# Lab 2 - Designing an AXI Accelerator for Matrix Multiplication

In this lab you will be designing an AXI accelerator for matrix multiplication for the Xilinx Zynq device.

## **Requirements:**

- The know-how gained during the previous lab and exercise.
- Knowing AXI Stream communication protocol.

### Tools:

- Xilinx Vivado HLx Edition 2018.3<sup>1</sup>

### **Intended Learning outcomes:**

- Creating a custom IP
- IP-based design
- Developing software for FPGA designs using the Xilinx Software Development Kit (SDK)

#### **Assessment:**

- Verify your design using the provided test bench.
- You have to demonstrate your solution, and explain your design to the lab assistants in one of the following lab sessions:
  - o Thursday May 9<sup>th</sup>, 13:15 17:00, room 2315
  - o Friday, May 24<sup>th</sup>, 13:15 17:00, room 2315
- Submit the Verilog code for your solution afterwards on the student portal.

<sup>&</sup>lt;sup>1</sup> The description contains some screenshots taken using Vivado v2015.4, but the description applies also to the recent version.

## **Matrix Multiplication**

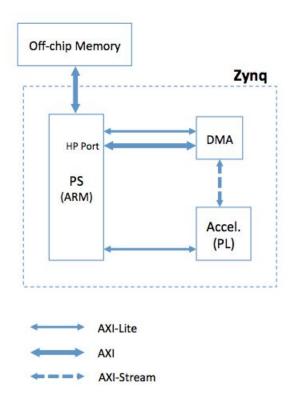
In this lab we consider matrix multiplication, a basic mathematical operation that is important in a wide variety of applications and algorithms (e.g., in scientific computing or machine learning). Matrix multiplication is a good candidate for acceleration, since the matrices needed in practice are often huge, and processing them can be a bottleneck.

$$\begin{bmatrix} a_{11} & a_{12} & a_{13} & a_{14} \\ a_{21} & a_{22} & a_{23} & a_{24} \\ a_{31} & a_{32} & a_{33} & a_{34} \\ a_{41} & a_{42} & a_{43} & a_{44} \end{bmatrix} \times \begin{bmatrix} b_{11} & b_{12} & b_{13} & b_{14} \\ b_{21} & b_{22} & b_{23} & b_{24} \\ b_{31} & b_{32} & b_{33} & b_{34} \\ b_{41} & b_{42} & b_{43} & b_{44} \end{bmatrix} = \begin{bmatrix} r_{11} & r_{12} & r_{13} & r_{14} \\ r_{21} & r_{22} & r_{23} & r_{24} \\ r_{31} & r_{32} & r_{33} & r_{34} \\ r_{41} & r_{42} & r_{43} & r_{44} \end{bmatrix}$$

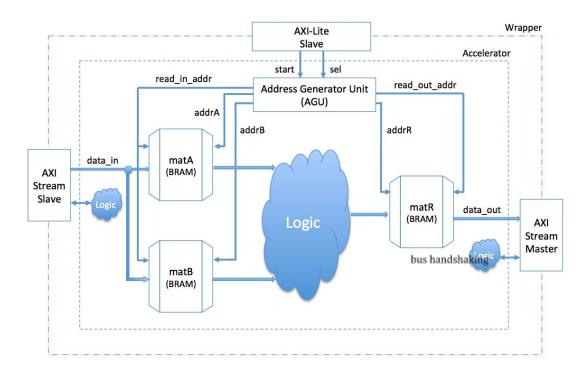
An unoptimised sequential implementation of matrix multiplication is as follows:

## **System Overview**

- PS: Processing System (ARM Cores)
- PL: Programmable Logic, i.e. the FPGA fabrique (IPs and buses)
- AXI-Lite: simple AXI bus used by the processor to configure the IPs (memory-mapped)
- AXI: high performance AXI bus (memory-mapped)
- AXI-Stream: streaming bus (address-less)
- HP: High Performance port, used by the Direct Memory Access controller to access the off-chip memory



## **Proposed Architecture for the MatMul Accelerator**

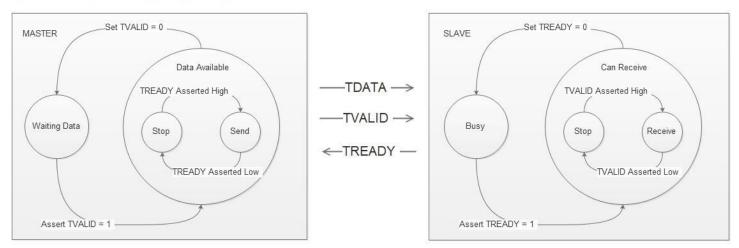


- sel: used by the PS to select matA or matB before sending the matrix to the accelerator (memory-mapped via the axi-lite config bus)
- start: used by the PS to start the accelerator after transferring the matrices (memory-mapperd via the axi-lite config bus)
- AGU: Address Generator Unit; used to generate addresses to:
  - Fill-in the input matrices
  - Read from the matrices during multiplication
  - Write the result to the output matrix
  - Sending the result to the processor
- matX: input and output matrices implemented as dual-port block RAMs
- Logic: used to implement the data path for the multiplication and also handshaking signals for the AXI Stream buses

