

# From RDKit to the Universe and back



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- Analyze trajectories from molecular dynamics simulations
- Support for reading most computational chemistry file formats (Gromacs, Amber, NAMD, XYZ, PDBQT...*etc.*)
- Trajectory manipulation (alignment, centering...*etc.*)
- Extensive atom selection commands
- Core objects: Universe and AtomGroup

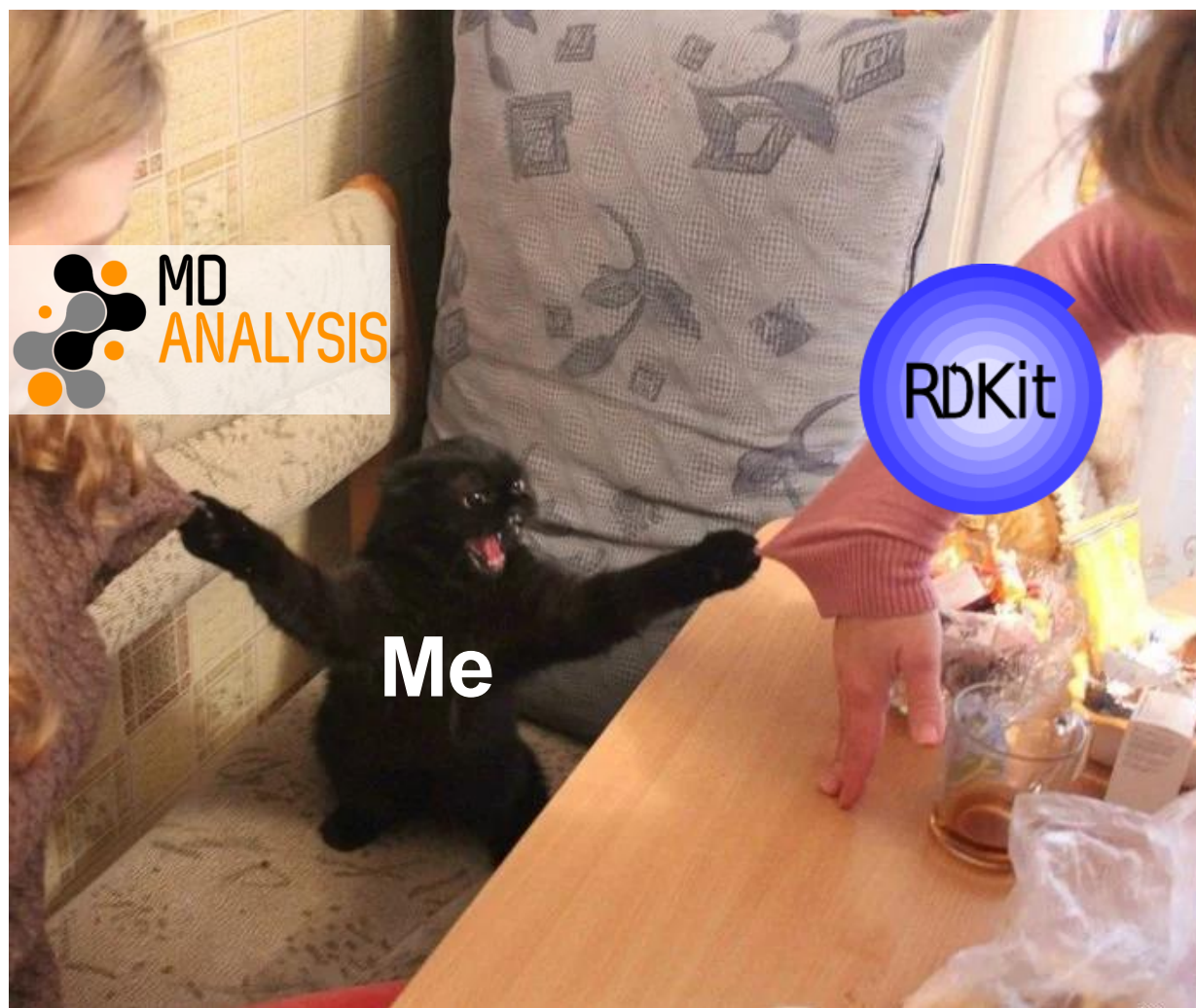
<https://www.mdanalysis.org/>

# Motivation

	Knows chemistry	Reads MD trajectories
RDKit		
MDAnalysis		

→ Both packages would complement each other

# Summary of the project



# From RDKit to the Universe



# From RDKit to the Universe

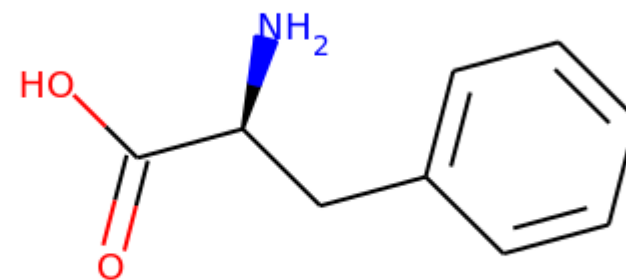
- Brings indirect support for SMILES, SDF and more
- Atom properties are kept (*residues, chains, charges...etc.*)
- Introduces aromaticity to MDAnalysis

```
In [6]: ▶ u = mda.Universe.from_smiles("CCO", numConfs=10)  
u.trajectory
```

```
