



# Lecture 24: Other Parallel Applications

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UNIVERSITY OF  
MARYLAND

# Announcements

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- Quiz 3 will be posted on Dec 2 midnight AoE and due on Dec 3 midnight AoE
- Check your presentation slot on the lectures page
  - All group members must be present
  - Be prepared to have your camera on when you are presenting
- Final project and report due on Dec 14

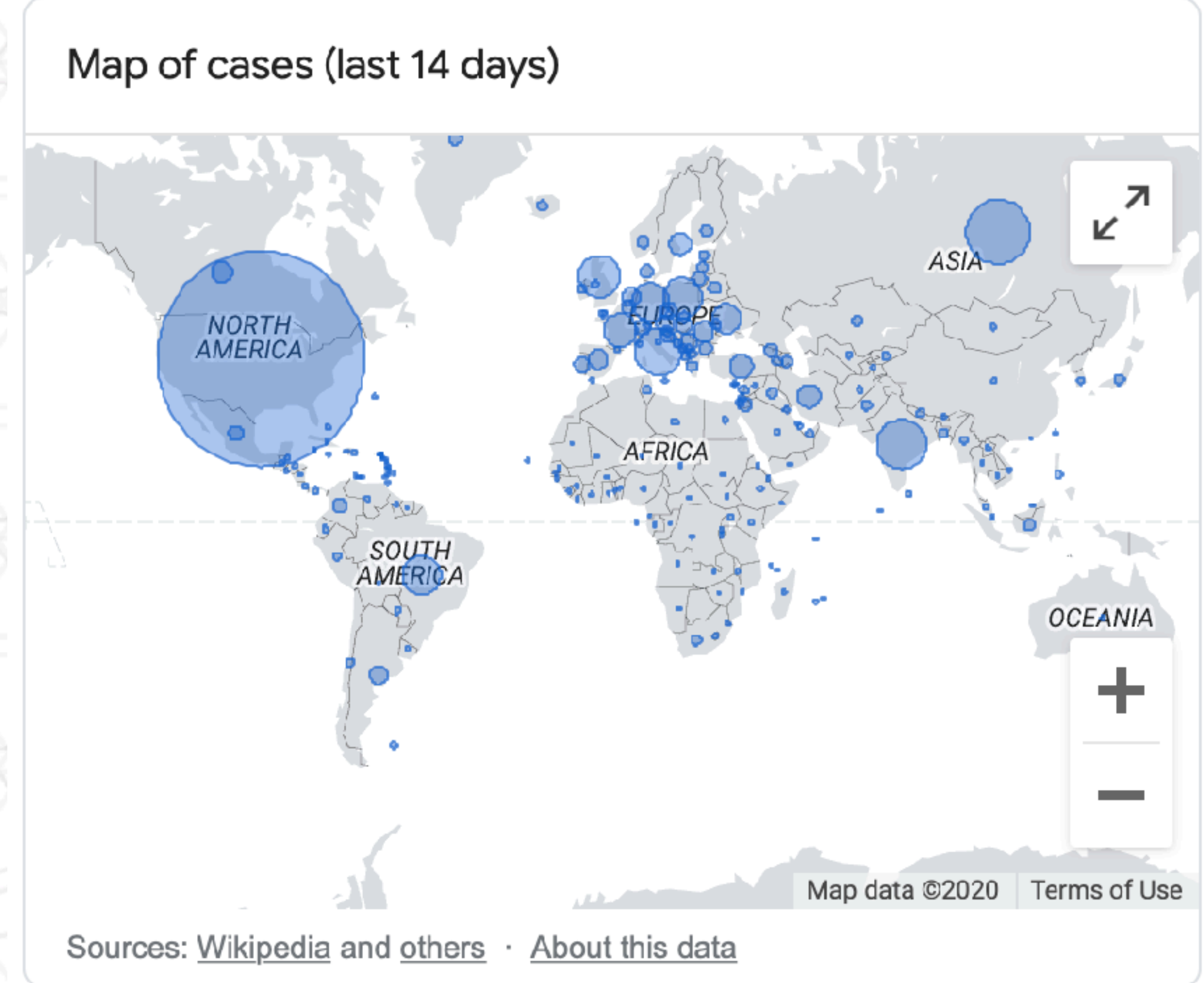
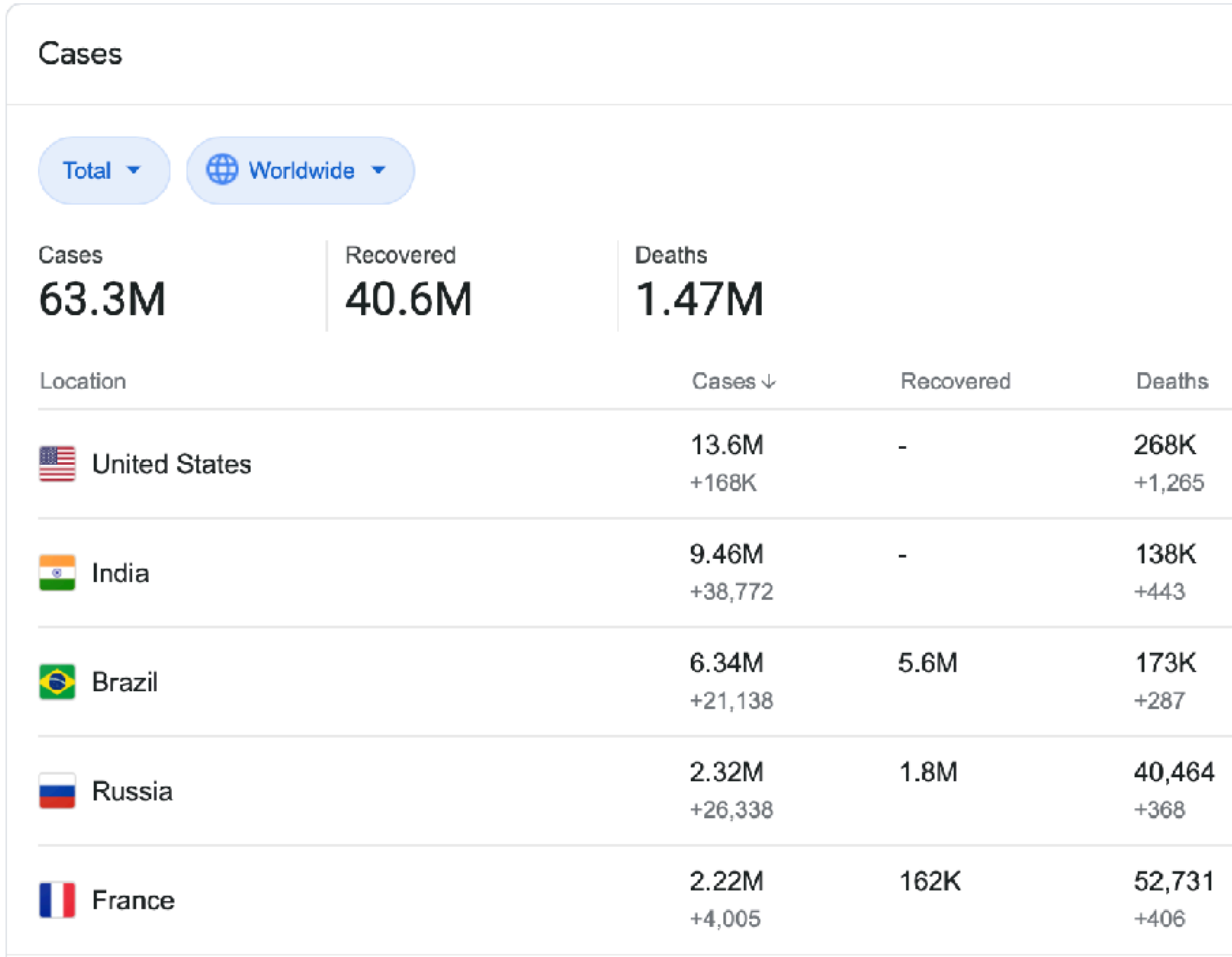
# Presentation and Final report format