### **AXI-Stream State Machine**

We will be using the following handshaking protocol to receive and send data from and through the AXI-Stream bus (can be implemented as a state machine)

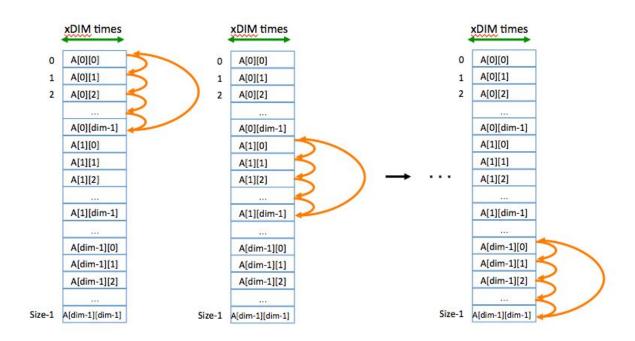
## AXI4-Stream State Machine

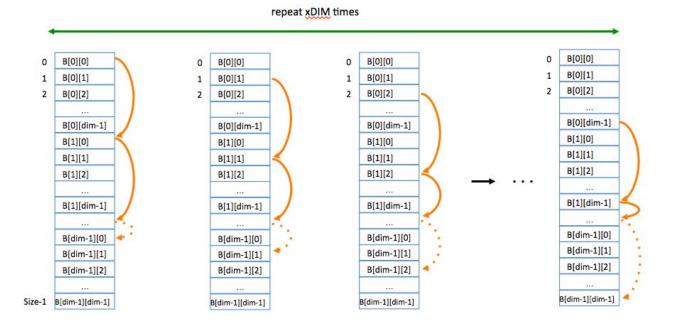


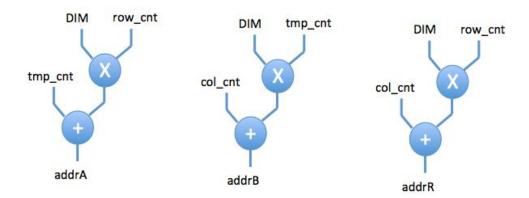
www.seaai.com, copyright 2016

#### More on AGU

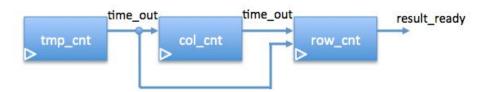
- size: dim\*dim
- row counter: 0 ... dim-1
- column counter: 0 ... dim-1
- temporary counter: 0 ... dim-1
- address: 0 ... size-1







read\_addr\_in and read\_addr\_out that are used to fill in the matrices and to read the result out are regular sequence counters in the range of  $0\ldots$  size-1.



## Multiplier and Accumulator (MAC) Unit



## **Inferring Dual-Port Block RAMs from HDL Code**

```
always @(posedge clka) begin
if (wea)
BRAM[addra] <= dina;
if (enb)
ram_data <= BRAM[addrb];
end
assign doutb = ram_data;
```

#### **Your Task**

You are required to design the accelerator based on the aforementioned components. Moreover, you should make sure that all the components are correctly synchronized. This is achieved by designing the correct control logic that ensures correct timing between all the components.

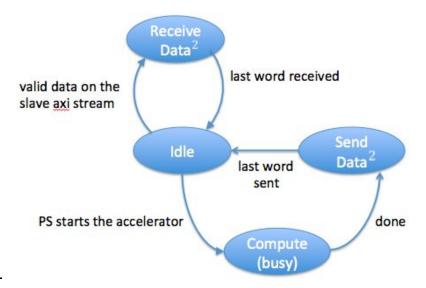
You can open the design files in Vivado HLx and complete the design according to the instructions in this manual (you will need to complete the TODO parts in the skeleton files).

Finally, you need to test your design. It might be easier to simulate your stand-alone accelerator in a separate file since we are using IP-based design. You can prepare a test bench yourself or use the provided one "lab2\_matmul/src/mat\_mul\_tb.v". The provided test bench should produce the output "HW/SW result match!" when simulated to completion.

If you are interested in starting the design from the scratch, you can refer to Appendix I. You can learn how to programme the FPGA and run your software via the SDK in Appendix II.

