

# Flexible accelerated molecular dynamics with a hybrid metadynamics/hyperdynamics method

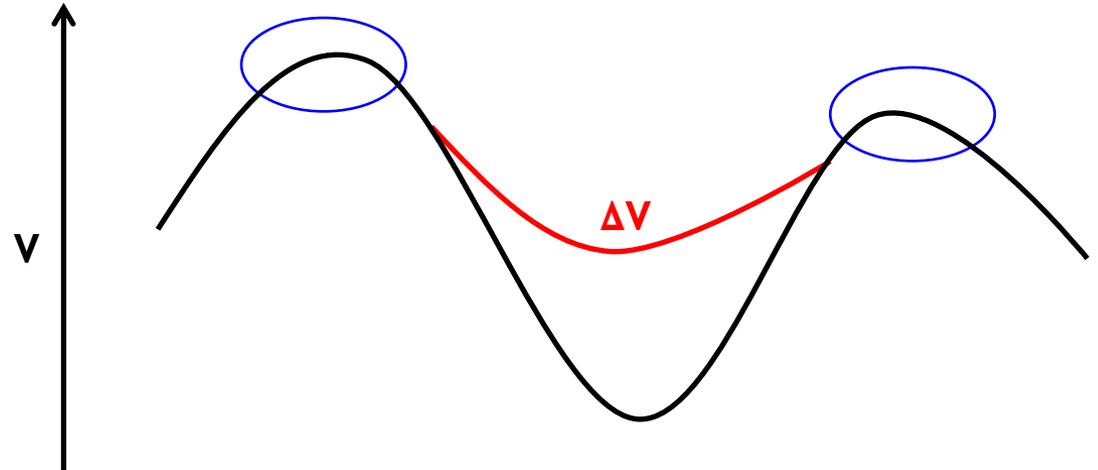
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# **INTRODUCTION TO THE CVHD METHOD**

# HYPERDYNAMICS



Add a bias potential  $\Delta V$  to the potential energy surface (PES)

“Fill” and destabilize minima

Leave dividing surfaces untouched

Simulations on the modified PES  $V^*(\mathbf{R}) = V(\mathbf{R}) + \Delta V(\mathbf{R})$  exhibit

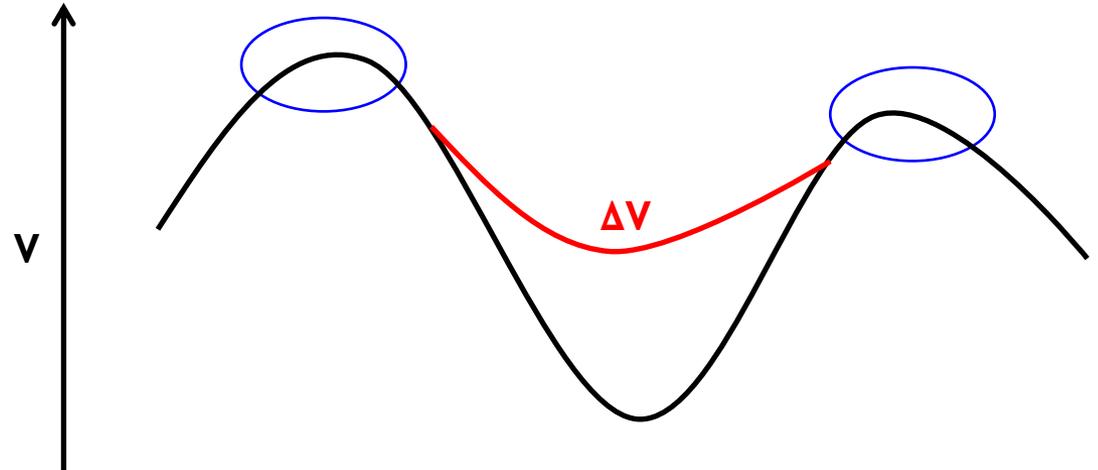
Faster state-to-state transitions...

...but correct relative dynamics...

...and global system evolution equivalent to (much slower) MD

Time becomes a statistical quantity, this **hypertime** is related to the MD time through the **boost factor**  $\langle e^{\beta\Delta V} \rangle$ .

# HYPERDYNAMICS



## How to construct a suitable and efficient bias potential?

→ What should  $\Delta V$  be a function of?

The lowest eigenvalue of the Hessian (Voter)

The potential energy  $V$  (Steiner; Fichthorn et al.; Hamelberg et al.; ...)

Bond distortions (Miron & Fichthorn)

Collective variables (Tiwary & van de Walle)

→ How to parameterize  $\Delta V$ ?

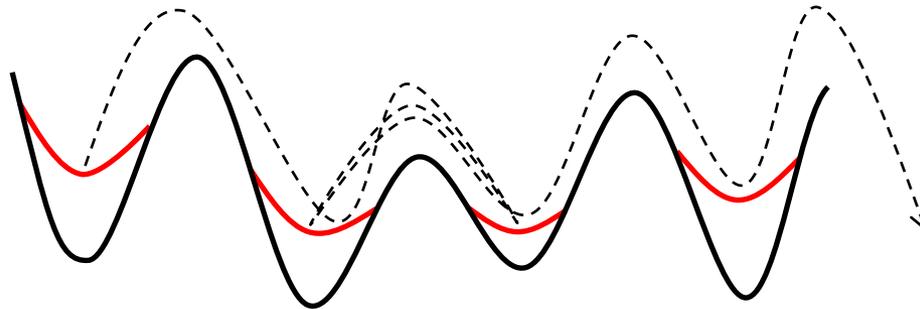
Use *a priori* knowledge of the PES (most methods)

Apply a self-learning method

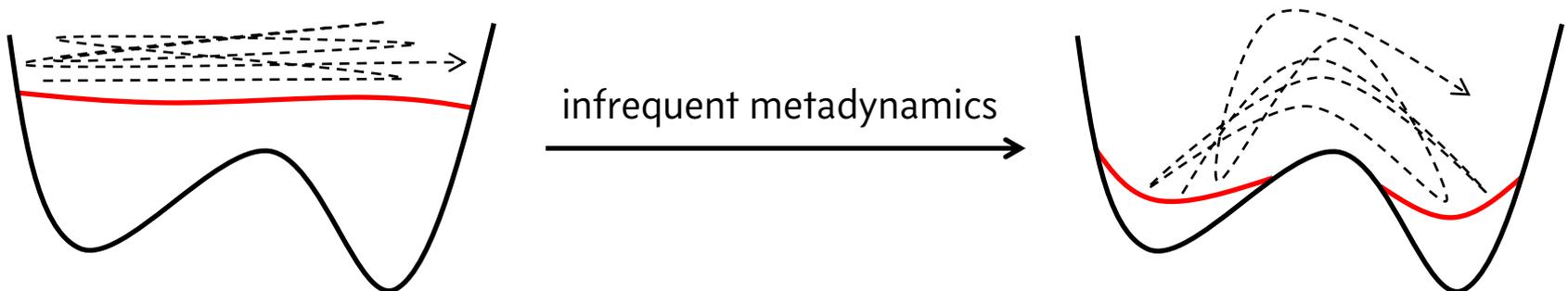
# HYPERDYNAMICS & METADYNAMICS

To some extent, metadynamics is already self-learning hyperdynamics, as it also enhances sampling through a bias potential, but with a different focus

**HYPERDYNAMICS:** “natural” unconstrained sequence of state-to-state transitions, without much a priori information on the possible pathways.



