

The background features several molecular models. On the left, there are blue and orange cage-like structures, possibly C60 or similar fullerenes, some with grey electron density isosurfaces. On the right, there is a blue hexagonal lattice structure, likely representing a carbon surface or graphene. In the bottom right corner, there is an orange and blue molecular structure with dashed lines indicating interactions.

EuroCVD22 – BalticALD16

24-28 June 2019

Luxembourg

# How spectator adsorbates affect surface reactivity

Simon D. Elliott, Thomas J. Mustard

**SCHRÖDINGER**

*Transforming drug discovery and materials research*

How spectator adsorbates affect surface reactivity:  
computing the cooperative effect by automated  
enumeration of reaction pathways

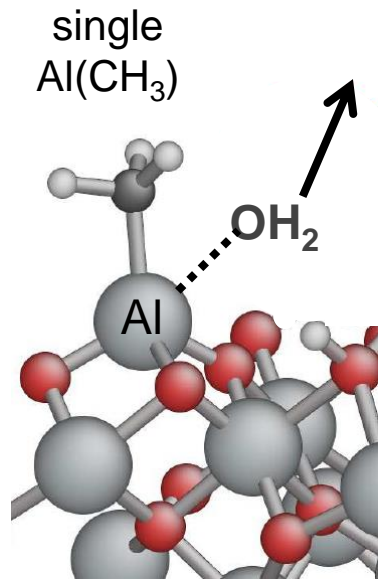
- **What is the cooperative effect?**
- **Cluster model and framework for enumeration**
- **Enumeration of structures for H<sub>2</sub>O adsorption**
- **Next step: reactions of adsorbed H<sub>2</sub>O**



What is the cooperative effect?

# Cooperative effect: neighbouring fragments affect reactivity

DFT calculations of H<sub>2</sub>O adsorption to methylated surface during ALD of Al<sub>2</sub>O<sub>3</sub>



**No chemisorption**  
of single H<sub>2</sub>O  
to single Al(CH<sub>3</sub>)

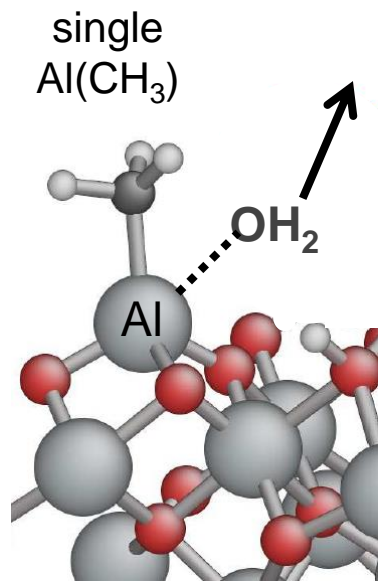
large grey=Al, red=O, white=H, small grey=C

M. Shirazi & S. D. Elliott, Nanoscale, 7, 6311-6318 (2015)

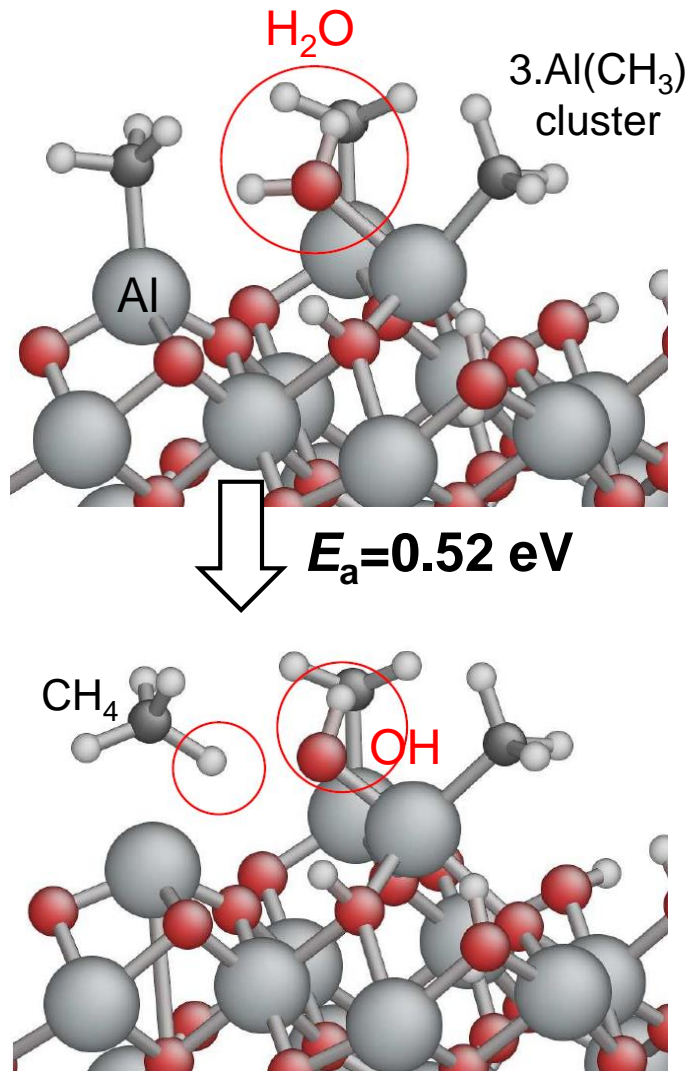


# Cooperative effect: neighbouring fragments affect reactivity

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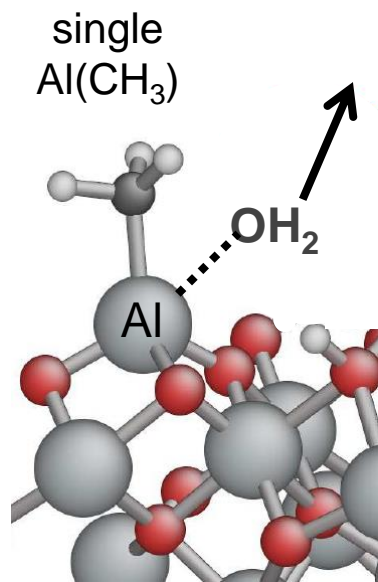


large grey=Al, red=O, white=H, small grey=C

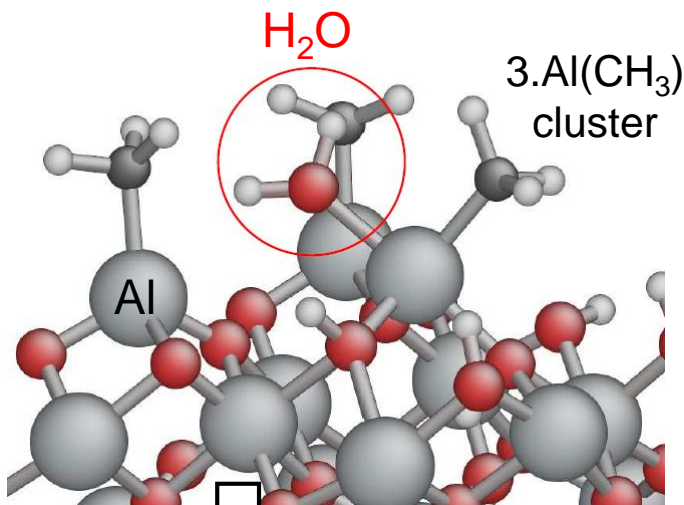
M. Shirazi & S. D. Elliott, Nanoscale, 7, 6311-6318 (2015)

# Cooperative effect: neighbouring fragments affect reactivity

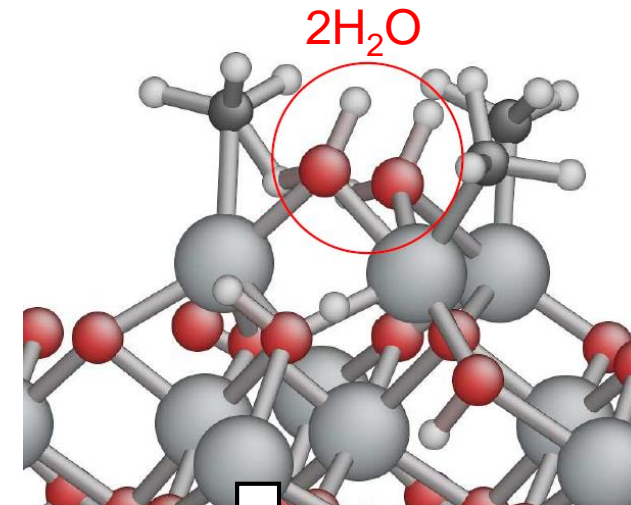
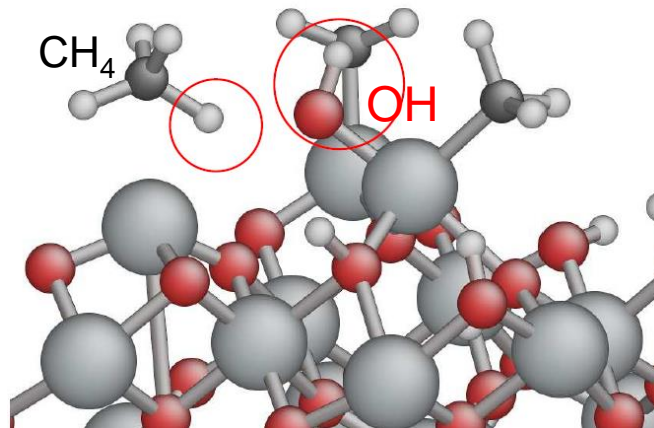
DFT calculations of H<sub>2</sub>O adsorption to methylated surface during ALD of Al<sub>2</sub>O<sub>3</sub>



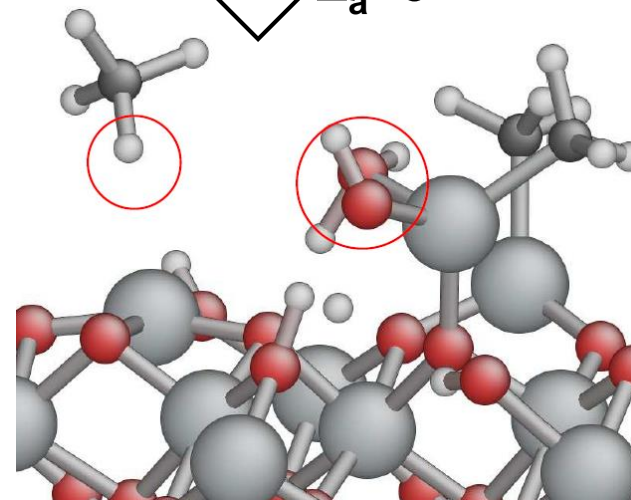
**No chemisorption**  
of single H<sub>2</sub>O  
to single Al(CH<sub>3</sub>)