### **Some Hints**

Think of the following state machine (algorithm) when designing the accelerator. <sup>2</sup>

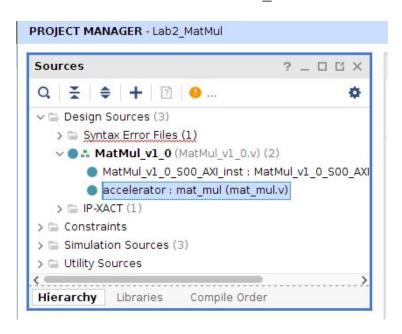


<sup>&</sup>lt;sup>2</sup> Also notice the axi stream protocol (page 4) when sending and receiving data.

## **Opening the Skeleton Files in Vivado**

After downloading the zip file and extracting it in a folder, open the project for the accelerator by opening lab2\_matmul/Lab2\_MatMul.xpr in Vivado.

When the project is opened, double-click on mat\_mul.v file in the Sources pane, and complete the TODO parts (you can find and edit the same file under lab2 matmul/src as well).



# Test and Debug your Design using the included Test Bench

After completing your modifications, you should test your design by simulating it. A possible test bench is already provided in the file mat\_mul\_tb.v, which will also be used to verify that your design works. You should also study the provided test bench carefully.

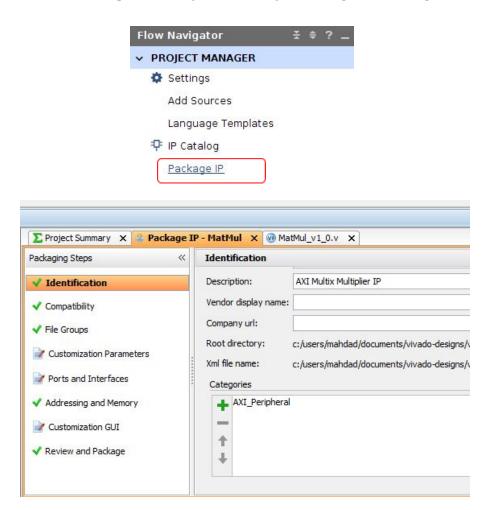
You should be able to explain to the TAs:

- the stimulus file that you are using (either your own or the provided one),
- how to interpret the results.

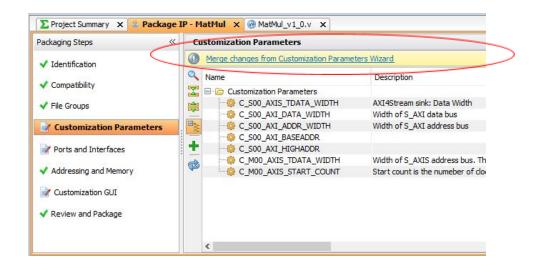
If launching the behavioural simulation fails, make sure that the library "xil\_defaultlib" is selected in the "Source File Properties" pane for all source files!

# **Optional: Re-Package IP**

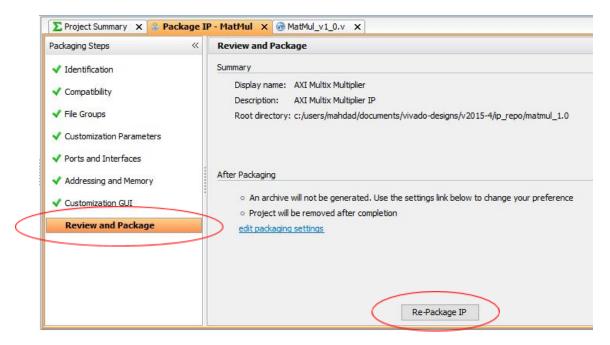
Once your modifications are complete, save your work by selecting the "Package IP" tab.



Select the steps without a green check mark. Select the wizard to resolve the issues and having green check marks for all the steps (having some warnings might be OK, as long as you understand the reason)..



Select "Review and Package" and click on the "Re-Package IP", you should receive a notification that the packaging is finished successfully.

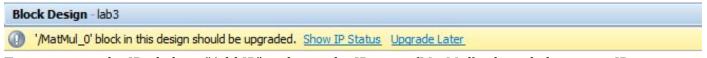


You can now open the main project which uses the accelerator, located under lab2/lab2.xpr.

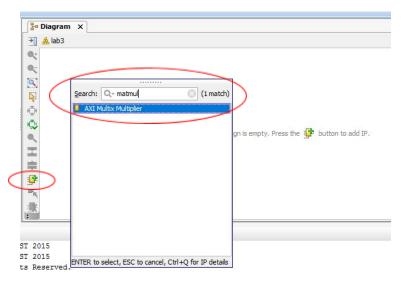
Click on the "Refresh IP Catalog" if the yellow warning bar appears at the top of the window.



If the following message appears, the easiest way to solve the problem would be to right-click on the MatMul IP block and delete it, then instantiating it again.



