## Machine-learning oxybarometer developed using zircon trace-element chemistry and its applications

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## ABSTRACT

Magmatic oxygen fugacity  $(f_{O_2})$  is a fundamental property to understanding the long-term evolution of the Earth's atmosphere and the formation of magmatic-hydrothermal mineral deposits. Classically, the magmatic  $f_{\Omega_2}$  is estimated using mineral chemistry, such as Fe-Ti oxides, zircon, and hornblende. These methods, however, are only valid within certain limits and/or require a significant amount of a priori knowledge. In this contribution, a new oxybarometer, constructed by data-driven machine learning algorithms using trace elements in zircon and their corresponding independent  $f_{\Omega_2}$  constraints, is provided. Seven different algorithms are initially trained and then validated on a data set that was never utilized in the training processes. Results suggest that the oxybarometer constructed by the extremely randomized trees model has the best performance, with the largest  $R^2$  value (0.91 ± 0.01), smallest RMSE ( $0.45 \pm 0.03$ ), and low propagated analytical error (~ $0.10 \log$  units). Feature importance analysis demonstrates that U, Ti, Th, Ce, and Eu in zircon are the key trace elements that preserve  $f_{02}$ information. This newly developed oxybarometer has been applied in diverse systems, including arc magmas and mid-ocean ridge basalts, fertile and barren porphyry systems, and global S-type detrital zircon, which provide  $f_{02}$  constraints that are consistent with other independent methods, suggesting that it has wide applicability. To improve accessibility, the oxybarometer was developed into a software application aimed at enabling more consistent and reliable  $f_{02}$  determinations in magmatic systems, promoting further research.

Keywords: Machine learning, zircon, trace elements, magmatic oxygen fugacity, oxybarometer