**METADYNAMICS:** extensive sampling of a limited part of the phase space.  
*Tiwary & Parrinello: get correct kinetics within this region if you're careful.*



# HYPERDYNAMICS & METADYNAMICS

With infrequent metadynamics, a self-learning sampling method has been given the ability to generate correct kinetics.

→ Metadynamics getting some hyperdynamics aspects

## **Can we go the other way?**

→ *Make hyperdynamics self-learning by adopting parts of metadynamics*

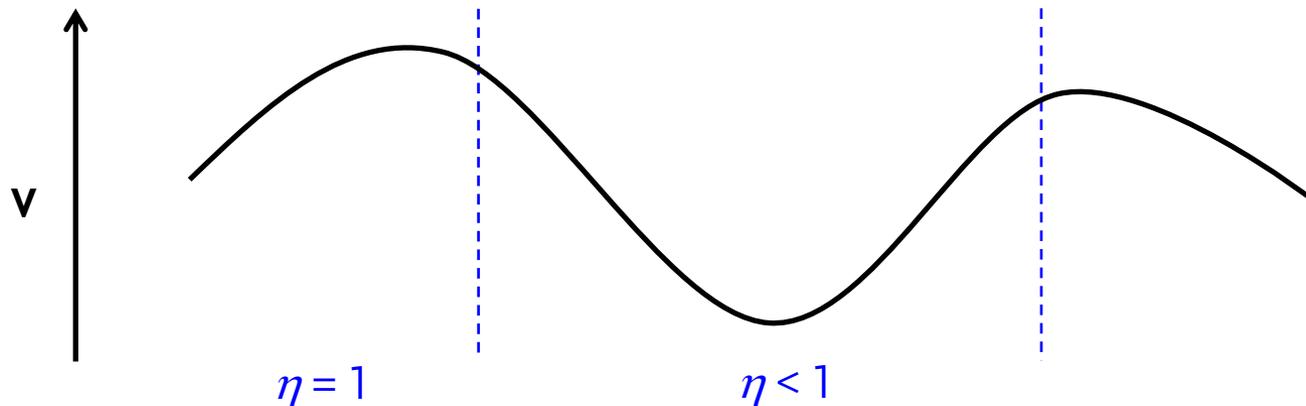
## **Required ingredients:**

Suitable collective variable (CV)

History-dependent bias constructed from a sum of repulsive Gaussians

→ *The collective variable-driven hyperdynamics method (CVHD)*

## CVHD - THE CV



In metadynamics, the used CV(s) must be able to distinguish between all relevant states one wishes to visit.

In a true hyperdynamics method, we preferably shouldn't need to know in advance where we're going, but this complicates the choice of CVs.

In CVHD, as in the SISYPHUS method (Tiwary & van de Walle), we use a single CV,  $\eta$ , centered around the current state:

If  $0 < \eta < 1$ : system is well within current state

If  $\eta > 1$ : system is close to dividing surface or has crossed it

i.e., only distinguish between "current state" and "rest of the universe"

## CVHD – THE CV

Most chemical processes involve bond breaking, so as a first CV it makes sense to use a bond distortion (cf. Bond Boost):

$$\chi_i = \frac{r_i - r_i^{\min}}{r_i^{\max} - r_i^{\min}}$$

Which can yield a single CV (cf. SISYPHUS):

$$\chi_t = \left( \sum_i \chi_i^p \right)^{1/p}$$

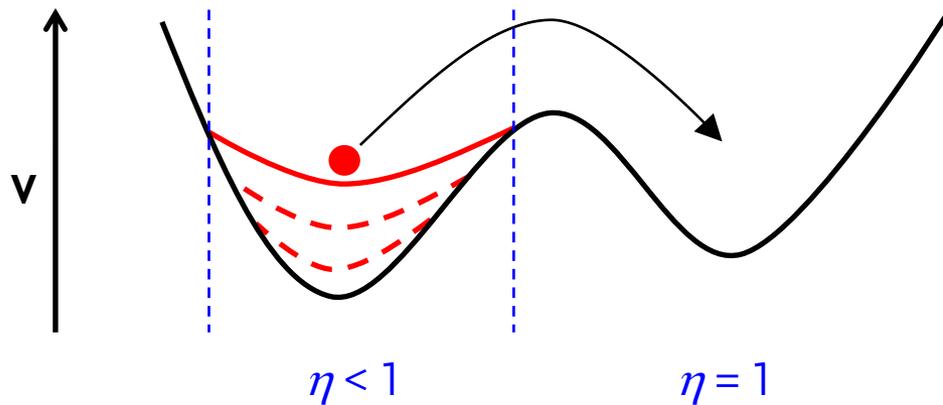
And in order to get vanishing derivatives:

$$\eta = \frac{1}{2} \left( 1 - \cos(\pi \chi_t^2) \right)$$

Generalizable to other  $\chi$ , other definitions of  $\eta$ , multiple CVs...

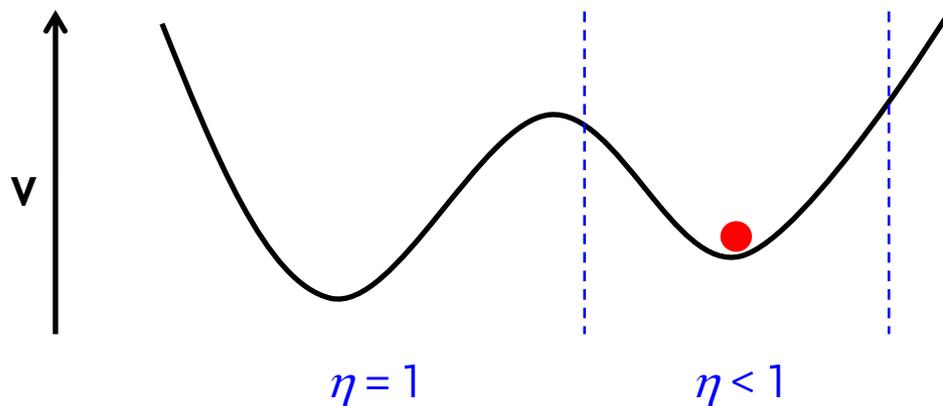
# CVHD - THE BIAS

A bias potential is easily generated through a metadynamics procedure, i.e., as a history-dependent sum of Gaussians.



$$\Delta V = \sum_i^{\text{hills}} e^{-\frac{(\eta - \eta(t_i))^2}{2\delta^2}}$$

But because the CV can only resolve the current state, we have to reset it after each transition, and “throw away” the bias.

