

# Tuning frictional properties of graphene sheets using kirigami inspired cuts and inverse design

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# Project description

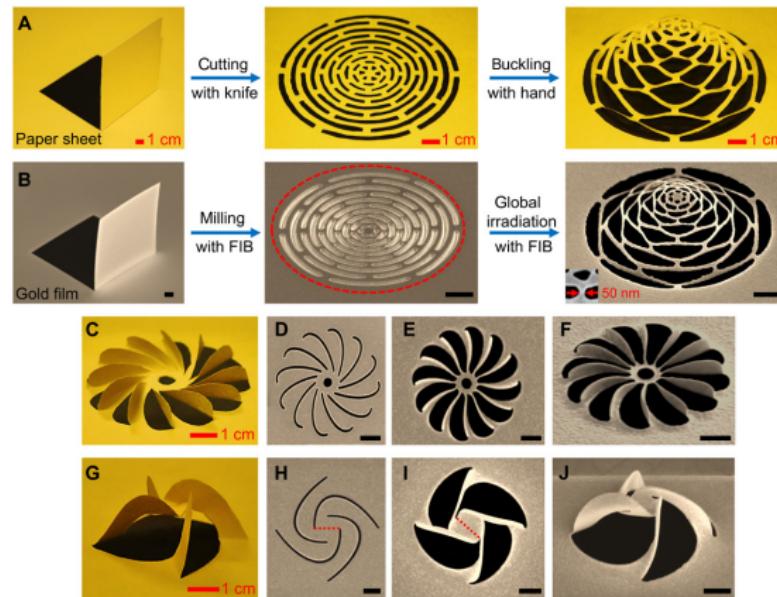
3 stages

- ① Sheet kirigami: Alter graphene sheet using atomic scale cuts.
- ② Forward simulation: Calculate frictional properties of the sheet using MD simulations.
- ③ Inverse design: Predict cut patterns based on frictional properties and optimize for desired properties using machine learning.
  - Low / high friction coefficient.
  - Coupling between stretch and friction.

# Motivation

Kirigami inspired cuts

Kirigami: Variation of origami with cuts permitted.



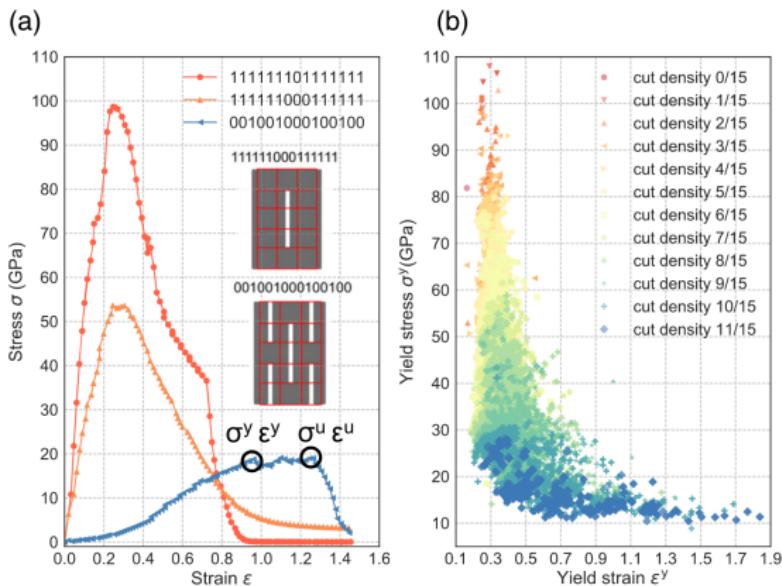
**Figure:** Example of transition from macro- to nano-kirigami using a focused ion-beam (FIB) (Nano-kirigami with giant optical chirality, ZHIGUANG LIU, 2018).

# Motivation

Kirigami inspired cuts

*Accelerated Search and Design of Stretchable Graphene Kirigami Using Machine Learning, Paul Z. Hanakata, 2018.*

- Kirigami inspired cuts is used to tune **yield stress** and **yield strain** as a function of cutting pattern.
- A side effect is buckling into the third dimension.



**Figure:** (a) Stress-strain plot of three representative kirigamis. Inset shows the “typical” kirigami cuts. (b) Yield stress as a function of yield strain for different configurations.

# Motivation

## Friction laws

- Friction laws at different scales:

Microscopic:  $F_f = \mu \cdot F_N$  ( independent of  $A$ ),

Nanoscale:  $F_f \propto A = N_c \cdot A_c$ ,

where  $F_f$  is friction force,  $\mu$  is the friction coefficient,  $F_N$  is the normal force,  $A$  is the contact area and  $N_c$  is the average number of atoms in contact with an average contact area  $A_c$ .

# Motivation

Nanomachine for negative friction coefficient

$$\left. \begin{array}{l} \text{Contact area : } A_0 = k \cdot F_N \\ \text{Kirigami : } A = A_0 - s_1 \cdot \text{stretch} \\ \text{Nanomachine : stretch} = s_2 \cdot F_n \end{array} \right\} \Rightarrow F_f \propto A = \underbrace{(k - s_1 \cdot s_2)}_{\mu} \cdot F_N$$

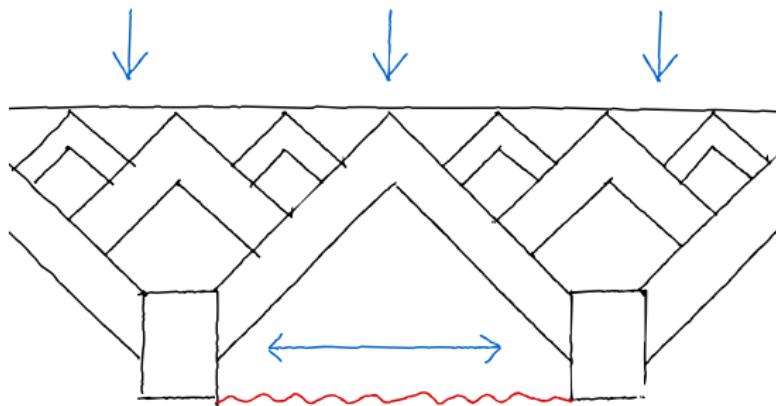
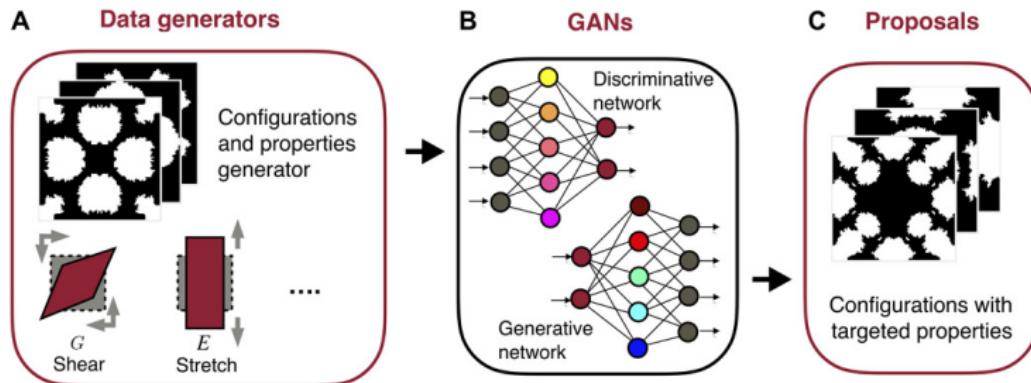


Figure: Sketch for nanomachine coupling normal force and stretch.

# Motivation

## Inverse design

*Designing complex architectured materials with generative adversarial networks, YUNWEI MAO, 2020.*

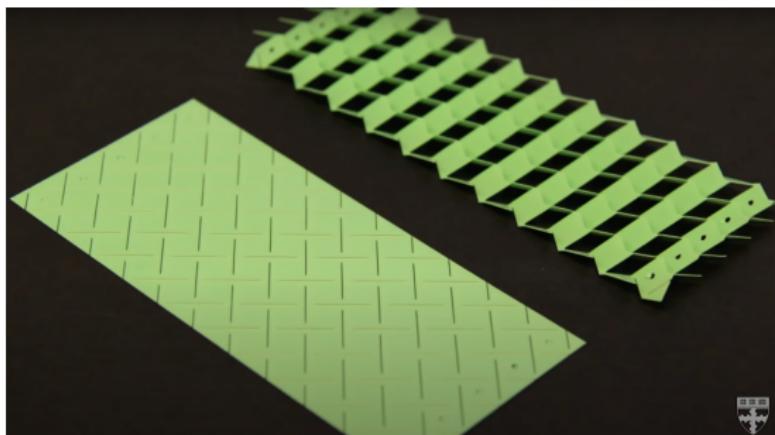


**Figure:** (A) Data generators to generate datasets of configurations and properties of architectured materials. (B) GANs trained by the datasets. (C) New designs of architectured materials with the targeted properties proposed by the GANs.

# Stage 1 - Kirigami cuts

Choosing a cut pattern

- Kirigami design on macroscale.



**Figure:** New pop-up strategy inspired by cuts, not folds - Leah Burrows, Harvard John A. Paulson School of Engineering and Applied Sciences.

