

## Python + cuda

Let us repeat the previous exercises in python.

```
In [25]: !nvidia-smi
      Mon Nov 7 10:45:37 2022
       +----+
       | NVIDIA-SMI 460.32.03 | Driver Version: 460.32.03 | CUDA Version: 11.2
       | GPU Name Persistence-M| Bus-Id Disp.A | Volatile Uncorr. ECC |
       | Fan Temp Perf Pwr:Usage/Cap| Memory-Usage | GPU-Util Compute M. | | MIG M. |
       | Processes:
       | GPU GI CI
                                                                  GPU Memory |
                          PID Type Process name
         ID ID
                                                                  Usage
       In [26]: from numba import cuda
        from numba import jit
        import numpy as np
        from numba import vectorize, int32, int64, float32, float64
        import matplotlib.pyplot as plt
        %matplotlib inline
        x = np.arange(N, dtype=np.float64) # [0...N] on the host
        print(f"Number of elements: {N} \nMemory size of array element in [MB]: {x.nbytes/1E6}")
      Number of elements: 67108864
      Memory size of array element in [MB]: 536.870912
        Reduction
In [27]: # reference: https://numba.pydata.org/numba-doc/dev/cuda/reduction.html
        @cuda.reduce
        def sum reduce(a, b):
           return a + b
        expect = x.sum()
                         # numpy sum reduction
        got = sum_reduce(x) # cuda sum reduction
        assert expect == got
       /usr/local/lib/python3.7/dist-packages/numba/cuda/dispatcher.py:488: NumbaPerformanceWarning: Grid s
       ize 64 will likely result in GPU under-utilization due to low occupancy.
        warn(NumbaPerformanceWarning(msg))
       /usr/local/lib/python3.7/dist-packages/numba/cuda/cudadrv/devicearray.py:885: NumbaPerformanceWarnin
       g: Host array used in CUDA kernel will incur copy overhead to/from device.
        warn(NumbaPerformanceWarning(msg))
       usr/local/lib/python3.7/dist-packages/numba/cuda/dispatcher.py:488: NumbaPerformanceWarning: Grid s/
      ize 1 will likely result in GPU under-utilization due to low occupancy.
        warn(NumbaPerformanceWarning(msg))
In [28]: #Lambda functions can also be used here:
        sum_reduce_lam = cuda.reduce(lambda a, b: a + b)
        expect = x.sum()
                           # numpy sum reduction
        got = sum_reduce_lam(d_x) # cuda sum reduction
        assert expect == got
       /usr/local/lib/python3.7/dist-packages/numba/cuda/dispatcher.py:488: NumbaPerformanceWarning: Grid s
       ize 64 will likely result in GPU under-utilization due to low occupancy.
        warn(NumbaPerformanceWarning(msg))
       /usr/local/lib/python3.7/dist-packages/numba/cuda/dispatcher.py:488: NumbaPerformanceWarning: Grid s
      ize 1 will likely result in GPU under-utilization due to low occupancy.
        warn(NumbaPerformanceWarning(msg))
```

```
In [29]: %timeit x.sum() # NumPy on CPU
```

44.5 ms  $\pm$  346  $\mu$ s per loop (mean  $\pm$  std. dev. of 7 runs, 10 loops each)

```
In [30]: %timeit sum_reduce_lam(x) # Numba on GPU - data from host
```

/usr/local/lib/python3.7/dist-packages/numba/cuda/cudadrv/devicearray.py:885: NumbaPerformanceWarnin
g: Host array used in CUDA kernel will incur copy overhead to/from device.
 warn(NumbaPerformanceWarning(msg))

251 ms  $\pm$  31.8 ms per loop (mean  $\pm$  std. dev. of 7 runs, 1 loop each)

```
In [31]: %timeit sum_reduce_lam(d_x) # Numba on GPU - prefetched data
```

## 2.57 ms $\pm$ 17.1 $\mu$ s per loop (mean $\pm$ std. dev. of 7 runs, 100 loops each)

## **SAXPY**

**SAXPY** stands for "Single-Precision A·X Plus Y". It is a function in the standard Basic Linear Algebra Subroutines (BLAS) library.

```
In [32]: a = 10
y = np.copy(x)

d_a = cuda.to_device(a) # Copy of a on the device
d_x = cuda.to_device(x) # Copy of x on the device
d_y = cuda.to_device(y) # Copy of y on the device
d_out = cuda.device_array_like(d_x) # Like np.array_like, but for device arrays
In [33]: @vectorize(['float64(int64, float64, float64)'], target='cuda') # Type signature and target are req
def add_ufunc(a, x, y):
    return a*x + y
```

```
In [34]: expect = a*x + y  # numpy sum reduction
got = add_ufunc(d_a, d_x, d_y)  # cuda sum reduction
# assert expect == got
np.allclose(expect, got)
```

Out[34]: True