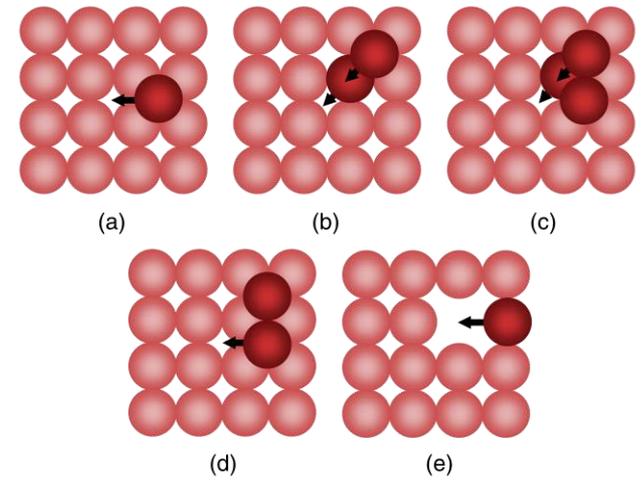


Sometimes more efficient to not use a “dynamic” bias, but rather a predefined one

$$\Delta V = V^{\max} (1 - \eta)$$

# **APPLICATIONS**

# DIFFUSION ON CU(001)



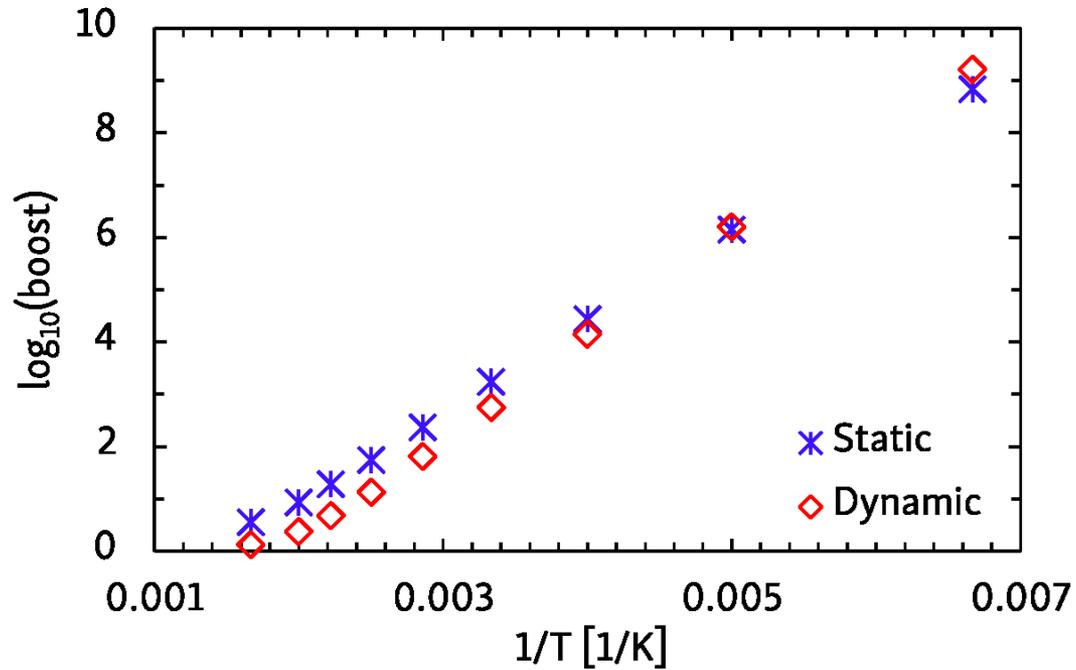
process	$E_A^{\text{DB}}$ (eV)	$E_A^{\text{SB}}$ (eV)	$E_A^{\text{BB}}$ (eV)
vacancy hop	$0.44 \pm 0.01$	$0.43 \pm 0.02$	$0.44 \pm 0.03$
adatom hop	$0.53 \pm 0.01$	$0.51 \pm 0.01$	$0.52 \pm 0.03$
adatom exchange	$0.76 \pm 0.04$	$0.71 \pm 0.05$	$0.73 \pm 0.04$
dimer hop	$0.51 \pm 0.01$	$0.49 \pm 0.02$	$0.47 \pm 0.03$
dimer exchange	$0.74 \pm 0.06$	$0.76 \pm 0.05$	$0.71 \pm 0.06$

