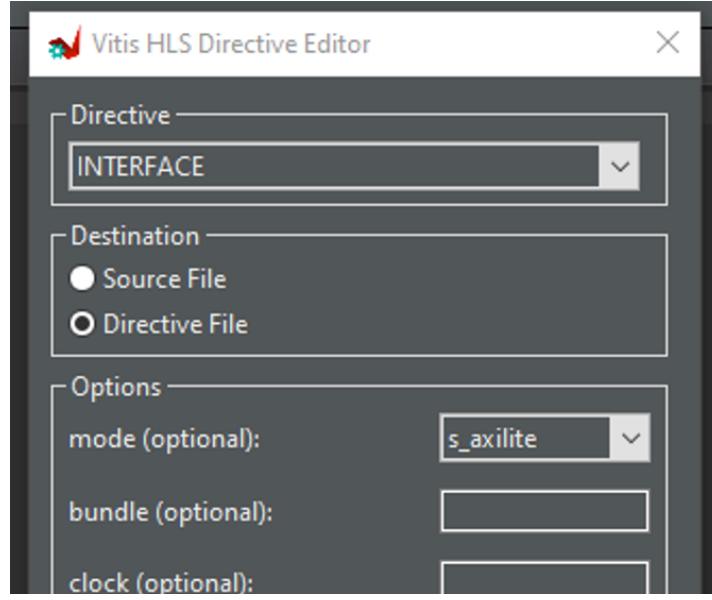


Figure 3 Opened Directive for the option to select Modify Directive

Vitis Results

Performance & Resource Estimates															
Modules & Loops	Issue Type	Violation Type	Distance	Slack	Latency(cycles)	Latency(ns)	Iteration Latency	Interva	Trip Count	Pipelined	BRAM	DSP	FF	LUT	URAM
↳ HCD			-	-	4425812	4.426E7	-	4425800	-	dataflow	80	22	9733	10408	0
↳ process_input			-	-	328193	3.282E6	-	328193	-	no	0	1	133	242	0
↳ blur_img			-	-	4425798	4.426E7	-	4425798	-	no	12	1	1274	1635	0
↳ compute_dif			-	-	528907	5.289E6	-	528907	-	no	12	9	1016	884	0
↳ blur_diff			-	-	4425799	4.426E7	-	4425799	-	no	36	3	3695	4863	0
↳ compute_response			-	-	459265	4.593E6	-	459265	-	no	0	8	1007	617	0
↳ find_local_maxima			-	-	3195589	3.196E7	-	3195589	-	no	20	0	615	705	0

Figure 4 Initial code with some basic \$pragma

Performance & Resource Estimates															
Modules & Loops	Issue Type	Violation Type	Distance	Slack	Latency(cycles)	Latency(ns)	Iteration Latency	Interva	Trip Count	Pipelined	BRAM	DSP	FF	LUT	URAM
↳ HCD			-	-	42346	4.230E5	-	42343	-	dataflow	68	83	19948	18646	0
↳ process_input			-	-	32777	3.280E5	-	32777	-	no	0	5	377	435	0
↳ blur_img			-	-	42342	4.230E5	-	42342	-	no	6	15	2150	2454	0
↳ compute_dif			-	-	37201	3.720E5	-	37201	-	no	6	0	2740	2494	0
↳ blur_diff			-	-	40029	4.000E5	-	40029	-	no	36	54	7541	7290	0
↳ compute_response			-	-	32779	3.280E5	-	32779	-	no	0	9	1262	1065	0
↳ find_local_maxima			-	-	37343	3.730E5	-	37343	-	no	20	0	3885	3446	0

Figure 5 Optimization with compact streaming interface and pipelining the sub-functions

Package the RTL implementation export to an RTL IP

After the verifying, Synthesizing and running the Simulation, the final step in the Vitis HLS flow is to export the RTL design. Click the Export RTL command in the Flow Navigator to open the Export RTL dialog box shown in the following figure.

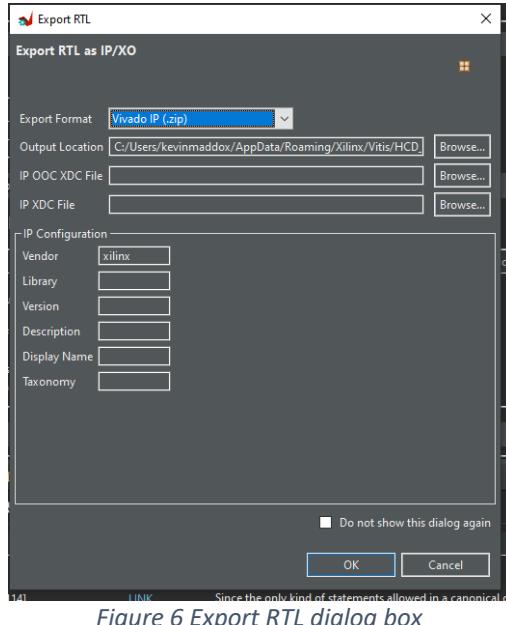


Figure 6 Export RTL dialog box

Vivado: Generating bitstream from RTL code

We need to Import RTL code and can be found on the imported RTL for folder here

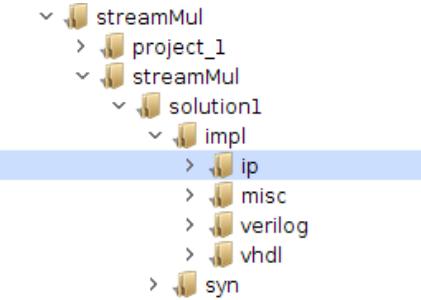


Figure 7 IP location from the Vitis RTL

Created Design

After the IP import and adding a couple of interconnects and DMA this IP is produced