# Stage 1 - Kirigami cuts

Choosing a cut pattern

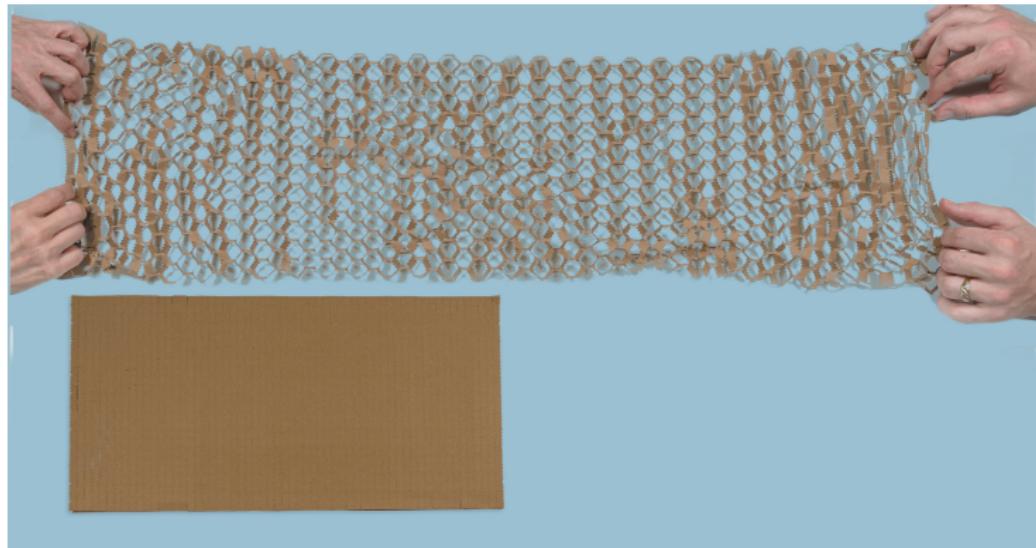
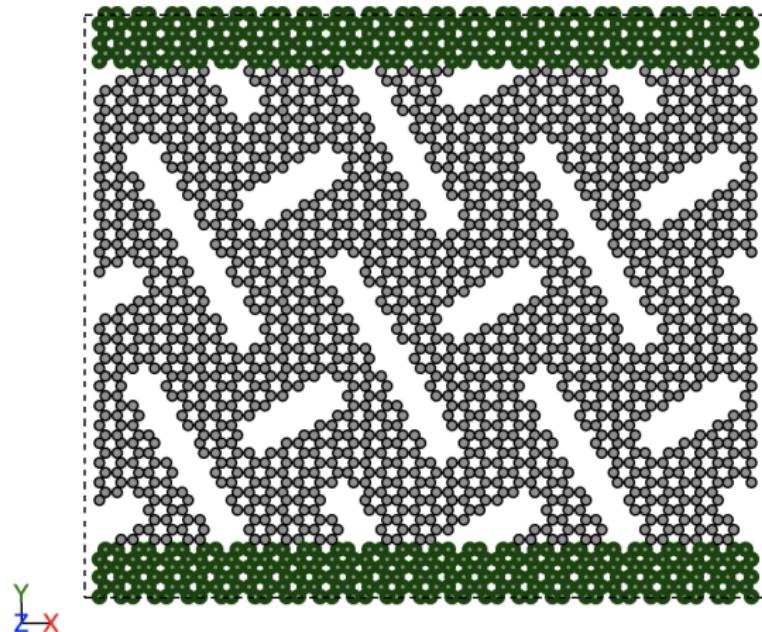


Figure: Scotch Cushion Lock Protective Wrap.

# Stage 1 - Kirigami cuts

Choosing a cut pattern



**Figure:** Example of cut pattern. The grey color marks the cuttable sheet while green marks added blocks for stretching and dragging the sheet.

# Stage 1 - Kirigami cuts

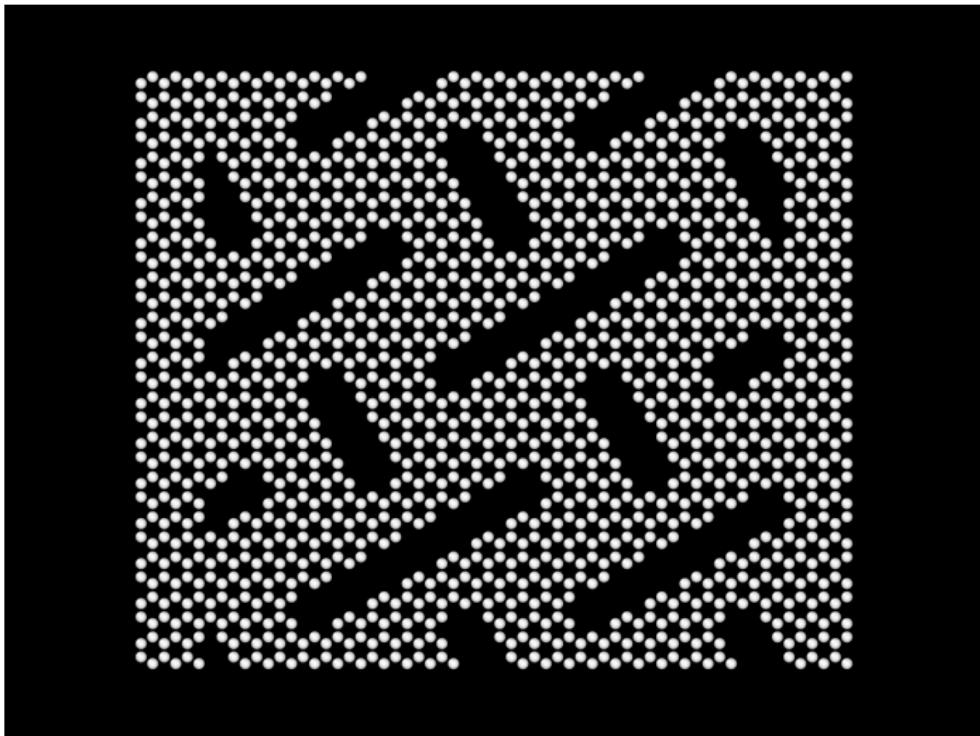


Figure: Kirigami sheet stretch in vacuum.

# Stage 1 - Kirigami cuts

Investigating 3D buckling

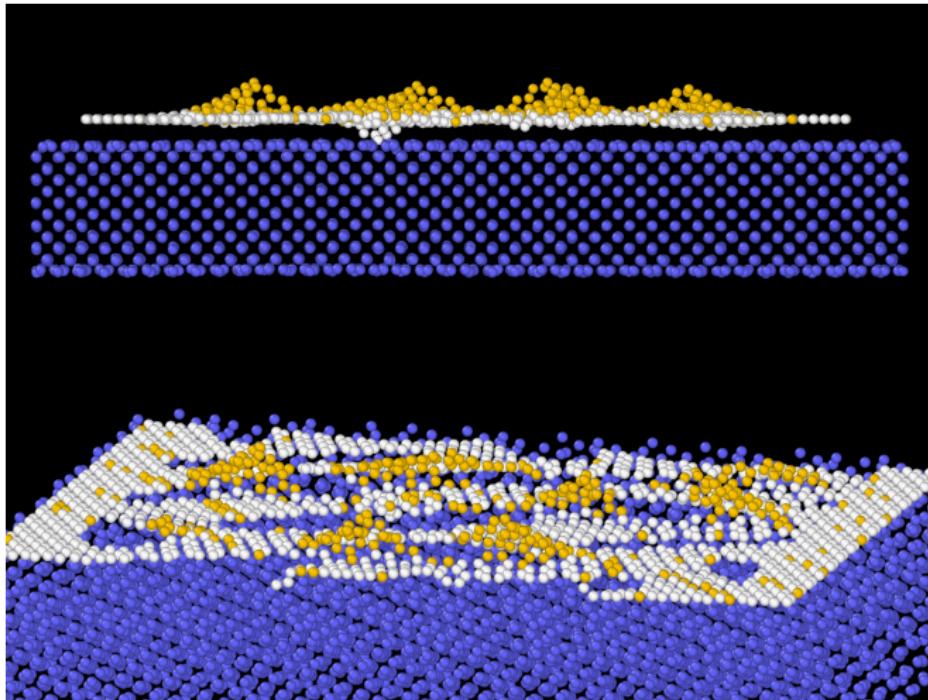
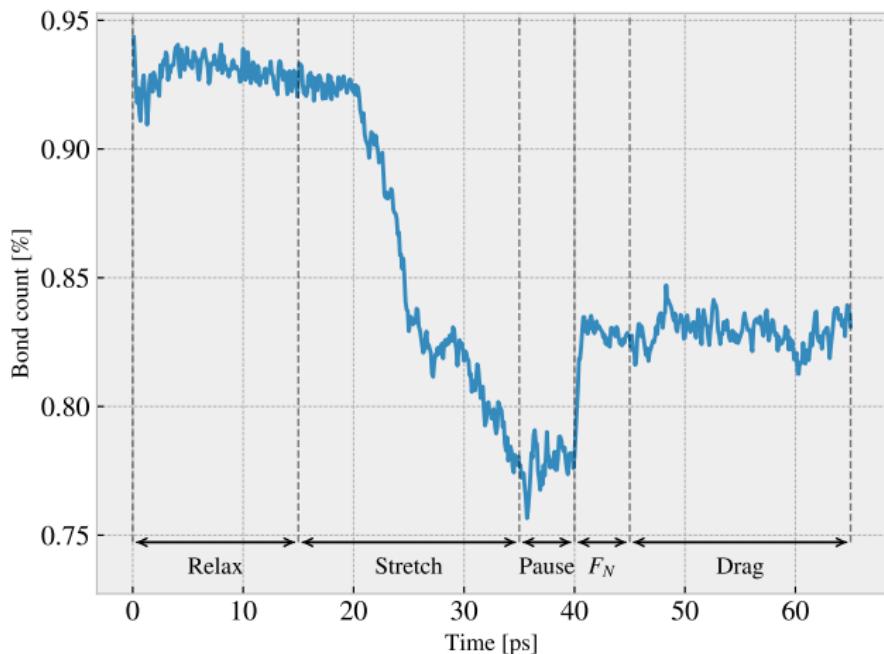


Figure: Kirigami stretch in contact with Si-substrate.

# Stage 1 - Kirigami cuts

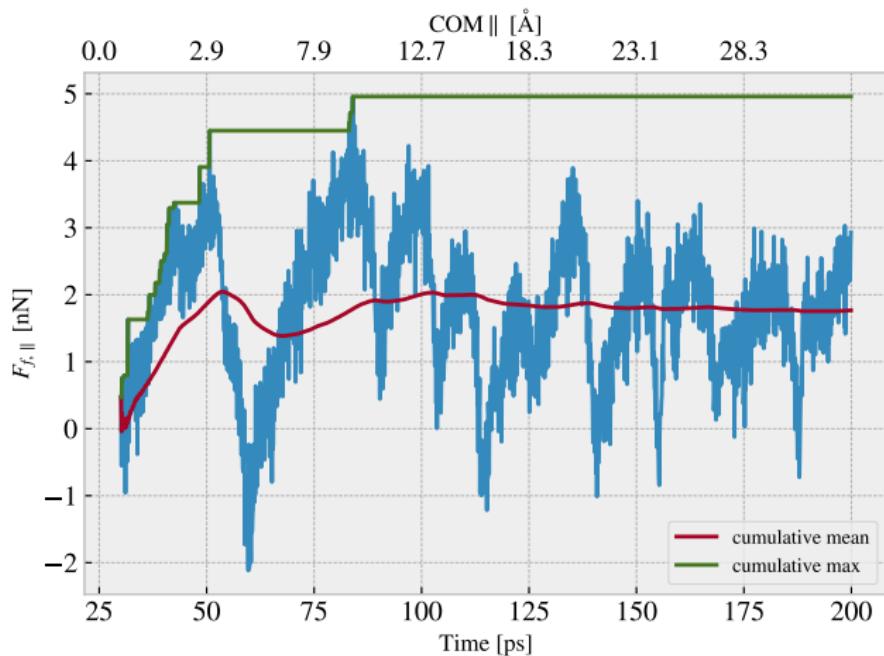
Investigating 3D buckling



**Figure:** Contact area: number of C-Si bonds within a threshold distance of 110% the equilibrium distance in LJ the potential.

