

# ECE408 Project Milestone 3 Report

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Team: tensor

UIUC on Campus Students

## **Deliverable 1: Correctness and timing with 3 different dataset sizes**

### **\* Running python m3.1.py 100**

Loading fashion-mnist data... done

Loading model... done

New Inference

Op Time: 0.000295

Op Time: 0.000998

Correctness: 0.76 Model: ece408

### **\* Running python m3.1.py 1000**

Loading fashion-mnist data... done

Loading model... done

New Inference

Op Time: 0.003069

Op Time: 0.010254

Correctness: 0.767 Model: ece408

### **\* Running python m3.1.py 10000**

Loading fashion-mnist data... done

Loading model... done

New Inference

Op Time: 0.031567

Op Time: 0.098181

Correctness: 0.7653 Model: ece408

## Deliverable 2: Demonstrate nvprof profiling the execution

### GPU activities:

1. **Time(%)**: 63.01%      **Time**:119.68ms      **Calls**:2  
**Avg**:59.841ms      **Min**:28.956ms      **Max**:90.727ms  
**Name**:mxnet::op::forward\_kernel(float\*, float const \*, float const \*, int, int, int, int, int, int)
2. **Time(%)**: 18.66%      **Time**:35.439ms      **Calls**:20  
**Avg**:1.7719ms      **Min**:1.1200us      **Max**:33.116ms  
**Name**:[CUDA memcpy HtoD]
3. **Time(%)**: 7.80%      **Time**:14.807ms      **Calls**:2  
**Avg**:7.4035ms      **Min**:2.9338ms      **Max**:11.873ms  
**Name**:void mshadow::cuda::MapPlanLargeKernel<mshadow::sv::saveto, int=8, int=1024, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=4, float>, float>, mshadow::expr::Plan<mshadow::expr::BinaryMapExp<mshadow::op::mul, mshadow::expr::ScalarExp<float>, mshadow::Tensor<mshadow::gpu, int=4, float>, float, int=1>, float>>(mshadow::gpu, unsigned int, mshadow::Shape<int=2>, int=4, int)
4. **Time(%)**: 4.12%      **Time**:7.8308ms      **Calls**:1  
**Avg**:7.8308ms      **Min**:7.8308ms      **Max**:7.8308ms  
**Name**:volta\_sgemm\_128x128\_tn
5. **Time(%)**: 3.80%      **Time**:7.2152ms      **Calls**:2  
**Avg**:3.6076ms      **Min**:24.831us      **Max**:7.1904ms  
**Name**:void op\_generic\_tensor\_kernel<int=2, float, float, float, int=256, cudnnGenericOp\_t=7, cudnnNanPropagation\_t=0, cudnnDimOrder\_t=0, int=1>(cudnnTensorStruct, float\*, cudnnTensorStruct, float const \*, cudnnTensorStruct, float const \*, float, float, float, float, dimArray, reducedDivisorArray)
6. **Time(%)**: 2.31%      **Time**:4.3825ms      **Calls**:1  
**Avg**:4.3825ms      **Min**:4.3825ms      **Max**:4.3825ms  
**Name**:void cudnn::detail::pooling\_fw\_4d\_kernel<float, float, cudnn::detail::maxpooling\_func<float, cudnnNanPropagation\_t=0>, int=0, bool=0>(cudnnTensorStruct, float const \*, cudnn::detail::pooling\_fw\_4d\_kernel<float, float, cudnn::detail::maxpooling\_func<float, cudnnNanPropagation\_t=0>, int=0, bool=0>, cudnnTensorStruct\*, cudnnPoolingStruct, float, cudnnPoolingStruct, int, cudnn::reduced\_divisor, float)
7. **Time(%)**: 0.21%      **Time**:391.13us      **Calls**:1  
**Avg**:391.13us      **Min**:391.13us      **Max**:391.13us  
**Name**:void mshadow::cuda::MapPlanLargeKernel<mshadow::sv::saveto, int=8, int=1024, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>, mshadow::expr::Plan<mshadow::expr::ScalarExp<float>, float>>(mshadow::gpu, unsigned int, mshadow::Shape<int=2>, int=2, int)
8. **Time(%)**: 0.04%      **Time**:68.000us      **Calls**:1  
**Avg**:68.000us      **Min**:68.000us      **Max**:68.000us

**Name:**void mshadow::cuda::SoftmaxKernel<int=8, float,  
mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>,  
mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>,  
float>>(mshadow::gpu, int=2, unsigned int)

9. **Time(%):** 0.03% **Time:**65.440us **Calls:**13

**Avg:**5.0330us **Min:**1.1840us **Max:**24.544us

**Name:**void mshadow::cuda::MapPlanKernel<mshadow::sv::saveto, int=8,  
mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>,  
mshadow::expr::Plan<mshadow::expr::ScalarExp<float>, float>>(mshadow::gpu,  
unsigned int, mshadow::Shape<int=2>, int=2)