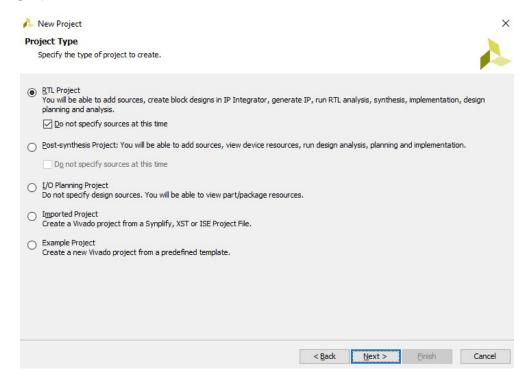
To instantiate the IP, click on "Add IP" and type the IP name (MatMul), then click on your IP.



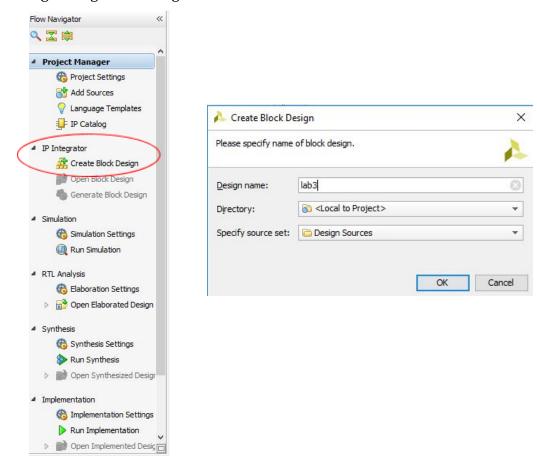
You can then continue from page 17 of this manual (Run Connection Automation).

## Appendix I - Create a Custom AXI IP

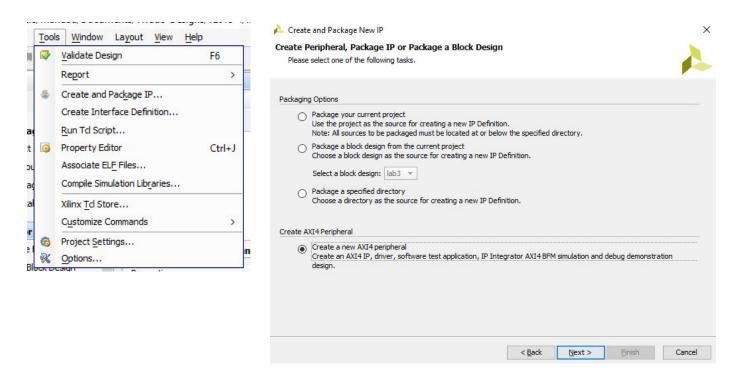
Create a new project in Vivado. Choose the board ZC702 or ZC706.



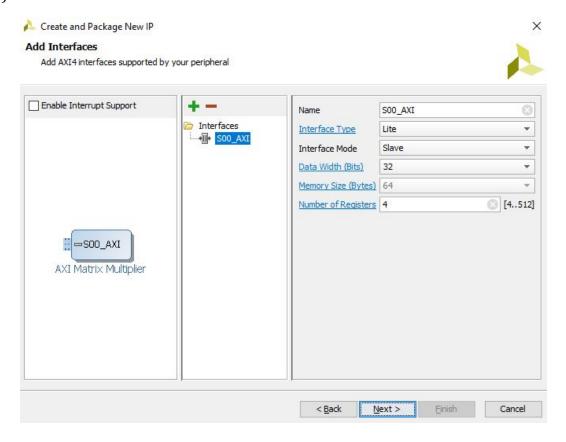
Create a block design using the IP integrator.



Select "Tools  $\rightarrow$  Create and Package IP ...", then select "Create a new AXI4 peripheral". Give your IP a name and description.



We will need three interfaces for the MatMul IP: one AXI-Lite for configuration (slave), and two AXI-Stream (one master and one slave). The AXI-Lite is created by default. Add the AXI-Stream interfaces by clicking on the green + sign. Change the type to "Stream". Select the proper mode (slave or master).



Accelerating Systems with Programmable Logic Components – 1DT109 Select "Edit IP" and click "Finish". A new project window opens.

The top module for the IP is created. It contains three Verilog files that correspond to the three port instances.



