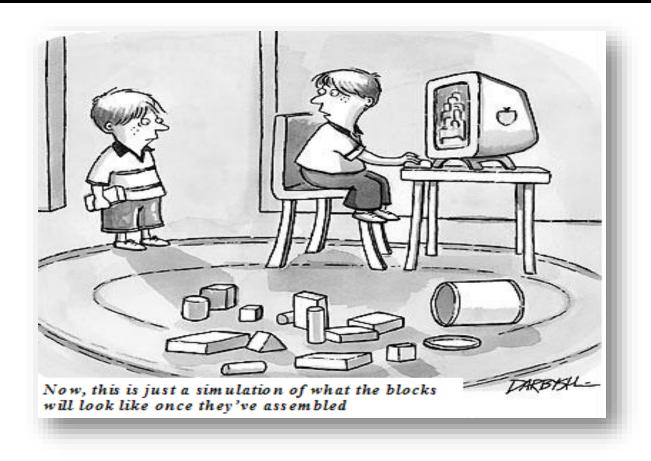
#### ECE569 Module 27



• Matrix Multiplication – Thread Divergence

1

## Performance Impact of Control Divergence

```
if (Row < Width && t * TILE WIDTH+tx < Width)
 ds M[ty][tx]=M[Row*Width+p*TILE WIDTH+tx];
else
  ds M[ty][tx] = 0.0;
   (p*TILE WIDTH+ty < Width && Col < Width)
 ds N[ty][tx]=N[(p*TILE WIDTH +ty)*Width+Col];
else
 ds N[ty][tx] = 0.0;
```

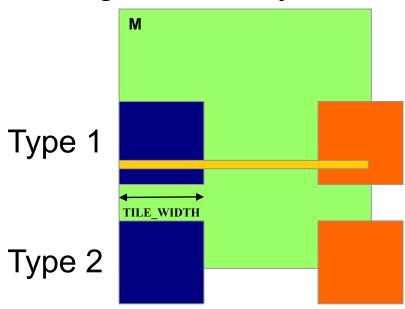
# Two types of blocks in loading M Tiles

# Type 1

 Blocks whose tiles are all within valid range until the last phase.

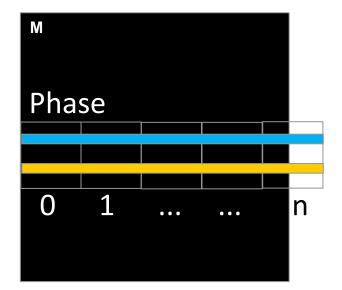
## Type 2

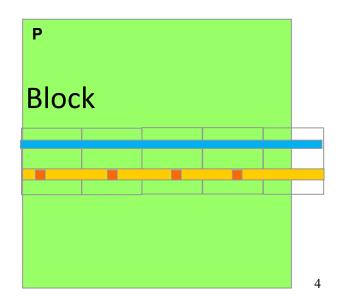
 Blocks whose tiles are partially outside the valid range all the way



# **Analysis of Control Divergence Impact**

 Assume 16x16 tiles and thread blocks, and matrices of 100x100. How many thread blocks are allocated? How many phases will each thread go through?

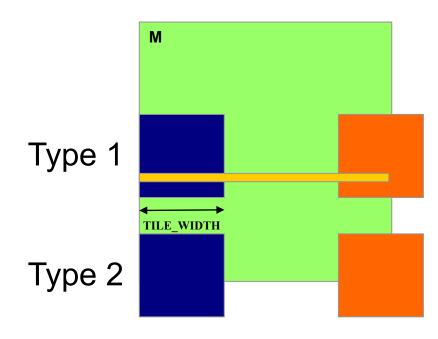




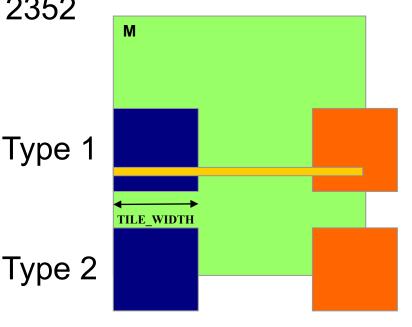
# **Analysis of Control Divergence Impact**

- Assume 16x16 tiles and thread blocks
- Assume square matrices of 100x100
- How many thread blocks are allocated?
  - There are 49 thread blocks (7 in each dimension)
- How many phases will each thread go through?
  - Each thread will go through 7 phases (ceiling of 100/16)

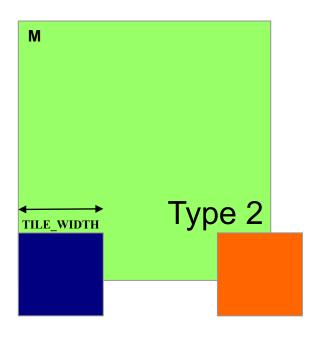
- How many Type 1 Blocks?
- How many warps in Type 1?
- How many warp phases in Type 1?
- How many warps observe control divergence in Type 1?



- How many Type 1 Blocks?
  - 6 rows, 7 columns => 42 blocks
- How many warps in Type 1?
  - Each block 16x16, 8 warps => 336 warps
- How many warp phases in Type 1?
  - 7 phases per warp => 7\*336 = 2352
- How many warps observe control divergence in Type 1?
  - Only last phase observes divergence
    - 1\*336 = 336 warps have control divergence



- How many Type 2 Blocks?
- How many warps in Type 2?
- How many warp phases in Type 2?
- How many warps observe control divergence in Type 2?



- How many Type 2 Blocks and Warps?
  - 7 blocks , each 8 warps => 56 warps
- How many warp phases in Type 2?
  - -7 phase each => 7\*56 = 392
- How many warps observe control divergence in Type 2?
  - 100x100 => last 4 rows of the matrix are processed by blocks in row 7.
    - Each row 16 elements => 64 elements
    - 2 warps/block process valid data unit last phase.
      - Each phase requires boundary check 2\*7 = 14 warps
    - 6 remaining warps outside the valid range (not a concern)

## **Overall Impact of Control Divergence**

#### Type 1 Blocks:

336 out of 2,352 warp-phases have control divergence

#### Type 2 Blocks:

- 14 out of 392 warp-phases have control divergence
- The performance impact is expected to be less than 12%

#### **Conclusions**

- The calculation of impact of control divergence in loading N tiles is somewhat different and is left as an exercise
- The estimated performance impact is data dependent.
  - For larger matrices, the impact will be significantly smaller
- In general, the impact of control divergence for boundary condition checking for large input data sets should be insignificant
  - One should not hesitate to use boundary checks to ensure full functionality
- The fact that a kernel is full of control flow constructs does not mean that there will be heavy occurrence of control divergence
  - We will cover some algorithm patterns that naturally incur control divergence (such as parallel reduction)

#### **Next**

Atomic Operations