$E_a = 0.52 \text{ eV}$



$E_a = 0$



large grey=Al, red=O, white=H, small grey=C

M. Shirazi & S. D. Elliott, Nanoscale, 7, 6311-6318 (2015)

## What is limiting low-temperature atomic layer deposition of $\text{Al}_2\text{O}_3$ ? A vibrational sum-frequency generation study

V. Vandalon<sup>a)</sup> and W. M. M. Kessels<sup>a)</sup>

*Department of Applied Physics, Eindhoven University of Technology, P.O. Box 513, 5600 MB Eindhoven, The Netherlands*

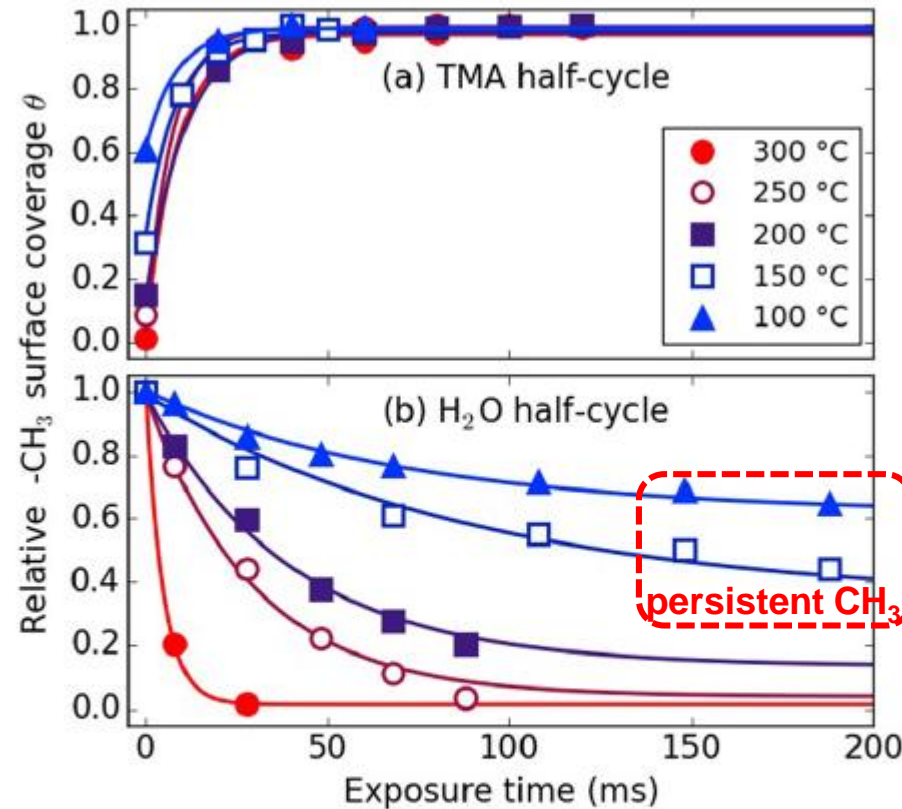
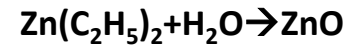


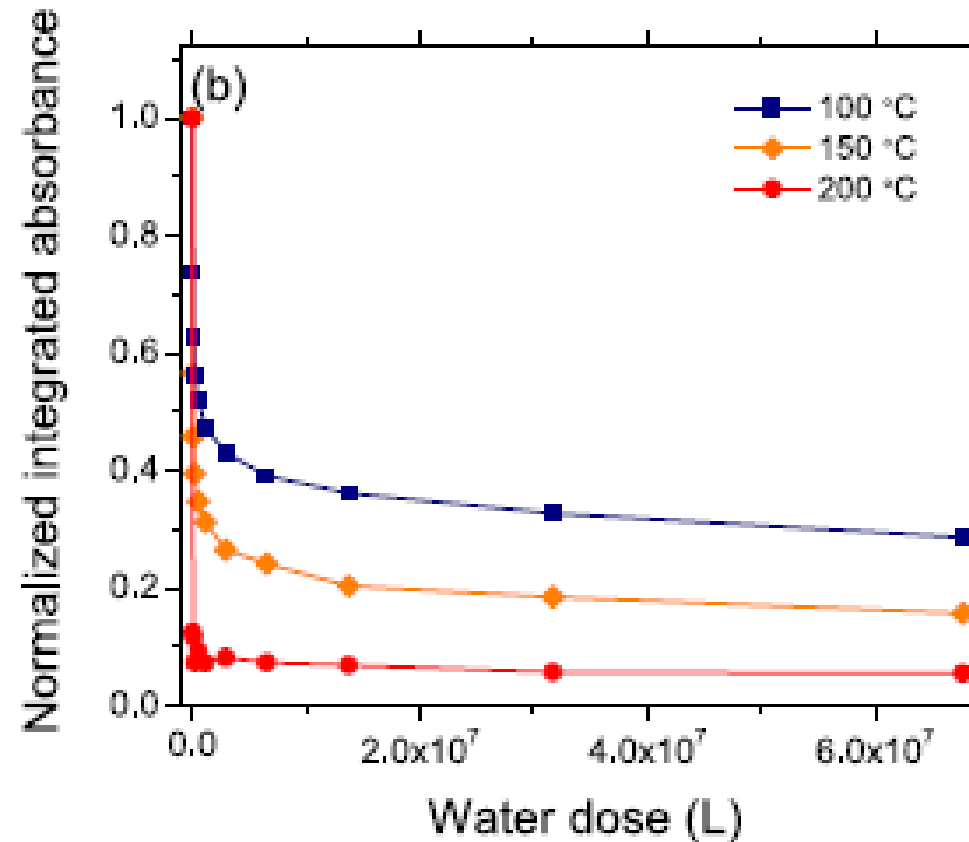
FIG. 3. Relative  $-\text{CH}_3$  surface coverage  $\theta$ , extracted from the BB-SFG spectra as a function of TMA and  $\text{H}_2\text{O}$  exposure for various temperatures. The solid lines represent fits to the data in order to extract information about the reaction kinetics.

## Incomplete elimination of precursor ligands during atomic layer deposition of zinc-oxide, tin-oxide, and zinc-tin-oxide

Adriaan J. M. Mackus, Callisto MacIsaac, Woo-Hee Kim, and Stacey F. Bent<sup>a)</sup>  
*Department of Chemical Engineering, Stanford University, Stanford, California 94305, USA*

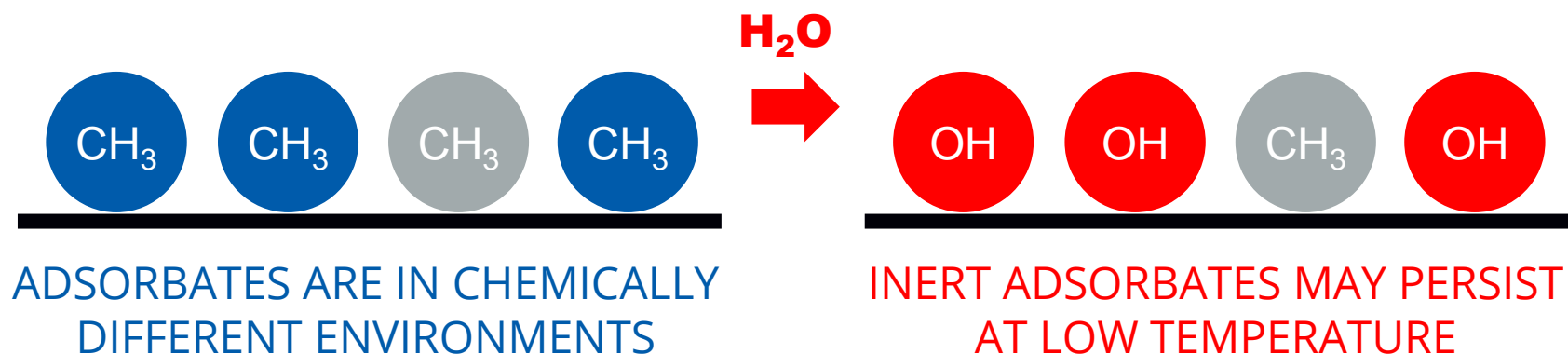


Ligand CH detected by FTIR at end of  $\text{H}_2\text{O}$  pulse relative to end of Zn pulse:





# Cooperative effect: neighbouring fragments affect reactivity



## Open questions:

- Is the effect specific to 4-coordinate Al, or does it occur in other Al coordination environments as well?
- Are neighbouring adsorbates exerting a steric effect, or also electronic?
- Kinetics only, or also thermodynamics?

# Challenges for simulation

Rather than modelling...	We must now consider...
isolated molecules	many configurations of co-adsorbates
in small simulation cells	in large simulation cells
on flat smooth crystalline surfaces	on more realistic 3D nanostructured surface regions
yielding one mechanism, one reaction pathway, one activation energy.	potentially producing as many activation energies and pathways as surface geometries that can be imagined.

Automatic enumeration of surface geometries gives a route towards systematically investigating such complex systems, exploiting the power of computational chemistry.