Double-click on the top module (MatMul\_V1\_0). Inside the file you can observe the instantiation of the interfaces. Vivado implements the interfaces as FIFO streams. However, we intend to use Block RAMs. As a result, we keep the interface signals in the top module, but delete the instantiations of Axi Bus Interfaces S00\_AXIS and M00\_AXIS (stream slave and master). We will later implement correct AXI stream bus handshaking logic and connect them to the corresponding interface signals in the top module. Note that the design hierarchy updates after you delete the instances and save your design.

```
// Instantiation of Axi Bus Interface MOO AXIS
// Instantiation of Axi Bus Interface S00 AXIS
                                                                  MatMul v1 0 M00 AXIS # (
   MatMul v1 0 S00 AXIS # (
                                                                      .C M AXIS TDATA WIDTH (C MOO AXIS TDATA WIDTH) ,
        .C S AXIS TDATA WIDTH (C SOO AXIS TDATA WIDTH)
                                                                      .C_M_START_COUNT(C_MOO_AXIS_START_COUNT)
   ) MatMul v1 0 S00 AXIS inst (
                                                                  ) MatMul v1 0 M00 AXIS inst (
        .S AXIS ACLK(s00 axis aclk),
                                                                      .M AXIS ACLK(m00 axis aclk),
        .S_AXIS_ARESETN(s00_axis_aresetn),
                                                                       .M AXIS ARESETN (m00 axis aresetn),
        .S AXIS TREADY (s00 axis tready),
                                                                       .M_AXIS_TVALID(m00_axis_tvalid),
        .S AXIS TDATA(s00 axis tdata),
                                                                       .M_AXIS_TDATA(m00_axis_tdata),
        .S_AXIS_TSTRB(s00_axis_tstrb),
                                                                       .M AXIS TSTRB (m00 axis tstrb),
        .S AXIS TLAST (s00 axis tlast),
                                                                       .M AXIS TLAST (m00 axis tlast),
        .S_AXIS_TVALID(s00_axis_tvalid)
                                                                       .M_AXIS_TREADY(m00_axis_tready)
   );
```

PS configures the accelerator by writing to the internal control registers of the accelerator via the AXI-Lite slave interface. For instance, before writing a matrix into the accelerator, PS first sets the appropriate bit in the control register of the accelerator to indicate which matrix (A or B) is being transferred to the accelerator. Moreover, when both matrices are transferred, PS starts the accelerator by setting the start bit in the accelerator's control register. We can use the register at the base address of the accelerator as the control register. Each IP has a base address, which is used by the PS to communicate with the IPs. IPs are memory-mapped, which means that they are connected to the bus and the PS can simply read from or write to them by issuing requests for those addresses on the bus.

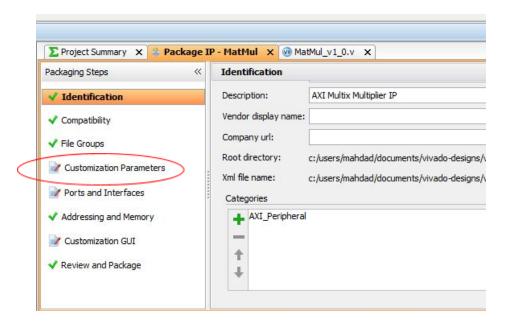
By default there are four slave registers in the AXI-Lite interface (slv\_reg0 to slv\_reg3). We will use the slv\_reg0 as the control register. The address of this register is the same as the base address of the IP. Vivado manages all the base addresses and makes them available to the SDK in a header file named "xparameters.h". We will use this header file to communicate to the IPs from the PS by reading from and writing to those base addresses.

As a design choice, we consider slv\_reg0[0] as the matrix select bit, and the slv\_reg0[1] as the start bit. We need to create user-defined ports and make this bits available in the ports of the AXI-Lite module. We use these bits in the top module to implement the accelerator's logic.

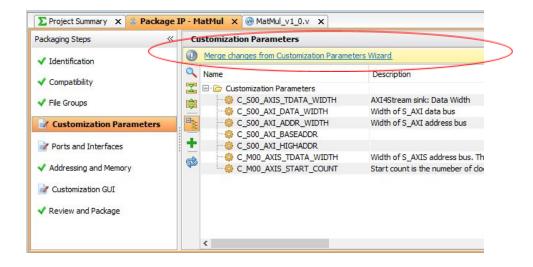
**N.B.** as a design choice, we choose that the "start" bit should be asserted only for one clock cycle, i.e. it should be cleared after it is set.

You can browse through the lab skeleton files and observe how these modifications have been made (look for comments including the word "user").

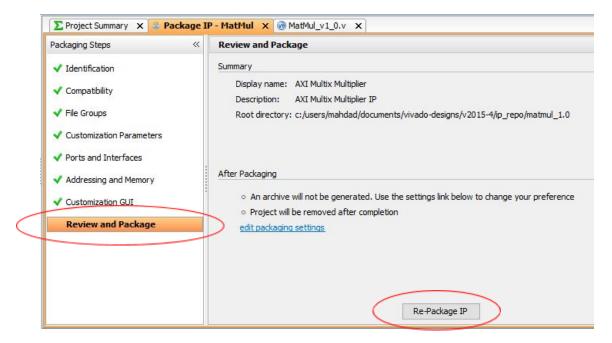
Once your design is complete, save the project and select the "Package IP" tab.