# Stage 2 - MD measurements

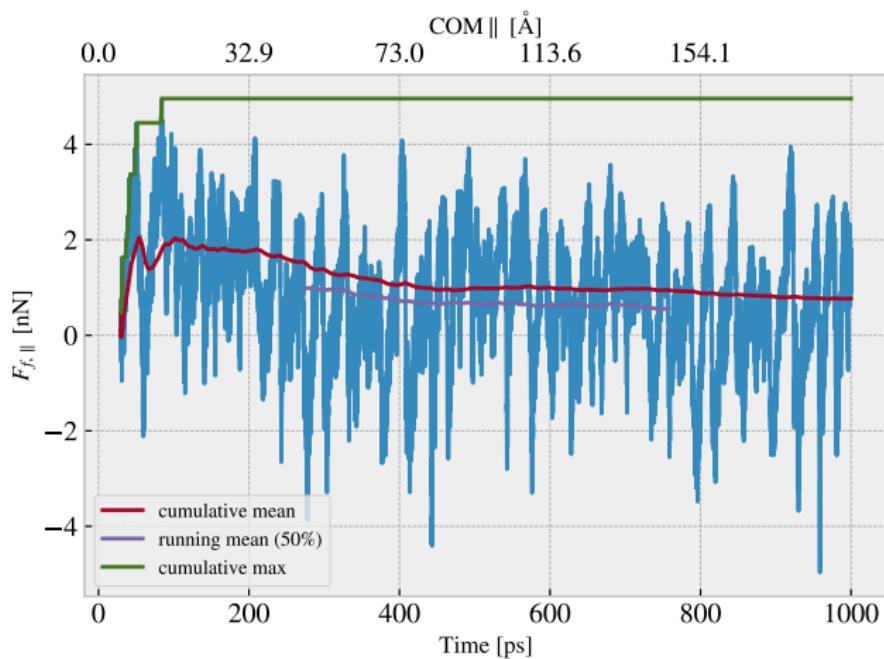
Friction force



**Figure:** Friction force parallel to drag direction with normal force  $F_N = 200$  nN.  
Drag distance = 40 Å

# Stage 2 - MD measurements

Friction force



**Figure:** Friction force parallel to drag direction with normal force  $F_N = 200$  nN.  
Drag distance = 200 Å.

# Stage 2 - MD measurements

Contact area

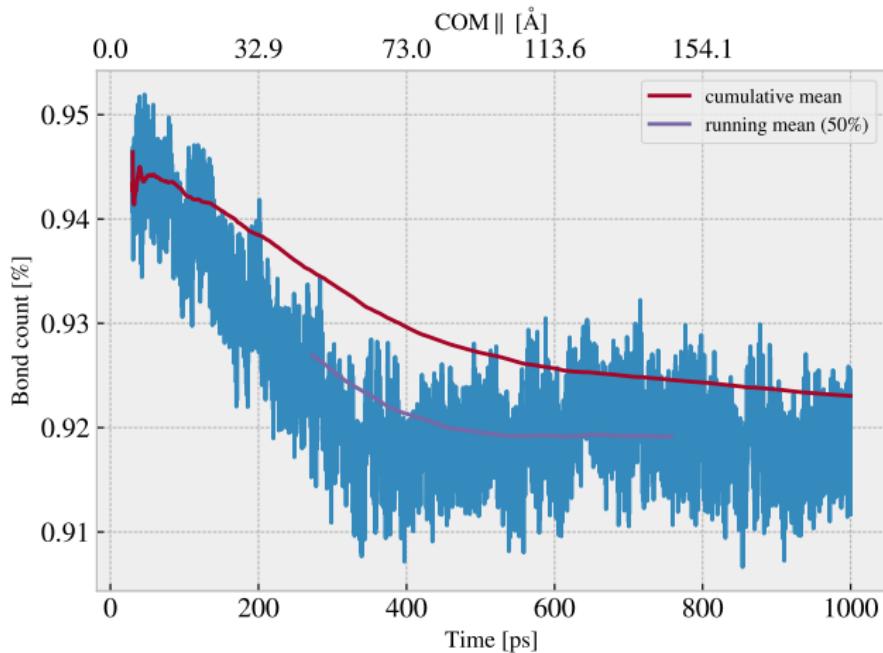


Figure: Contact bond count with normal force  $F_N = 200$  nN. Drag distance = 200 Å.

# Stage 2 - MD measurements

Contact area

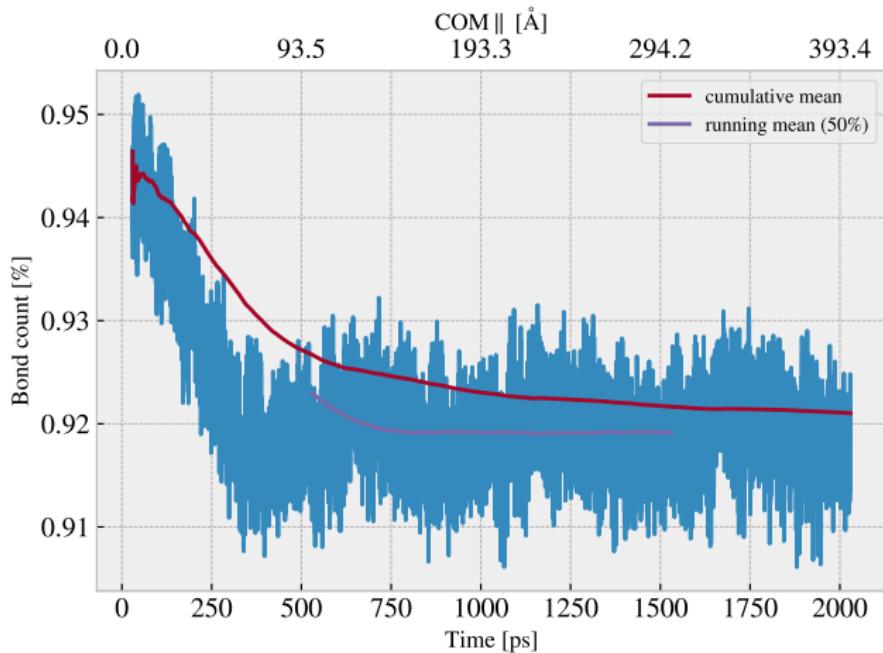
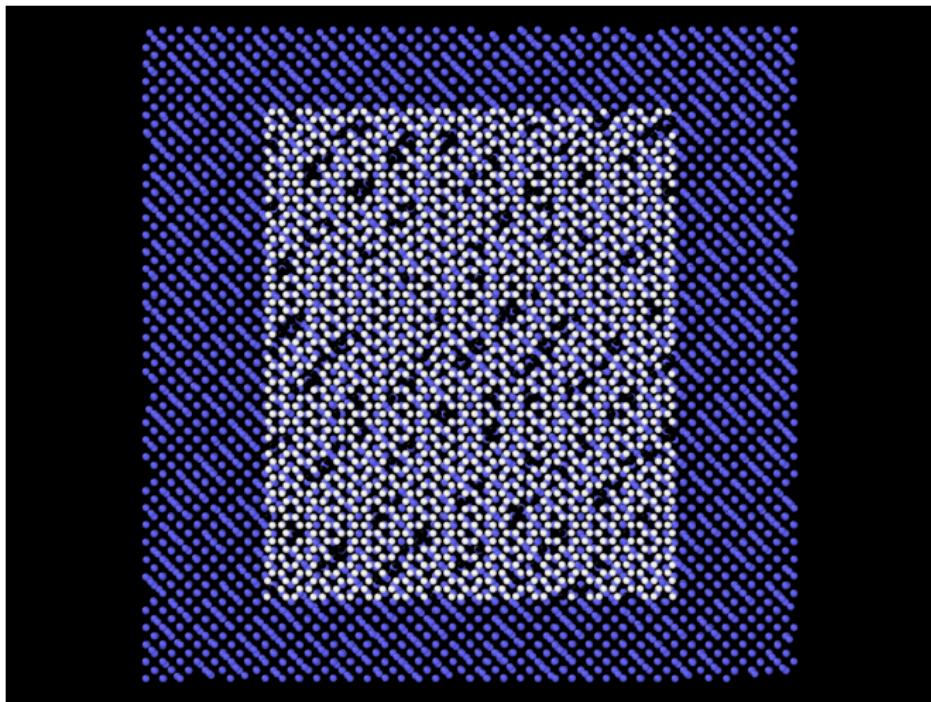


Figure: Contact bond count with normal force  $F_N = 200$  nN. Drag distance = 400 Å.

# Stage 2 - MD measurements

Static non-bonded regions



**Figure:** Contact visualization (black atoms is non-bonded).  $F_N = 200 \text{ nN}$ , Drag length =  $400 \text{ \AA}$ .

