

# Appendix

Websites with machine learning, remote sensing and GIS exercises in R.

1. **Spatial Data Science with R**

<http://rspatial.org/analysis/rst/9-remotesensing.html>

2. **Stackoverflow**

<http://stackoverflow.com>

3. **Burns Statistics**

**Why use the R Language?**

<https://www.burns-stat.com/documents/tutorials/why-use-the-r-language/>

4. **ML & R**

**Recursive Feature Elimination**

<http://ml-tutorials.kyrcha.info/rfe.html>

5. **Quick R by Datacamp**

**About Quick-R**

<https://www.statmethods.net/>

**6. Rtips. Revival 2014!**

<http://pj.freefaculty.org/R/Rtips.html>

**7. Online R resources for Beginners**

[http://www.introductoryr.co.uk/R\\_Resources\\_for\\_Beginners.html](http://www.introductoryr.co.uk/R_Resources_for_Beginners.html)

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