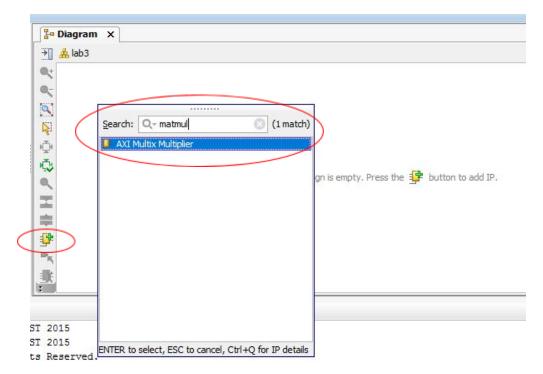
Select the steps without a green check mark. Select the wizard to resolve the issues and having green check marks for all the steps.



Select "Review and Package" and click on the "Re-Package IP", then select "yes" to close the project. The initial project window appears.

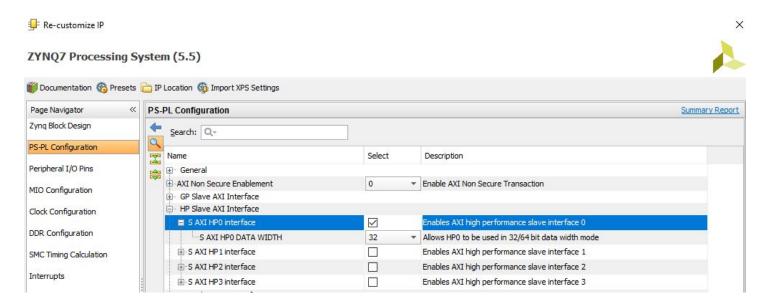


Now you can add the IP that you just created. Click on "add IP" and type your IP name. Click on your IP name and it will be instantiated in the block design.

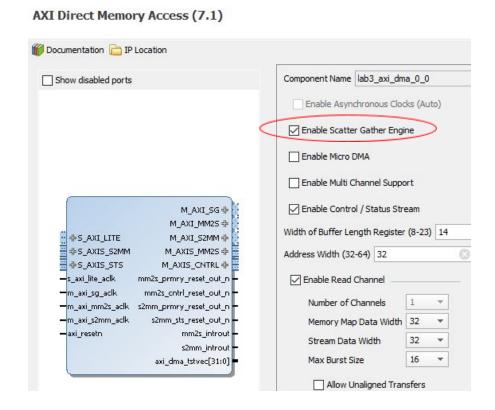


Similarly add the Zynq Processing System, AXI Direct Memory Access, and an AXI Timer.

Double-click on the Zynq IP (or right-click and choose customize block). Go to "PS-PL" configuration and enable the HPO AXI interface (be aware that you need to invalidate the cache manually if you are using this port. Alternatively, you can use the Accelerator Coherency Port (ACP), which handles the data coherency). It will be used by the DMA to access the external memory. Choose the data width to be 32.

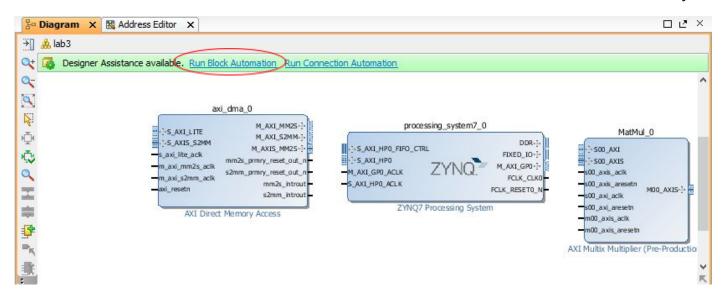


Double-click on the DMA and de-select the "scatter-gather" mode.



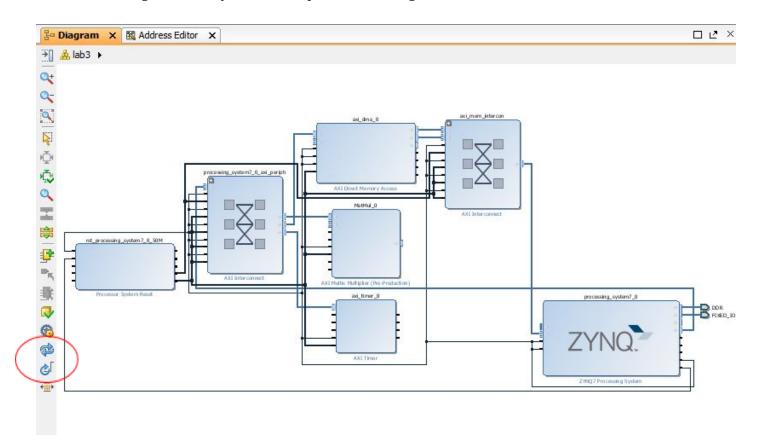
### 16

Click on "Run Block Automation". This will add interfaces to connect the PS to the external memory.



Then click on "Run Connection Automation" to add the necessary interconnections (from the window that appears choose "All Automation"). If needed, repeat this step until "Run Connection Automation" disappears.