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- Upload pdf slides on ELMS after your presentation
  - Introduce your project so that it is understandable by a CS audience
  - Present what you are implementing or evaluating (serial / parallel algorithms)
  - Progress so far
  - Results (performance / performance analysis)
- Final report
  - Upload code and pdf report to ELMS
  - E-mail Abhinav and Shoken how you are distributing your virtual dollars (100) among your teammates with justification



# 1.47 million people have died of COVID-19 this year alone



# Societal challenge

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- Controlling the spread of infectious diseases is important
- Computational and mathematical modeling of epidemics important to assist governments in responding to outbreaks
- Made challenging due to:
  - increased and denser urbanization
  - increased local and global travel
  - increasingly immuno-comprised population

# Approach: individual-based simulation

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- Agent-based modeling to simulate epidemic diffusion
- Models agents (people) and interactions between them
- People interact when they visit the same location at the same time
- These “interactions” between pairs of people are represented as “visits” to locations
- Use a bi-partite graph of people and locations or a people-people interactivity graph



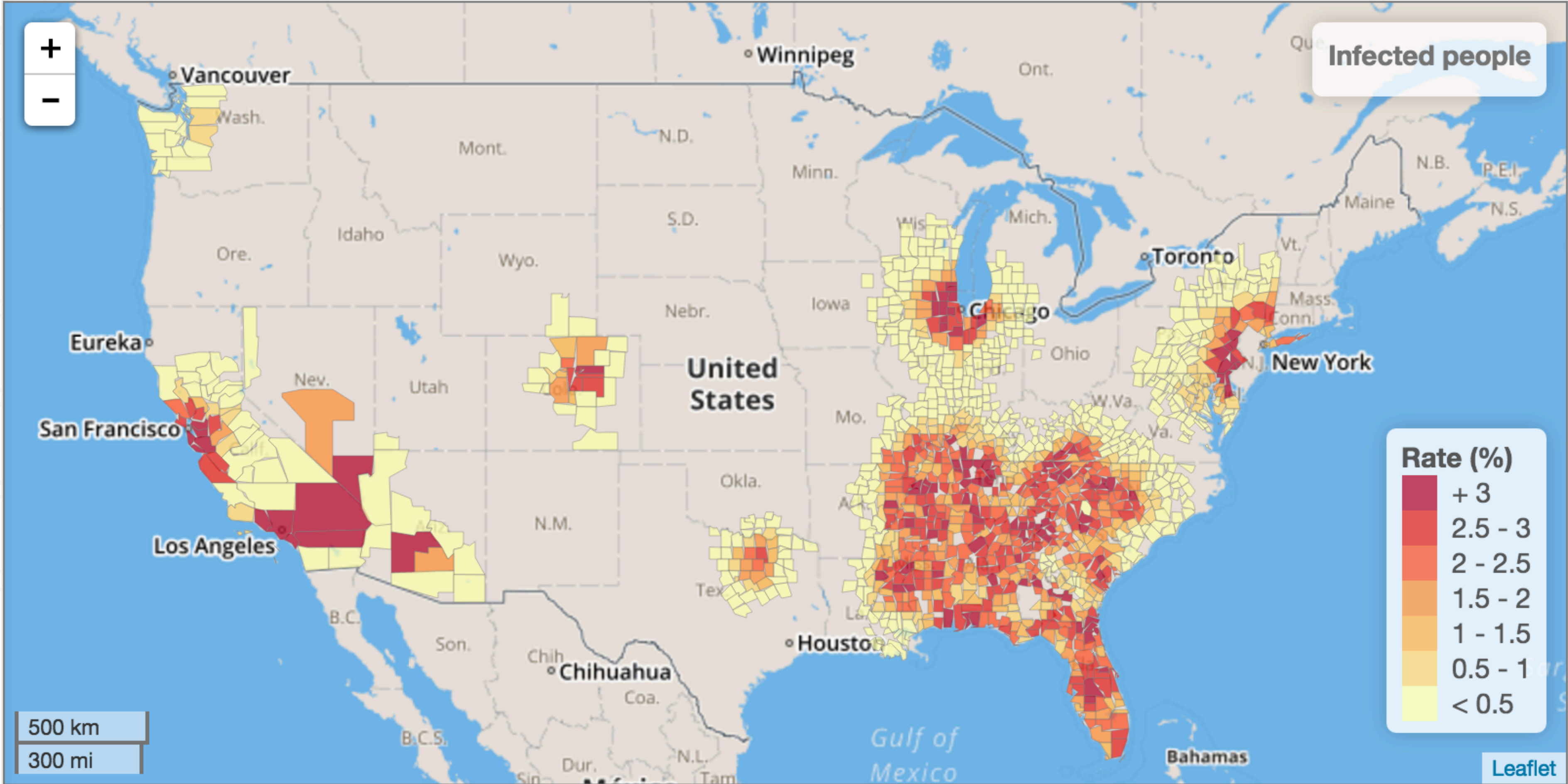
# Serial algorithm

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- At each timestep (typically a day):
  - Determine which people visit which locations
  - “Send” people to those locations
  - At each location “interactions” happen and transmission happens
  - Update people’s states at the end of the day and continue
- Interventions (vaccinations, school closures) can be added on certain days to change people’s susceptibility, movements etc.

# Parallel simulation

Day: 56 Cases: 3176704





# Parallel simulation is challenging

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- Size and scale of the social contact network (6 billion agents for a global simulation)
  - Unstructured networks and complicated dependencies lead to high communication cost
- Individuals and their behaviors are not identical
- Co-evolving epidemics, public policies and agent behaviors make it impossible to apply standard model reduction techniques

# Deep learning

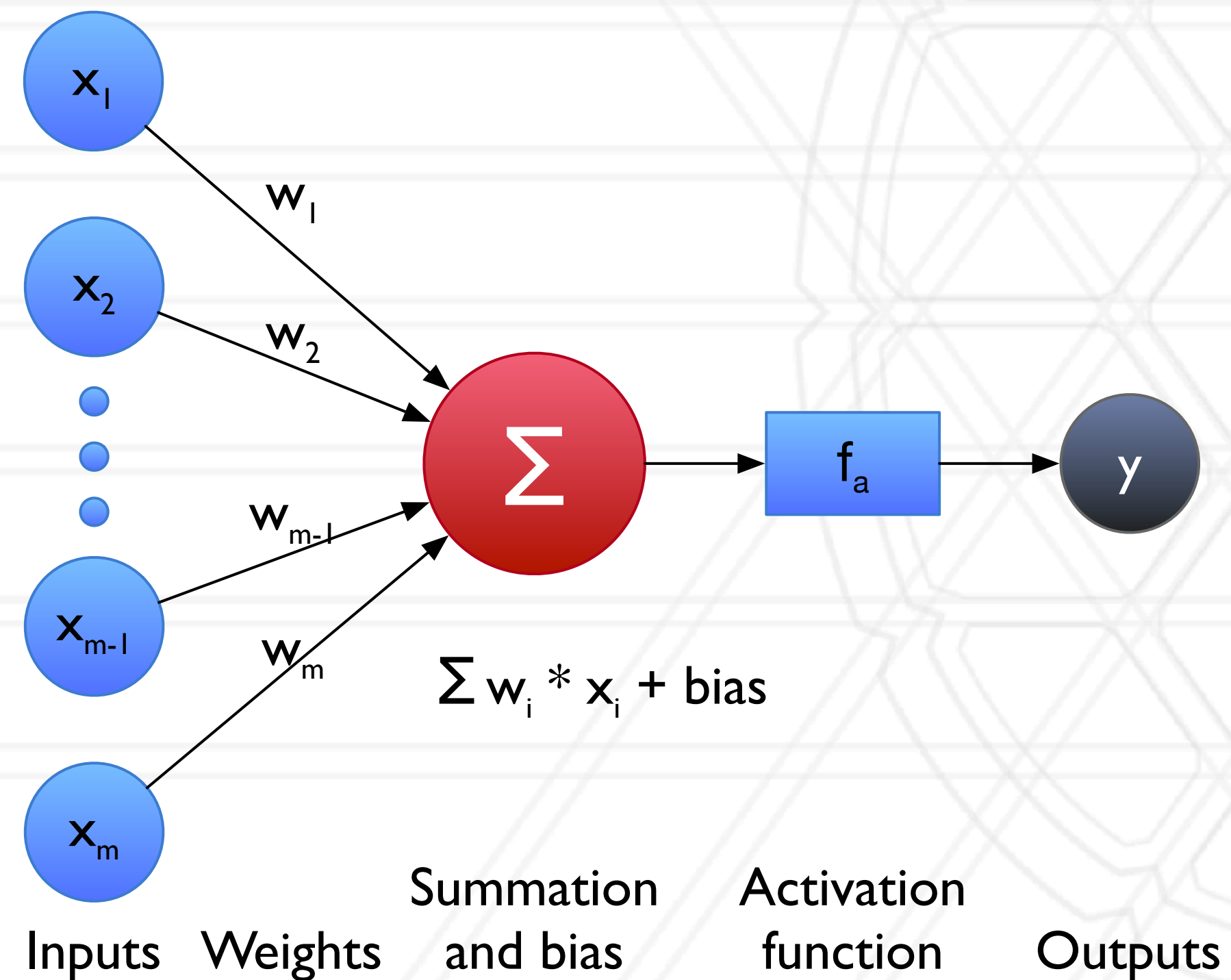
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- Uses artificial neural networks (ANNs) to approximate a function