Out[6]: <RDKitReader with 10 frames of 9 atoms>
```

```
In [7]: ▶ mol = Chem.MolFromSequence("F")  
mol
```

```
Out[7]:
```



```
In [8]: ▶ u = mda.Universe(mol)  
u.select_atoms("aromatic")
```

```
Out[8]: <AtomGroup with 6 atoms>
```


# From the Universe to RDKit



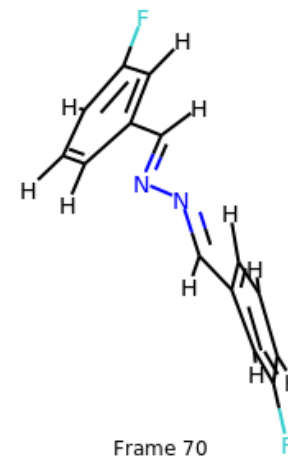
# From the Universe to RDKit

- Brings indirect support for MD trajectories, PDBQT and more
- AtomGroup properties (residues, chains...*etc.*) are kept

```
In [12]: ▶ u = mda.Universe(TOP, TRAJ)
          lig = u.select_atoms("resname LIG")
          for ts in ProgressBar(u.trajectory[:80:10]):
              mol = lig.convert_to("RDKit")
              img = Draw.MolToImage(mol,
                                     legend=f"Frame {ts.frame}")
          img
```

100%  8/8 [00:00<00:00, 42.13it/s]

Out[12]:





# Requirements

- Elements\*
- Bonds\*
- Explicit hydrogens

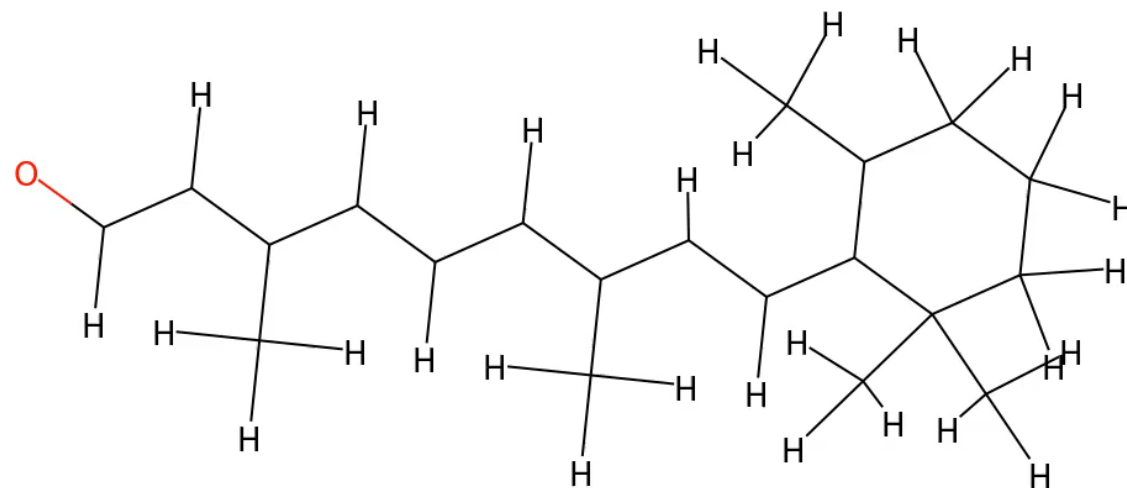
→ Infers bond orders and formal charges from there