# Cluster model and framework for enumeration

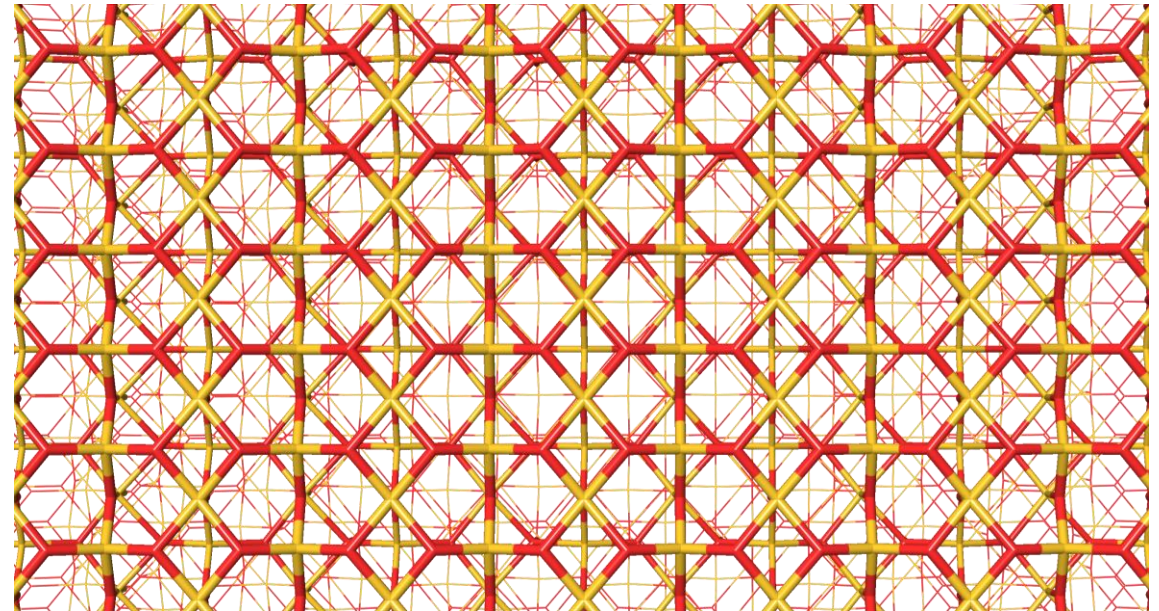
# Model of $\text{Al}_2\text{O}_3$ surface

Monoclinic  $\theta\text{-Al}_2\text{O}_3$  C21/m1 (#12) as model of amorphous as-deposited film.

Selected AlO-terminated (1 0 0) surface based on computed surface energies:

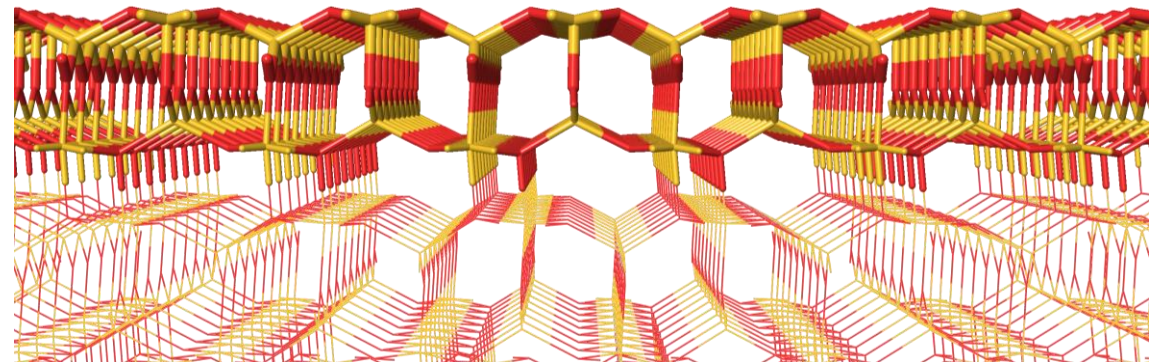
- $0.6 \text{ J/m}^2$  for AlO-terminated (1 0 0)
- $1.1 \text{ J/m}^2$  for O-terminated (1 0 0)
- $1.4 \text{ J/m}^2$  for AlO-terminated (0 0 1)
- $2.3 \text{ J/m}^2$  for O-terminated (0 0 1)

TOP VIEW



Ga=yellow, O=red

SIDE VIEW





# Model of $\text{Al}_2\text{O}_3$ surface

(1 0 0) surface

5-coordinate Al

4-coordinate Al

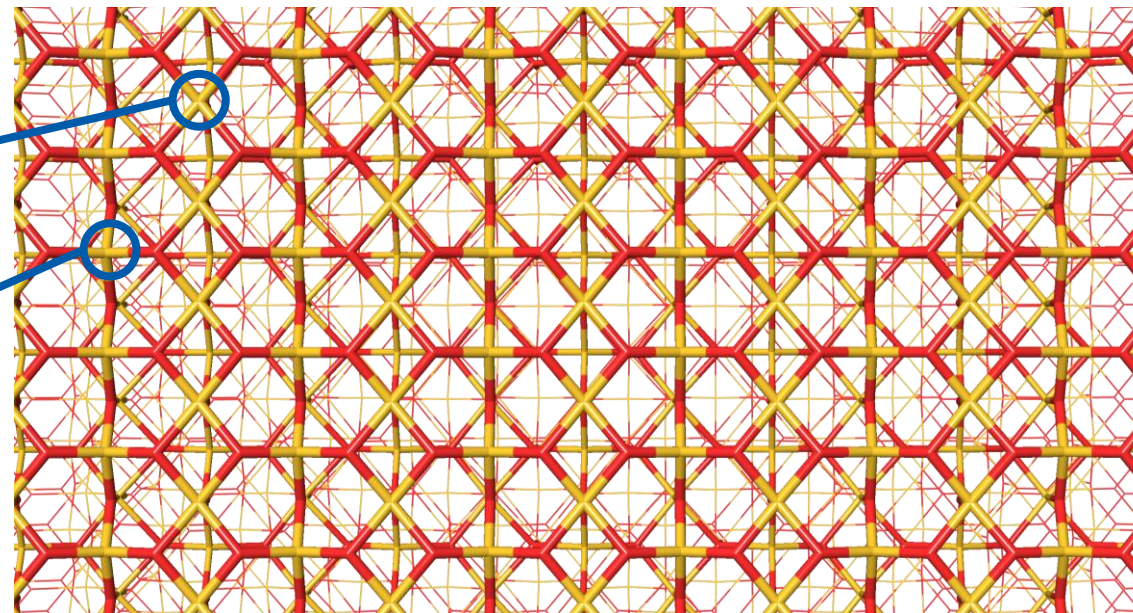
molar volume  
 $= 24 \text{ \AA}^3/\text{AlO}_{3/2}$

Monolayer thickness  
 $= (\text{molar volume})^{1/3}$   
 $= 2.9 \text{ \AA}$

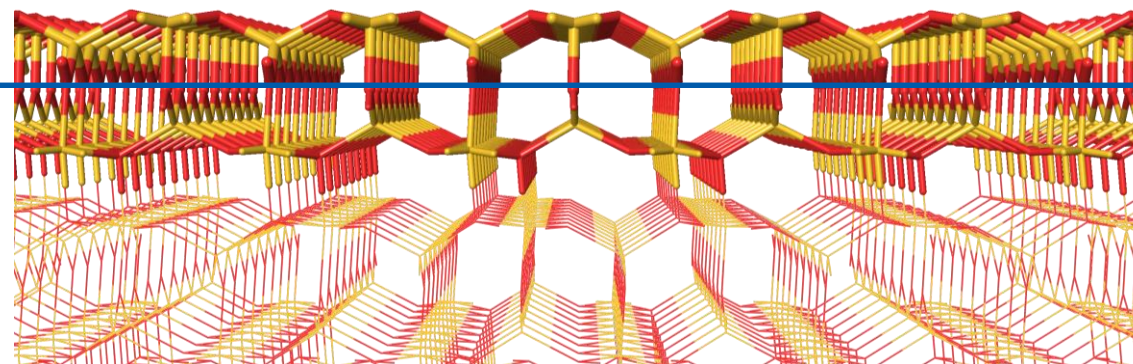
Areal density =  
 $(\text{molar volume})^{-2/3} =$   
 $6(\text{Al}_2\text{O}_3)/\text{nm}^2$

