Summary

pytransform3d is a Python library for transformations in three dimensions. Heterogenous software systems that consist of proprietary and open source software are often combined when we work with transformations. For example, suppose you want to transfer a trajectory demonstrated by a human to a robot. The human trajectory could be measured from an RGB-D camera, fused with inertial measurement units that are attached to the human, and then translated to joint angles by inverse kinematics. That involves at least three different software systems that might all use different conventions for transformations. Sometimes even one software uses more than one convention. The following aspects are of crucial importance to glue and debug transformations in systems with heterogenous and often incompatible software:

- Compatibility: Compatibility between heterogenous softwares is a difficult topic. It might involve, for example, communicating between proprietary and open source software or different languages.
- Conventions: Lots of different conventions are used for transformations in three dimensions. These have to be determined or specified.
- Conversions: We need conversions between these conventions to communicate transformations between different systems.
- Visualization: Finally, transformations should be visually verified and that should be as easy as possible.

pytransform3d assists in solving these issues. Its documentation clearly states all of the used conventions, it makes conversions between rotation and transformation conventions as easy as possible, it is tightly coupled with Matplotlib to quickly visualize (or animate) transformations and it is written in Python with few dependencies. Python is a widely adopted language. It is used in many domains and supports a wide spectrum of communication to other software.

The library focuses on readability and debugging, not on computational efficiency. If you want to have an efficient implementation of some function from the library you can easily extract the relevant code and implement it more efficiently in a language of your choice.

The library integrates well with the scientific Python ecosystem (G. Varoquaux, Gouillart, & Vahtiras, 2018) with its core libraries Numpy, Scipy and Matplotlib. We rely on Numpy (Walt, Colbert, & Varoquaux, 2011) for linear algebra and on Matplotlib (Hunter, 2007) to offer plotting functionalities. Scipy (Jones, Oliphant, Peterson, & others, 2001–2001--) is used if you want to automatically compute new transformations from a graph of existing transformations.

More advanced features of the library are the TransformManager which manages complex chains of transformations, the TransformEditor which allows to modify transformations
The TransformManager builds a graph of transformations that can be used to automatically infer previously unknown transformations. One of the strengths of pytransform3d in comparison to most other libraries is its rigorous approach to testing. Unit tests have 100% branch coverage for code that is not related to visualization, there is more test code than library code, there are additional examples, and continuous integration runs with Python 2.7, 3.4, 3.5, and 3.6. The maintainer ensures that this level of quality will not be sacrificed for new features.

There are several similar software packages. ROS tf2 (Foote, Marder-Eppstein, Meeussen, & others, 2009–2009–) is probably the most widely used of them. It offers functionality that is similar to the TransformManager of pytransform3d, but also considers temporal aspects of transformations. It also provides conversions between various conventions and visualization can be done with ROS’ rviz package. EnviRe (Carrió et al., 2016) provides similar functionality. However, both libraries come with a number of dependencies and require complex build tools. Hence, it is not easy to set them up quickly in a new environment with minimum impact to the system, while pytransform3d is a lightweight library that only requires the basic scientific Python software stack that runs on any machine that supports CPython. There are other lightweight Python libraries that offer transformations and conversions between conventions, for example, transforms3d (Brett & Gohlke, 2009–2009–) and rowan (Ramasubramani & Glotzer, 2018), but these do not directly support visualization.
Figure 2: Transformation Editor: The TransformEditor based on PyQt4 can be used to visually modify transformations with a minimal number of dependencies.

Fabisch, (2019). pytransform3d: 3D Transformations for Python. *Journal of Open Source Software*, 4(33), 1159. https://doi.org/10.21105/joss.01159
**Research**

pytransform3d is used in various domains, for example, specifying motions of a robot, learning robot movements from human demonstration, and sensor fusion for human pose estimation. pytransform3d has been used by Gutzeit et al. (2018) in the context of learning robot behaviors from demonstration.

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