\* can be guessed by MDAanalysis

# Inferring bond orders and charges

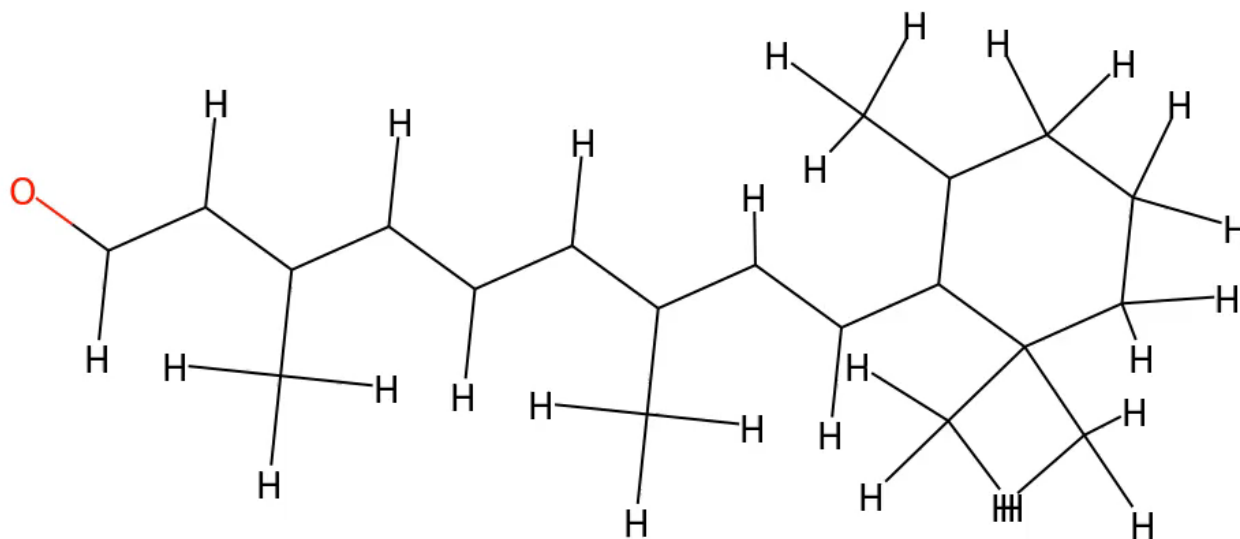
## Pseudo code:

```
1 For each atom:  
2   Compare expected vs current valence  
3   If all valence electrons are paired:  
4     Continue to next atom  
5   Else if atom exceeds expected valence:  
6     Assign (+) charge  
7   Else:  
8     If a neighbor can accept a double/triple bond:  
9       Increase bond order  
10  Else:  
11    Assign (-) charge
```



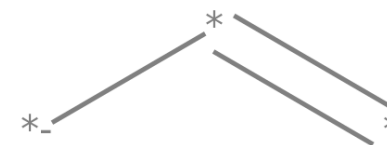
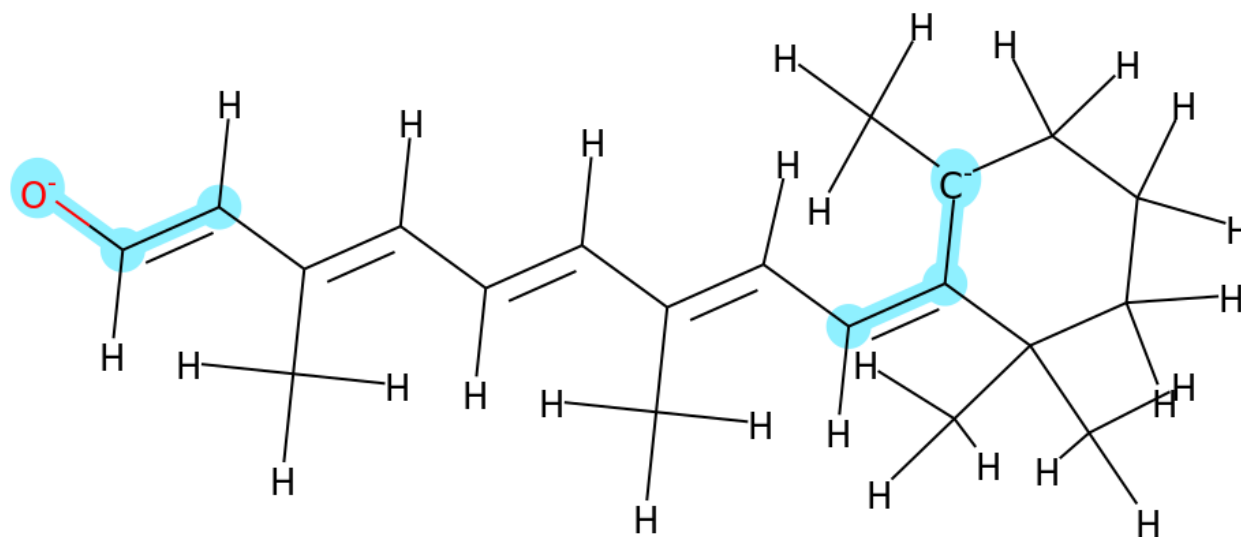
# Inferring bond orders and charges

