深度学习笔记

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2020.03*

目录

1 简介 1

本课程主要选用Ian Goodfellow, Yoshua Bengio, Aaron Courville的《深度学习》(Deep Learning)一书。

1 简介

图 1反映了深度学习与其他几个常见概念之间的关系。传统的机器学习(如决策树、SVM、随机森林等)常需要人工提取特征,这一步经常涉及到特征工程(feature engineering),如果特征没有进行一定处理,直接丢进去让其学习,往往会产生非常糟糕的结果。在一种表示下可能可以对数据进行线性二分,而另一种表示下则没有办法。因此,为了避免对特征的强依赖性,一种方法是利用机器学习来学习表示(representation)本身,再将新的表示送入到后面的学习器中让它学习表示到输出的映射,此即表示学习。再到后来,深度学习则更加将这种思想发扬光大,表示学习只能学习到浅层简单的特征,那深度学习则尝试去学习深层复杂的特征。

事实上现在图神经网络(GNN)也是遵循这样的发展过程,最开始尝试在图上做机器学习[1,2,3];然后又开始在图上以各种随机游走的方式做图表示学习-图嵌入(embedding)[4,5];后来发现图嵌入能够获得的特征依然太浅层了,因此现在更多则采用图神经网络[6,7,8,9]的方式来做图相关的工作。

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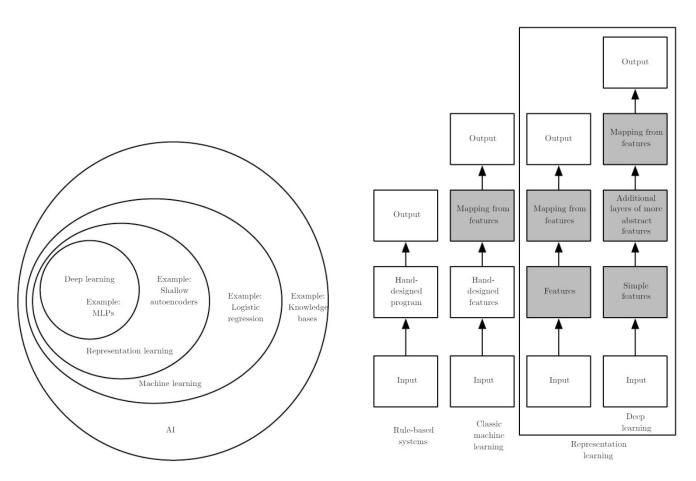


图 1: 深度学习Venn图

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