# Stage 2 - MD measurements

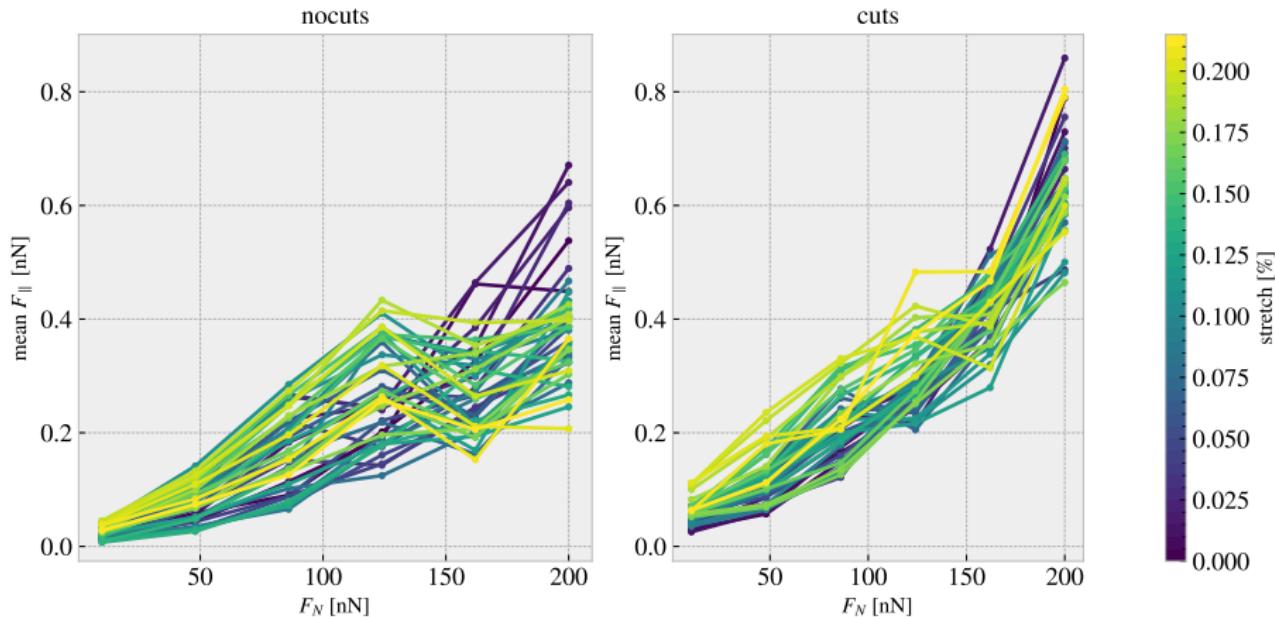
## Parameters

Category	Parameter	Range
Physical (free)	Temperatur	[0, 300] K
	Drag speed	[1, 20] m/s
Physical (ML input)	Cut configuration	No ruptures
	Scan angle	[0, 90°]
	Stretch amount	[0, 20] %
	Normal force	[10, 200] nN
MD settings	Relax and pauses	~ 10 ps
	Stretch speed	[0.5, 0.1] %/ps
	Drag spring constant	[10, $\infty$ ] N/m
	Drag length	[50, 400] Å
	Sheet size	~ $62 \times 75$ Å

Table: Relevant parameters of MD simulation and approximate ranges.

# Stage 2 - MD measurements

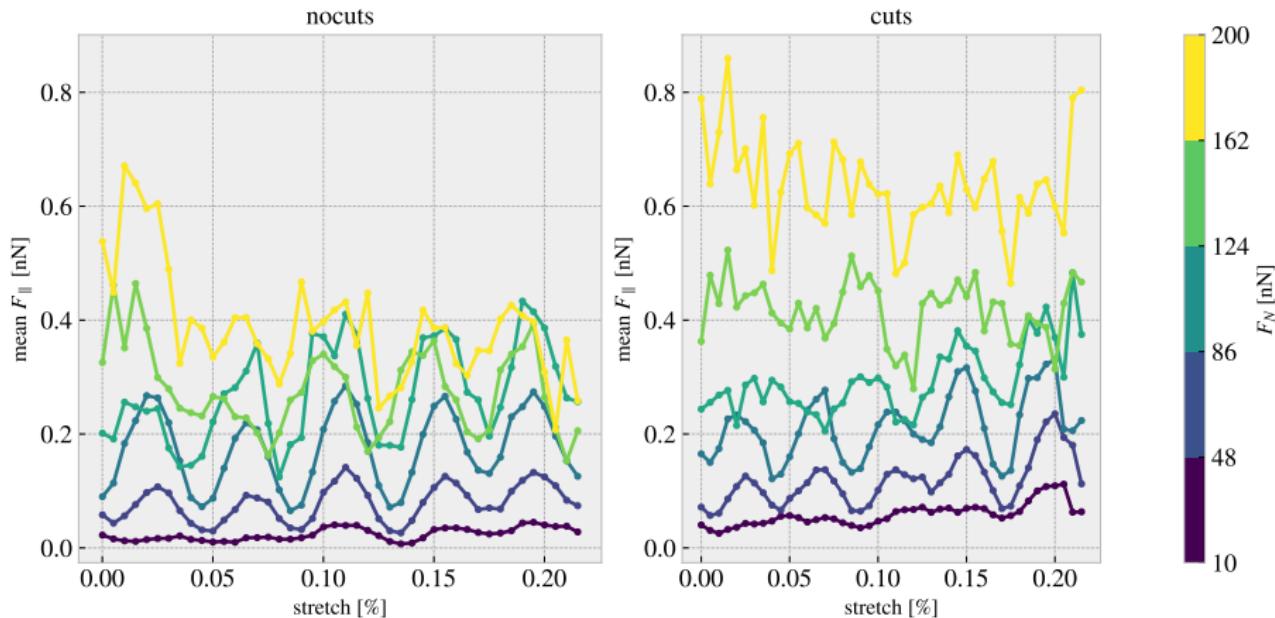
Varying normal force and stretch



**Figure:** Mean friction force  $F_{\parallel}$  parallel to drag direction versus applied normal force ( $F_N$ ) with and without cuts.

# Stage 2 - MD measurements

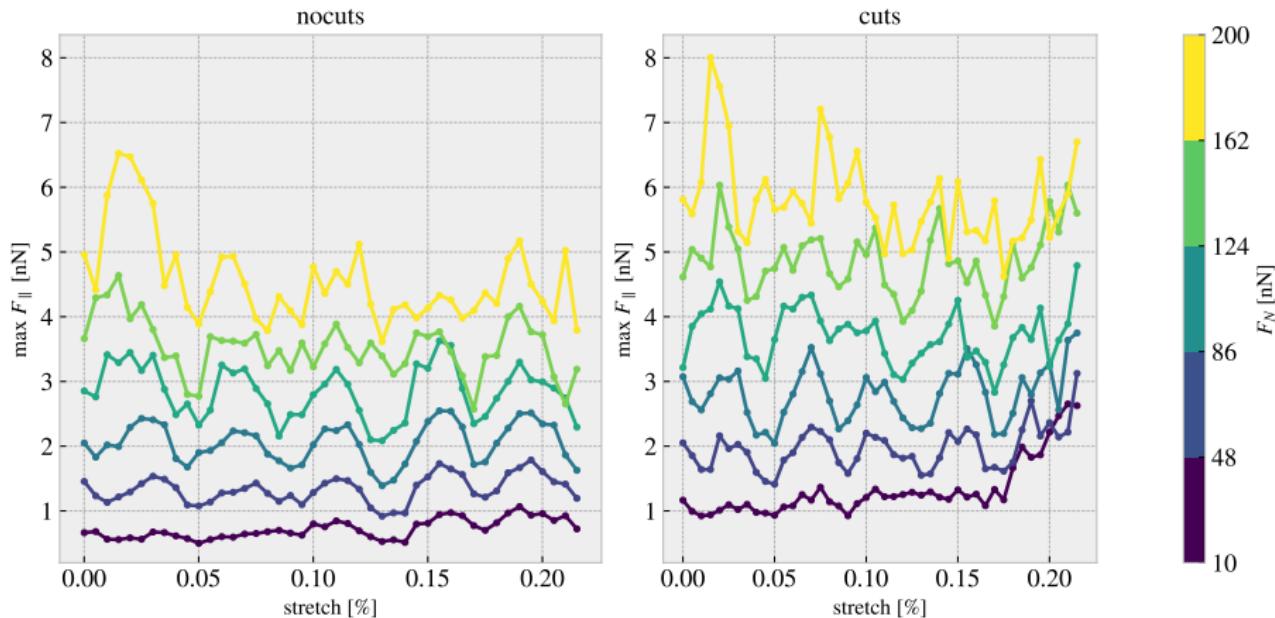
Varying normal force and stretch



**Figure:** Mean friction force  $F_{\parallel}$  parallel to drag direction versus stretch of the sheet with and without cuts.

# Stage 2 - MD measurements

Varying normal force and stretch



**Figure:** Max friction force  $F_{\parallel}$  parallel to drag direction versus stretch of the sheet with and without cuts.

# Stage 2 - MD measurements

Varying normal force and stretch

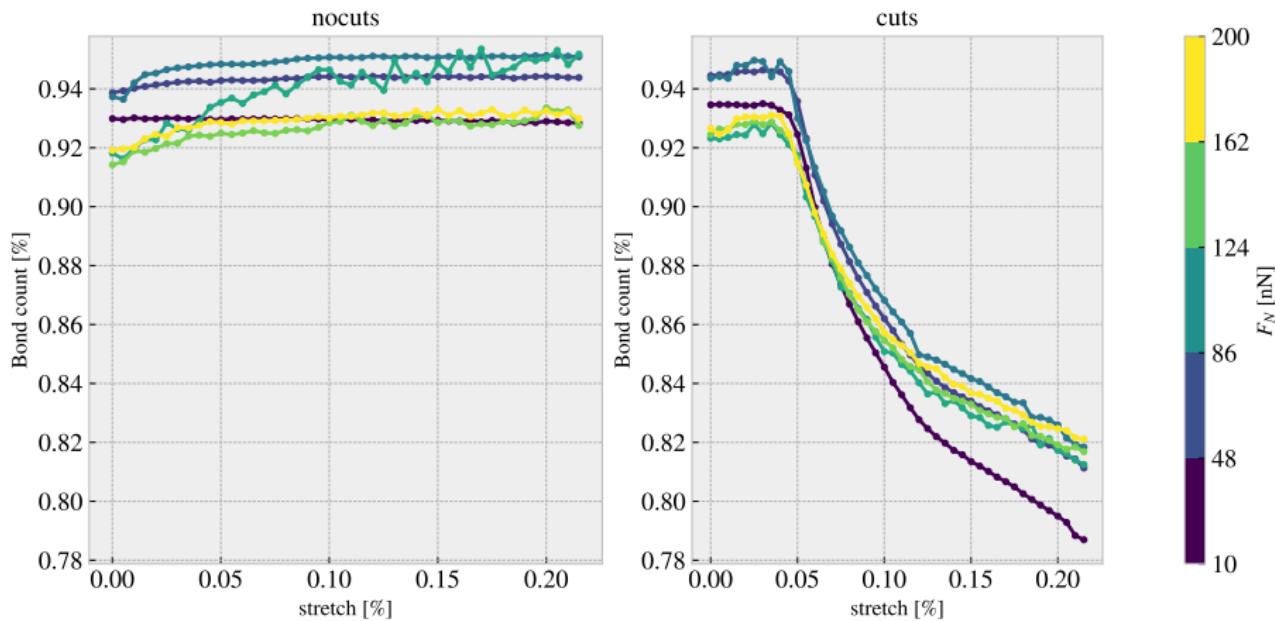


Figure: Contact bonds versus stretch of the sheet with and without cuts.