TOP VIEW

Ga=yellow, O=red

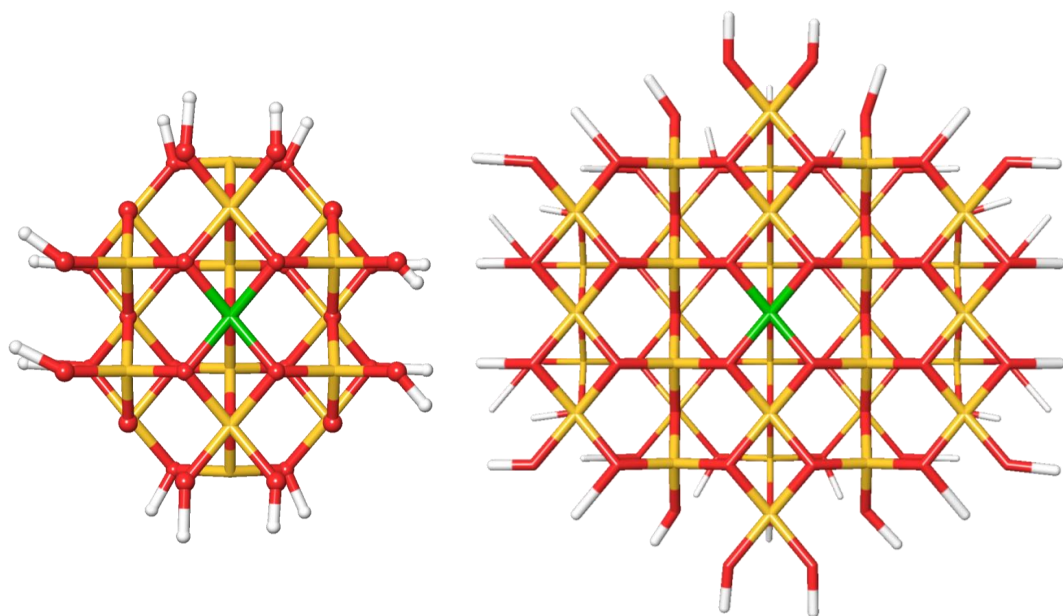


SIDE VIEW

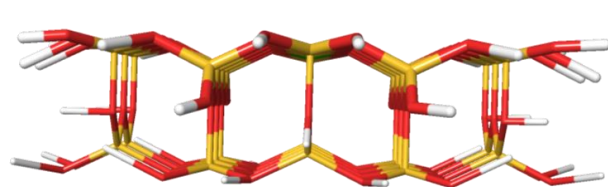




# Model of $\text{Al}_2\text{O}_3$ surface



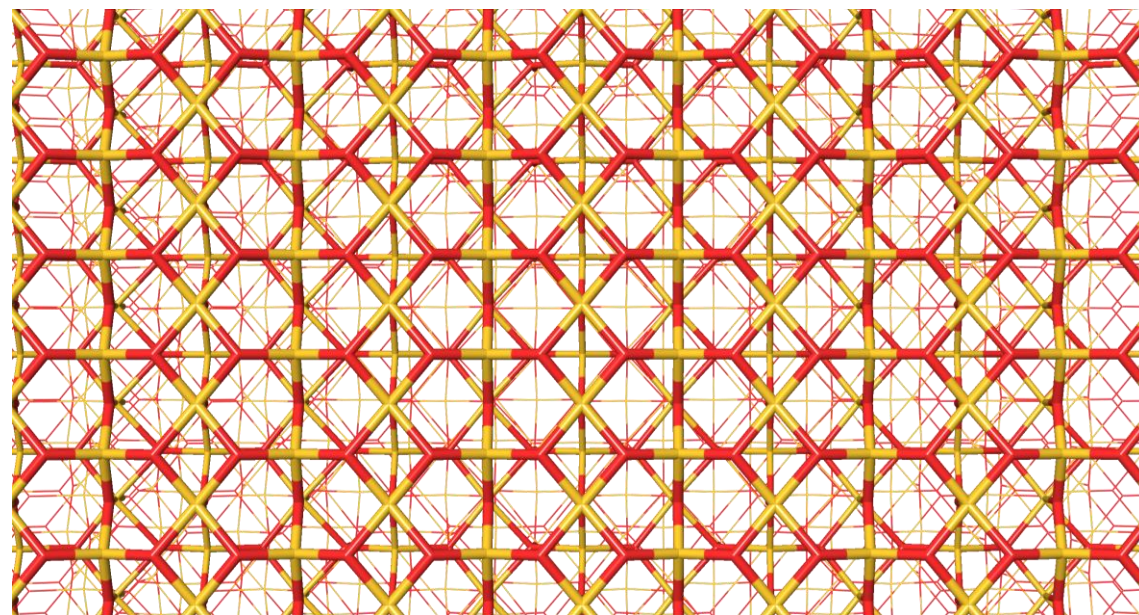
66-atom cluster  
area=0.67 nm<sup>2</sup>



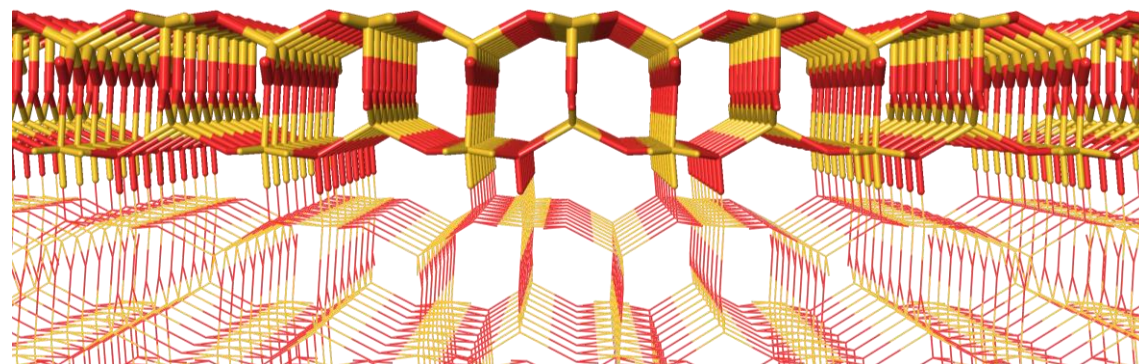
140-atom cluster  
area=1.33 nm<sup>2</sup>

TOP VIEW

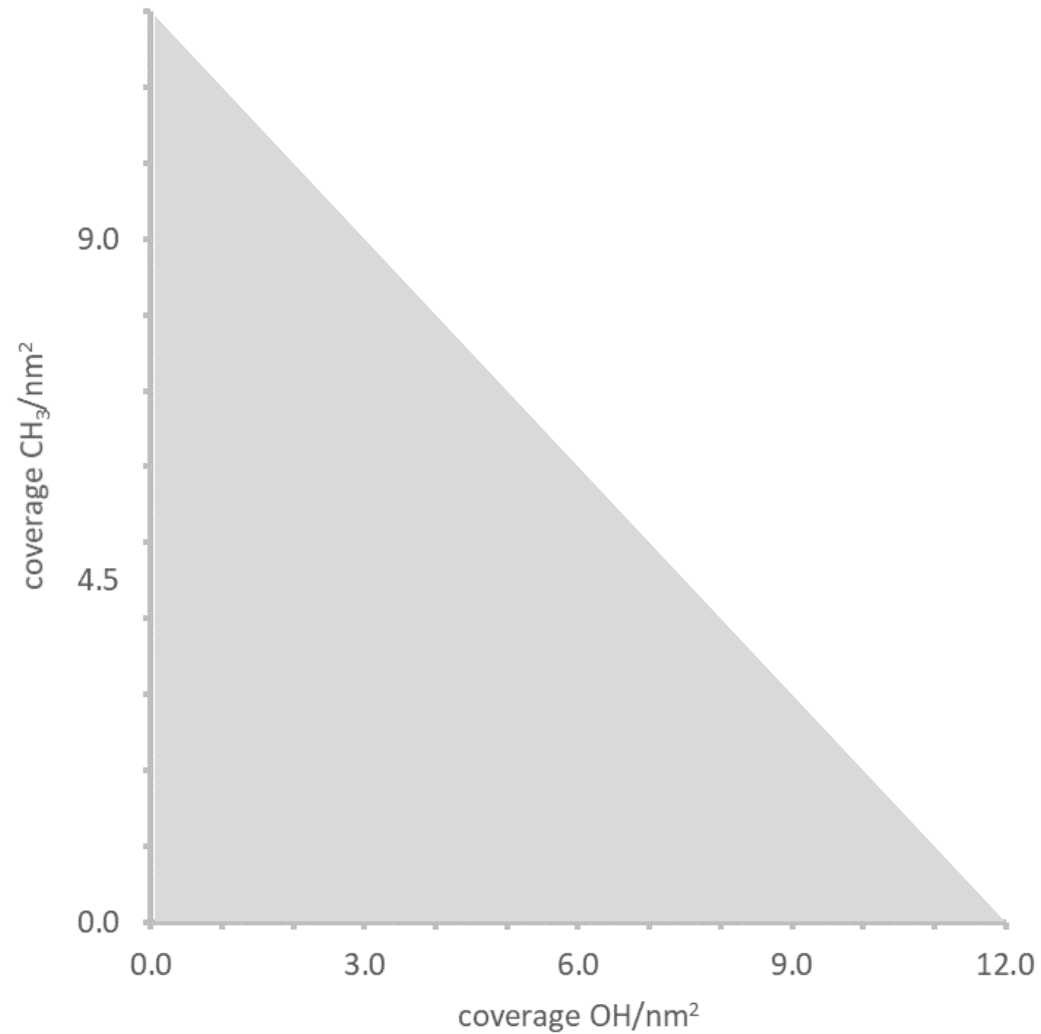
Ga=yellow, O=red, C=grey, H=white, adsorption site=green



