



10-601 Introduction to Machine Learning

Machine Learning Department
School of Computer Science
Carnegie Mellon University

Decision Trees (Part I)

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Lecture 2
Jan. 16, 2019

Q&A

Q: How will I earn the 5% Participation points?

A: Good question! One way is by filling out the **required** poll on what WIFI enabled devices you have on Piazza.

<https://piazza.com/class/jqnuz4ysoi96rm?cid=15>

Other points will be earned through in-class polls, some “grace days”, and other opportunities to gain participation points.

Starting next week, please come to class with a WIFI enabled smartphone or tablet. We’ll announce on Piazza what to do if you don’t have such a device.

Reminders

- **Homework 1: Background**
 - **Out: Wed, Jan 16 (2nd lecture)**
 - **Due: Wed, Jan 23 at 11:59pm**
 - Two parts:
 1. written part to Gradescope,
 2. programming part to Autolab
 - unique policy for this assignment:
 1. **two submissions** for written (see writeup for details)
 2. **unlimited submissions** for programming (i.e. keep submitting until you get 100%),
 - **unique policy for this assignment: we will grant (essentially) any and all extension requests**

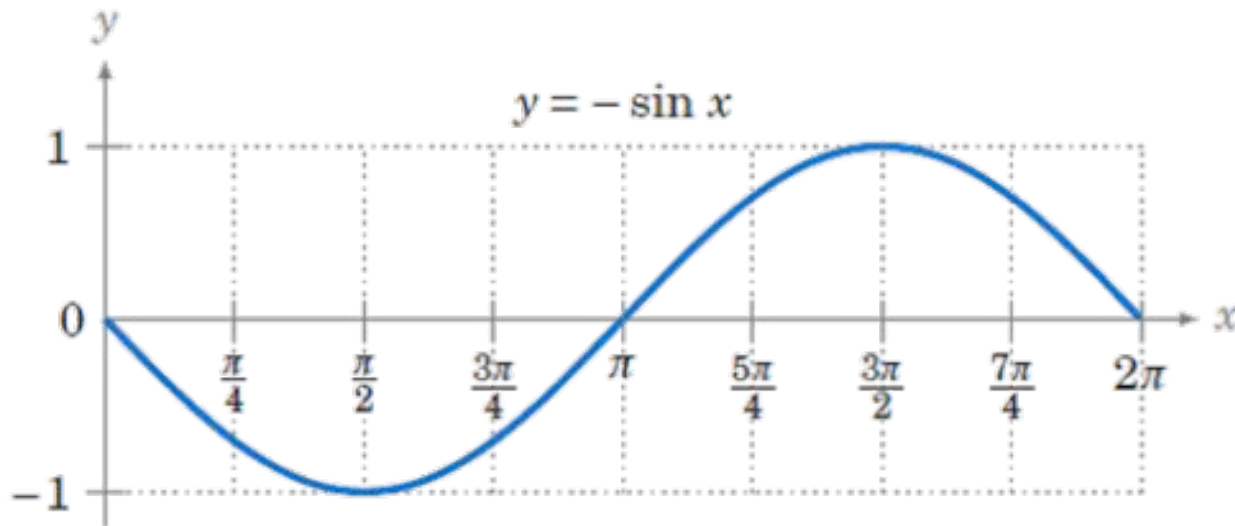
Big Ideas

1. How to formalize a learning problem
2. How to learn an expert system (i.e. Decision Tree)
3. Importance of inductive bias for generalization
4. Overfitting

FUNCTION APPROXIMATION

Function Approximation

Quiz: Implement a simple function which returns $\sin(x)$.



1. 用很多数据来近似
2. Taylor approximation to locally approximate the function

A few constraints are imposed:

1. You can't call any other trigonometric functions
2. You *can* call an existing implementation of $\sin(x)$ a few times (e.g. 100) to test your solution
3. You only need to evaluate it for x in $[0, 2\pi]$

Medical Diagnosis



- Setting:
 - Doctor must decide whether or not to prescribe a treatment
 - Looks at attributes of a patient to make a medical diagnosis
 - Prescribes treatment if diagnosis is positive
- Key problem area for Machine Learning
- Potential to reshape health care

ML as Function Approximation

Chalkboard

– ML as Function Approximation

- Problem setting
- Input space
- Output space
- Unknown target function
- Hypothesis space
- Training examples

DECISION TREES

Decision Trees

Chalkboard

- Example: Medical Diagnosis
- Does memorization = learning?
- Decision Tree as a hypothesis
- Function approximation for DTs

Tree to Predict C-Section Risk

Learned from medical records of 1000 women (Sims et al., 2000)

Negative examples are C-sections

```
[833+,167-] .83+ .17-
Fetal_Presentation = 1: [822+,116-] .88+ .12-
| Previous_Csection = 0: [767+,81-] .90+ .10-
| | Primiparous = 0: [399+,13-] .97+ .03-
| | Primiparous = 1: [368+,68-] .84+ .16-
| | | Fetal_Distress = 0: [334+,47-] .88+ .12-
| | | | Birth_Weight < 3349: [201+,10.6-] .95+ .05-
| | | | Birth_Weight >= 3349: [133+,36.4-] .78+ .22-
| | | Fetal_Distress = 1: [34+,21-] .62+ .38-
| Previous_Csection = 1: [55+,35-] .61+ .39-
Fetal_Presentation = 2: [3+,29-] .11+ .89-
Fetal_Presentation = 3: [8+,22-] .27+ .73-
```