Opportunity to compare CVHD with “Bond Boost” (BB) hyperdynamics

BB ~ static CVHD with bond length distortion CV

Excellent recovery of Arrhenius-type diffusion parameters

# DIFFUSION ON CU(001)

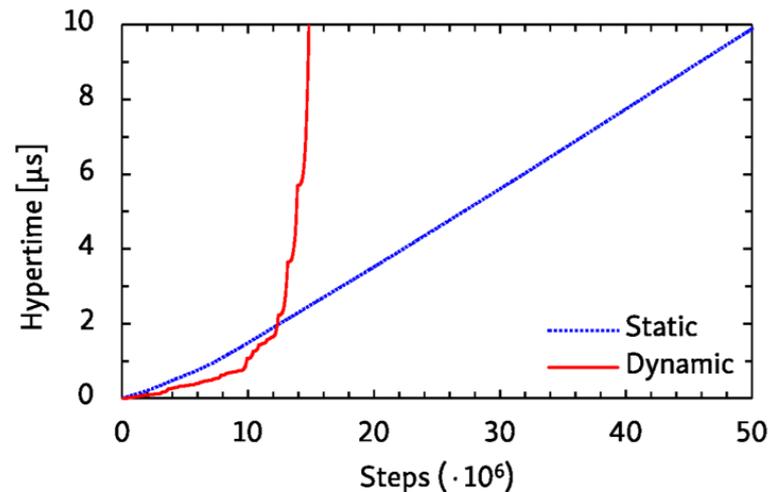
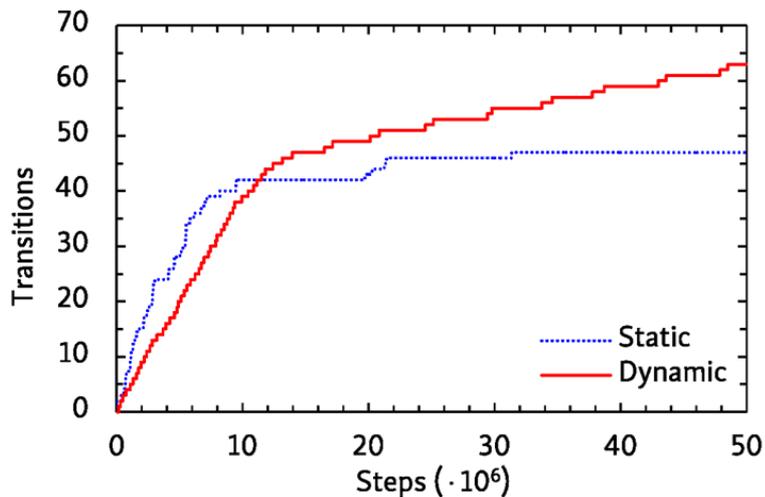
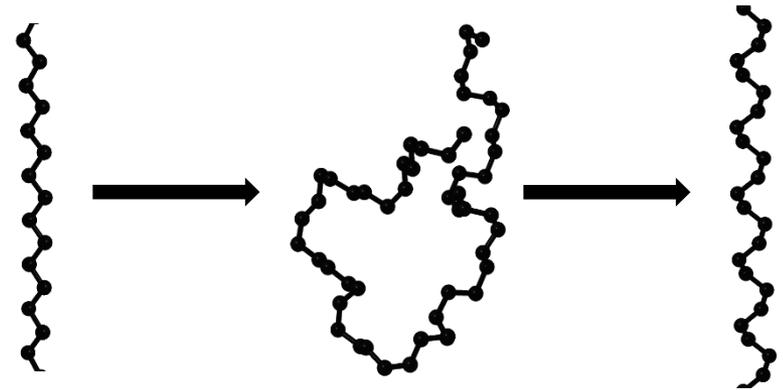


Performance of dynamic bias improves at lower rates

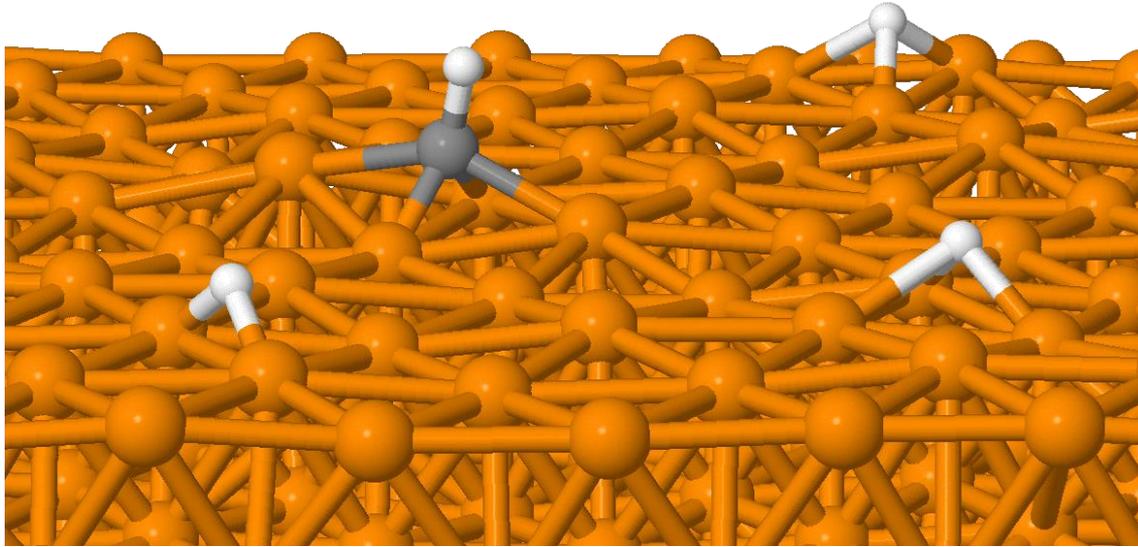
Temperatures as low as 150 K (time up to 500 seconds)

# MODEL FOLDING

Use dihedral distortion instead of bonds!  
Model potential with helix state as minimum  
~ 8 kcal/mol barrier for a single dihedral  
Start with 50 bead extended chain at 300 K  
Dynamic bias is adaptable and eventually beats the static option



# HETEROGENEOUS CATALYSIS



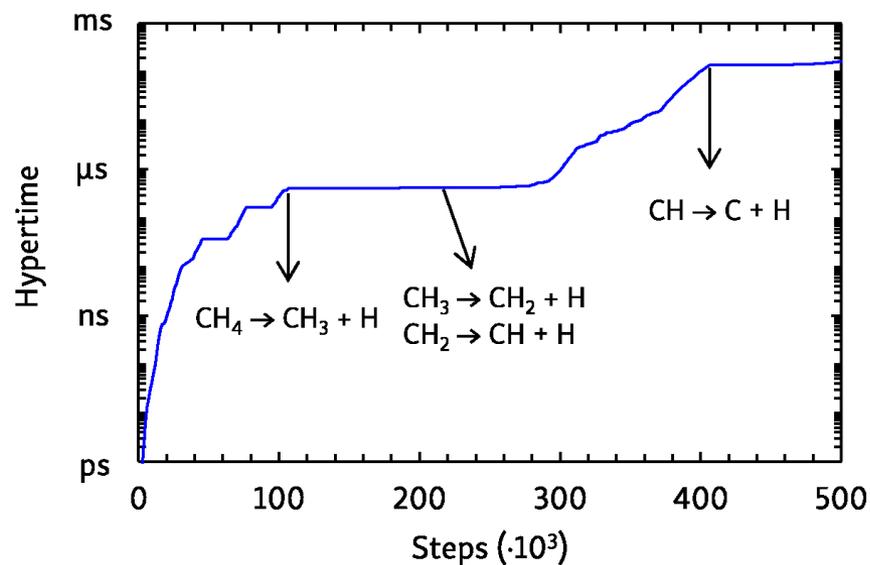
Dissociation of CH<sub>4</sub> on Ni(111): barriers for individual decomposition steps differ strongly:

Only ~8 kcal/mol for CH<sub>2</sub> → CH + H

More than 30 kcal/mol for CH → C + H

→ Can't use a predefined bias

# HETEROGENEOUS CATALYSIS



process	reaction time
$\text{CH}_4(g) \rightarrow \text{CH}_3(\text{ad}) + \text{H}(\text{ad})$	4–9 $\mu\text{s}$
$\text{CH}_3(\text{ad}) \rightarrow \text{CH}_2(\text{ad}) + \text{H}(\text{ad})$	0.09–0.22 $\mu\text{s}$
$\text{CH}_2(\text{ad}) \rightarrow \text{CH}(\text{ad}) + \text{H}(\text{ad})$	37–91 ps
$\text{CH}(\text{ad}) \rightarrow \text{C}(\text{ad}) + \text{H}(\text{ad})$	0.3–0.8 ms

CVHD in dynamic mode is really flexible

**Multi-timescale** abilities

# PYROLYSIS & COMBUSTION

We want to use CVHD as a predictive tool

Pyrolysis/combustion is an interesting option

Many MD studies (and good ReaxFF potential) available...

