

# Sequence Modeling: Recurrent and Recursive Nets

Lecture slides for Chapter 10 of *Deep Learning*

[www.deeplearningbook.org](http://www.deeplearningbook.org)

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2016-09-27

# Classical Dynamical Systems

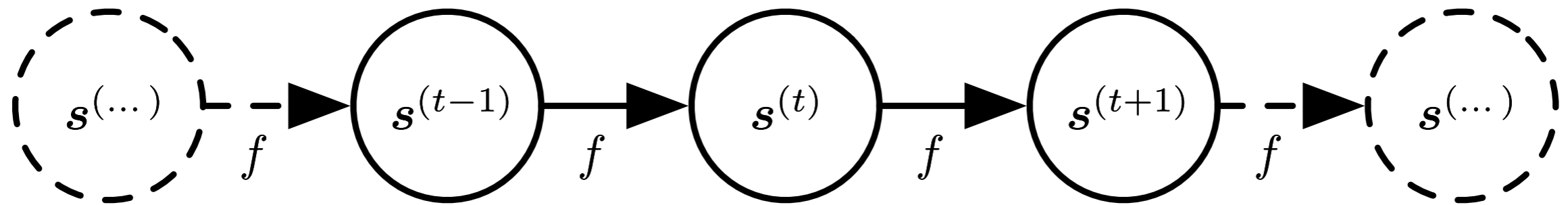


Figure 10.1