Click on the "Regenerate Layout" and "Optimize Routing".



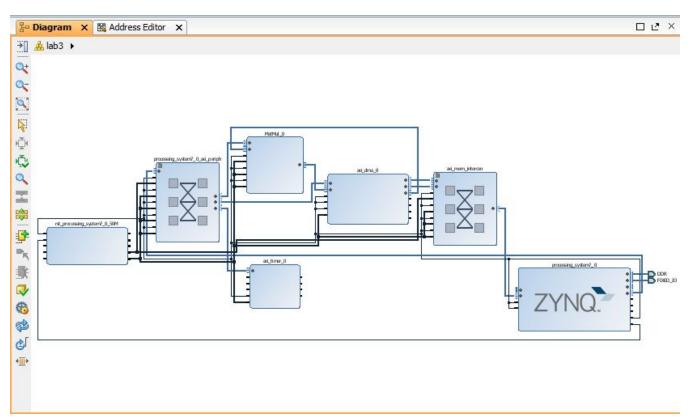
Zoom into AXI Matrix Multiplier and AXI DMA. You will need to complete the routing manually, as the automation is unable to finish the routing. Besides "reset" and "clock" in the multiplier IP, you need to fix the following connections:

Multiplier M00\_AXIS → DMA S\_AXIS DMA M\_AXIS → Multiplier S00\_AXIS

Hover the mouse pointer over the interface. The pointer changes to a pen. Click-and-hold and drag the pen to the desired interface. Also a green check mark will appear next to the matching interfaces. Release the pen to complete the interconnection.

Similarly connect the unattached "clock" and "reset" pins of the Multiplier IP.

Select "Regenerate Layout" to see the whole design. Save the design and select "Validate Design" (F6).

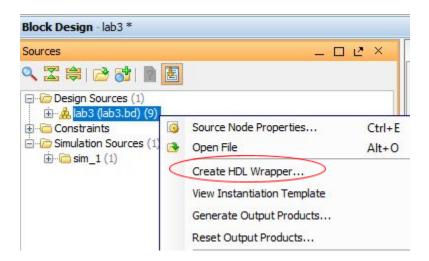


Ignore the warning about "axis\_tstrb" signal.

Also have a look at the "Address Editor". These are the base addresses of the IPs that are used by the PS to communicate with them. These addresses together with device drivers are exported to the SDK to develop software that runs on the PS and communicates with the IPs.

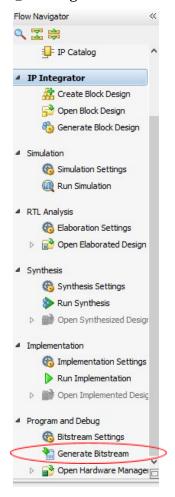


Now we need to create an HDL Wrapper that contains the whole design. Right-click on the block design (.bd) in the "Design Sources" and select "Create HDL Wrapper". From the window that appears select "Let Vivado Manage the Wrapper". Ignore the warning message concerning the s\_axis\_tstrb signal.

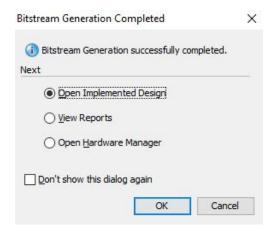


We are now ready to implement the design and create a bitstream. We will then export the bitstream to the SDK and write software to be run on the PS. Via the SDK we will then programme the FPGA using the bitstream and run the software on the PS.

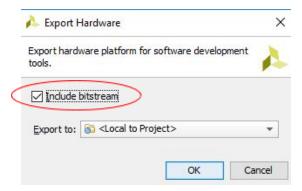
In the "Flow Navigator" click on the "Generate Bitstream". Choose "Yes" to run the implementation first. Ignore the warning about the s\_axis\_tstrb signal.



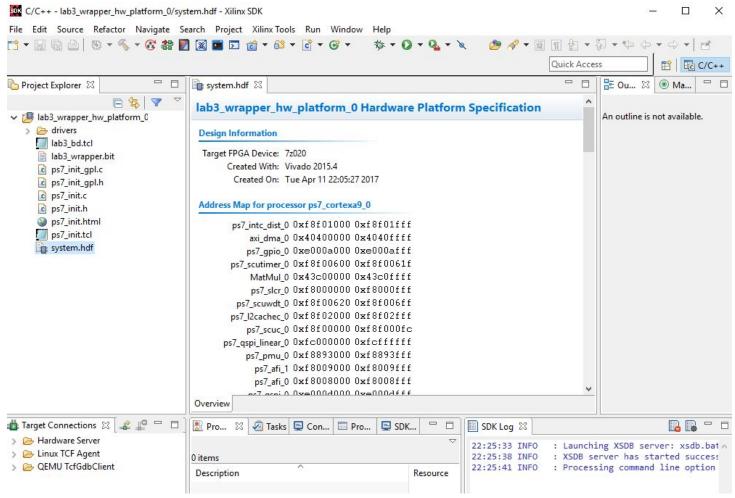
It takes a while for the bitstream to be created. Once completed, click "Cancel" to close the window.