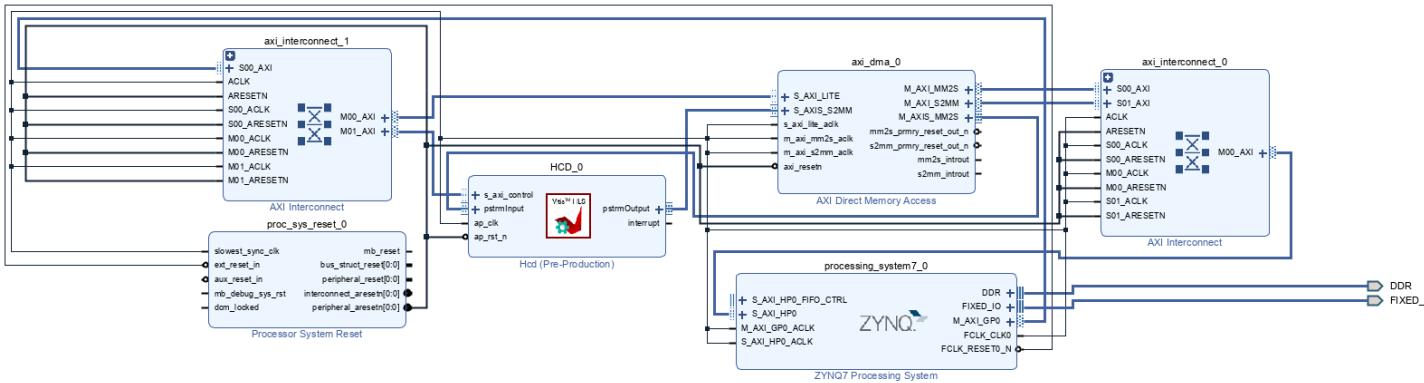


Figure 8 Created Block Diagram from IP Integrator

Generate Bitstream

In Sources, right click on design_1 and select Create HDL Wrapper

Bitstream, .hwh, and addresses

To locate the needed .hwh and bitstream go to sources ..

expand design_1_wrapper::design_1_i::design_1_axi4_sqrt_0::design_1_axi4_sqrt_0_0::inst : axi4_sqrt, double click on axi4_sqrt_sqrt_s_axi_U , and note the address for ipHCD write as 0x10 , 0x18 and 0x00 respectively. We need this address in our host program