# Stage 2 - MD measurements

Varying normal force and stretch

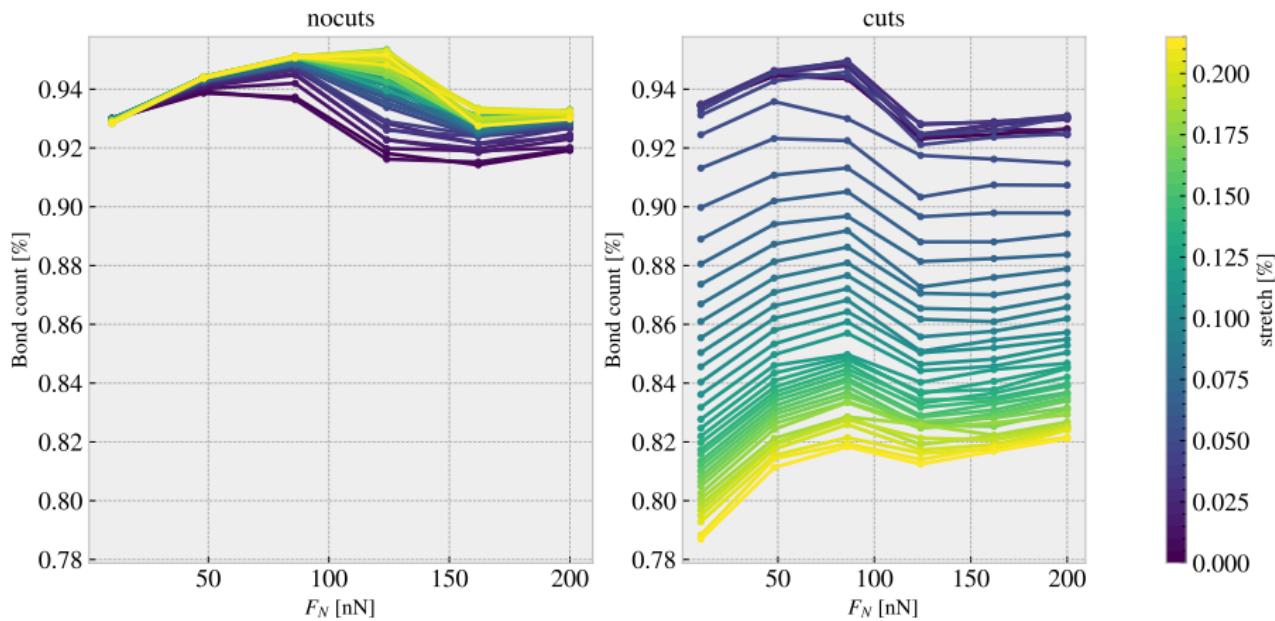
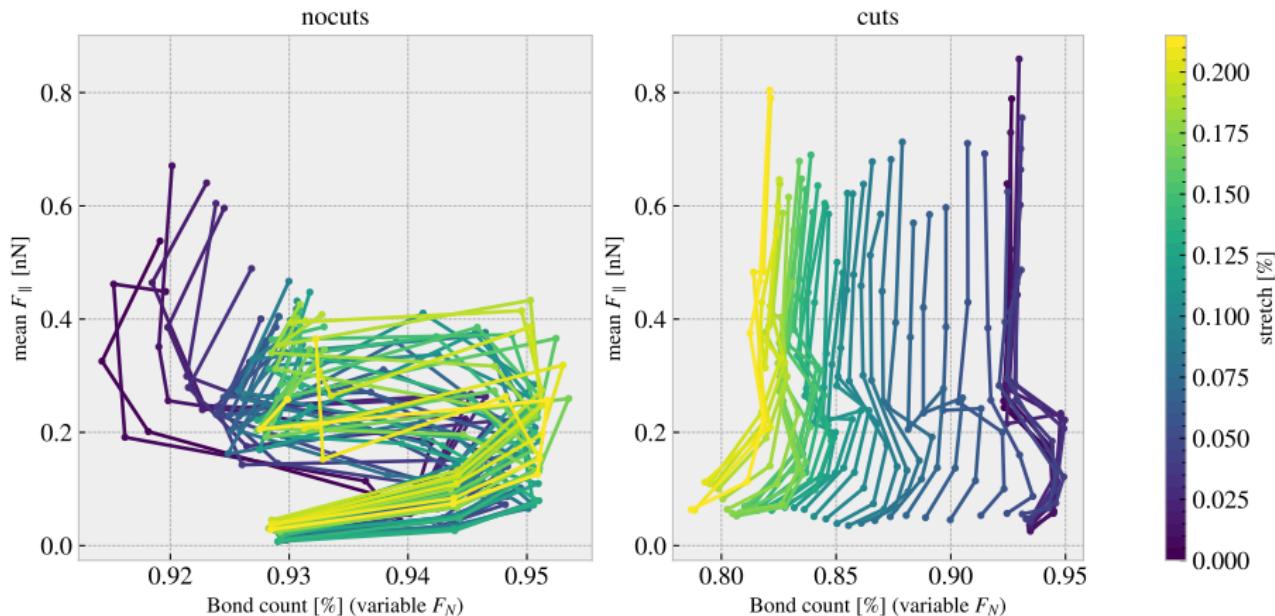


Figure: Contact bonds versus normal force  $F_N$  of the sheet with and without cuts.

# Stage 2 - MD measurements

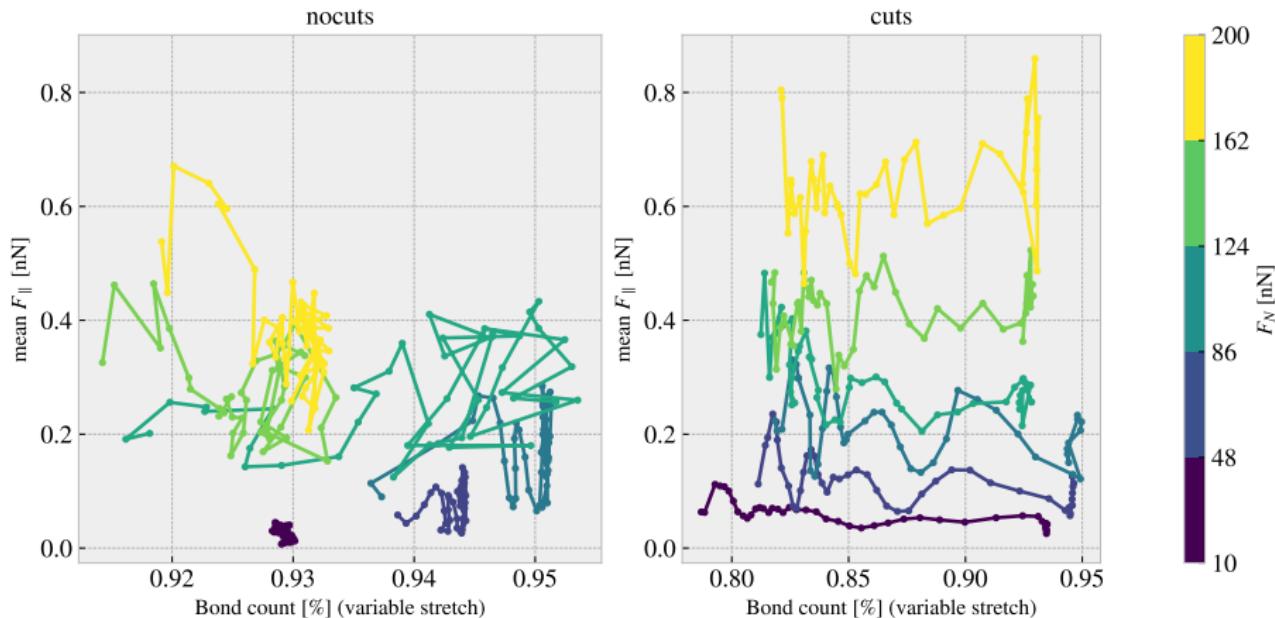
Varying normal force and stretch



**Figure:** Mean friction force  $F_{\parallel}$  parallel to drag direction versus contact bonds (varied by normal force  $F_N$ ) with and without cuts.

# Stage 2 - MD measurements

Varying normal force and stretch



**Figure:** Mean friction force  $F_{\parallel}$  parallel to drag direction versus contact bonds (varied by normal force stretch) with and without cuts.