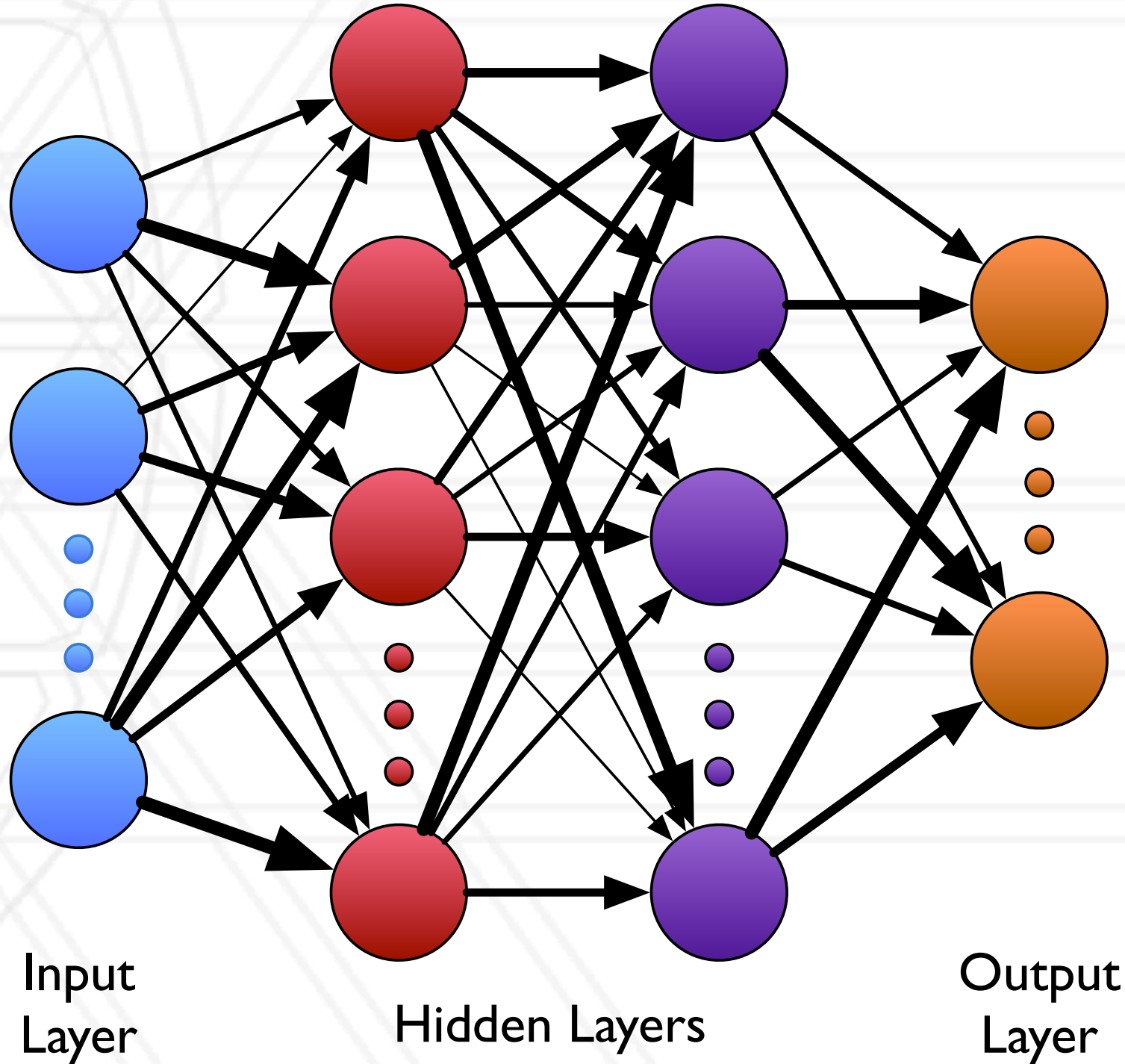