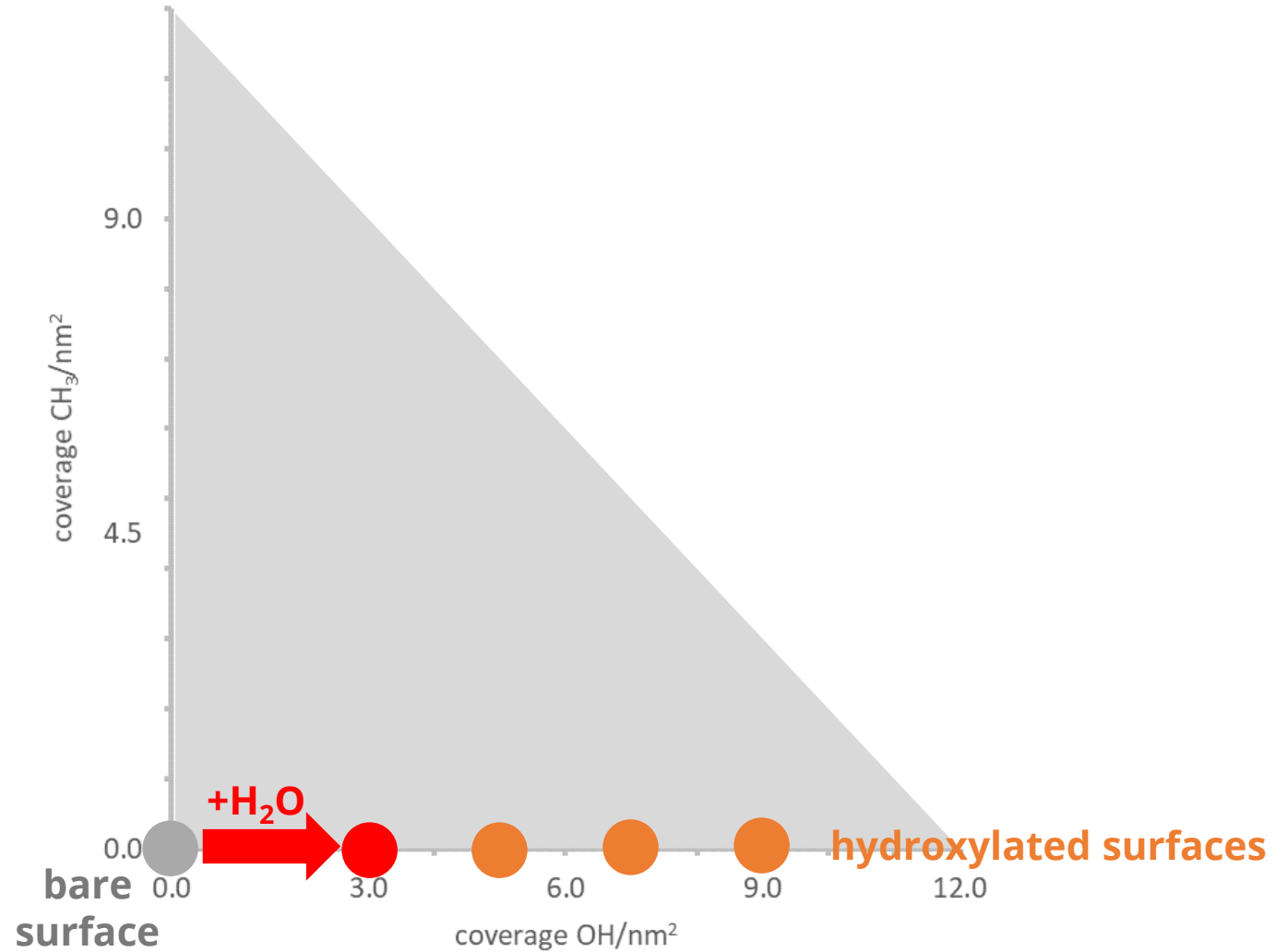
SIDE VIEW



# Chemical space of ALD

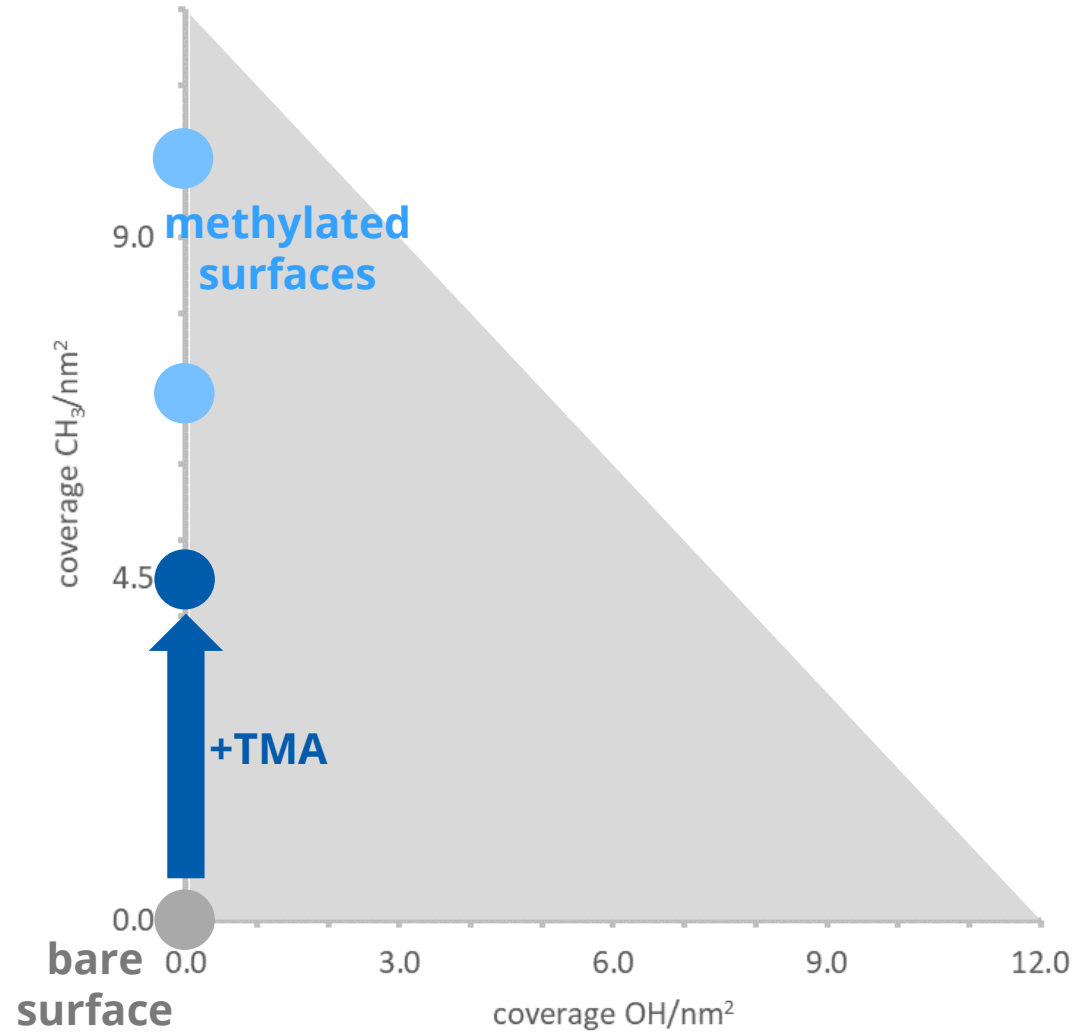


# Chemical space of ALD

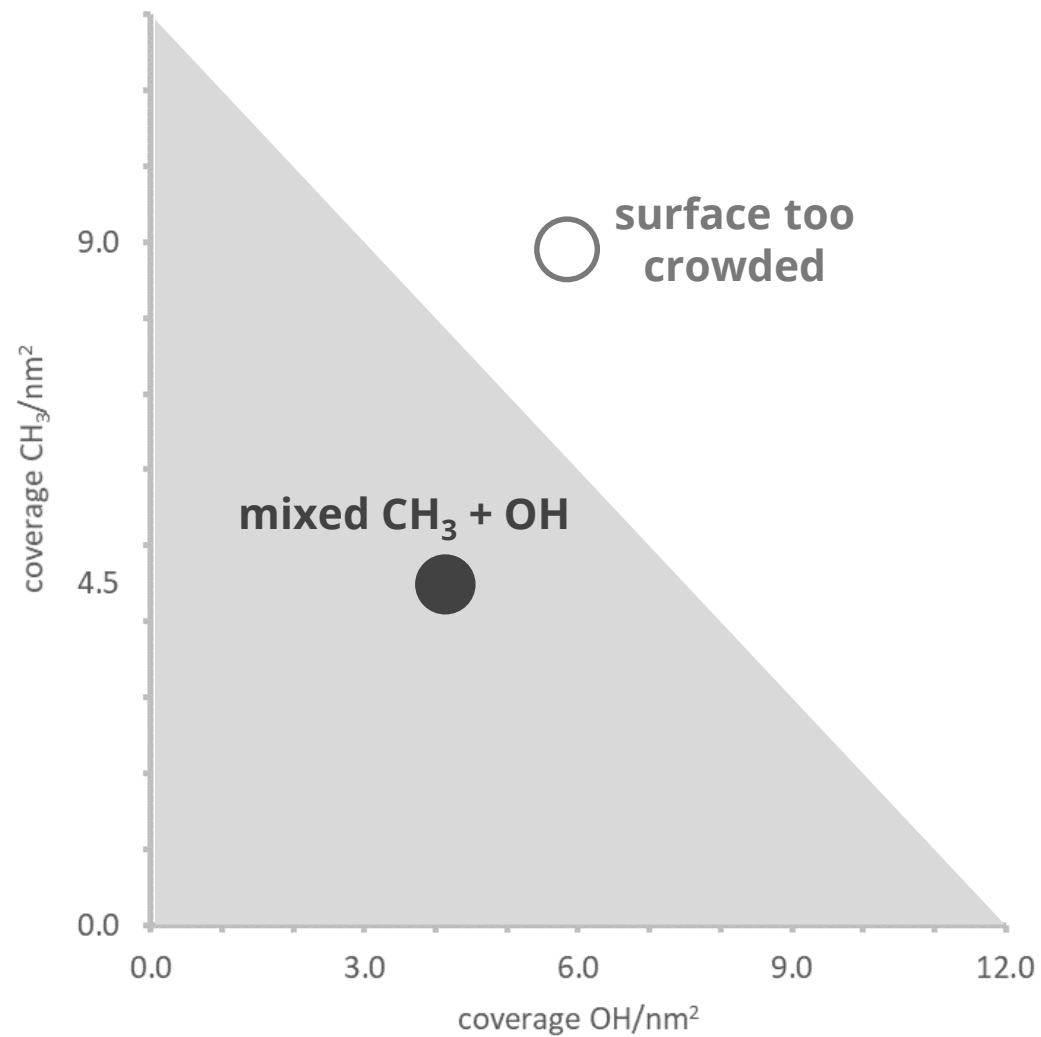




# Chemical space of ALD



# Chemical space of ALD

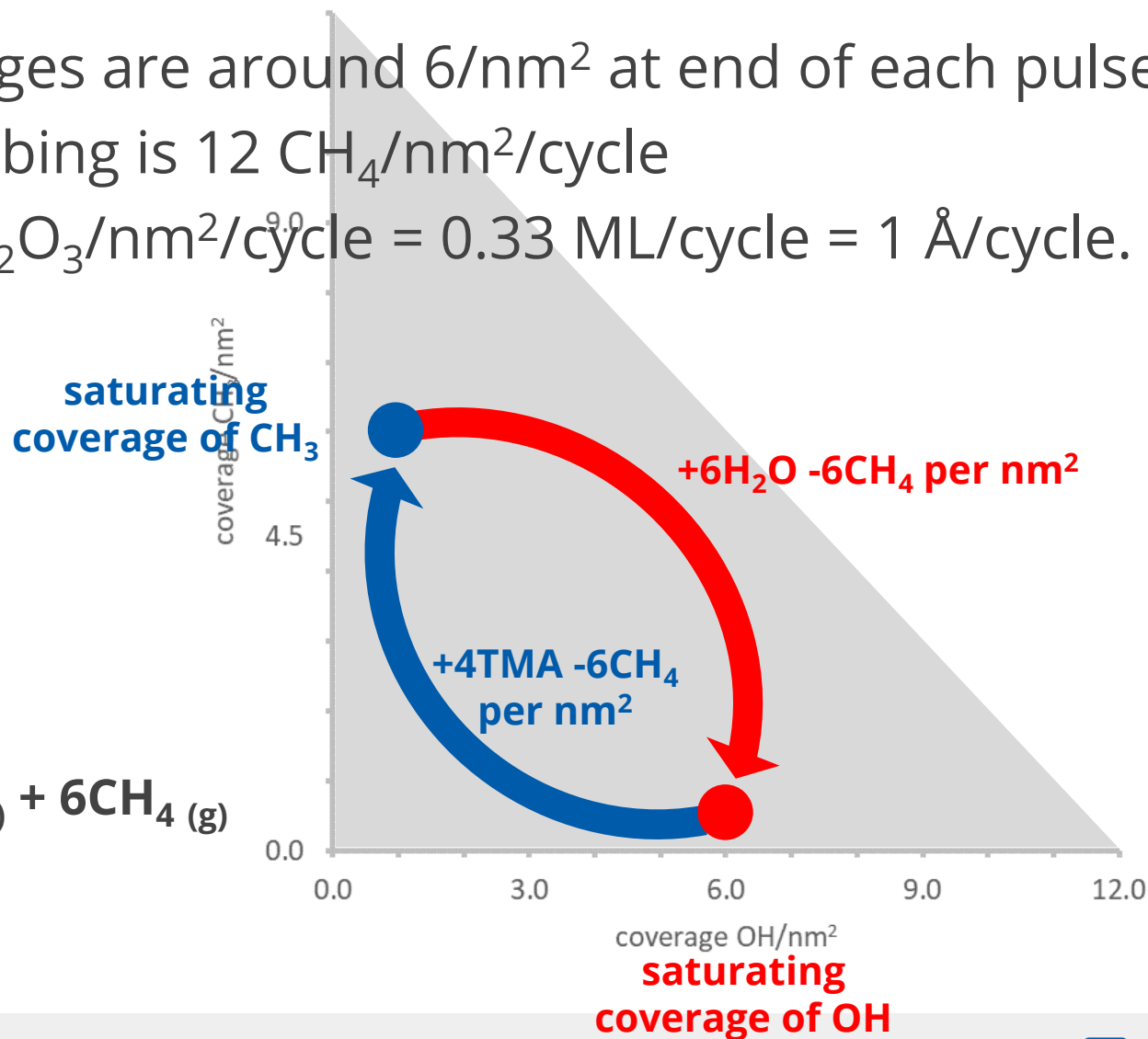


# Chemical space of ALD

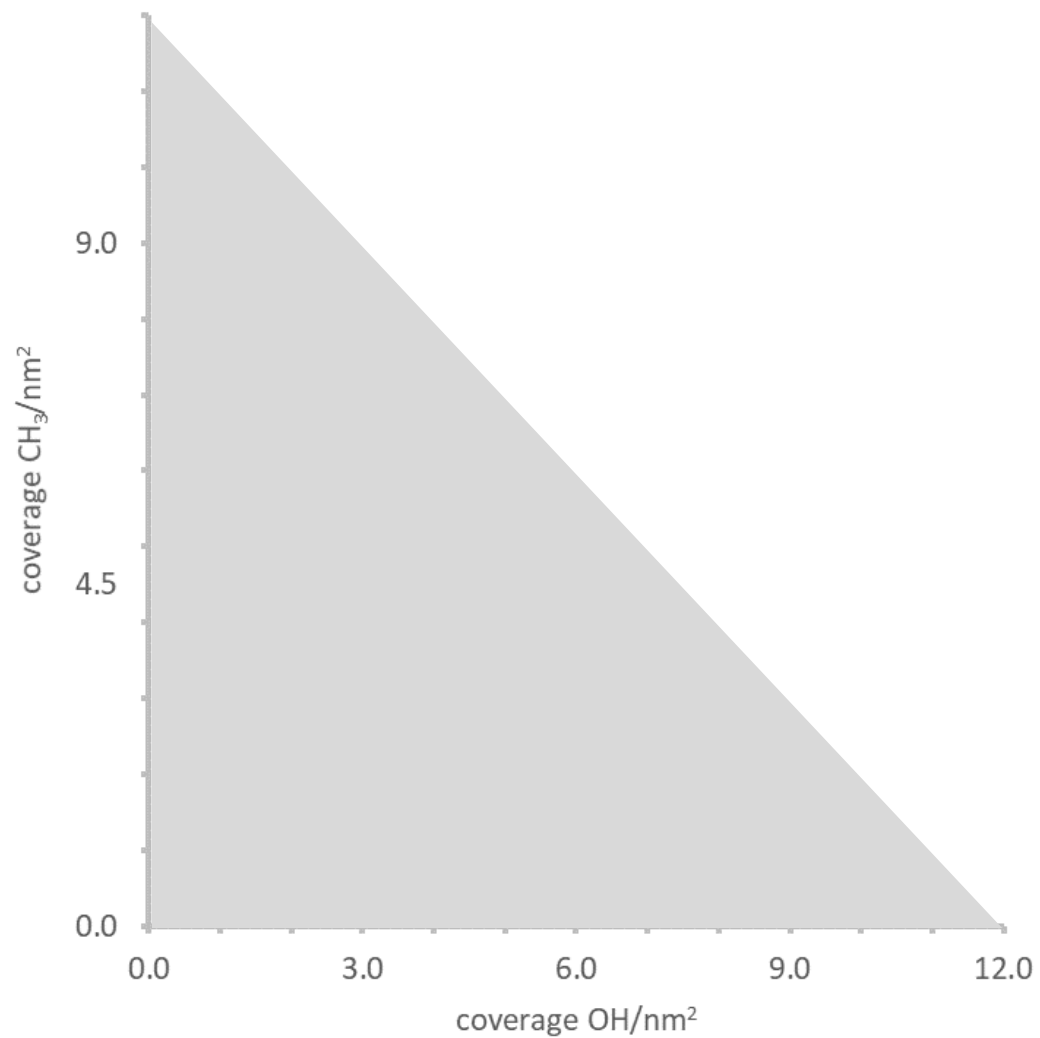