# Stage 2 - MD measurements

New data

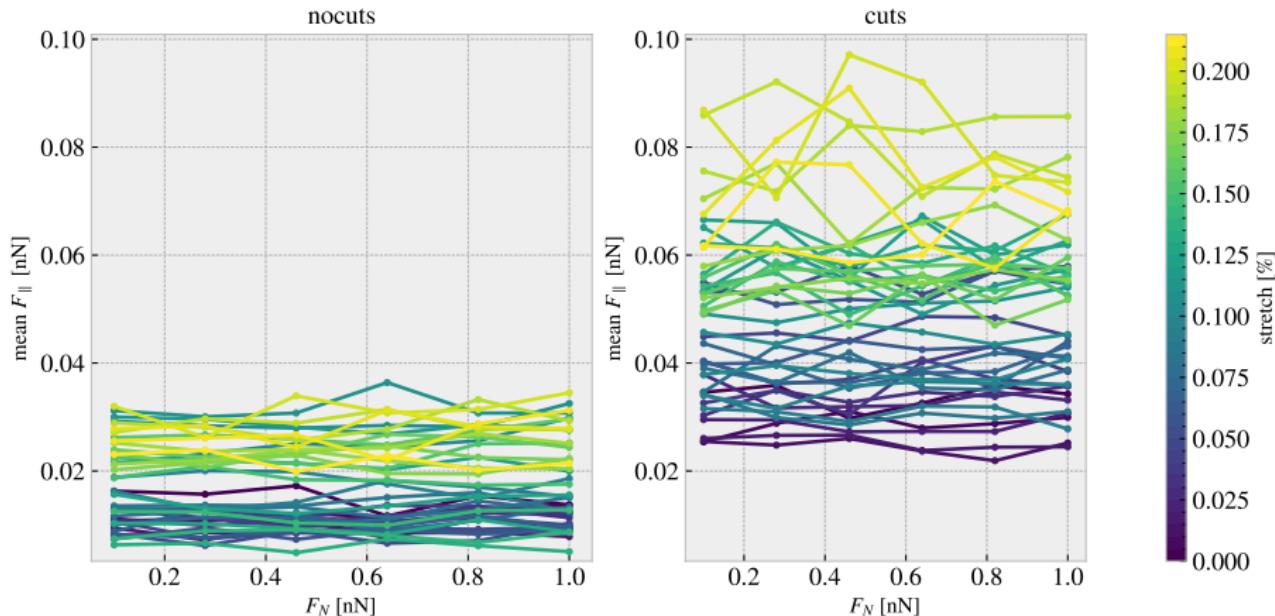
## New data

Investigate different  $F_N$  range:

$$F_N = [10, 200] \rightarrow [0.1, 1] \text{nN}$$

# Stage 2 - MD measurements

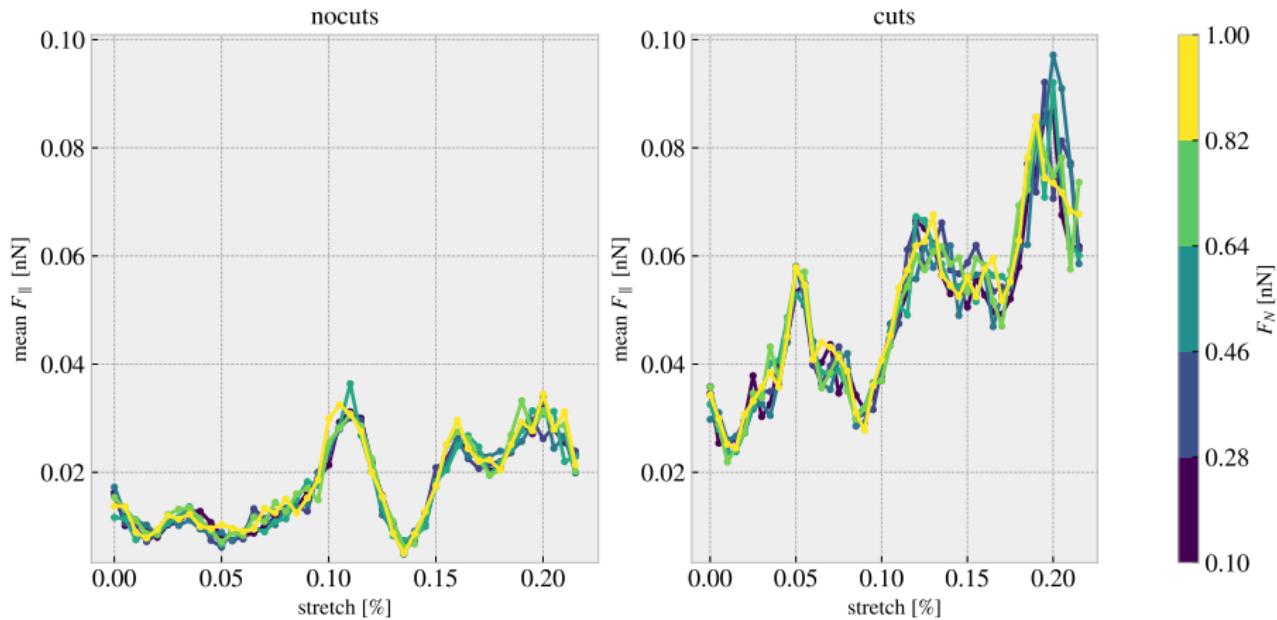
Varying normal force and stretch



**Figure:** Mean friction force  $F_{\parallel}$  parallel to drag direction versus applied normal force ( $F_N$ ) with and without cuts.

# Stage 2 - MD measurements

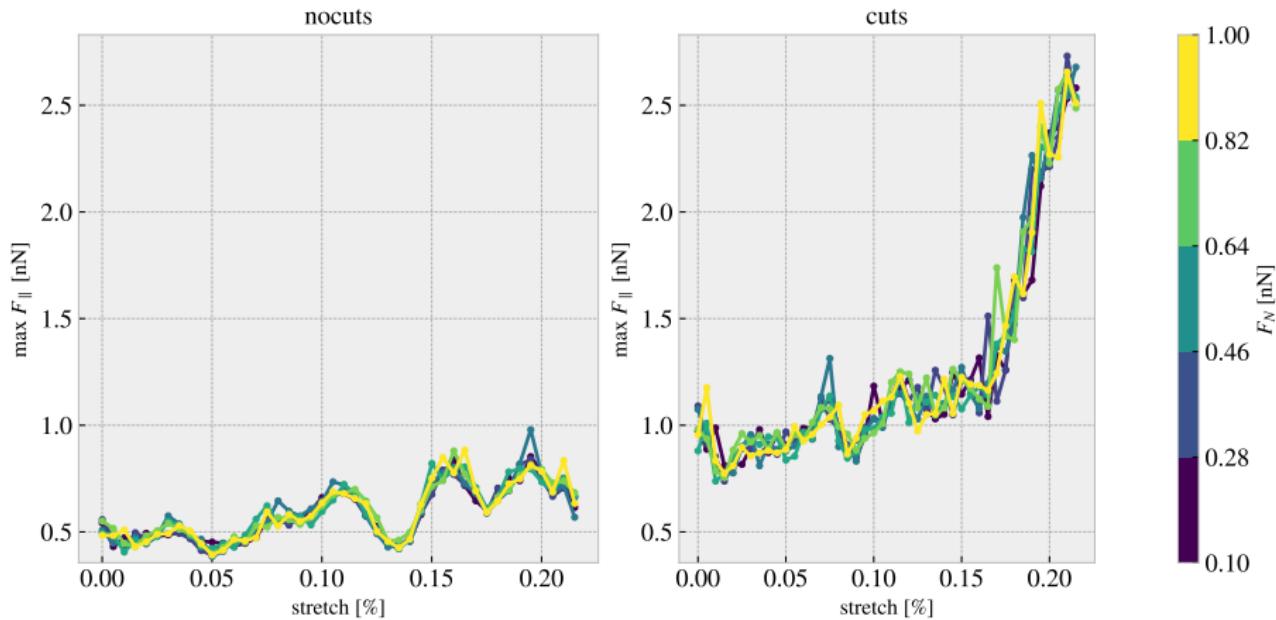
Varying normal force and stretch



**Figure:** Mean friction force  $F_{\parallel}$  parallel to drag direction versus stretch of the sheet with and without cuts.

# Stage 2 - MD measurements

Varying normal force and stretch



**Figure:** Max friction force  $F_{\parallel}$  parallel to drag direction versus stretch of the sheet with and without cuts.

# Stage 2 - MD measurements

Varying normal force and stretch

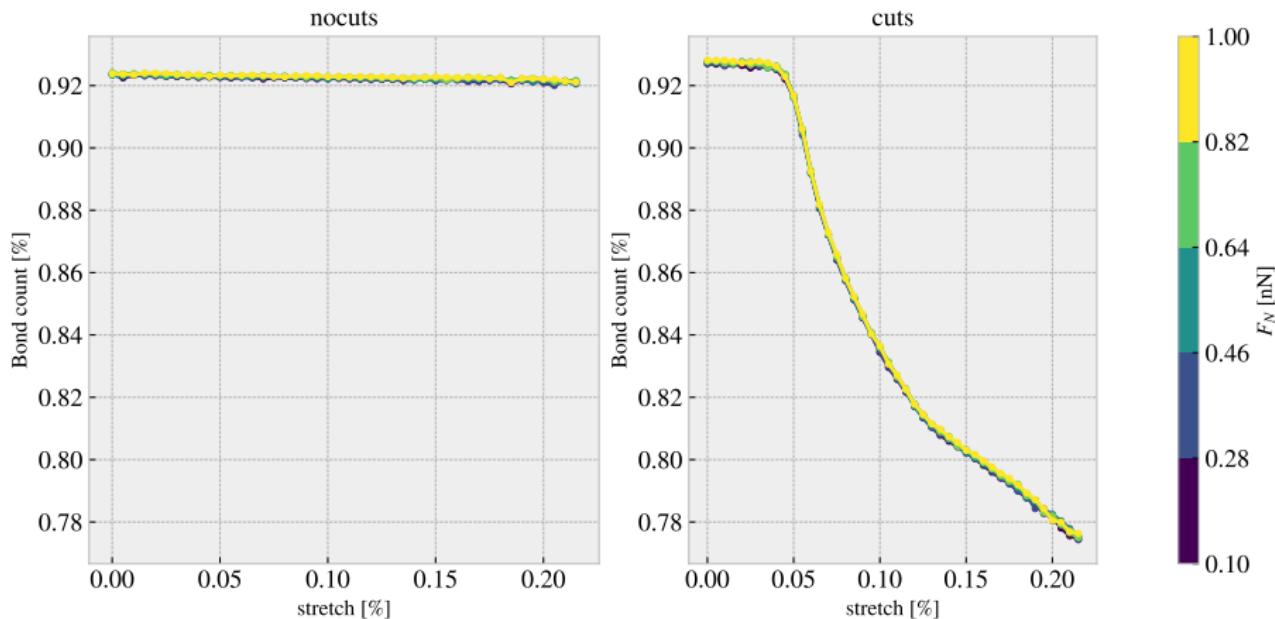


Figure: Contact bonds versus stretch of the sheet with and without cuts.