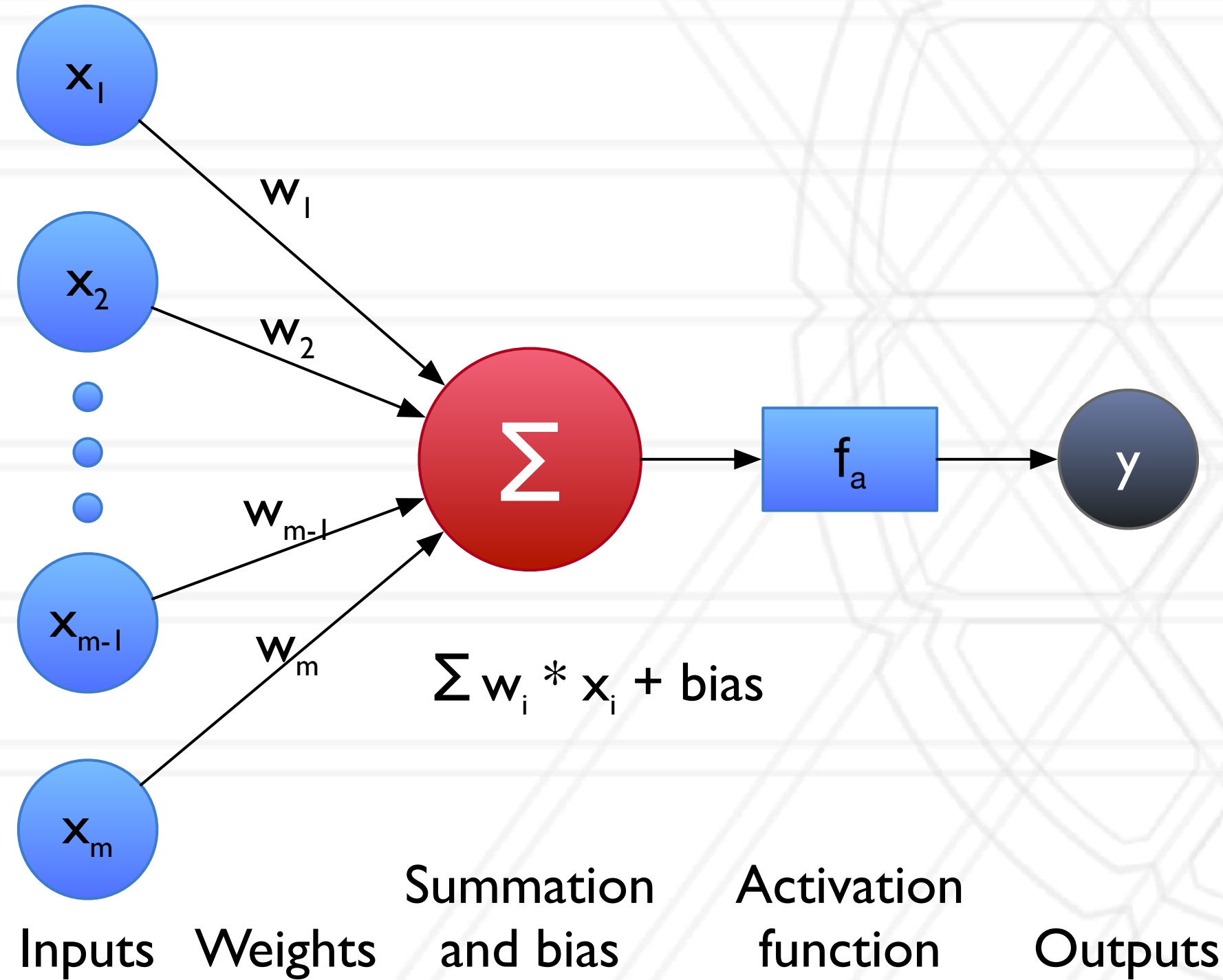
# Deep learning