# Unfolding Computation Graphs

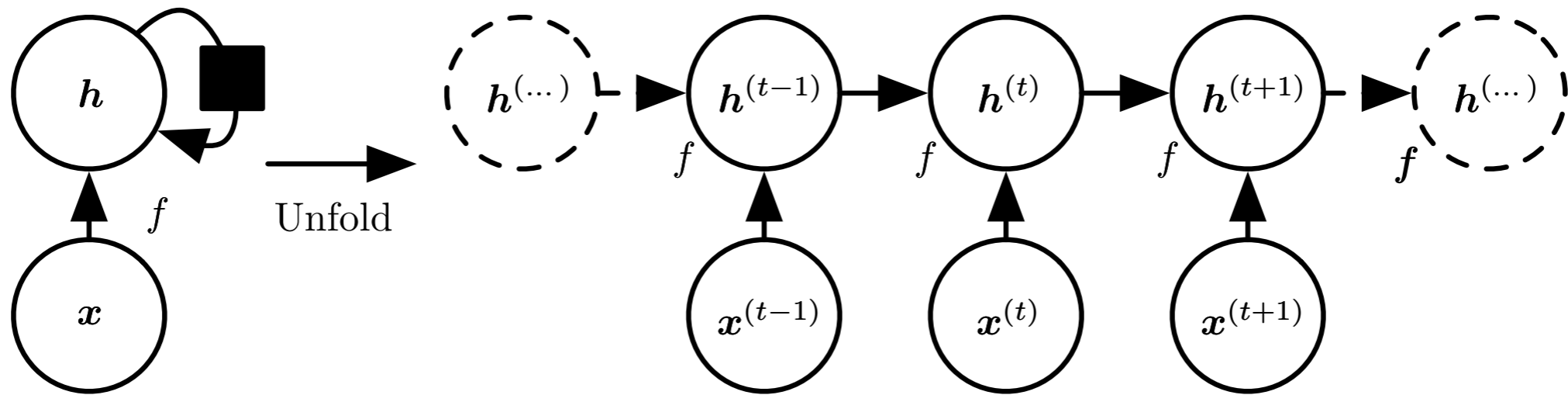


Figure 10.2

# Recurrent Hidden Units

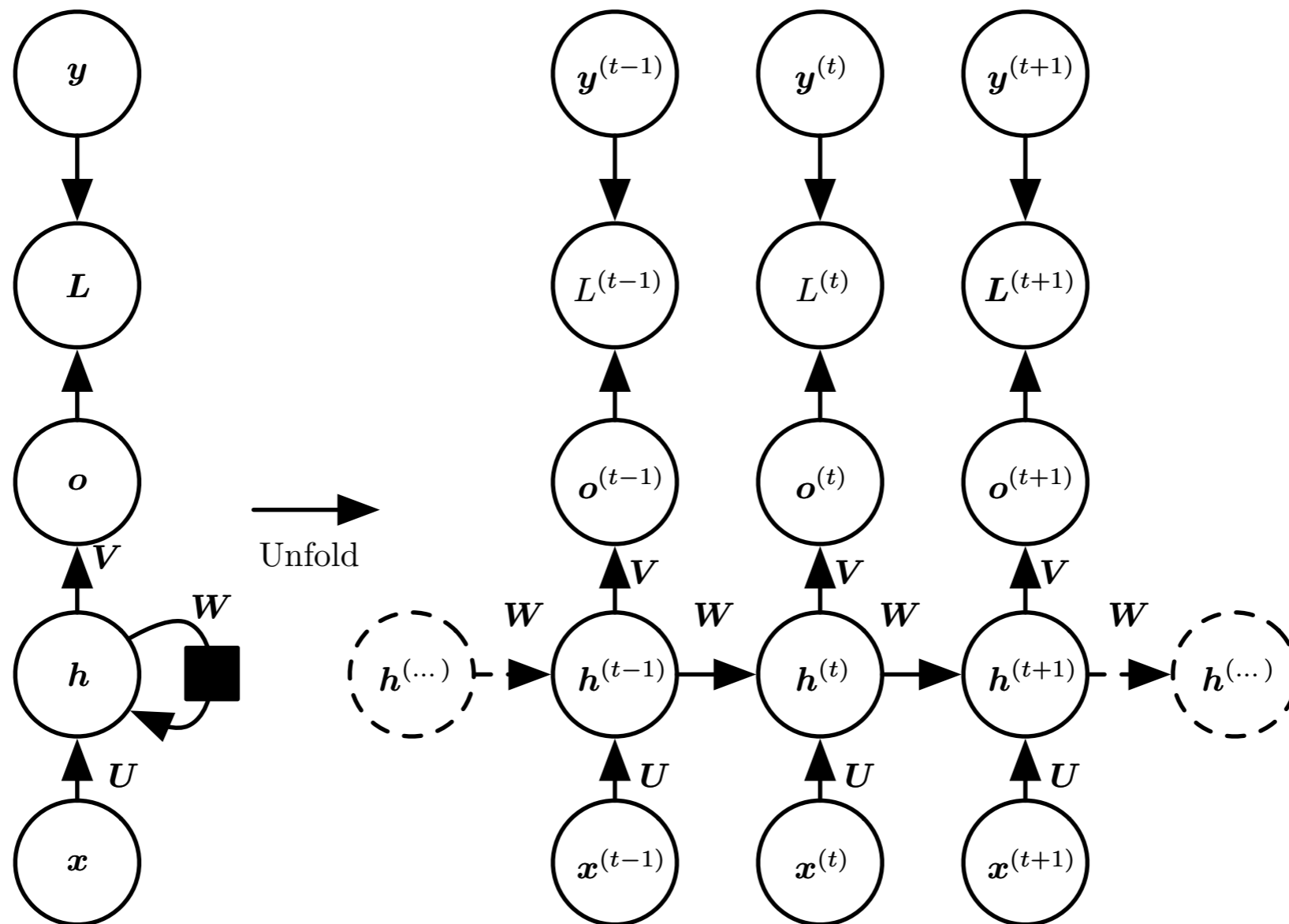


Figure 10.3



# Recurrence through only the Output

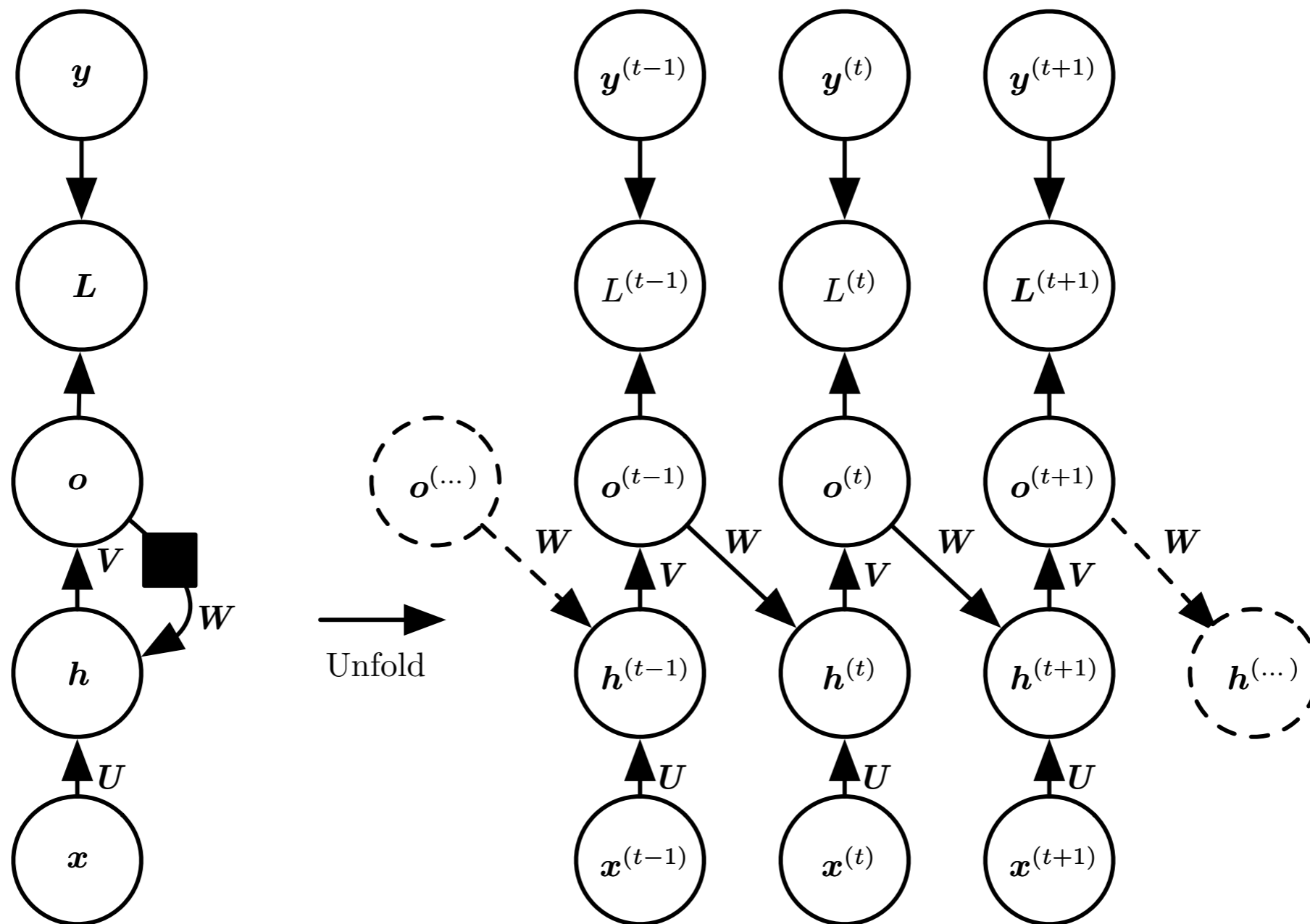


Figure 10.4

# Sequence Input, Single Output

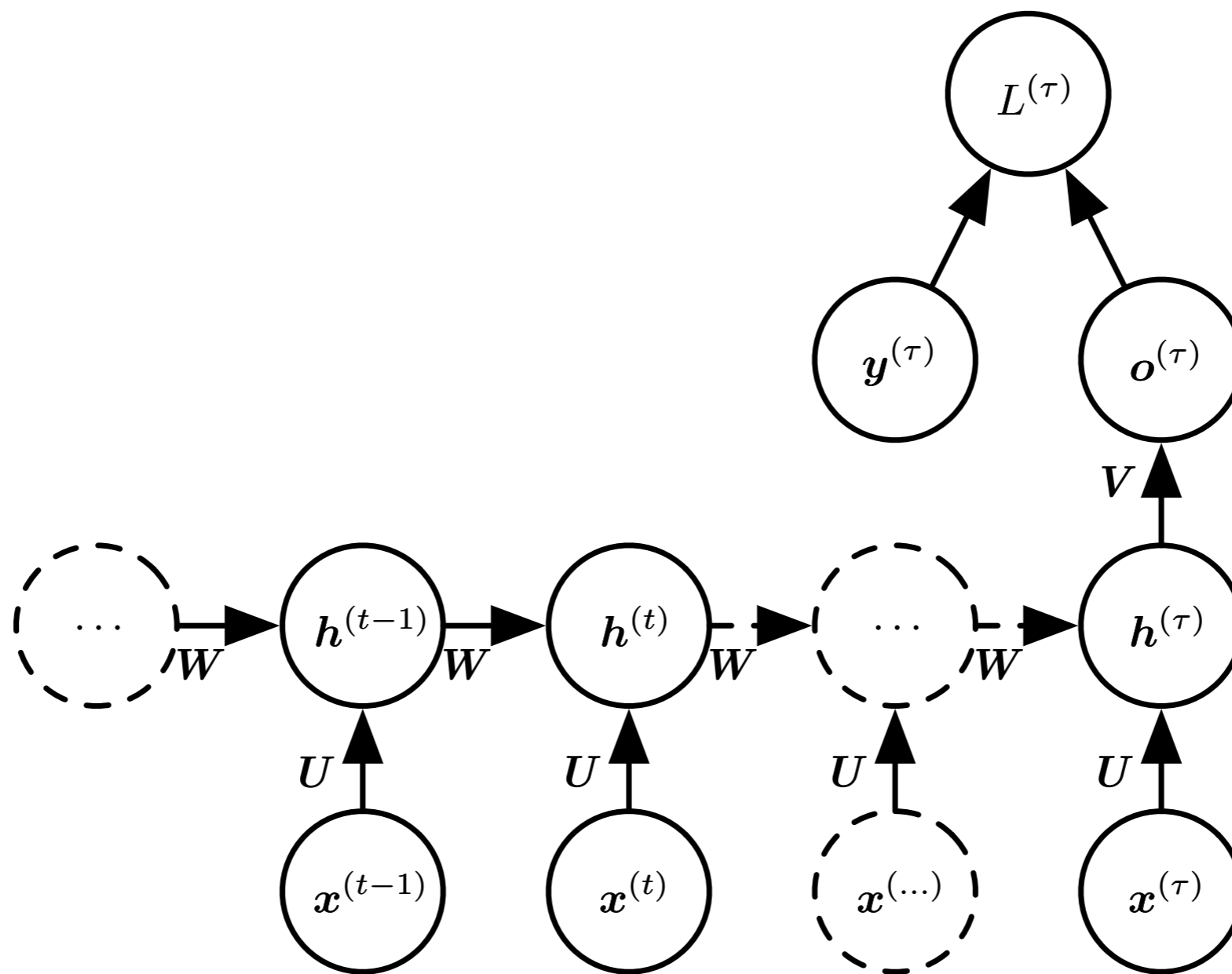