# Stage 2 - MD measurements

Varying normal force and stretch

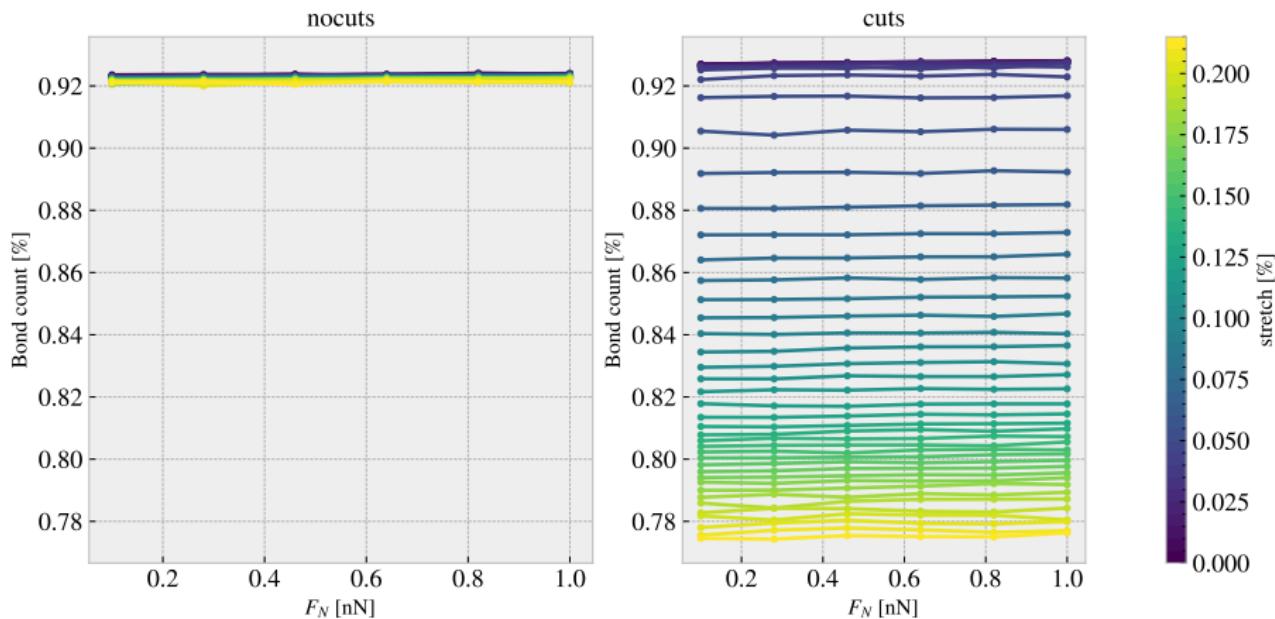
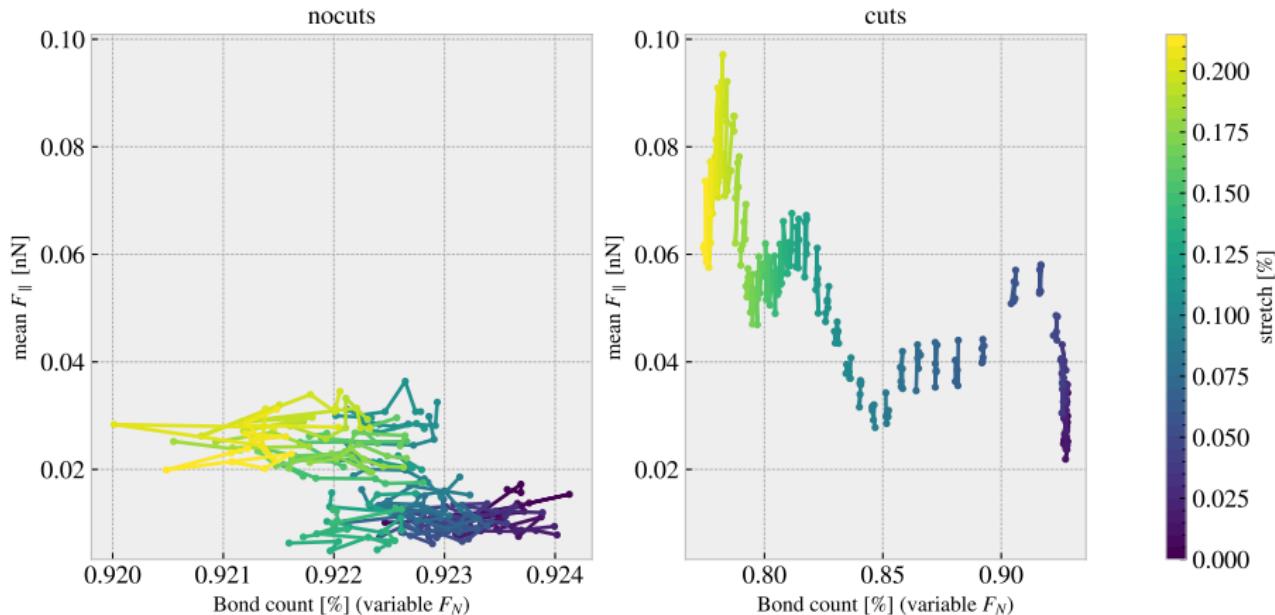


Figure: Contact bonds versus normal force  $F_N$  of the sheet with and without cuts.

# Stage 2 - MD measurements

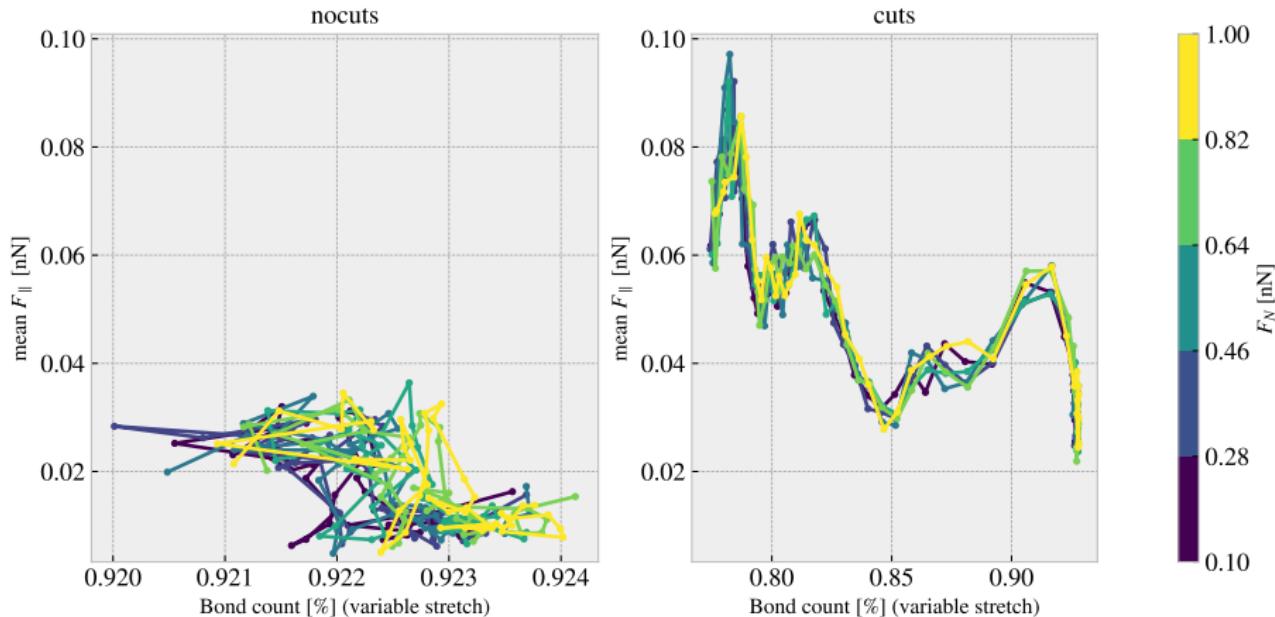
Varying normal force and stretch



**Figure:** Mean friction force  $F_{\parallel}$  parallel to drag direction versus contact bonds (varied by normal force  $F_N$ ) with and without cuts.

# Stage 2 - MD measurements

Varying normal force and stretch



**Figure:** Mean friction force  $F_{\parallel}$  parallel to drag direction versus contact bonds (varied by normal force stretch) with and without cuts.