## Problem 1: order dependency



# Inferring bond orders and charges

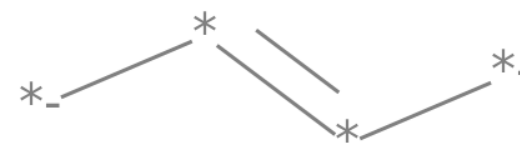
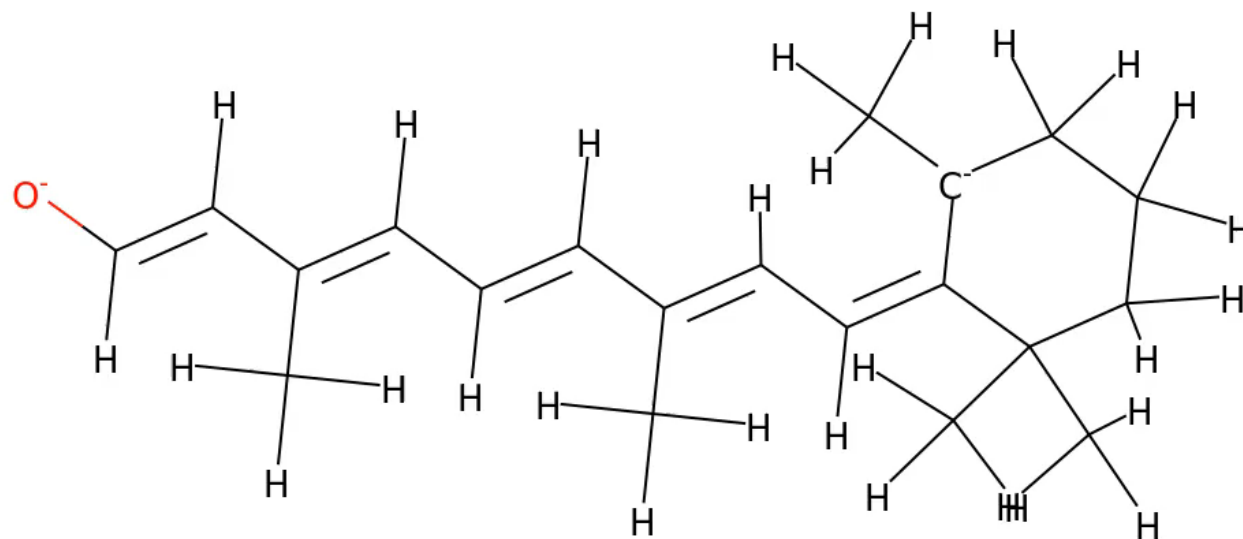
## Problem 1: order dependency