Figure 10.5

# Teacher Forcing

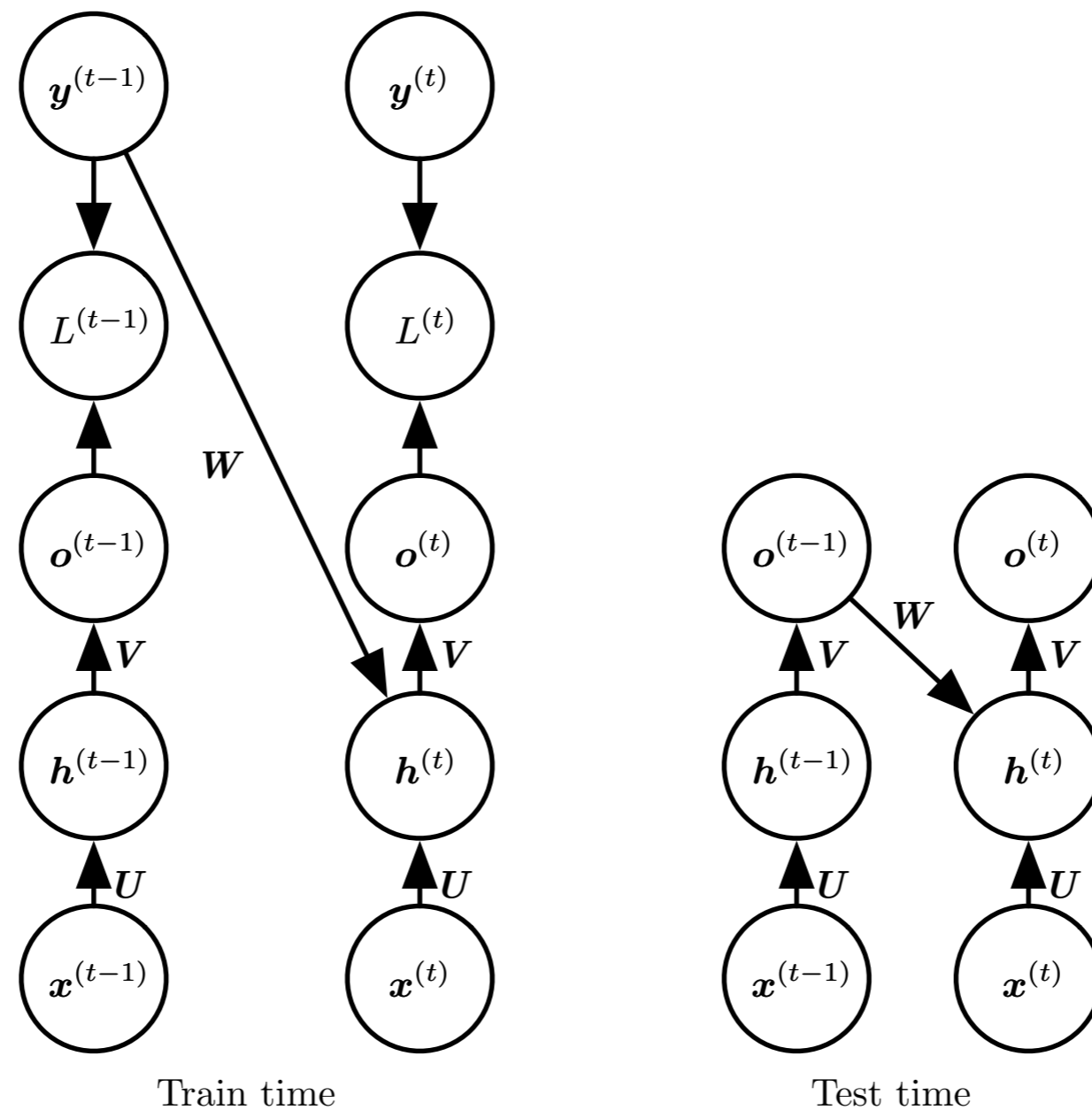


Figure 10.6

# Fully Connected Graphical Model

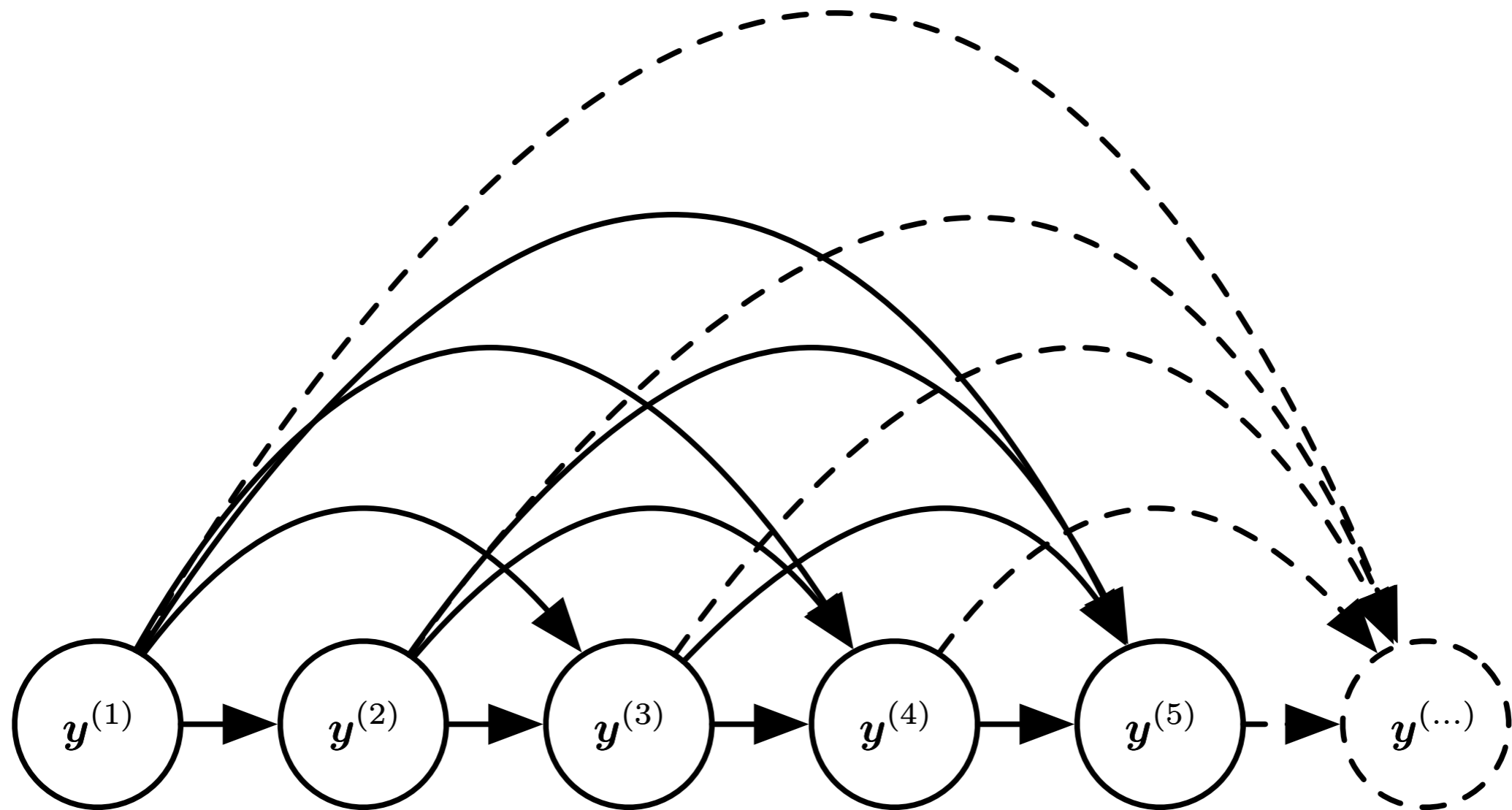


Figure 10.7

# RNN Graphical Model

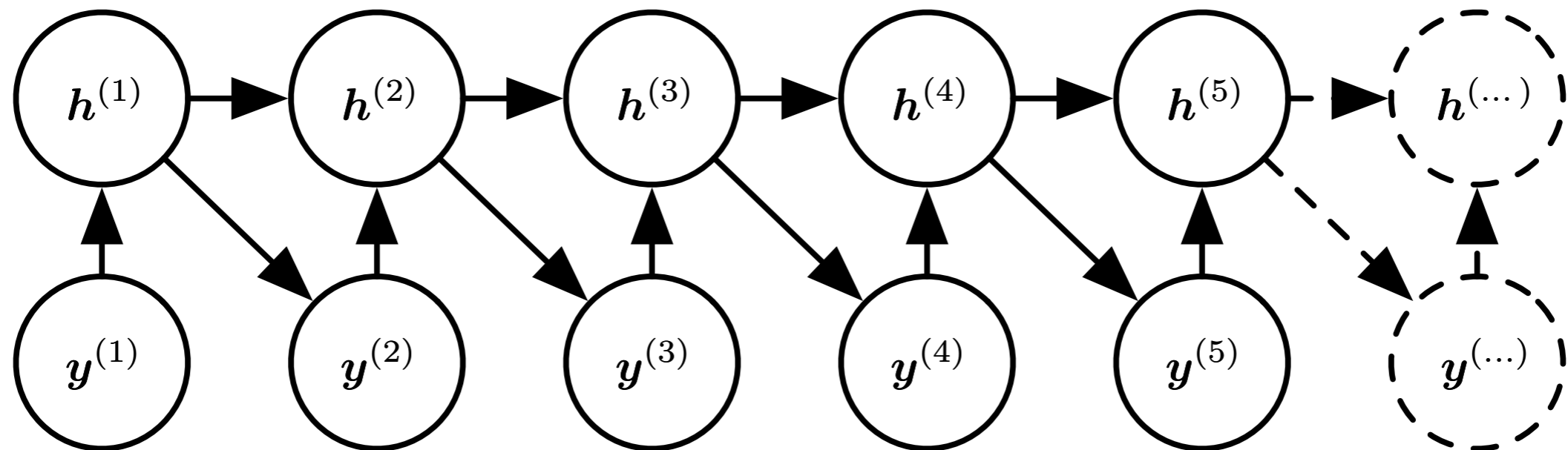


Figure 10.8

(The conditional distributions for the hidden units are deterministic)