... but at high temperatures (>2000 K instead of ~1000 K)

Complex temperature-dependent pathways and products

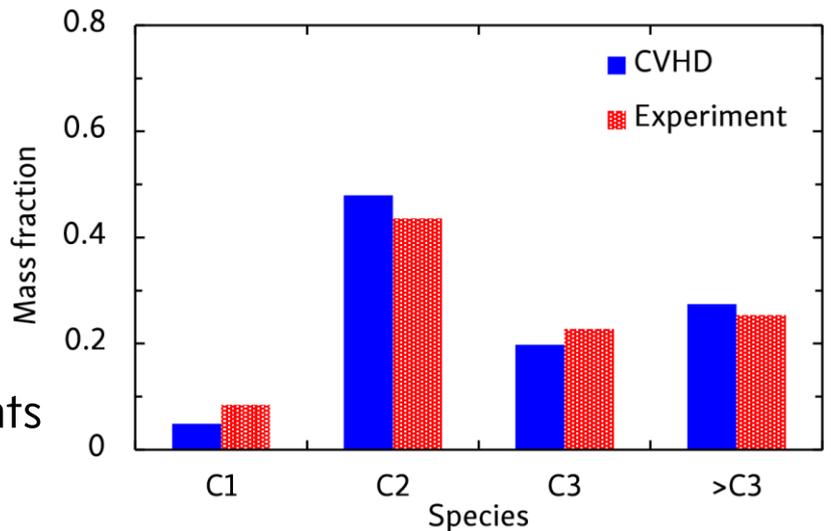
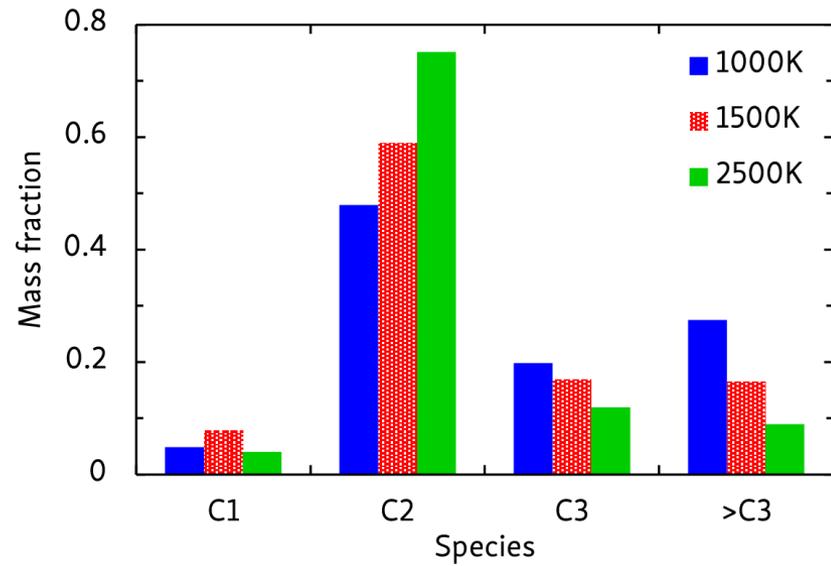
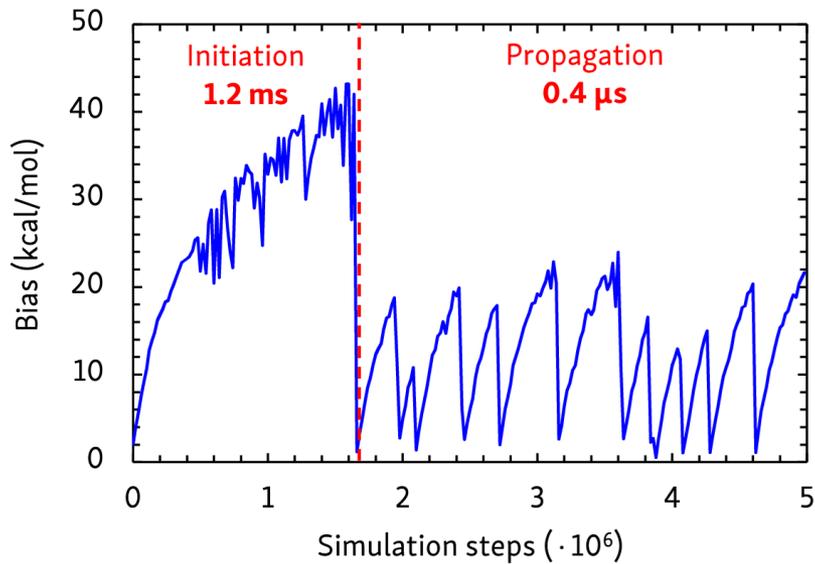
Barriers from ~30 kcal/mol (propagation) to ~80 kcal/mol (initiation)

Parallel replica only got to 1  $\mu$ s at 1350 K (Joshi et al.)

For the *n*-dodecane test system, CVHD can reach longer times (ms and beyond)

	Pyrolysis	Combustion
Lowest temperature	1000 K	700 K
Longest simulated time	57 ms	39 s
Largest boost	$6.3 \times 10^6$	$1.3 \times 10^9$