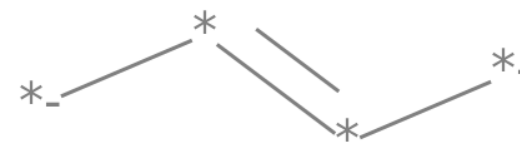
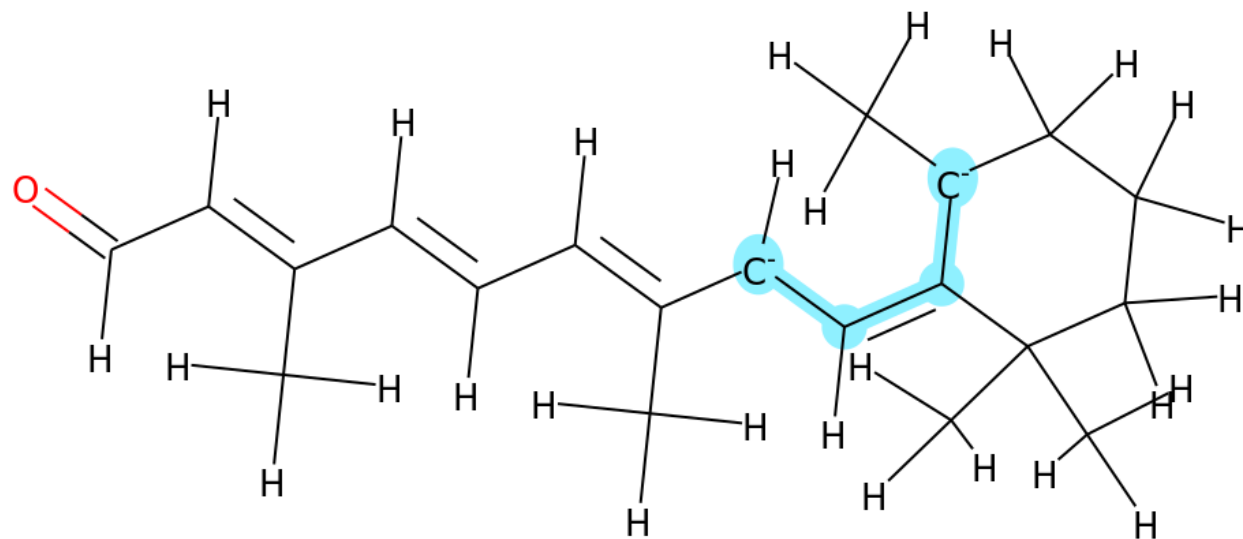
# Inferring bond orders and charges

