

- ufjc: The Python package for the uFJC single-chain model
- 2 Michael R. Buche\*1 and Scott J. Grutzik1
- $_{
  m 3}$   $\,$   $\,$   $\,$   $\,$   $\,$   $\,$  Materials and Failure Modeling, Sandia National Laboratories, Albuquerque, NM 87185, USA  $\,$

#### DOI: 10.xxxxx/draft

#### **Software**

- Review 🗗
- Repository 🗗
- Archive ♂

### Editor: ♂

**Submitted:** 22 March 2022 **Published:** unpublished

#### License

Authors of papers retain 13 copyright and release the work 14 under a Creative Commons 15 Attribution 4.0 International License (CC BY 4.0).

# Summary

ufjc is the Python package that implements the uFJC model for single polymer chains. The uFJC model replaces the rigid links of the freely-jointed chain (FJC) model (Rubinstein & Colby, 2003) with flexible links of potential energy function u (Buche & Silberstein, 2021). This replacement allows the stretching of polymer chains to include bond stretching, and depending on the potential choice, bond breaking (Buche et al., 2022). Through a robust implementation the uFJC single-chain model, the ufjc package (1) allows the stretching of polymer chains to be efficiently modeled, (2) is readily integrated into single-chain-based polymer network constitutive models, and (3) provides the tools to study the fundamental statistical thermodynamics of the model system. ufjc utilizes efficient capabilities provided by numpy (Harris et al., 2020) and scipy (Virtanen et al., 2020); visualization using matplotlib (Hunter, 2007) is recommended.

# Basic usage

The model class is first imported from the package,

```
»> from ufjc import uFJC
```

and then a model instance may be created,

```
>>> model = uFJC(N_b=8, potential='morse', varepsilon=88)
```

Here, model is an instance of the uFJC single-chain model with 8 links, where each link is assigned the Morse (1929) potential with a nondimensional energy scale of 88 (Buche et al., 2022). The model instance has methods corresponding to thermodynamic functions, and results are returned as a numpy.ndarray. For example, the nondimensional end-to-end length (extension) of the chain,  $\gamma$ , is computed when a nondimensional force of  $\eta=0.55$  is applied at the ends of the chain:

```
»> model.gamma(0.55)
array([0.18780929])
```

- Other methods include the nondimensional free energy of the chain as a function of extension,
- $_{\rm 26}$   $\,$  the nondimensional probability functions of chain extensions at equilibrium, and the net
- 27 rate of breaking a chain as a function of extension. Optional keyword arguments in each
- method are available in order to specify certain features, such as the calculation approach or
- 29 the thermodynamic ensemble. For example, evaluate the nondimensional equilibrium radial
- distribution function using the reduced asymptotic approach:

```
»> model.g_eq([0, 0.23, 0.88], approach='reduced')
array([0.00000000e+00, 2.64707367e+00, 1.24115933e-04])
```

These functions are plotted over an exemplary range of parameters in Figure 1.

<sup>\*</sup>mrbuche@sandia.gov

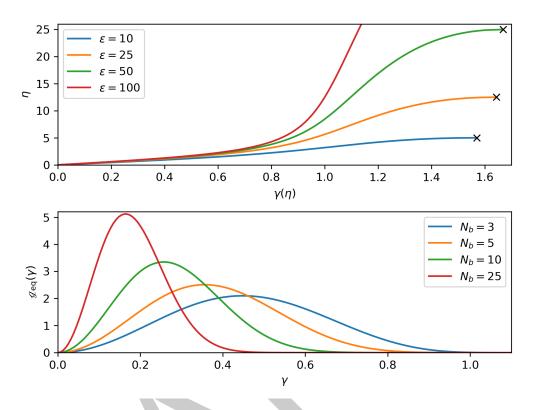


Figure 1: Thermodynamic functions for the Morse-FJC model with base parameters  $N_b=8$ ,  $\alpha=1$ , and  $\varepsilon=88$ . (top) The nondimensional single-chain mechanical response (force versus extension) for an increasing nondimensional potential energy scale. An x denotes the maximum force that the chain can sustain, where additional force would cause breaking. (bottom) The nondimensional equilibrium radial distribution function versus extension for an increasing number of links.