# PYROLYSIS



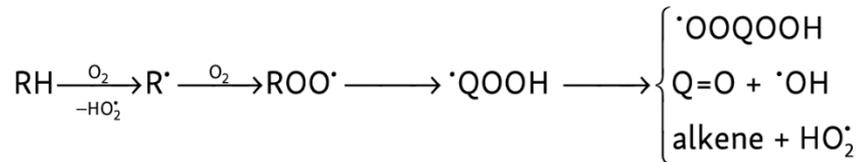
Use of dynamic bias in practice

Temperature-dependent pyrolysis products

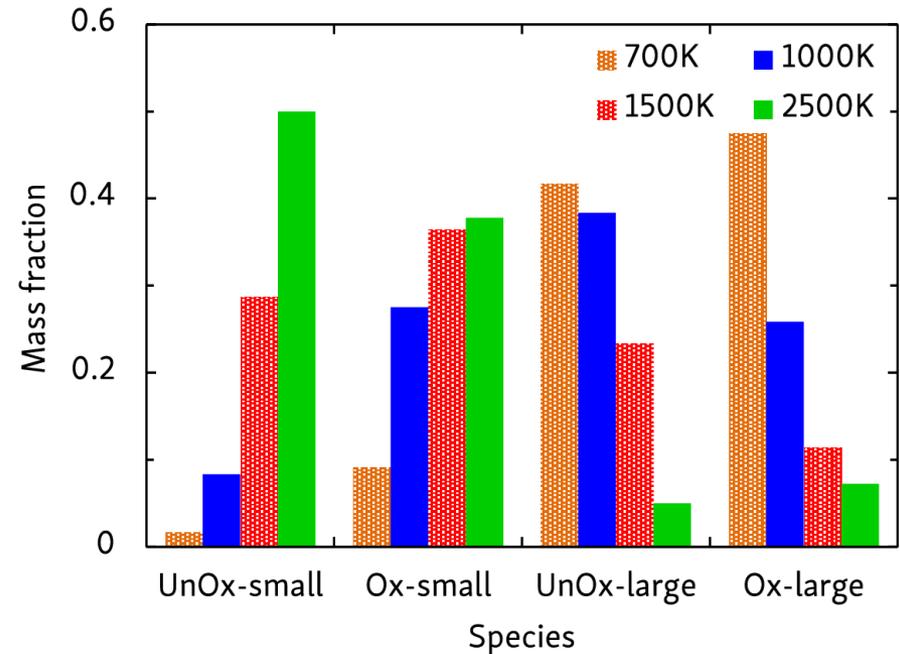
Remarkable agreement with recent experiments

# OXIDATION

**Low temperature:**

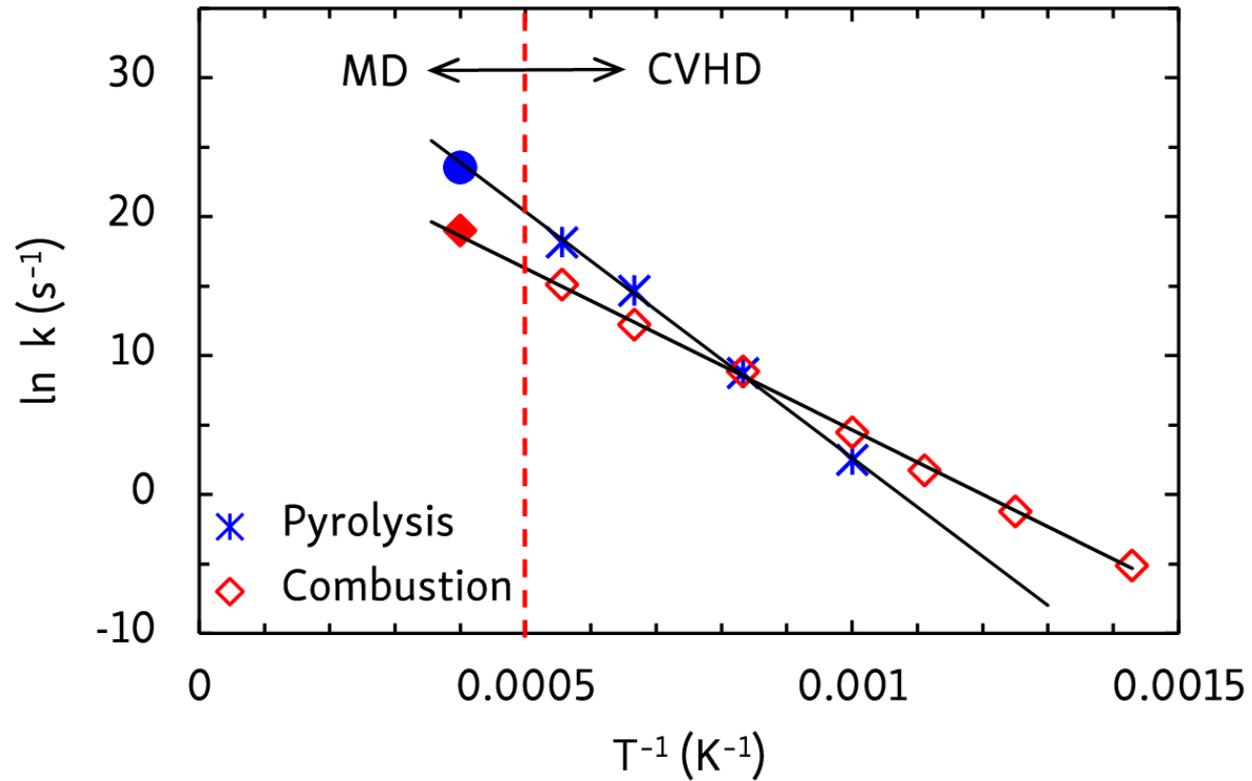


**High temperature:**



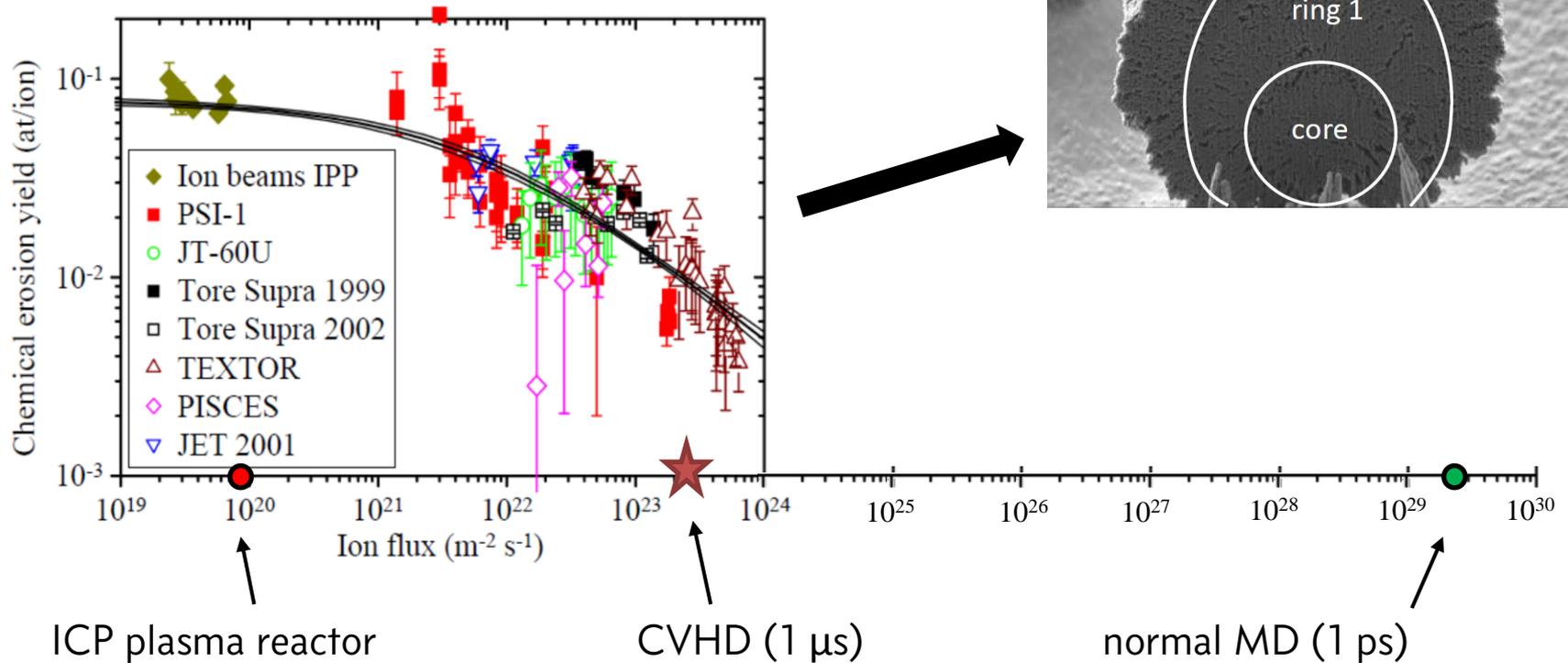
Temperature-dependent oxidation pathways and products can also be captured

