Weekly Exercise - Week 1

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Write a function that implements the following pseudo code:

- Input sample size n.
- Generate n observations with a single predictor variable $x \sim \mathcal{U}(-3,3)$
- Generate the response $y = 8\sin(x) + \epsilon$, with $\epsilon \sim \mathcal{N}(0, 1)$
- return x, y as a data.frame or pandas.DataFrame.

Use this function to generate a training set of size 50 and a test set of size 10000. Train two polynomial regression models, one with a degree of 3 and one with a degree of 15, and estimate their mean squared errors (MSE) on the test set. Repeat the process with a training set of size 10000. Answer the following questions:

- What is the best possible prediction rule f in this case? Obtain the test MSE of the best prediction rule as well. (BONUS: Explain, considering how we generated the data, why this value is not a surprise.)
- Report the 4 obtained test mean squared error values (for degree 3 and 15 and for both training set sizes). Explain the obtained numbers using bias and variance. Hints: Start with the results for the large training set, taking the optimal MSE into account as well can help.

Generate and upload one pdf using either RMarkdown or Python Notebook including both your code as well as the textual answers.