# Vector to Sequence

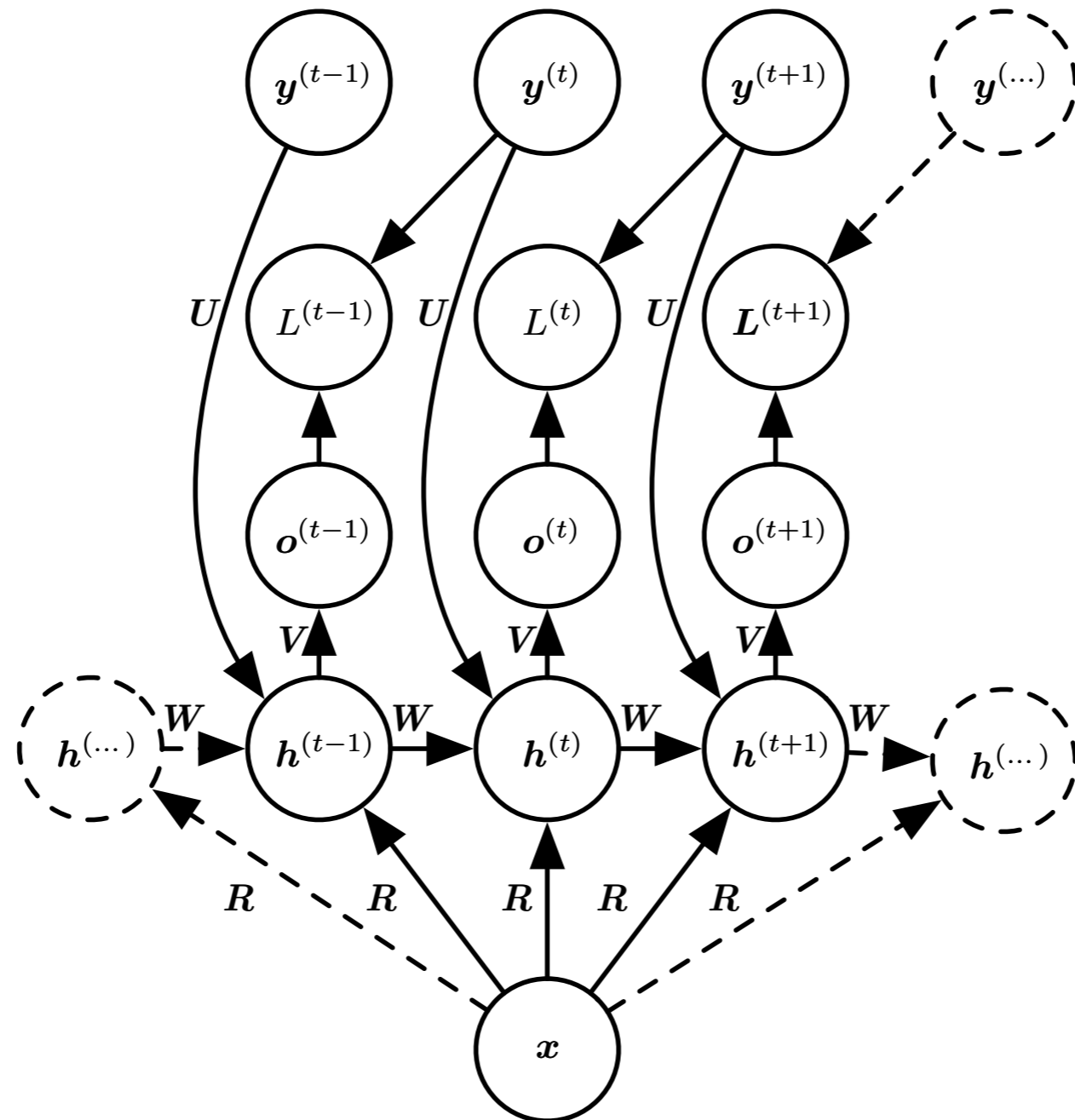


Figure 10.9

# Hidden and Output Recurrence

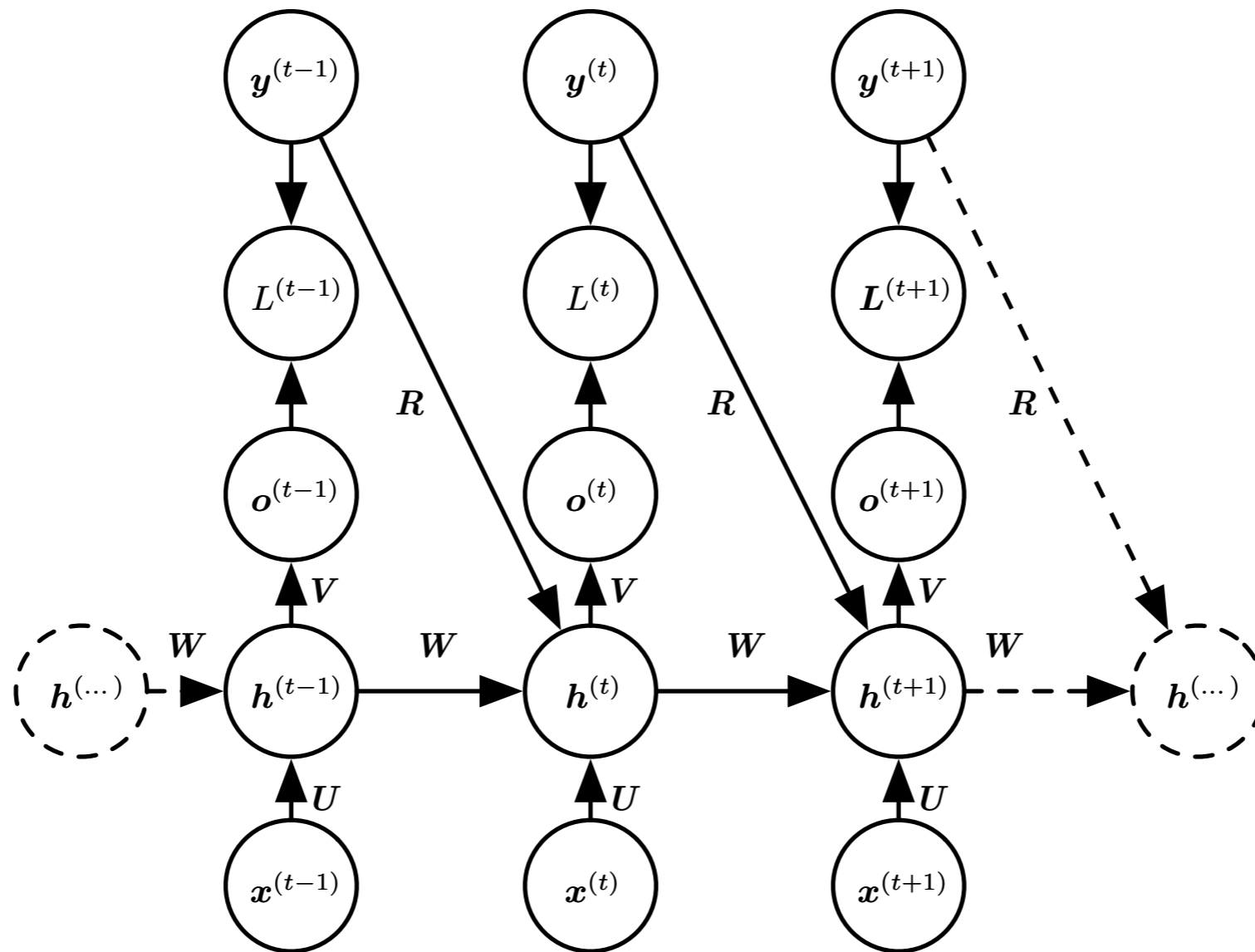


Figure 10.10

The output values are not forced to be conditionally independent in this model.