If both saturating coverages are around 6/nm<sup>2</sup> at end of each pulse

→ total by-product desorbing is 12 CH<sub>4</sub>/nm<sup>2</sup>/cycle

→ total deposition is 2 Al<sub>2</sub>O<sub>3</sub>/nm<sup>2</sup>/cycle = 0.33 ML/cycle = 1 Å/cycle.

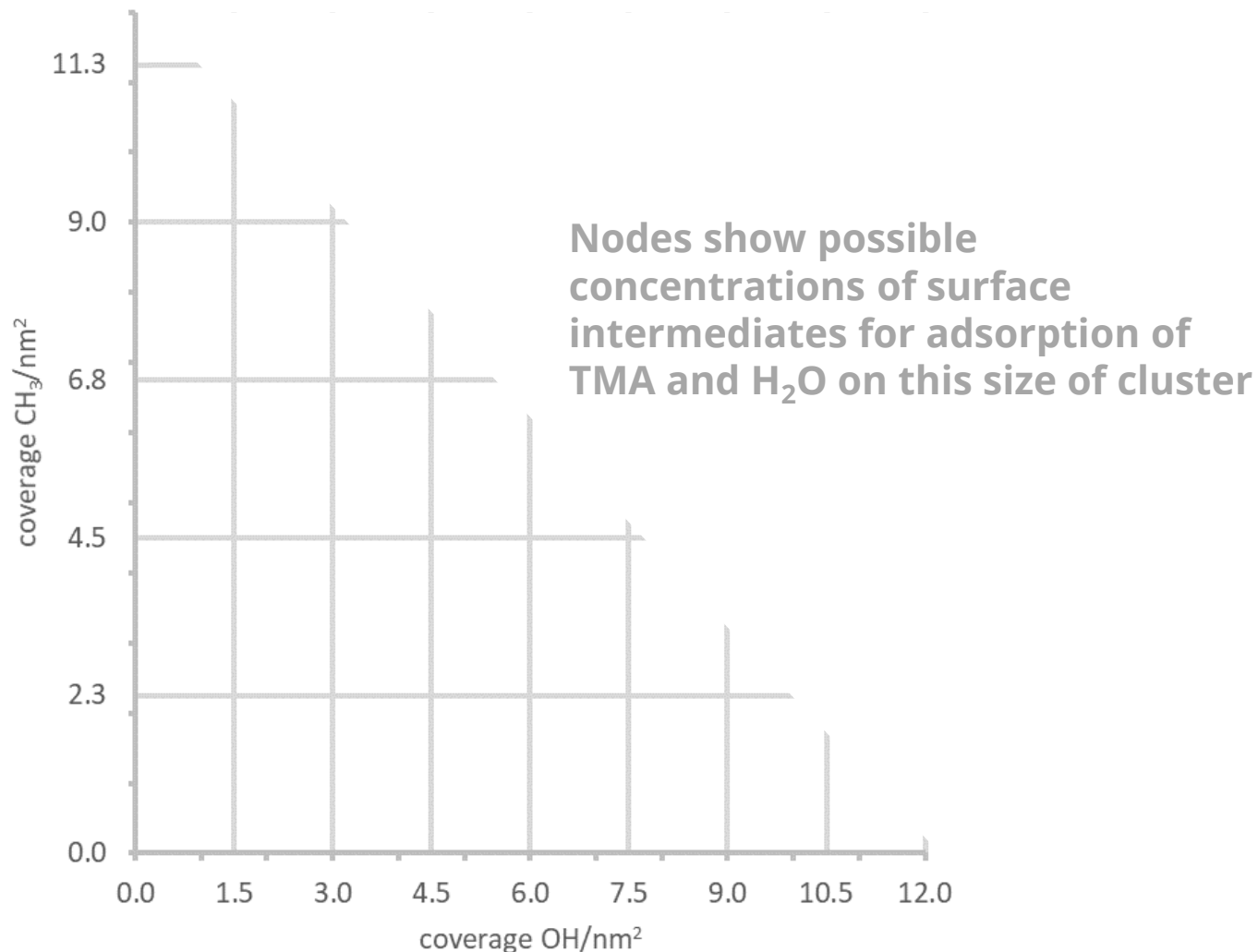
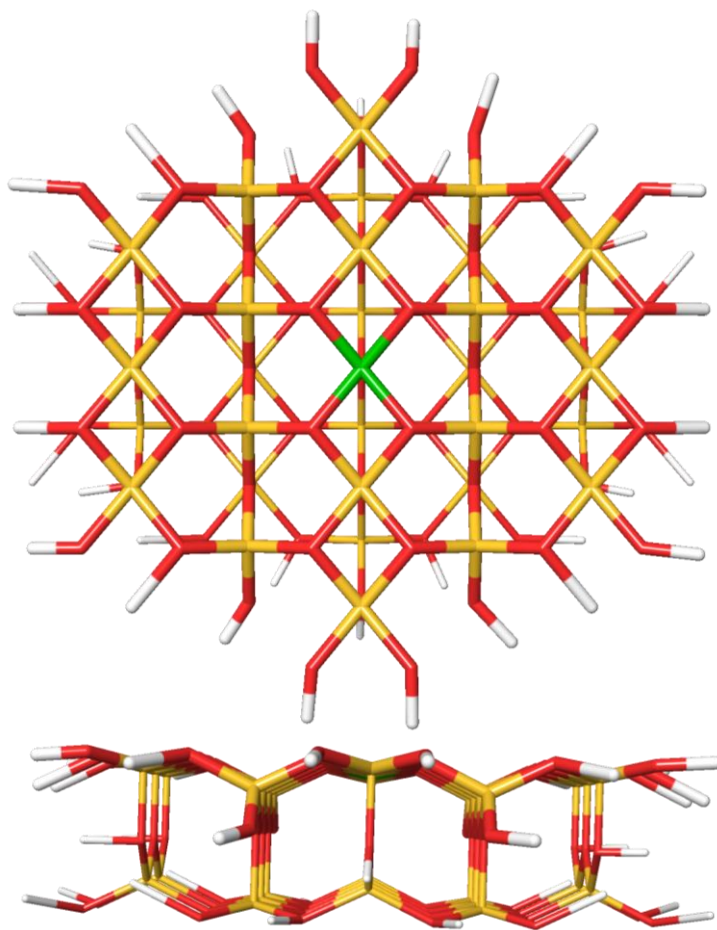