## Statement of need

41

42

43

46

47

50

51

uf jc was developed for researchers to effectively model single polymer chains and networks of polymer chains. Researchers have historically relied on the freely-jointed chain (FJC) model, which captures fundamental physics while maintaining analytic simplicity. The FJC model consists of a number of rigid phantom links connected in series by penalty-free hinges; the increasing force required to extend the chain is due to entropy reduction, and is described by the Langevin function (Rubinstein & Colby, 2003). Researchers have become interested in modeling polymers up to and including failure, but unfortunately the rigid links of the FJC model are neither capable of modeling bond stretching nor breaking. The rigid links can be made flexible according to some potential energy function u, but this causes the model to become analytically intractable, except for the special case of a harmonic potential and the isotensional ensemble (Balabaev & Khazanovich, 2009; Buche & Silberstein, 2020; Manca et al., 2012). Quite recently, an asymptotically-correct statistical thermodynamic theory (Buche, 2021) has been successfully applied to this uFJC model, resulting in accurate, analytically-tractable relations for the model for steep link potentials (Buche et al., 2022). The uf ic package robustly implements this approach, enabling the results presented by Buche et al. (2022) while providing many additional functionalities. The object-oriented structure of ufjc allows it to be readily integrated into other packages as a sub-package, such as polymer network constitutive models that build up from a single-chain models. Correspondingly, ufic will streamline ongoing constitutive model development, and improve existing constitutive models through reimplementation (Buche & Silberstein, 2021).



## Acknowledgements

This work was supported by the Laboratory Directed Research and Development (LDRD) program at Sandia National Laboratories under project 222398. Sandia National Laboratories is a multi-mission laboratory managed and operated by National Technology and Engineering Solutions of Sandia, LLC., a wholly owned subsidiary of Honeywell International, Inc., for the U.S. Department of Energy's National Nuclear Security Administration under contract DE-NA0003525. This paper describes objective technical results and analysis. Any subjective views or opinions that might be expressed in the paper do not necessarily represent the views of the U.S. Department of Energy or the United States Government.

### References

- Balabaev, N., & Khazanovich, T. (2009). Extension of chains composed of freely joined elastic
   segments. Russian Journal of Physical Chemistry B, 3(2), 242–246. https://doi.org/10.
   1134/S1990793109020109
- Buche, M. R. (2021). Fundamental theories for the mechanics of polymer chains and networks [PhD thesis, Cornell University]. https://www.proquest.com/openview/680bd18d1bf93950b88a41aa62ebdb3c
- Buche, M. R., & Silberstein, M. N. (2020). Statistical mechanical constitutive theory of
   polymer networks: The inextricable links between distribution, behavior, and ensemble.
   Physical Review E, 102(012501), 012501. https://doi.org/10.1103/PhysRevE.102.012501
- Buche, M. R., & Silberstein, M. N. (2021). Chain breaking in the statistical mechanical constitutive theory of polymer networks. *Journal of the Mechanics and Physics of Solids*, 156, 104593. https://doi.org/10.1016/j.jmps.2021.104593
- Buche, M. R., Silberstein, M. N., & Grutzik, S. J. (2022). On freely-jointed chain models with flexible links. https://arxiv.org/abs/2203.05421
- Harris, C. R., Millman, K. J., Walt, S. J. van der, Gommers, R., Virtanen, P., Cournapeau, D., Wieser, E., Taylor, J., Berg, S., Smith, N. J., Kern, R., Picus, M., Hoyer, S., Kerkwijk, M. H. van, Brett, M., Haldane, A., Fernández del Río, J., Wiebe, M., Peterson, P., ... Oliphant, T. E. (2020). Array programming with NumPy. *Nature*, 585, 357–362. https://doi.org/10.1038/s41586-020-2649-2
- Hunter, J. D. (2007). Matplotlib: A 2D graphics environment. Computing in Science & Engineering, 9(03), 90–95.
- Manca, F., Giordano, S., Palla, P. L., Zucca, R., Cleri, F., & Colombo, L. (2012). Elasticity of flexible and semiflexible polymers with extensible bonds in the Gibbs and Helmholtz ensembles. *The Journal of Chemical Physics*, 136(15), 154906. https://doi.org/10.1063/1.4704607
- Morse, P. M. (1929). Diatomic molecules according to the wave mechanics. II. Vibrational levels. *Physical Review*, *34*(1), 57. https://doi.org/10.1103/PhysRev.34.57
- Rubinstein, M., & Colby, R. H. (2003). *Polymer physics*. Oxford University Press. https://global.oup.com/academic/product/polymer-physics-9780198520597
- Virtanen, P., Gommers, R., Oliphant, T. E., Haberland, M., Reddy, T., Cournapeau, D.,
   Burovski, E., Peterson, P., Weckesser, W., Bright, J., van der Walt, S. J., Brett, M., Wilson,
   J., Millman, K. J., Mayorov, N., Nelson, A. R. J., Jones, E., Kern, R., Larson, E., ... SciPy
   1.0 Contributors. (2020). SciPy 1.0: Fundamental Algorithms for Scientific Computing in
   Python. Nature Methods, 17, 261–272. https://doi.org/10.1038/s41592-019-0686-2