10. **Time(%):** 0.01% **Time:**26.144us **Calls:**2

**Avg:**13.072us **Min:**3.8080us **Max:**22.336us

**Name:**void mshadow::cuda::MapPlanKernel<mshadow::sv::plusto, int=8,  
mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>,  
mshadow::expr::Plan<mshadow::expr::Broadcast1DExp<mshadow::Tensor<mshado  
w::gpu, int=1, float>, float, int=2, int=1>, float>>(mshadow::gpu, unsigned int,  
mshadow::Shape<int=2>, int=2)

11. **Time(%):** 0.01% **Time:**23.936us **Calls:**1

**Avg:**23.936us **Min:**23.936us **Max:**23.936us

**Name:**volta\_sgemm\_32x128\_tn

12. **Time(%):** 0.01% **Time:**10.656us **Calls:**9

**Avg:**1.1840us **Min:**992ns **Max:**1.7600us

**Name:**[CUDA memset]

13. **Time(%):** 0.00% **Time:**6.8480us **Calls:**1

**Avg:**6.8480us **Min:**6.8480us **Max:**6.8480us

**Name:**[CUDA memcpy DtoH]

14. **Time(%):** 0.00% **Time:**4.3520us **Calls:**1

**Acg:**4.3520us **Min:**4.3520us **Max:**4.3520us

**Name:**void mshadow::cuda::MapPlanKernel<mshadow::sv::saveto, int=8,  
mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>,  
mshadow::expr::Plan<mshadow::expr::ReduceWithAxisExp<mshadow::red::maximu  
m, mshadow::Tensor<mshadow::gpu, int=3, float>, float, int=3, bool=1, int=2>,  
float>>(mshadow::gpu, unsigned int, mshadow::Shape<int=2>, int=2)