## Problem 1: order dependency



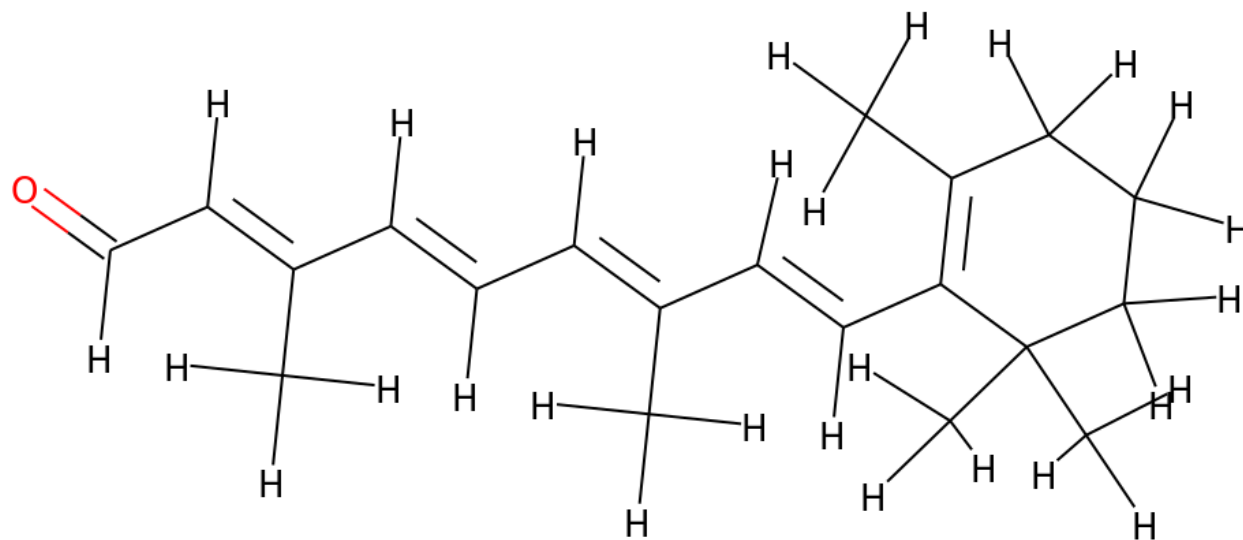
# Inferring bond orders and charges

## Problem 1: order dependency



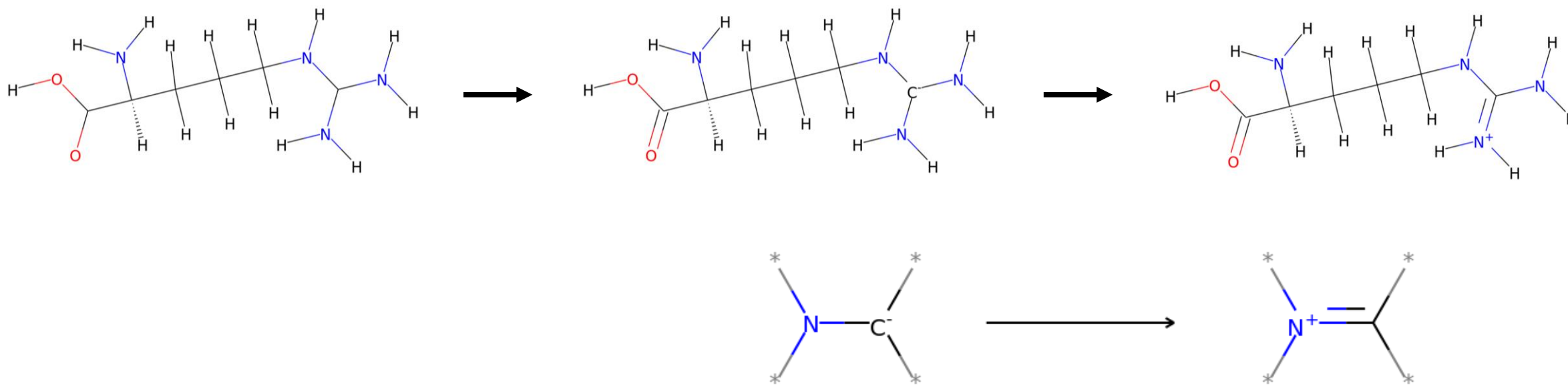
# Inferring bond orders and charges

## Problem 1: order dependency



# Inferring bond orders and charges

## Problem 2: logical pitfalls

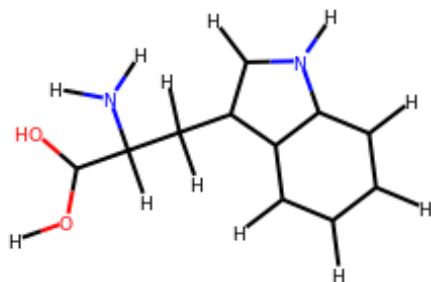




# Fallback option

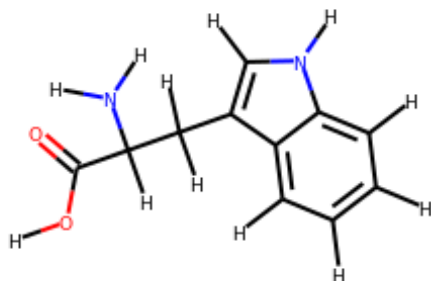
```
In [25]: ▶ mol = u.atoms.convert_to("RDKit", NoImplicit=False)  
mol
```

Out[25]:



```
In [26]: ▶ ref = Chem.MolFromSequence("W")  
ref = Chem.AddHs(ref)  
AllChem.AssignBondOrdersFromTemplate(ref, mol)
```

Out[26]:

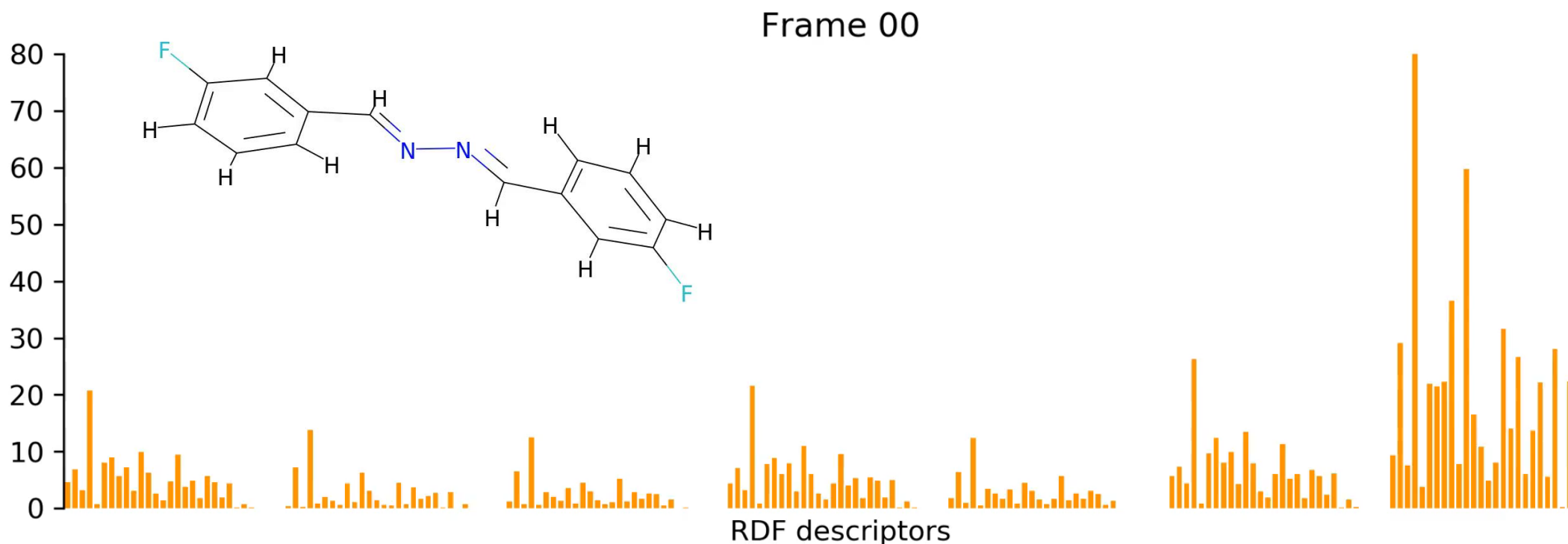


# Leveraging the interoperability



# 3D descriptors from MD simulations

```
In [5]: ▶ from MDAnalysis.analysis.RDKit import RDKitDescriptors  
u = mda.Universe(TOP, TRAJ)  
lig = u.select_atoms("resname LIG")  
desc = RDKitDescriptors(lig, "RDF").run()
```



# Smarter SMARTS selection

```
In [35]:  ► # charged residues  
          sel = u.select_atoms("protein and byres smarts [*+,*-]")  
          set(sel.residues.resnames)
```

```
Out[35]: {'ARG', 'ASP', 'GLU', 'LYS'}
```

```
In [36]:  ► # aromatic residues  
          sel = u.select_atoms("protein and byres smarts a")  
          set(sel.residues.resnames)
```

```
Out[36]: {'HSD', 'HSE', 'PHE', 'TRP', 'TYR'}
```



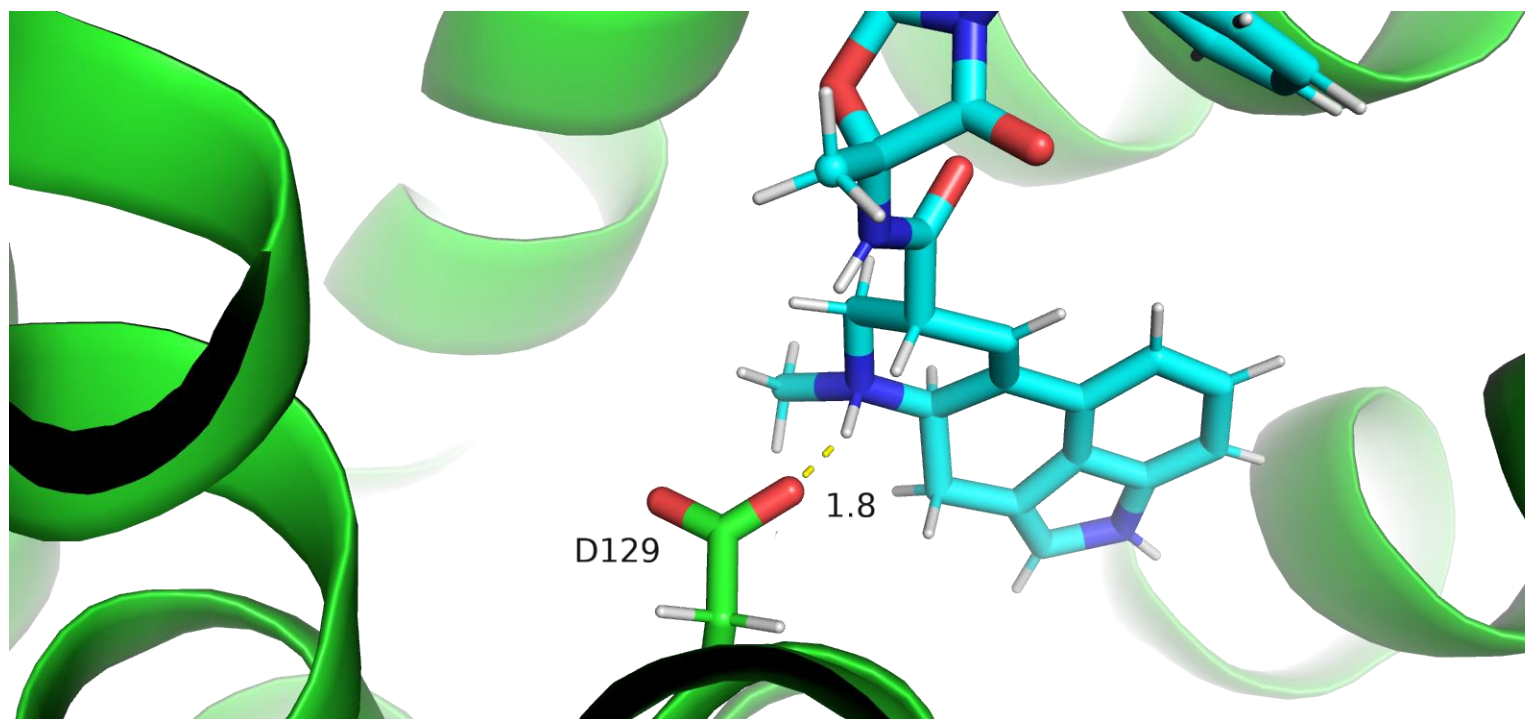
# Smarter SMARTS selection

```
In [51]: ▶ # protein atoms acting as HBond acceptors  
hbacc = u.select_atoms("(protein and smarts [O,N])"  
                        "and around 3.0 "  
                        "(resname ERM and smarts [$([H]-[O,N]))")")  
hbacc.residues[0]
```