# Bidirectional RNN

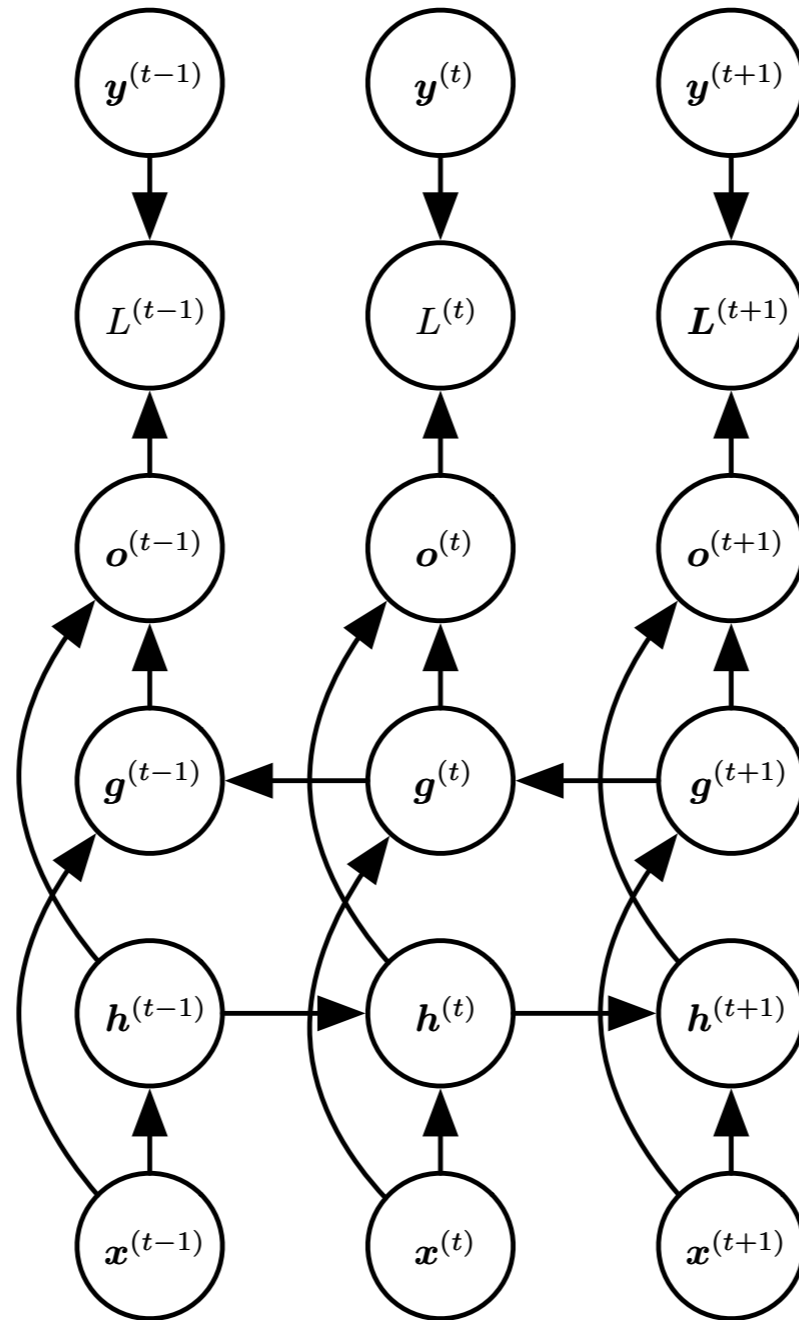


Figure 10.11



# Sequence to Sequence Architecture

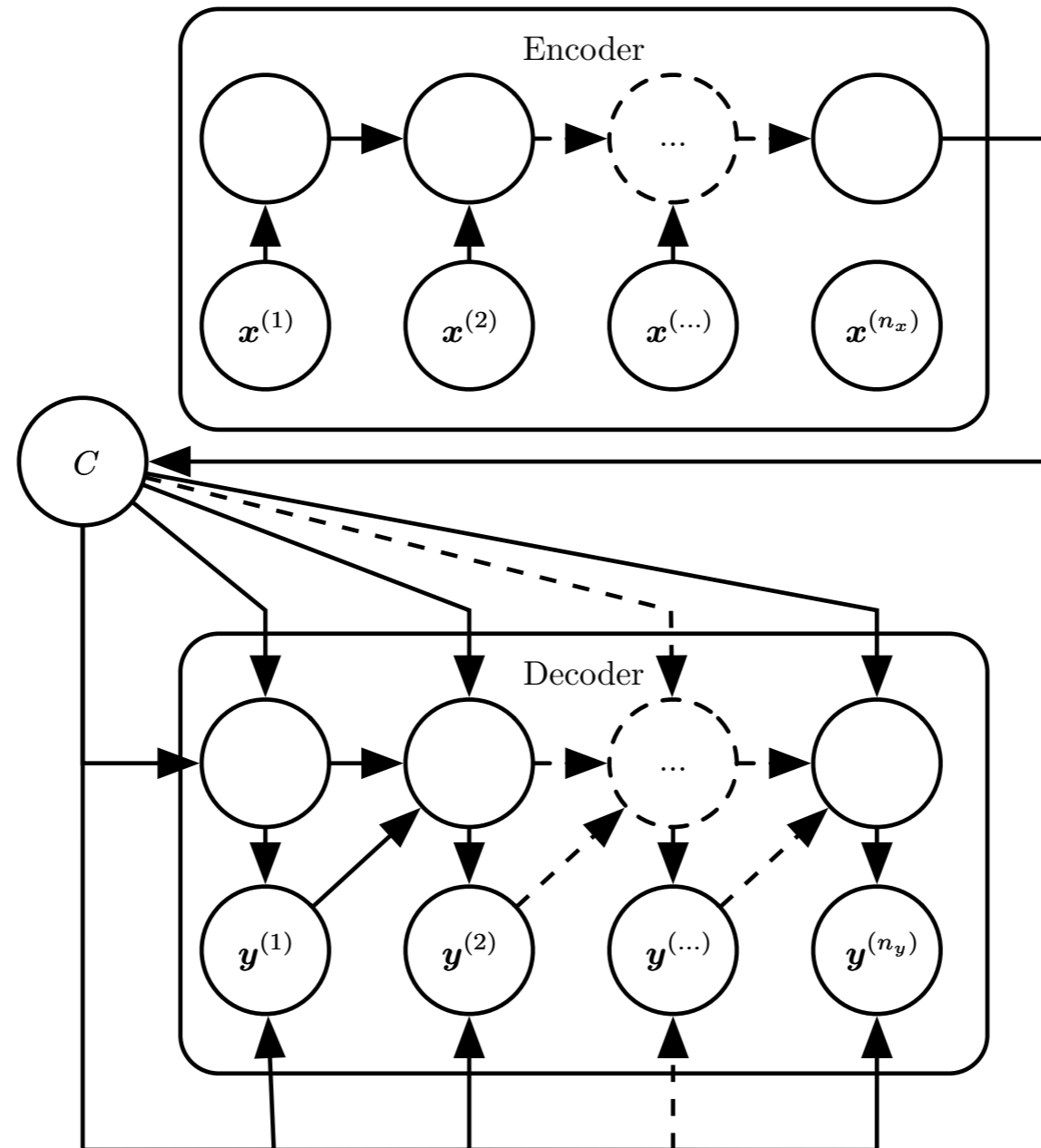


Figure 10.12

