# **Bibliography for Graph Classification**

### **Kernel and Neural Computation Methods**

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#### Abstract

Bibliography for the area of (supervised) graph classification, both graph kernel and deep learning approaches. We only included published articles.

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