Choose "File  $\rightarrow$  Export  $\rightarrow$  Export Hardware". Select "Include bitstream" and do not change "Export to: <Local to Project>".

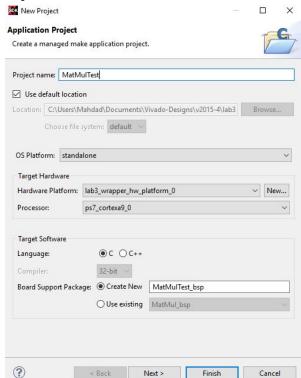


Choose "File → Launch SDK" and click OK. The Eclipse-based IDE of the Xilinx SDK opens.

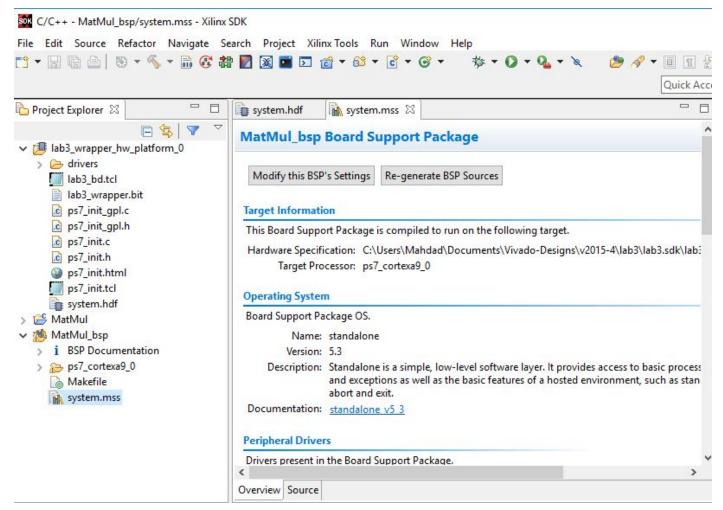


Your block design is exported to the SDK, with multiplier device driver. In the "system.hdf" (middle window) you can see the components/IPs and their memory-mapped addresses.

Select "File  $\rightarrow$  New  $\rightarrow$  Application Project". Give the project a name and click "Next". Select the default "Hello World" template. We will use this template to write our software. Click "Finish".



SDK creates your application project as well as the board support package (BSP). The application project contains binaries (.elf) for the ARM cores, debug files, libraries, and all the build and make scripts for your project. Also the BSP contains all the libraries and header files for all your design components and also the devices on the development board.



From the "Project Explorer" open MatMul 2 Src and double-click Helloworld.c (you can rename the file, if you wish).

Remove the "void print" and "print(Hello world)". Add the following header files:

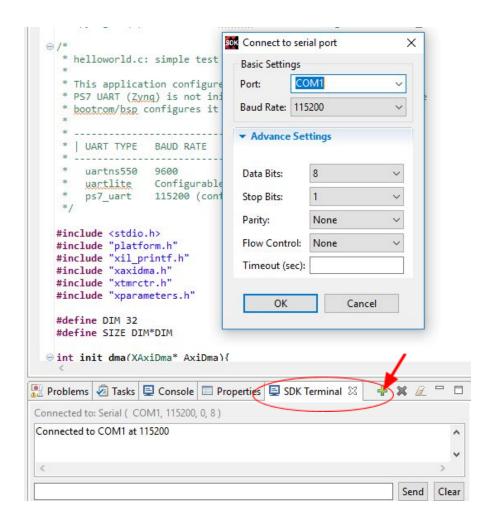
```
#include "xil_printf.h"  // function xil_printf()
#include "xaxidma.h"  // function calls to DMA
#include "xtmrctr.h"  // function calls to Timer
#include "xparameters.h"  // addresses of all the memory-mapped devices in the design
```

Have a look at the code provided in the lab skeleton files (lab2/lab2.sdk) and see how the software accesses the memory-mapped devices, including the accelerator.

## Appendix II - Programming the FPGA

You can optionally test your design using an actual Zynq-7000 FPGA. Connect the JTAG and UART cables to the USB port of your computer and power on the FPGA development board.

Connect to the serial port by adding a connection from the "SDK Terminal". Port is the COM Port number assigned to the UART USB connection (silicon labs cp210x).



Choose "Xilinx Tools  $\rightarrow$  Program FPGA".



Click on the "Program" in the window that appears. When the programming is completed, right-click on the application folder in the "Project Explorer" window and select "Run As  $\rightarrow$  1 Launch on Hardware". Your software begins to execute on the ARM PS and you will see the printouts in the "SDK Terminal".