# Deep RNNs

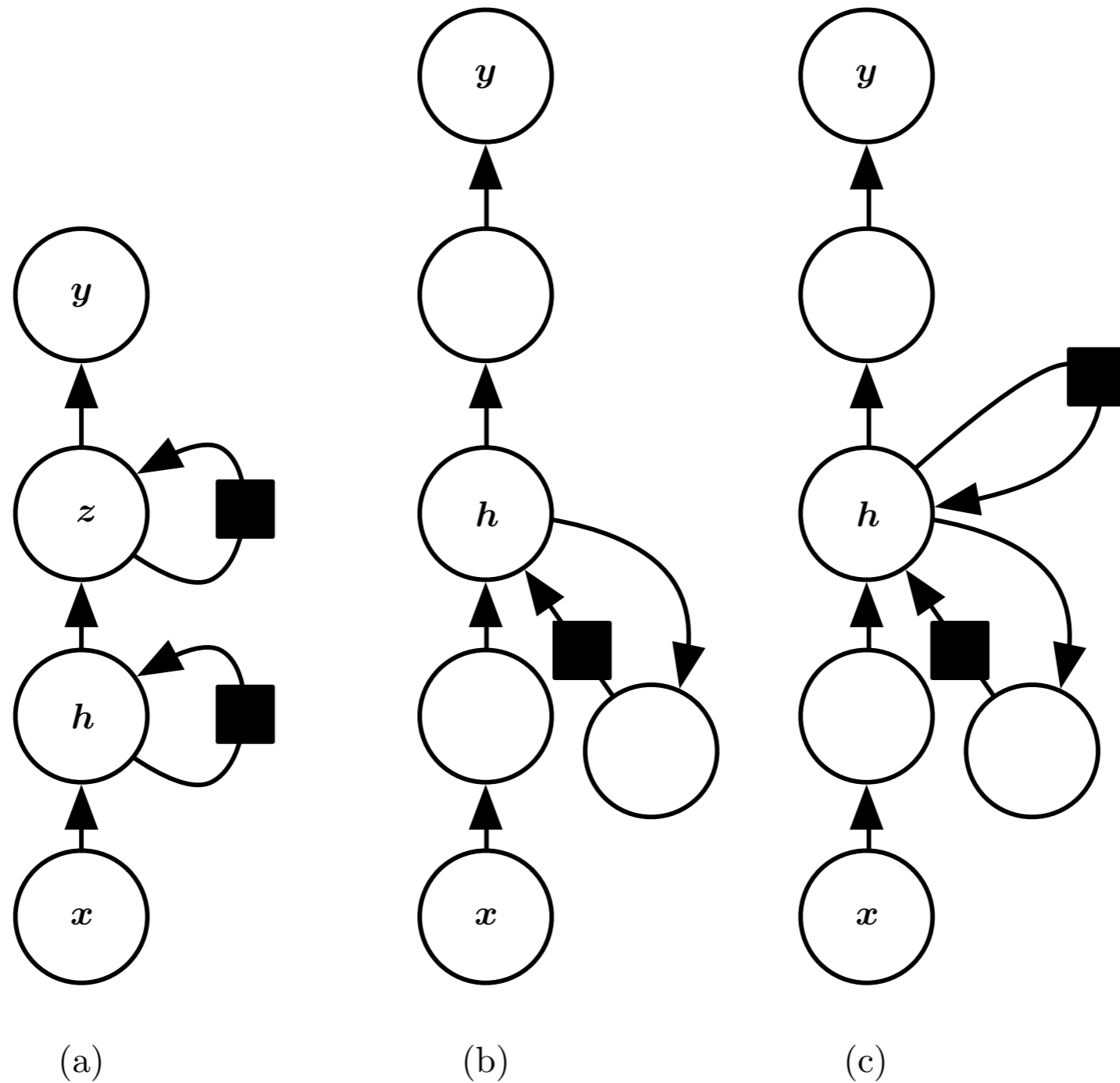


Figure 10.13

# Recursive Network

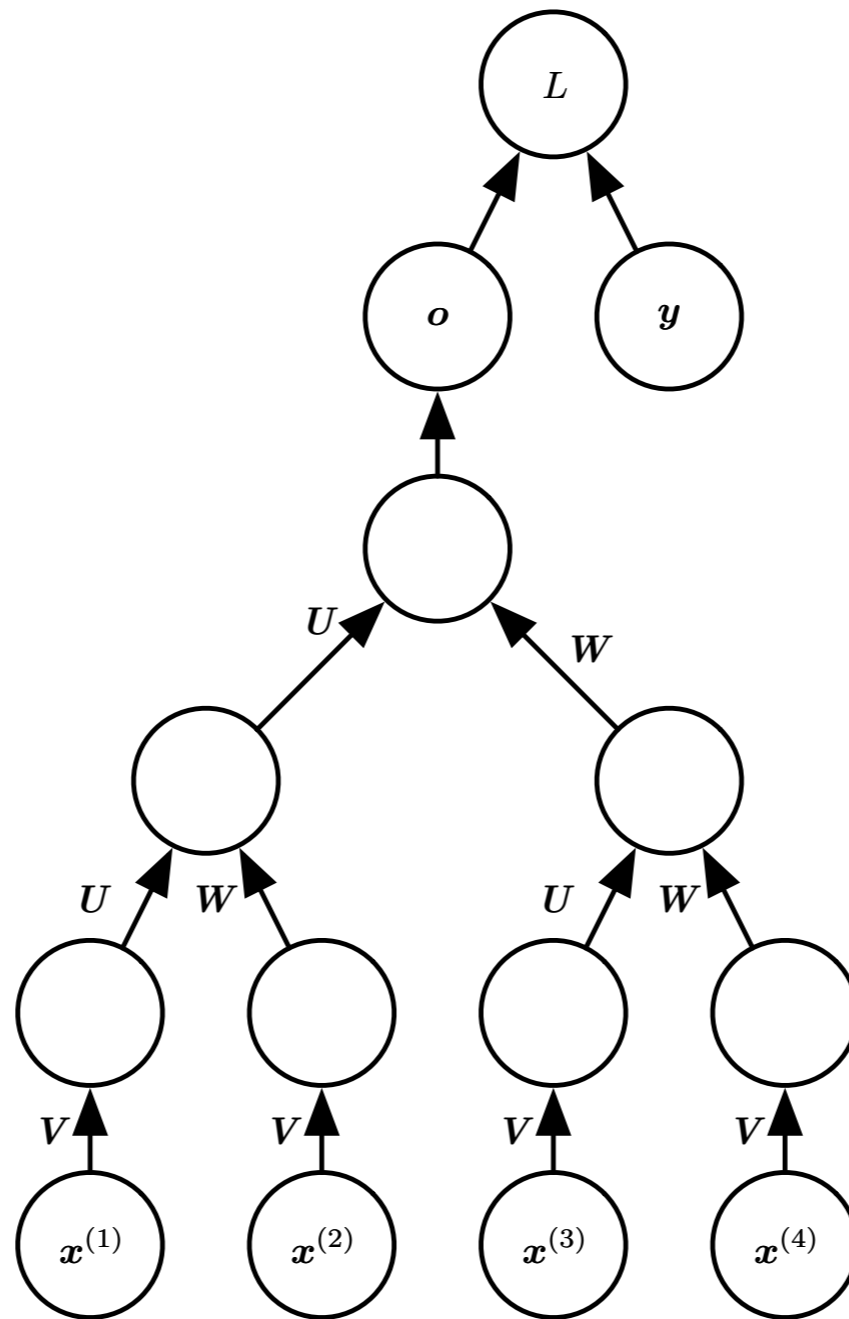


Figure 10.14