# Chemical space of ALD

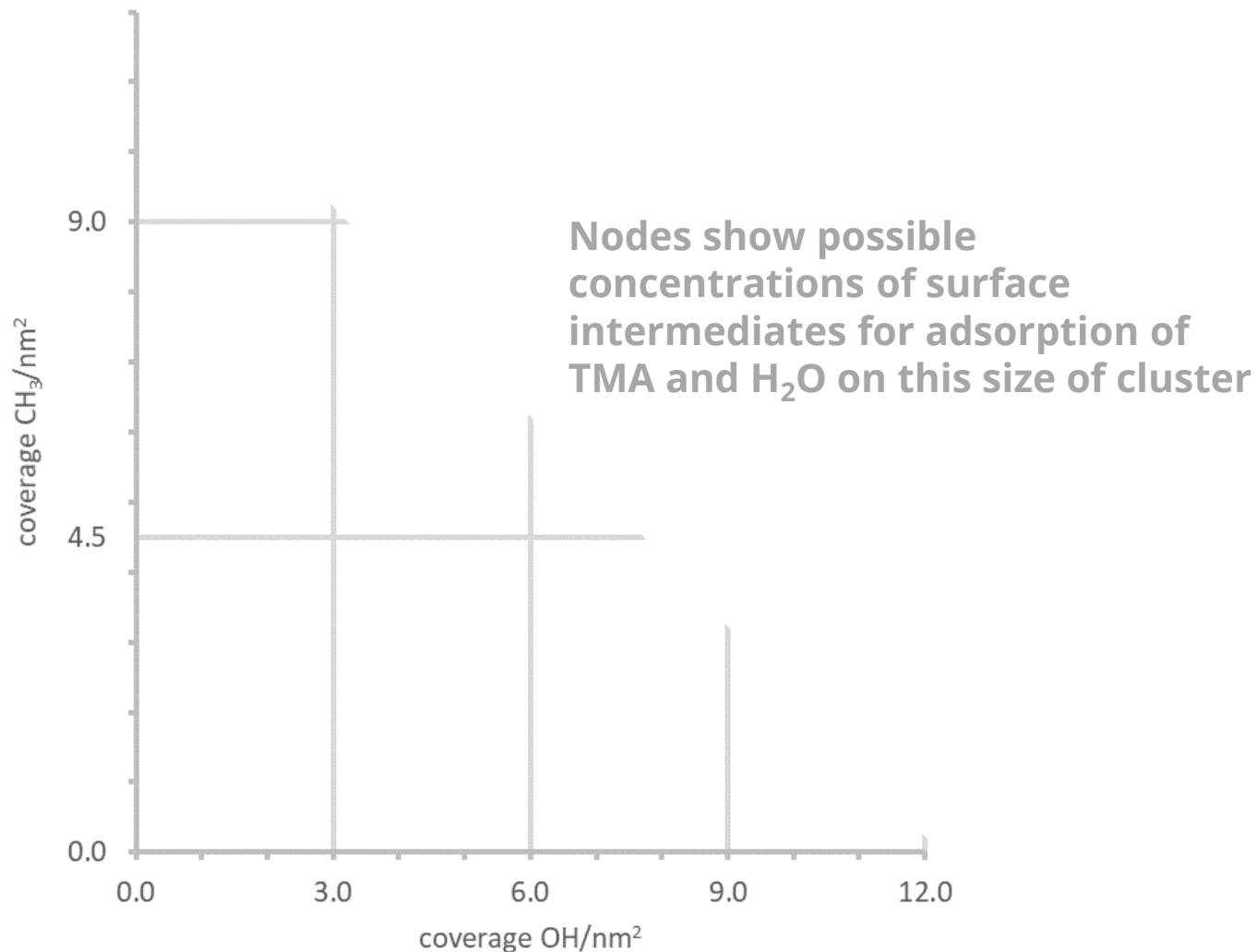
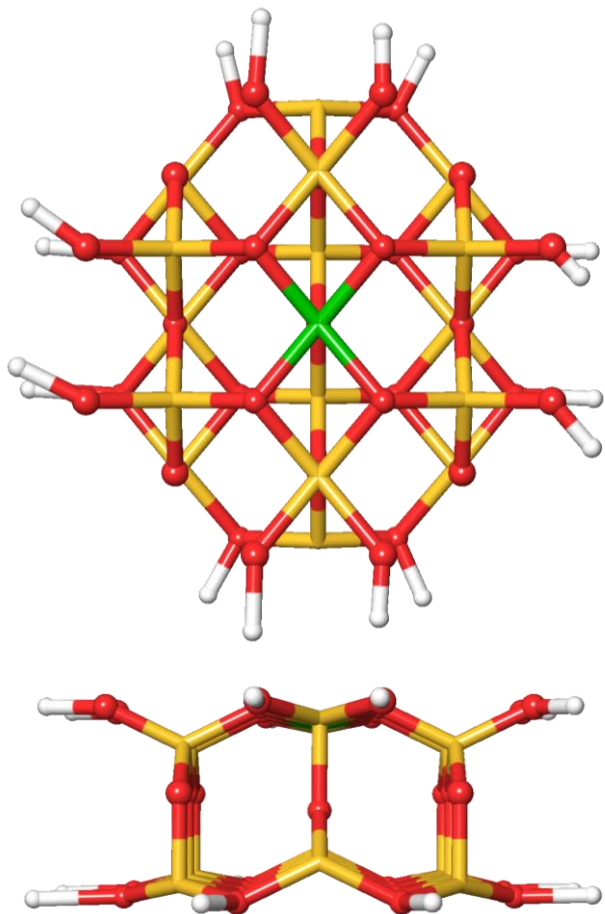




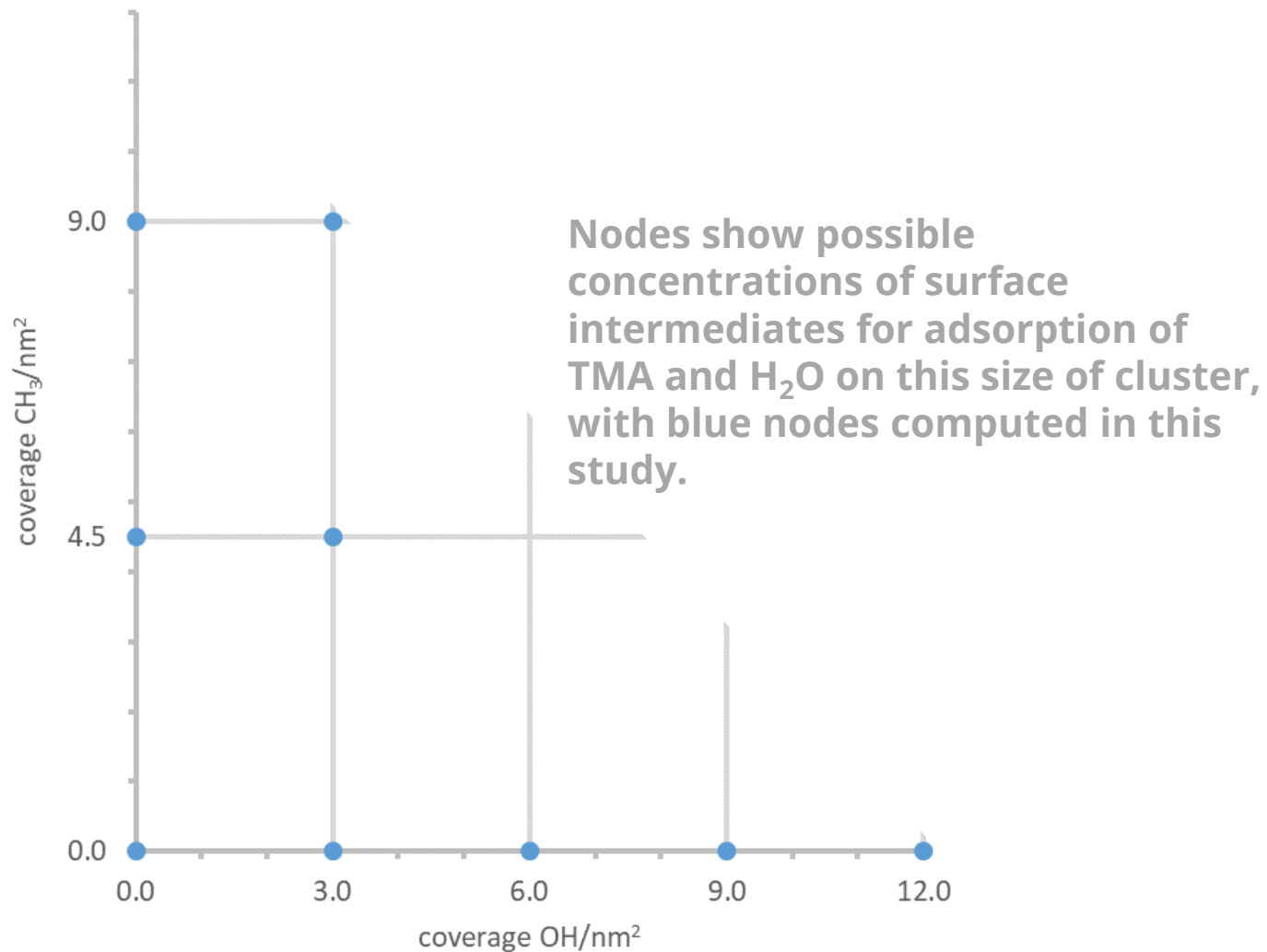
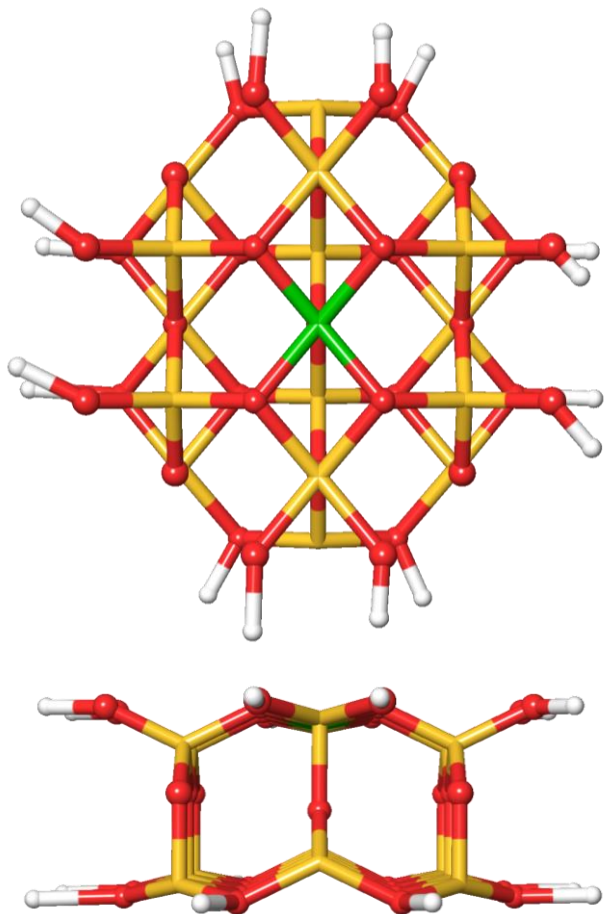
# A model within the chemical space of ALD