- Uses artificial neural networks (ANNs) to approximate a function



# Deep learning

- Uses artificial neural networks (ANNs) to approximate a function





# Additional terms

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- Loss: A scalar whose minimization leads to more accurate function approximation
- Gradient: Derivative of the loss w.r.t. the gradient
- Forward pass: calculation of output activations
- Backward pass or backpropagation: calculation of and backward flow of weight gradients

# Serial algorithm (SGD)

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- Stochastic Gradient Descent
- Organize dataset into mini-batches and process one mini-batch at a time
- Going over all the mini-batches is referred to as an epoch
- At each epoch:
  - For all mini-batches
    - Calculate activations and do a forward pass through all the layers
    - Calculate the loss on the last layer
    - Compute gradients and do a backward pass through all the layers



# Parallelism approaches

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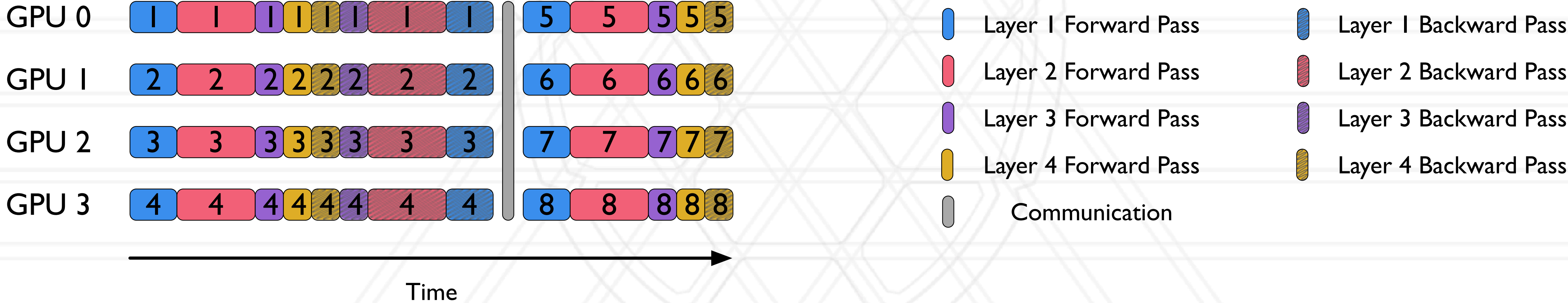
# Parallelism approaches