# Exploding Gradients from Function Composition

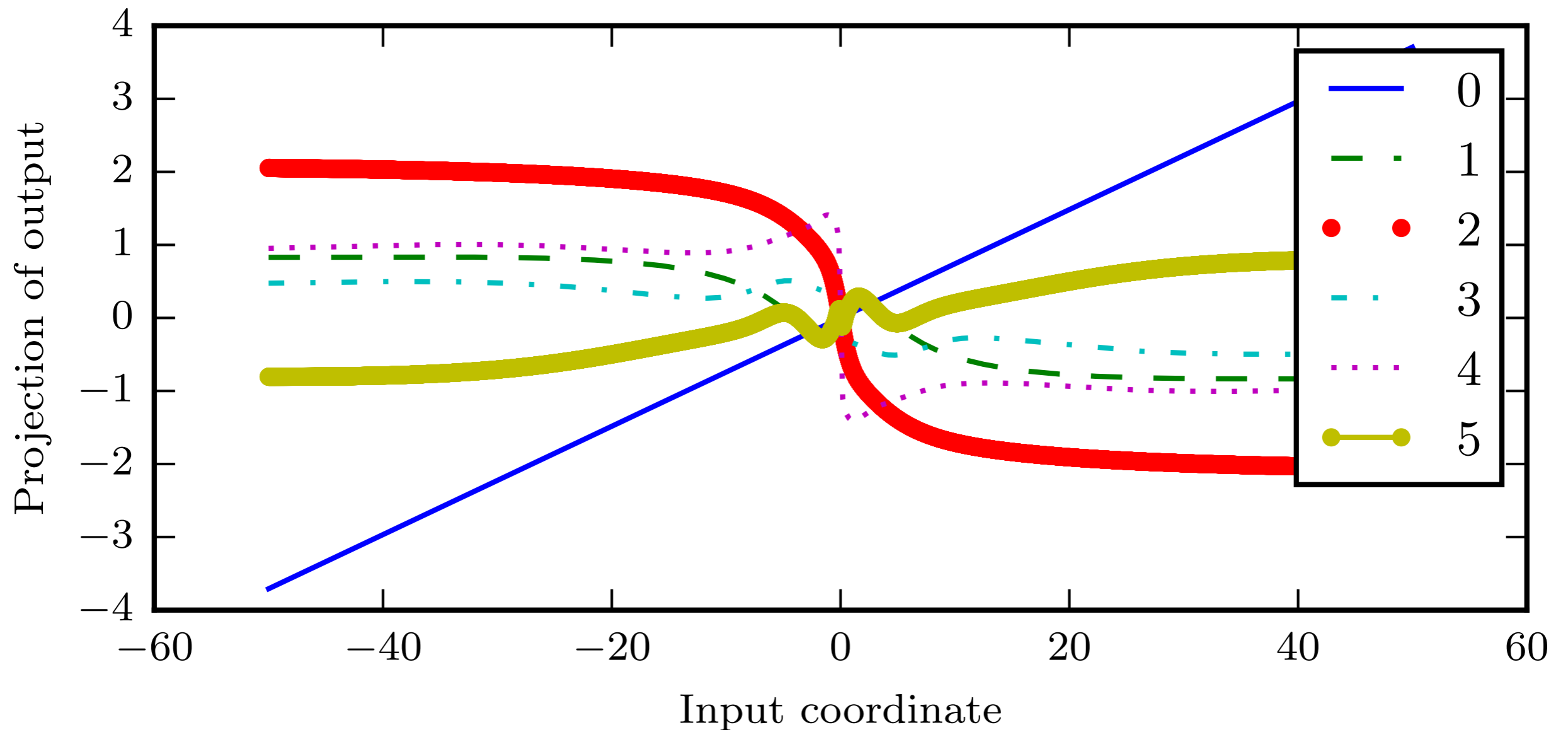


Figure 10.15

# LSTM

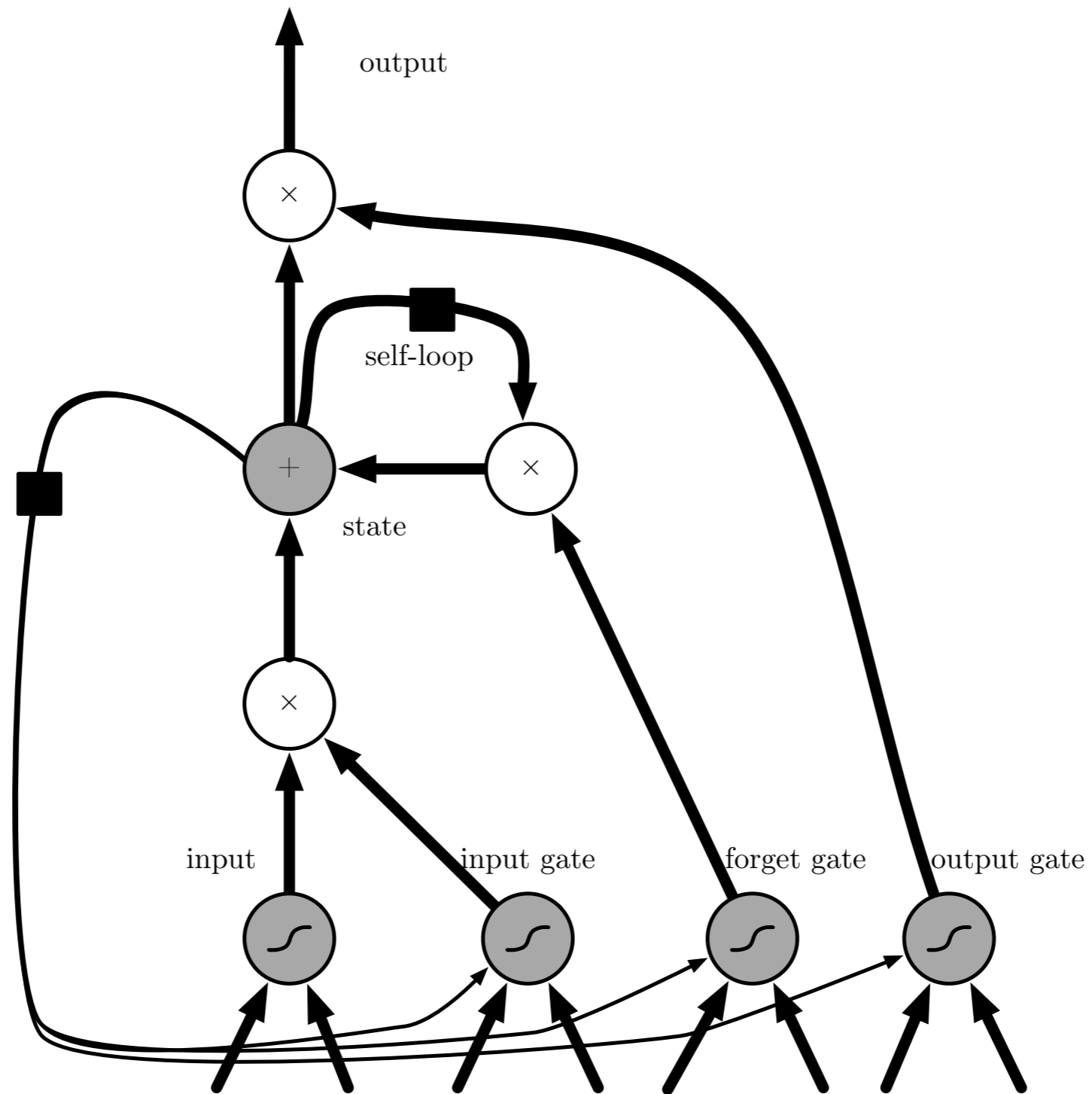
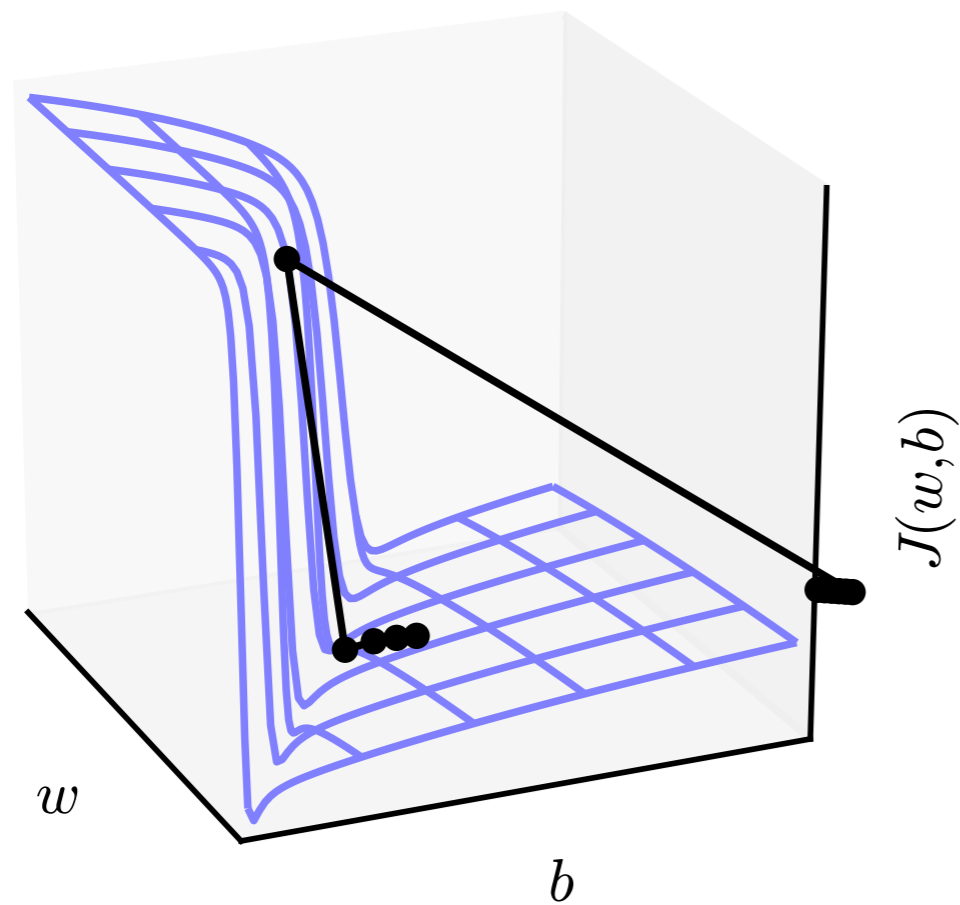