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$ running nprof python m3.1.py
Loading fashion-mnist data... done
==264== NPROF is profiling process 264, command: python m3.1.py
Loading model... done
New Inference
Op Time: 0.028987
Op Time: 0.090747
Correctness: 0.7653 Model: ece408
==264== Profiling application: python m3.1.py
==264== Profiling result:
   Type Time(%) Time Calls Avg Min Max Name
GPU activities: 63.01% 119.68ms 2 59.841ms 28.956ms 90.727ms mxnet::op::forward_kernel(float*, float const *, float const *, int, int, int, int, int)
18.66% 35.439ms 20 1.7719ms 1.1200ms 33.116ms [CUDA memcpy HtoD]
7.80% 14.807ms 2 7.4035ms 2.933ms 11.873ms void mshadow::cuda::MapPlanLargeKernel<mshadow::sv::saveto, int=8, int=1024, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=
4, float>, float>, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>, mshadow::Tensor<mshadow::gpu, int=4, float>, float, int=1>, float>>(mshadow::gpu, unsigned
int, mshadow::Shape<int=2>, int=4, int)
4.12% 7.838ms 1 7.8308ms 7.8308ms 7.8308ms volta_sgemm_128x128_tn
3.80% 7.2152ms 2 3.6076ms 24.631us 7.1804ms void op_generic_tensor_kernel<int=2, float, float, float, float, float, dimArray, reducedDivisorArray>
int=1>(cudnnTensorStruct, float, cudnnTensorStruct, float const *, cudnnTensorStruct, float const *, float, float, float, float, dimArray, reducedDivisorArray)
2.31% 4.3825ms 1 4.3825ms 4.3825ms 4.3825ms void cudnn::detail::pooling_fw_4d_kernel<float, float, cudnn::detail::maxpooling_func<float, cudnnNanPropagation_t=0>, int=0, bool=
0>(cudnnTensorStruct, float const *, cudnn::detail::pooling_fw_4d_kernel<float, float, cudnn::detail::maxpooling_func<float, cudnnNanPropagation_t=0>, int=0, bool=0>, cudnnTensorStruct, f
loat, cudnnPoolingStruct, int, cudnn::reduced_divisor, float)
0.21% 391.13us 1 391.13us 391.13us 391.13us void mshadow::cuda::MapPlanLargeKernel<mshadow::sv::saveto, int=8, int=1024, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=
2, float>, float>, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>, mshadow::Tensor<mshadow::gpu, int=4, float>, float, int=1>, float>>(mshadow::gpu, unsigned int, mshadow::Shape<int=2>, int=2, int)
0.04% 68.000us 1 68.000us 68.000us 68.000us void mshadow::cuda::SoftmaxKernel<int=8, float, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>, mshadow::e
xpr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>>(mshadow::gpu, int=2, float, float)>(mshadow::gpu, int=2, unsigned int)
0.02% 65.440us 13 5.0330us 1.1840us 24.544us void mshadow::cuda::MapPlanKernel<mshadow::sv::saveto, int=8, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, floa
t>, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, float>, mshadow::Tensor<mshadow::gpu, int=4, float>, float, int=1>, float>>(mshadow::gpu, unsigned int, mshadow::Shape<int=2>, int=2)
0.01% 23.936us 1 23.936us 23.936us 23.936us volta_sgemm_32x128_tn
0.01% 18.656us 9 1.1840us 992ns 1.7600us [CUDA memset]
0.00% 6.8480us 1 6.8480us 6.8480us 6.8480us [CUDA memcpy DtoH]
0.00% 4.3520us 1 4.3520us 4.3520us 4.3520us void mshadow::cuda::MapPlanKernel<mshadow::sv::saveto, int=8, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=2, float>, floa
t>, mshadow::expr::Plan<mshadow::Tensor<mshadow::gpu, int=3, float>, float, int=3, bool=1, int=2>, float>>(mshadow::gpu, unsigned int, mshadow::Shape<int=2>, int=2)

```

## API calls:

API calls:	41.72%	3.14080s	22	142.76ms	14.598us	1.61174s	cudaStreamCreateWithFlags
	33.01%	2.48520s	22	112.96ms	70.384us	2.46796s	cudaMemGetInfo
20.78%	1.56442s	18	86.912ms	1.1660us	416.98ms	cudaFree	
	1.79%	134.50ms	6	22.417ms	2.6950us	90.732ms	cudaDeviceSynchronize
	0.95%	71.254ms	9	7.9171ms	36.681us	33.159ms	cudaMemcpy2DAsync
	0.73%	55.188ms	912	60.512us	428ns	12.503ms	cudaFuncSetAttribute
	0.31%	23.240ms	66	352.12us	5.8380us	8.6339ms	cudaMalloc
	0.26%	19.554ms	29	674.26us	2.3410us	10.779ms	cudaStreamSynchronize
	0.24%	18.009ms	12	1.5008ms	7.4650us	17.568ms	cudaMemcpy
	0.07%	5.0520ms	4	1.2630ms	431.36us	1.8761ms	cudaGetDeviceProperties
	0.04%	2.6540ms	375	7.0770us	391ns	336.72us	cuDeviceGetAttribute
	0.02%	1.5578ms	6	259.63us	1.6910us	1.5262ms	cudaEventCreate
	0.02%	1.3771ms	216	6.3750us	1.1960us	161.81us	cudaEventCreateWithFlags
	0.01%	1.0304ms	8	128.81us	14.551us	729.24us	cudaStreamCreateWithPriority
	0.01%	760.11us	4	190.03us	90.125us	373.32us	cuDeviceTotalMem
	0.01%	744.21us	2	372.10us	50.931us	693.28us	cudaHostAlloc
	0.01%	698.46us	9	77.606us	10.051us	499.55us	cudaMemsetAsync
	0.01%	647.28us	4	161.82us	95.275us	246.37us	cudaStreamCreate
	0.01%	544.66us	27	20.172us	8.4970us	68.012us	cudaLaunchKernel
	0.01%	385.00us	202	1.9050us	792ns	4.6310us	cudaDeviceGetAttribute
	0.00%	293.94us	4	73.485us	47.775us	104.51us	cuDeviceGetName
	0.00%	173.90us	29	5.9960us	1.2320us	20.578us	cudaSetDevice
	0.00%	120.86us	557	216ns	72ns	804ns	cudaGetLastError
	0.00%	52.222us	18	2.9010us	803ns	4.9160us	cudaGetDevice
	0.00%	33.168us	2	16.584us	5.6730us	27.495us	cudaHostGetDevicePointer
	0.00%	15.995us	3	5.3310us	2.8150us	7.9730us	cudaEventRecord
	0.00%	7.2100us	6	1.2010us	573ns	2.1850us	cuDeviceGetCount
	0.00%	7.1830us	2	3.5910us	1.8980us	5.2850us	cudaDeviceGetStreamPriorityRange
	0.00%	5.6320us	5	1.1260us	493ns	1.8490us	cuDeviceGet
	0.00%	5.3000us	3	1.7660us	1.0470us	3.1540us	cuInit
	0.00%	5.2690us	20	263ns	91ns	663ns	cudaPeekAtLastError
	0.00%	4.7080us	1	4.7080us	4.7080us	4.7080us	cuDeviceGetPCIBusId
	0.00%	3.9050us	1	3.9050us	3.9050us	3.9050us	cudaEventQuery
	0.00%	3.6690us	1	3.6690us	3.6690us	3.6690us	cudaOccupancyMaxActiveBlocksPerMultiprocessorWithFlags
	0.00%	3.2150us	4	803ns	442ns	1.5420us	cuDeviceGetUuid
	0.00%	2.7180us	4	679ns	257ns	1.5760us	cudaGetDeviceCount
	0.00%	2.0550us	3	685ns	382ns	1.2700us	cuDriverGetVersion