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- Data Parallelism

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# Parallelism approaches

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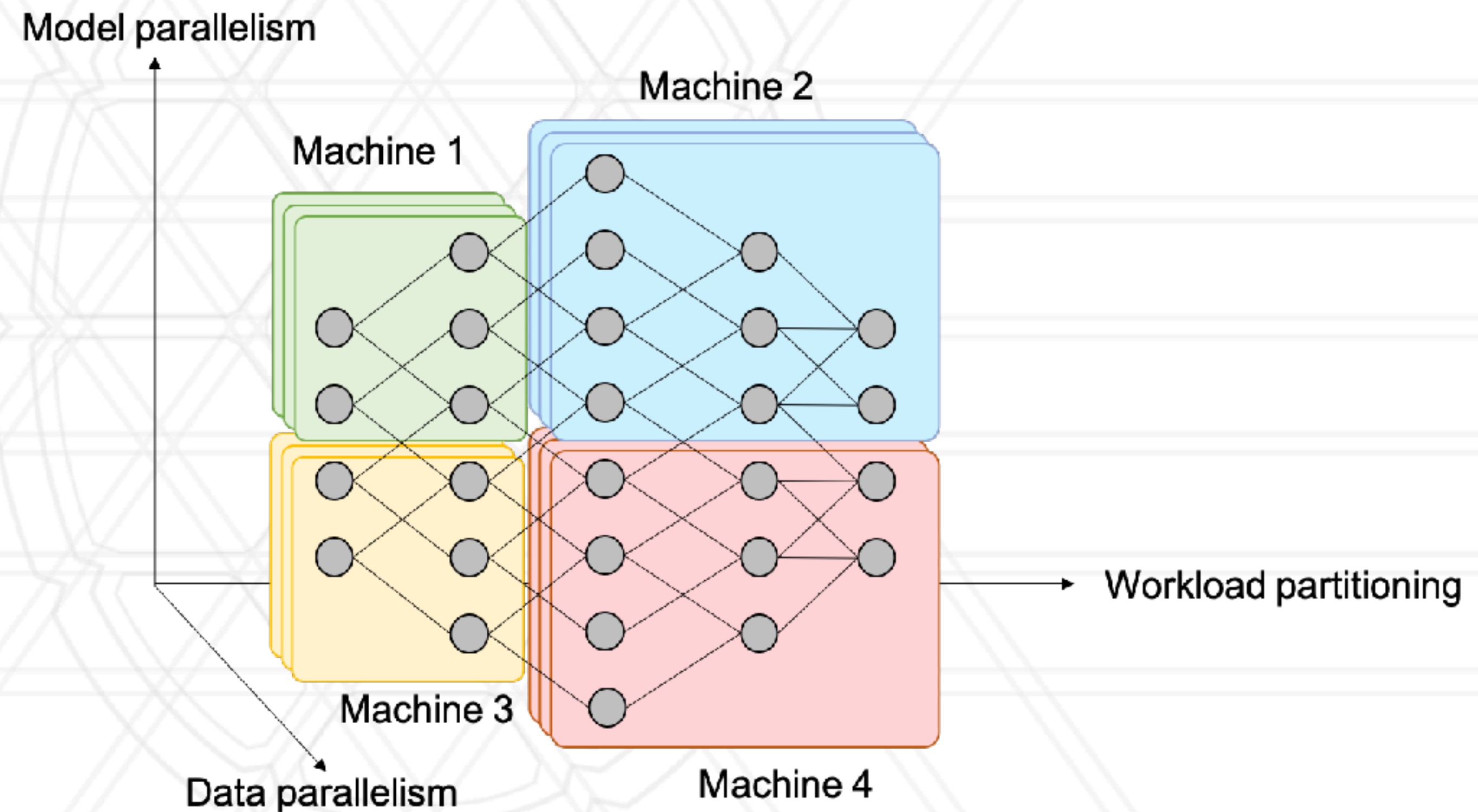
# Parallelism approaches

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- Model Parallelism

# Parallelism approaches

- Model Parallelism





# Parallelism approaches

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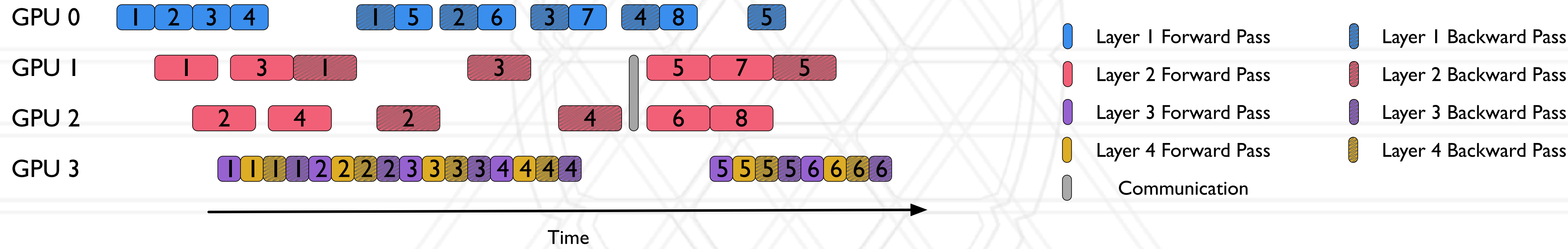
# Parallelism approaches

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- Pipeline Parallelism

# Parallelism approaches

- Pipeline Parallelism





# Course evaluation

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