# PYROLYSIS & COMBUSTION



*A posteriori* validation through direct MD

# PLASMA ETCHING

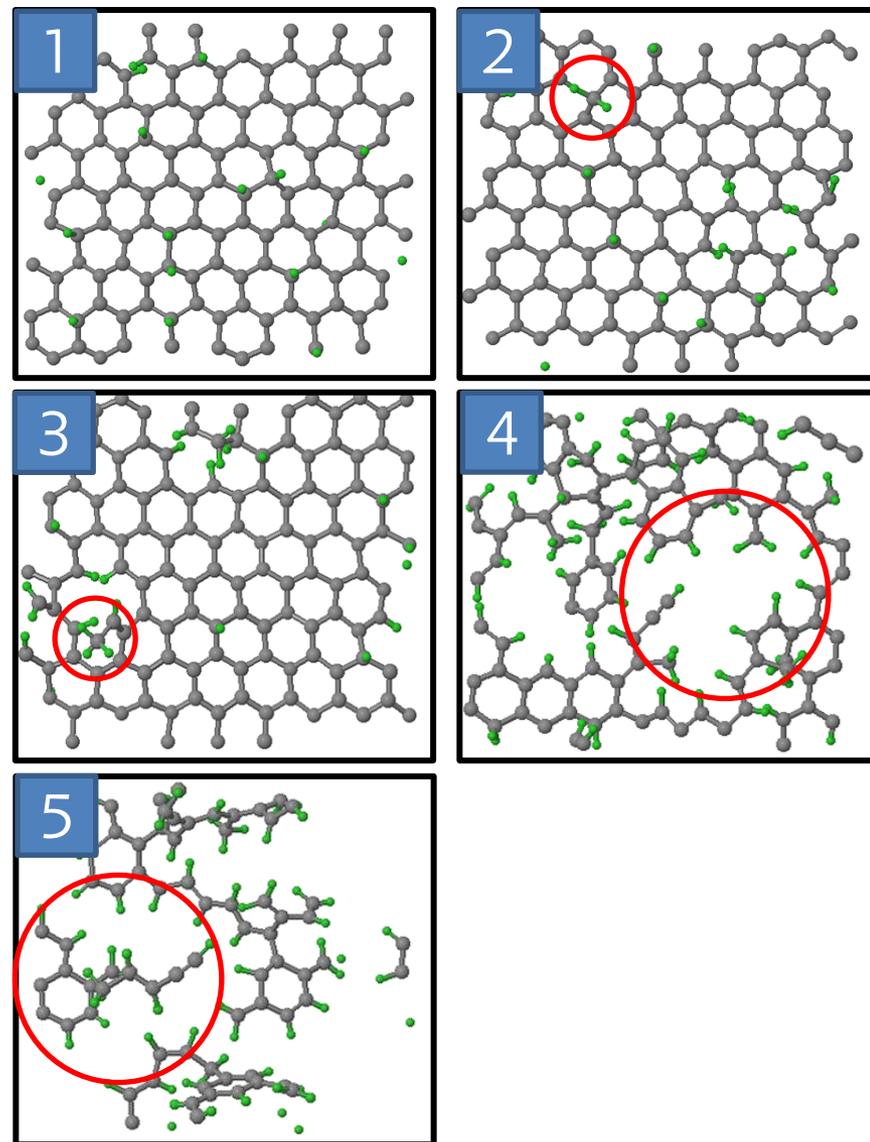
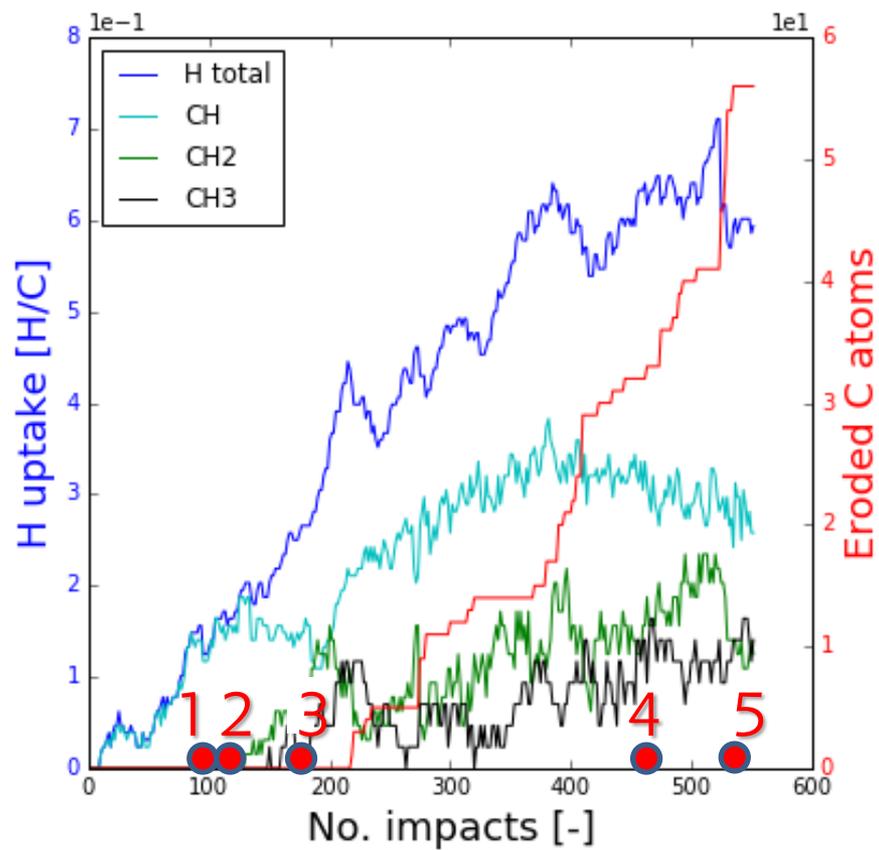


Graphite etching and redeposition in a fusion-like plasma generates carbon microstructures

Very high H fluxes: experiment approaching simulation!