Figure 10.16

# Gradient Clipping

Without clipping



With clipping

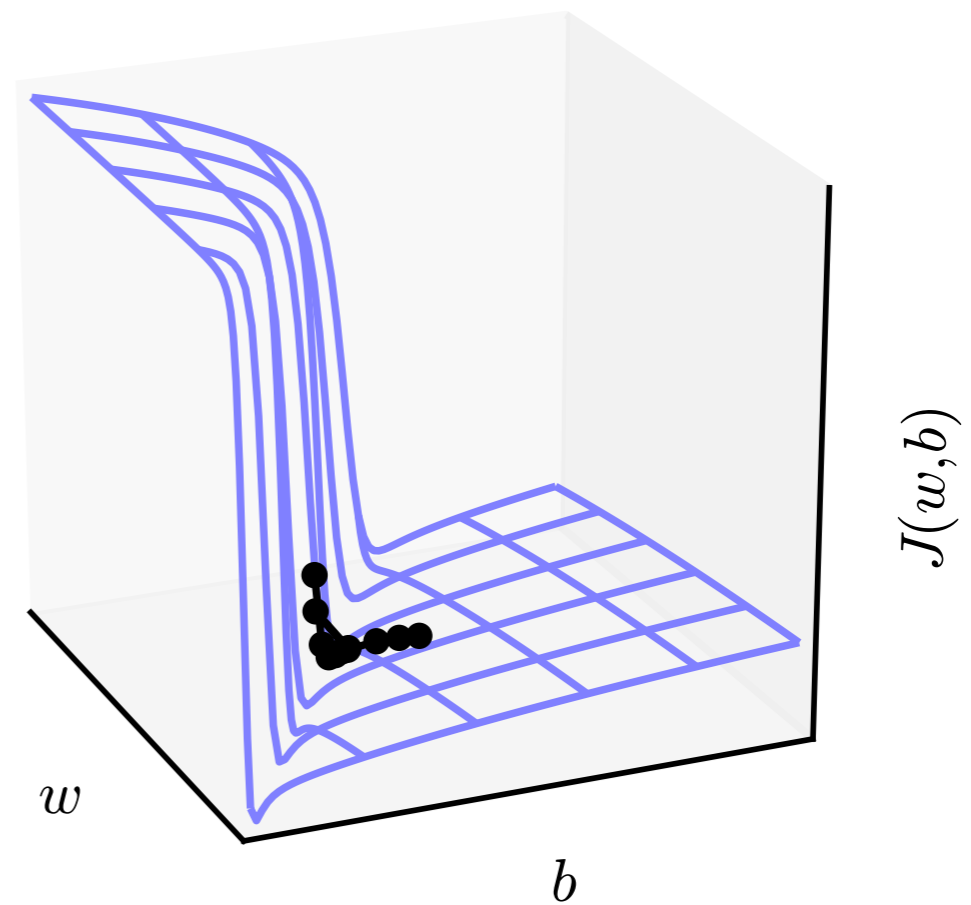


Figure 10.17

# Networks with explicit Memory

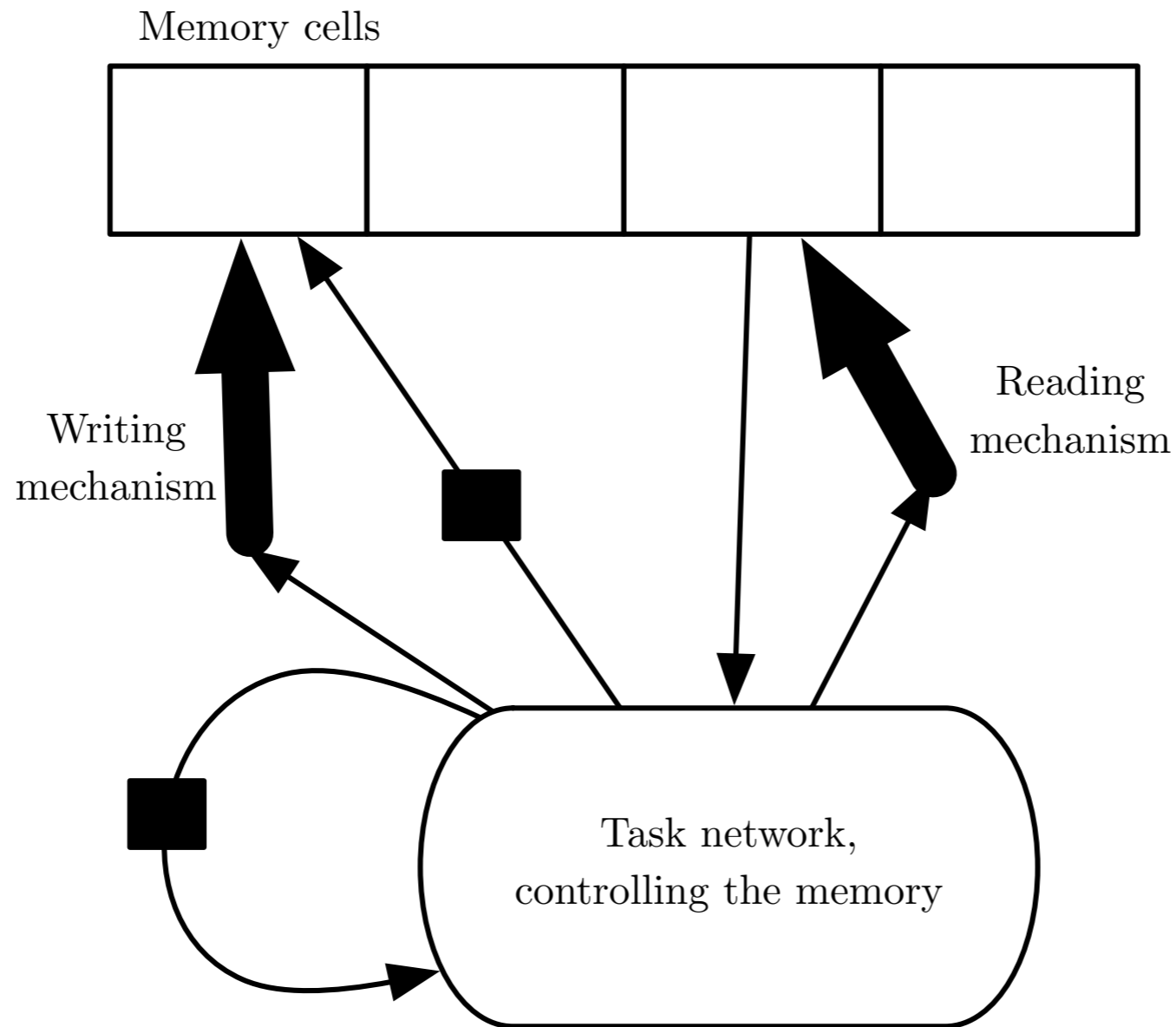


Figure 10.18