# Stage 2 - MD measurements

More data

Three different normal force ranges

$$F_N = [0.1, 1] \text{ nN}$$

$$F_N = [1, 10] \text{ nN}$$

$$F_N = [10, 86] \text{ nN}$$

# Stage 2 - MD measurements

Different normal force domains

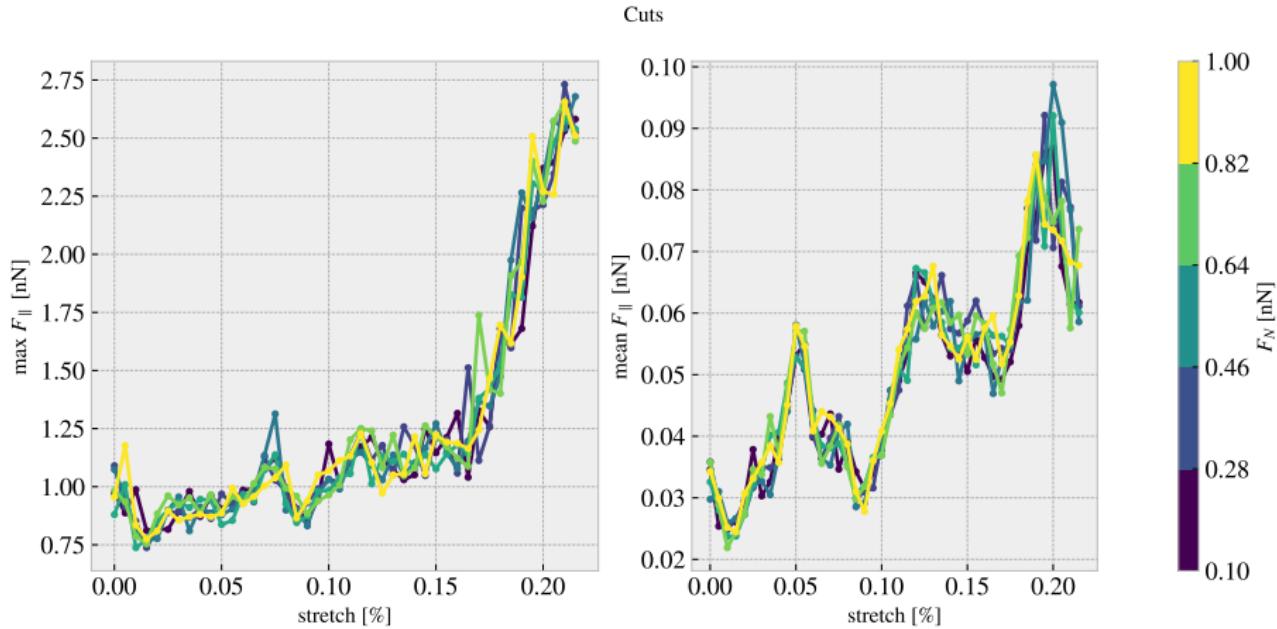


Figure: Max and mean friction for  $F_N = [0.1, 1]$  nN for cutted sheet

# Stage 2 - MD measurements

Different normal force domains

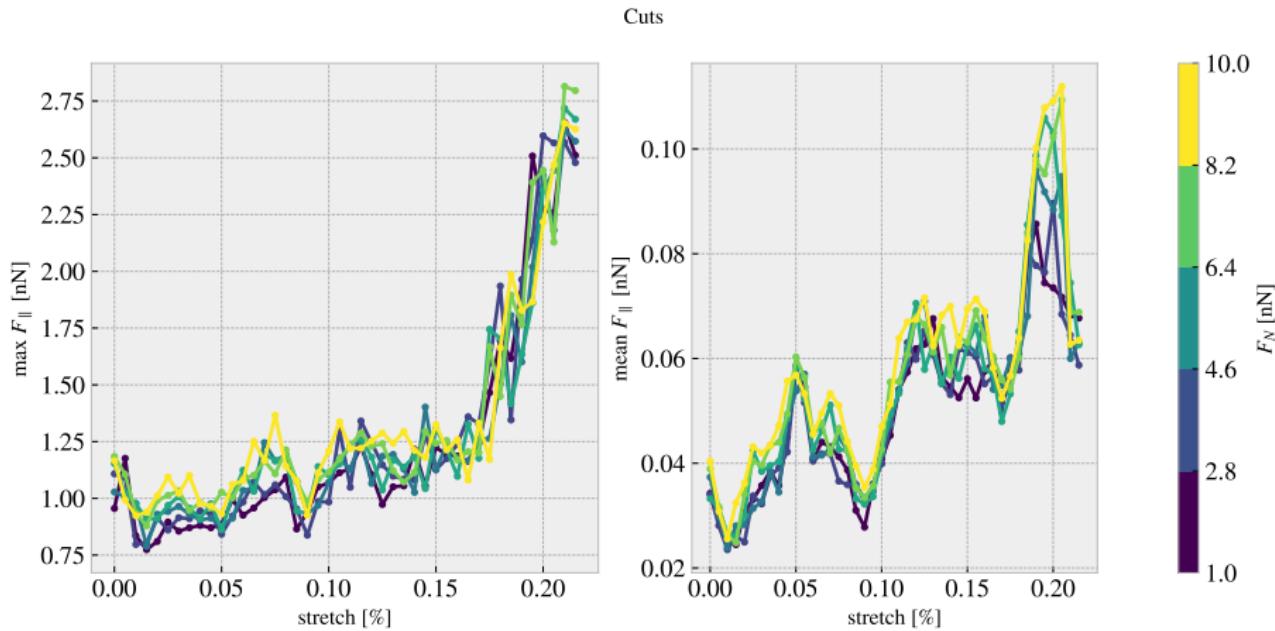


Figure: Max and mean friction for  $F_N = [1, 10]$  nN for cutted sheet

# Stage 2 - MD measurements

Different normal force domains

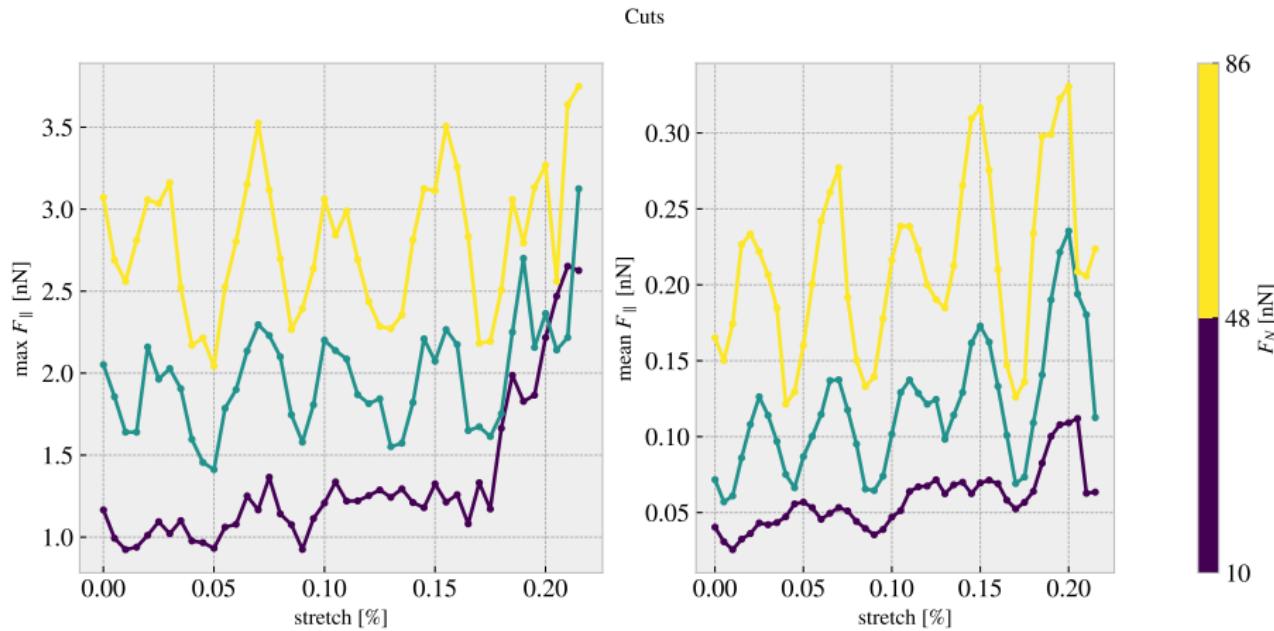


Figure: Max and mean friction for  $F_N = [10, 86]$  nN for cutted sheet

# Stage 2 - MD measurements

More data

Contribution from different parts, Full sheet = sheet + Pull blocks

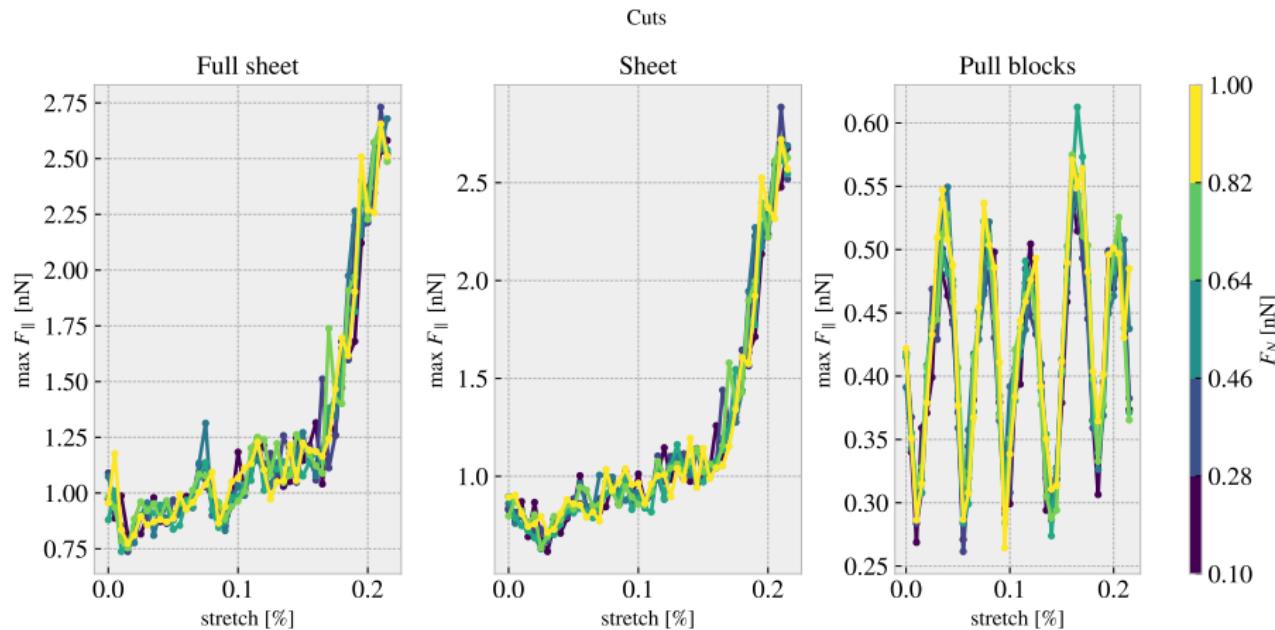


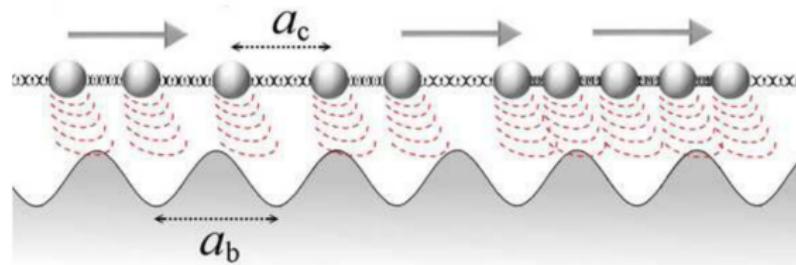
Figure: Max friction for different parts of the cutted sheet,  $F_N = [0.1, 1]$ .

# Stage 2 - MD measurements

## Frenkel-Kontorova Model

Friction force dependence of stretch might be explained by simple friction models such as the Frenkel-Kontorova (FK) model.

$$H = \sum_{i=1}^N \left[ \frac{p_i^2}{2m} + \frac{1}{2} K (x_{i+1} - x_i - a_c)^2 + \frac{1}{2} U_0 \cos \frac{2\pi x_i}{a_b} \right]$$



**Figure:** A sketch of the FK model, showing the two competing lengths: The average interparticle spacing and the lattice periodicity of the substrate (Friction and Nonlinear Dynamics, N. Manini, 2016).

Questions? Comments?