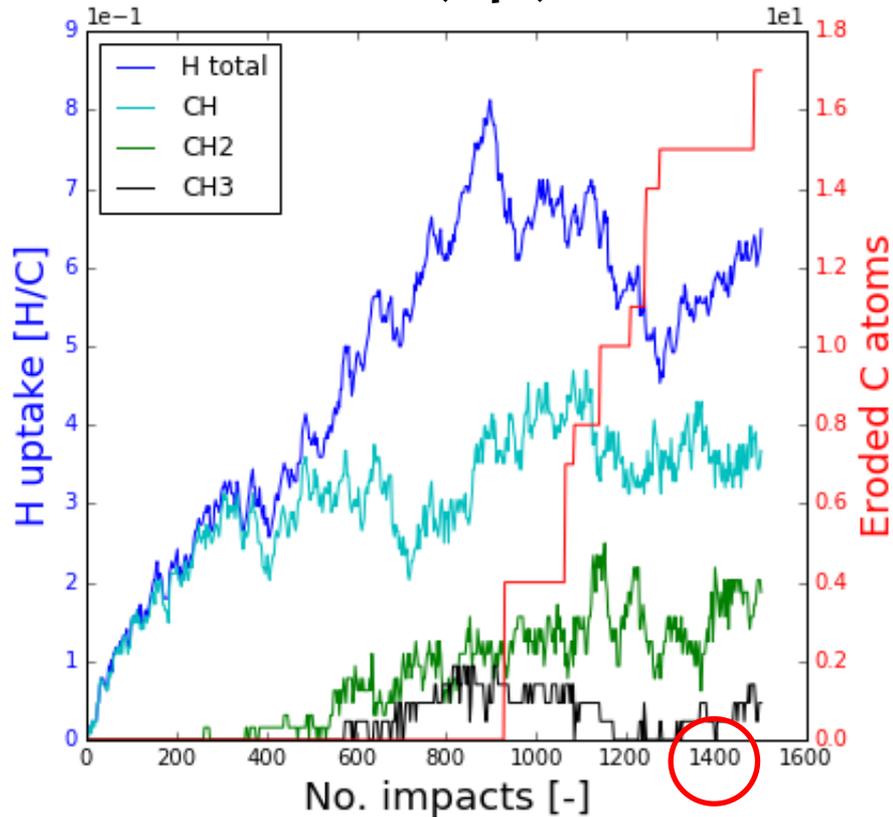
# PLASMA ETCHING

## CVHD

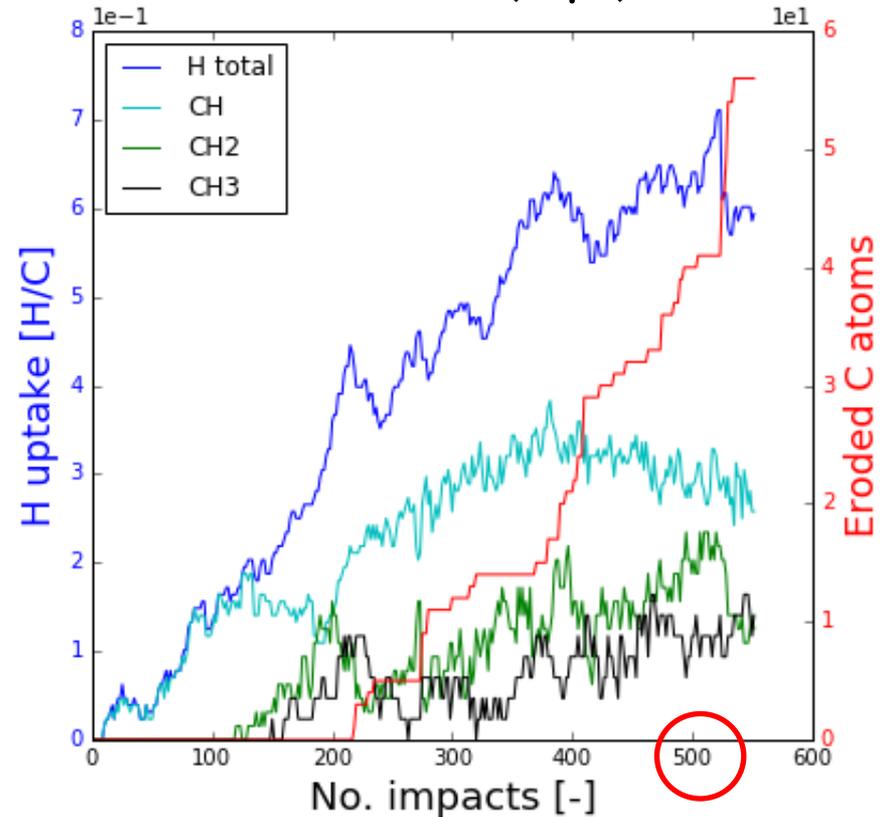


# PLASMA ETCHING

## MD (2 ps)



## CVHD (1 $\mu$ s)



Much more efficient erosion at lower fluxes + CVHD

## **CLOSING REMARKS**

# CONCLUSION

The CVHD method combines aspects from different well-established biasing methods (hyperdynamics and metadynamics)

- Quite easy to apply to different systems

- Does not require much system-specific optimization

- Spans a broad range of time scales

Probably not useful (for now?) if

- You want to recycle states/barriers

- Low-barrier events are a problem

The future

- Apply to different and more complicated systems (like nanoscale growth)

- Applications will lead to new CVs being used in CVHD

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Sayak Banerjee (Stanford): Pyrolysis experiments

## References

Bal & Neyts, Chem. Sci. **7**, 5280 (2016).

Bal & Neyts, J. Chem. Theory Comput. **11**, 4545 (2015).