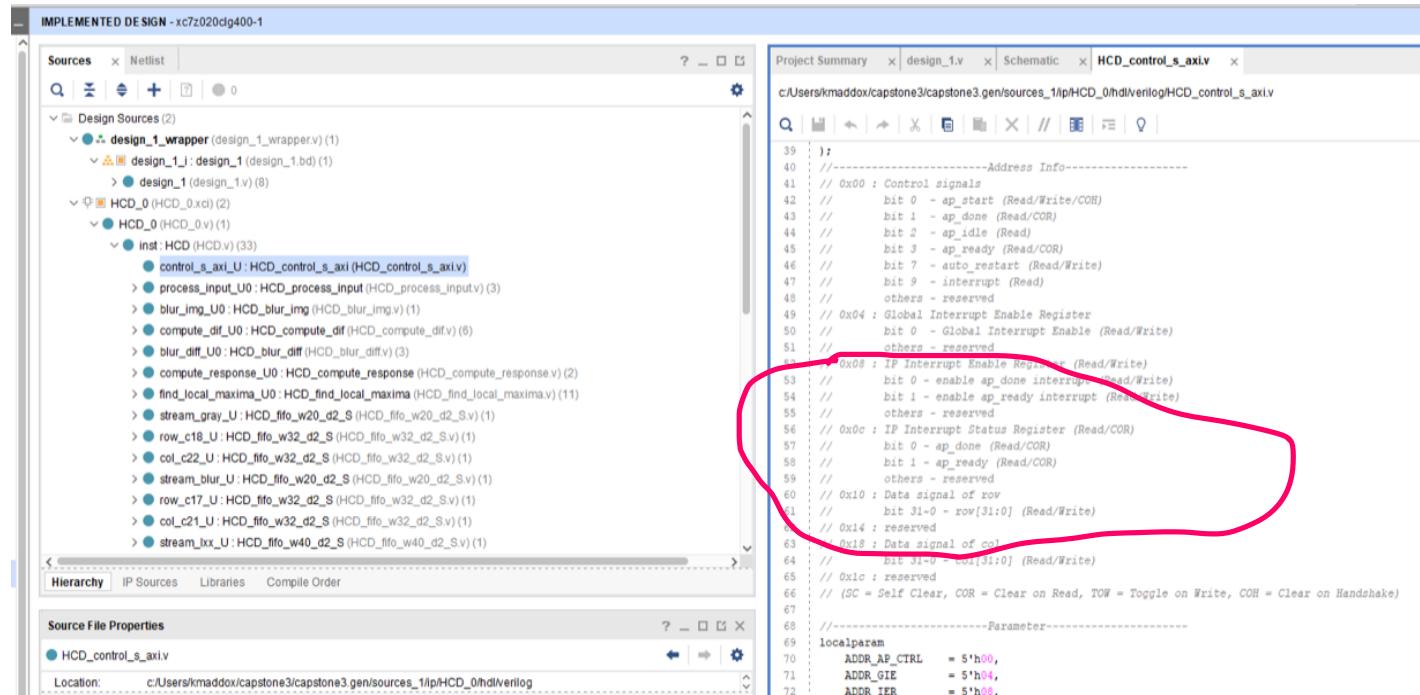


Figure 9 Under Sources, open mul_test_mul_io_s_axi.v, scroll down and note addresses for in and out ports

Host Program

We implement a host program in python (host), which can be run by using Jupyter Notebook. To interact with the IP first we need to load the overlay containing the IP b the following lines of code

```
# designate a bitstream to be flashed to the FPGA  
  
ol = Overlay("/home/xilinx/jupyter_notebooks/CapstoneF/design_1.bit")  
ol.download() # flash the FPGA
```

What is the difference between an ASIC and an FPGA?

ASIC and FPGAs have different value propositions, and they must be carefully evaluated before choosing any one over the other. Information abounds that compares the two technologies. While FPGAs used to be selected for lower speed/complexity/volume designs in the past, today's FPGAs easily push the 500 MHz performance barrier. With unprecedented logic density increases and a host of other features, such as embedded processors, DSP blocks, clocking, and high-speed serial at ever lower price points, FPGAs are a compelling proposition for almost any type of design.

Results/Comparison

Design	Latency (cycles)	Latency (ms)	BRAM	DSP	FF	LUT
Orginal	4425812	4.42E+07	80	22	9733	10408
Optimization	42346	4.23E+05	68	83	19948	18646
CPU run time	4.3152172565460205 sec					

Figure 10 Estimated CPU vs FPGA results

ADALM-PLUTO Radio Communications for PYNQ-Z2

To connect the Pluto with the ability to transmit an image, I tried to use GNU Radio which seems to be a popular way with a lot of control using the blocks. Was unable to run GNU Radio due to flaky PYNQ VNC. In the end able to install SDR drivers directly on to the PYNQ

- libiio, Analog Device's "cross-platform" library for interfacing hardware
- libad9361-iio, AD9361 is the specific RF chip inside the PlutoSDR
- pyadi-iio, the Pluto's Python API, this is our end goal, but it depends on the previous two libraries

then able to connect using the following lines of code

```
python3
import adi
sdr = adi.Pluto('ip:192.168.10.1') # or whatever your Pluto's IP is
sdr.sample_rate = int(2.5e6)
```

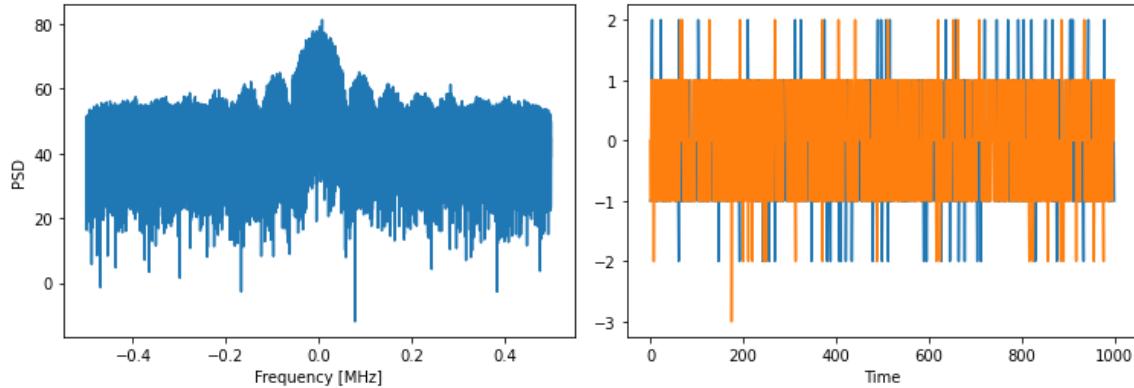


Figure 11 loopback results

Future Improvements

- There are number of approaches used to detect and matching of features as SIFT, SURF (Speeded up Robust Feature), FAST, HCD etc. SURF has become a more useful approaches to detect and matching of features because of it is invariant to scale, rotate, translation, illumination, and blur.
- Have all CMFD steps run on the FPGA
- Use GNU Radio for image transmission and receive
- Create a smaller overall device footprint

More Images