Out[51]: <Residue ASP, 129>

ligand

Hbond donor



# But wait, there's more!

- Fingerprints

```
In [34]: ▶ from MDAnalysis.analysis.RDKit import get_fingerprint
lig = u.select_atoms("resname LIG")
fp = get_fingerprint(lig, "Morgan",
                    radius=2, hashed=True, nBits=1024)
# number of activated bits
len(fp.GetNonzeroElements())
```

Out[34]: 20

- Drawing AtomGroups

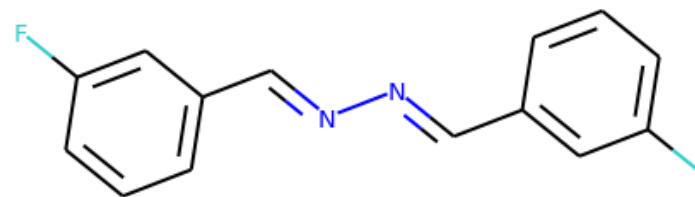
```
In [7]: ▶ # before
u.select_atoms("resname LIG")
```

Out[7]: <AtomGroup with 28 atoms>



```
In [8]: ▶ from MDAnalysis.visualization.RDKit import RDKitDrawer
u.select_atoms("resname LIG")
```

Out[8]:



# But wait, there's more!

- More features through RDKit-compatible packages:
  - Mordred (descriptors)

```
In [35]: ▶ from mordred import Calculator, descriptors
          desc = RDKitDescriptors(u.select_atoms("resname LIG"),
                                Calculator(descriptors)).run()
          # number of descriptors calculated
          len(desc.results[0,0].asdict())
```

Out[35]: 1826

- ODDT (docking and fingerprints)
- ...

# Acknowledgements

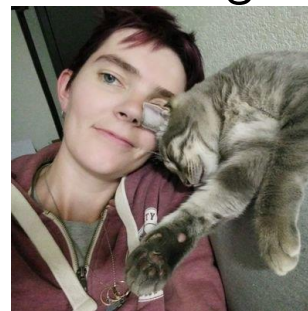


Google Summer of Code

NUMFOCUS  
[FISCALLY SPONSORED PROJECT]

- Mentors and MDAnalysis core devs

Irfan Alibay, Richard Gowers, Fiona Naughton, Oliver Beckstein



- RDKit and the community
- Chemosim Lab





# Summary

- New features in MDAnalysis (will be available in version 2.0)

```
1 mda.Universe.from_smiles(...)
2 mda.Universe(mol)
3 atomgroup.convert_to("RDKit")
4 universe.select_atoms("smarts ...")
5 RDKitDescriptors(atomgroup, ...)
6 get_fingerprint(atomgroup, ...)
7 RDKitDrawer()
```

- Development of a valence-based and rule-based method to quickly infer bonds orders and formal charges