## **Conducting Reproducible Research with Umbrella: Tracking, Creating, and Preserving Execution Environments**

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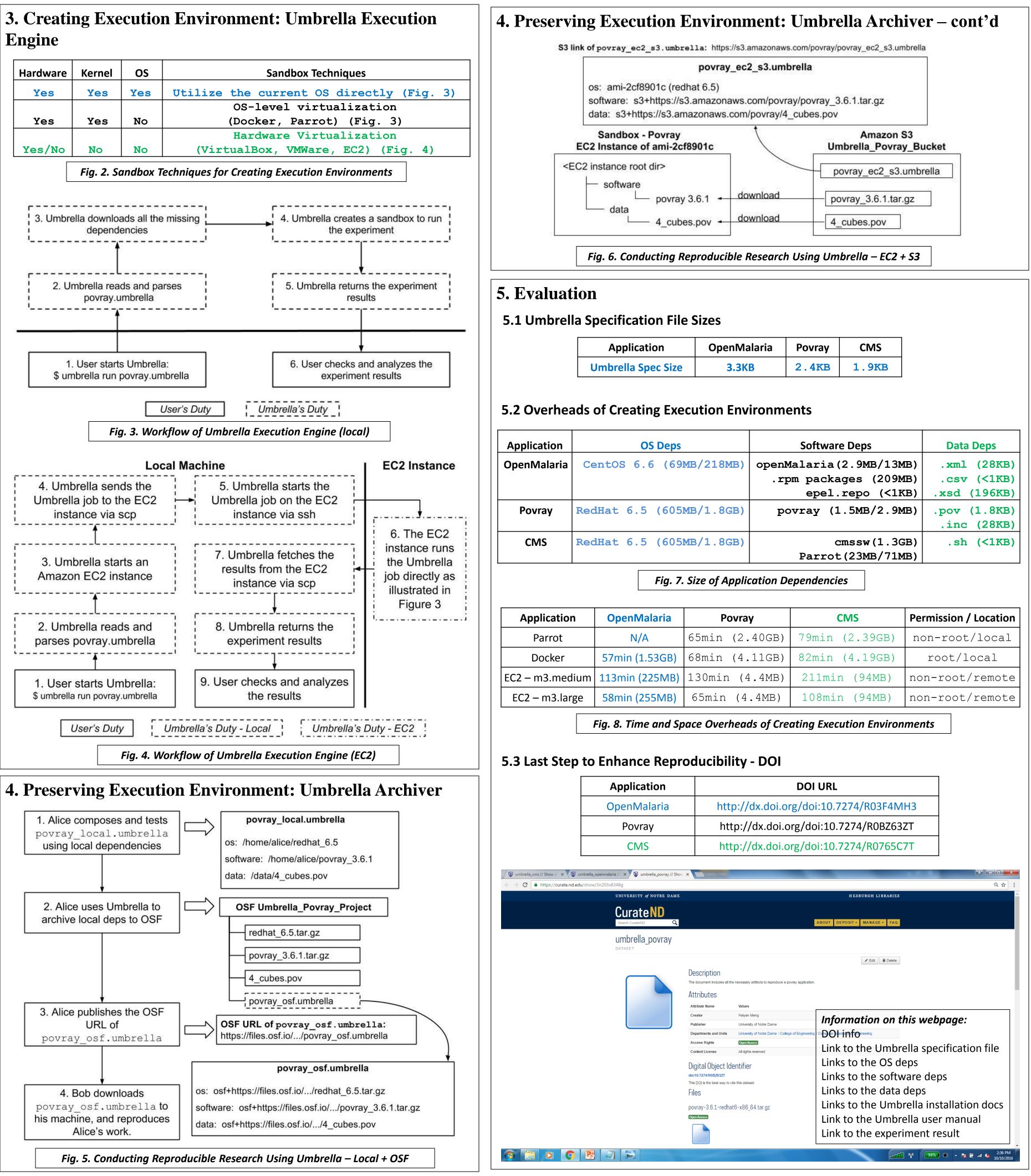
### **1. ABSTRACT**

Publishing scientific results without the detailed execution environments describing how the results were collected makes it difficult or even impossible for the reader to reproduce the work. However, the configurations of the execution environments are too complex to be described easily by authors. To solve this problem, we propose a framework facilitating the conduct of reproducible research by tracking, creating, and preserving the comprehensive execution environments with Umbrella. The framework includes a lightweight, persistent and deployable execution environment specification, an execution engine which creates the specified execution environments, and an archiver which archives an execution environment into persistent storage services like Amazon S3 and **Open Science Framework (OSF).** The execution engine utilizes sandbox techniques like virtual machines (VMs), Linux containers and user-space tracers, to create an execution environment, and allows common dependencies like base OS images to be shared by sandboxes for different applications.

We evaluate our framework by utilizing it to reproduce three scientific applications from epidemiology, scene rendering, and high energy physics. We evaluate the time and space overheads of reproducing these applications using different sandbox techniques – Parrot, Docker and the Amazon EC2. Our results show that these applications can be reproduced using different sandbox techniques successfully and efficiently, even through the overhead and performance slightly vary.



### Kernel OS Hardware Yes Yes Yes



### DASPOS: <u>www.daspos.org</u>

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