# A model within the chemical space of ALD



# A model within the chemical space of ALD

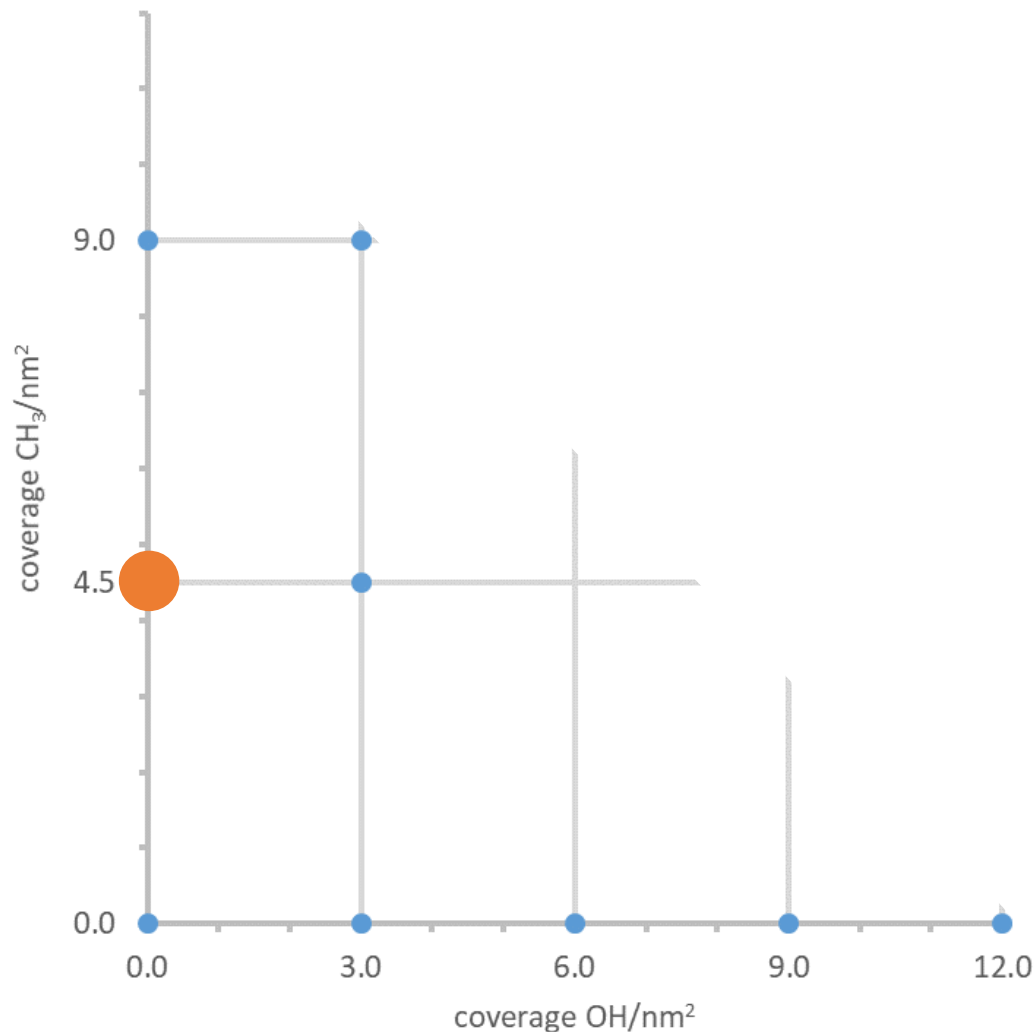




# Enumeration of structures for H<sub>2</sub>O adsorption



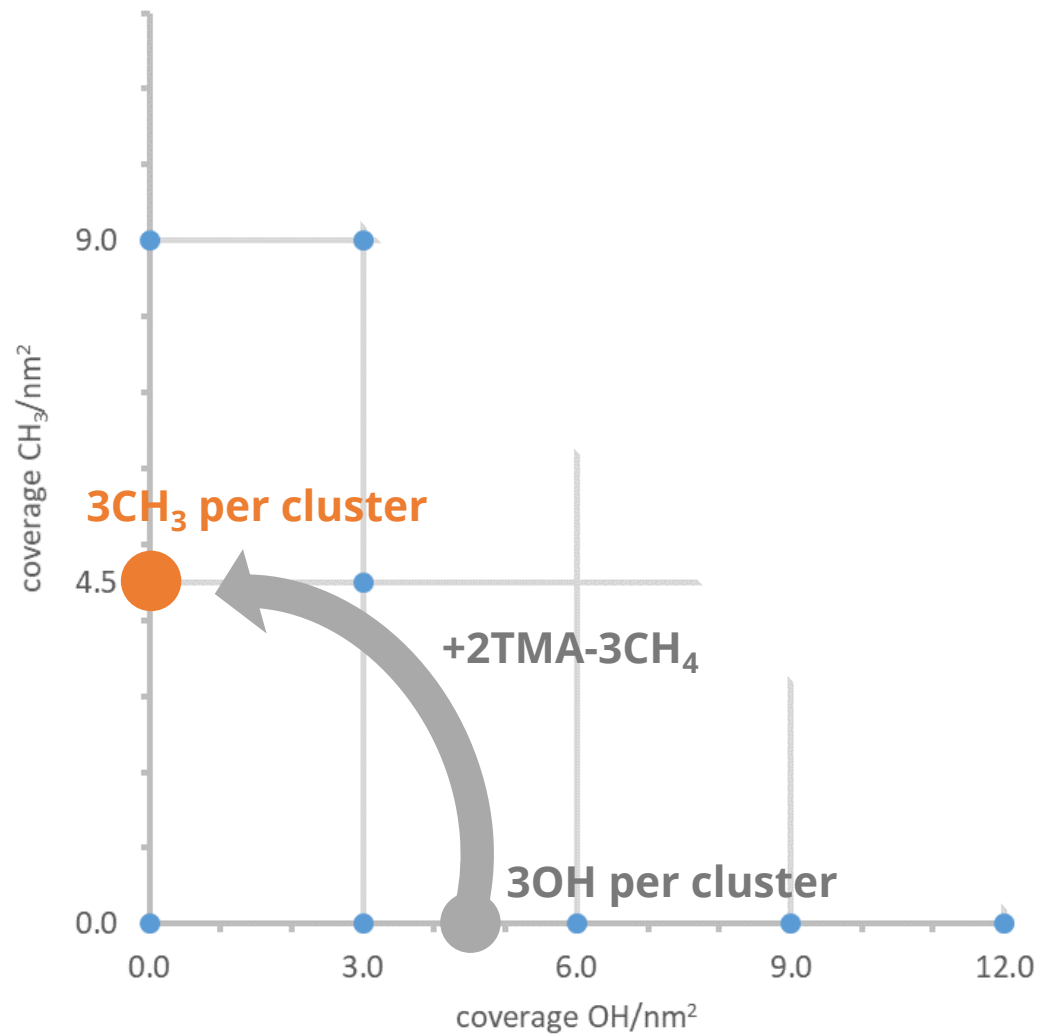
# Adsorption of H<sub>2</sub>O onto methylated surface



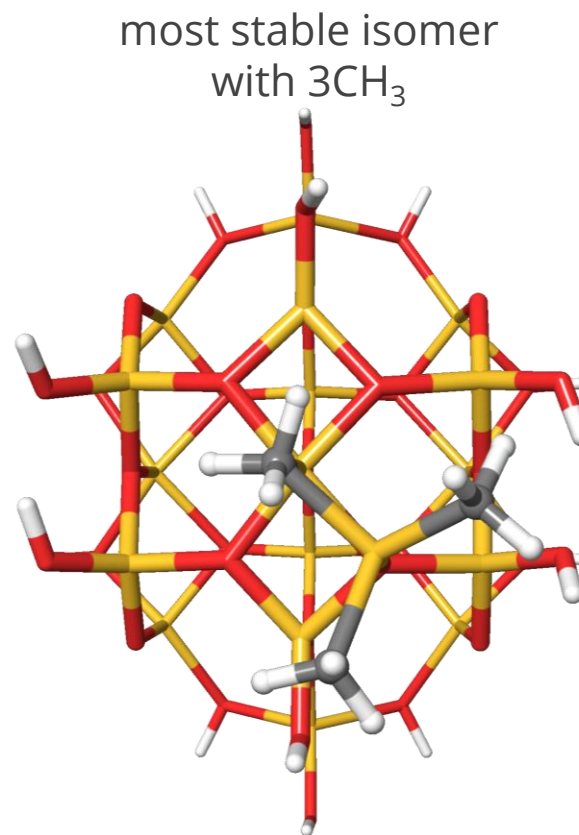
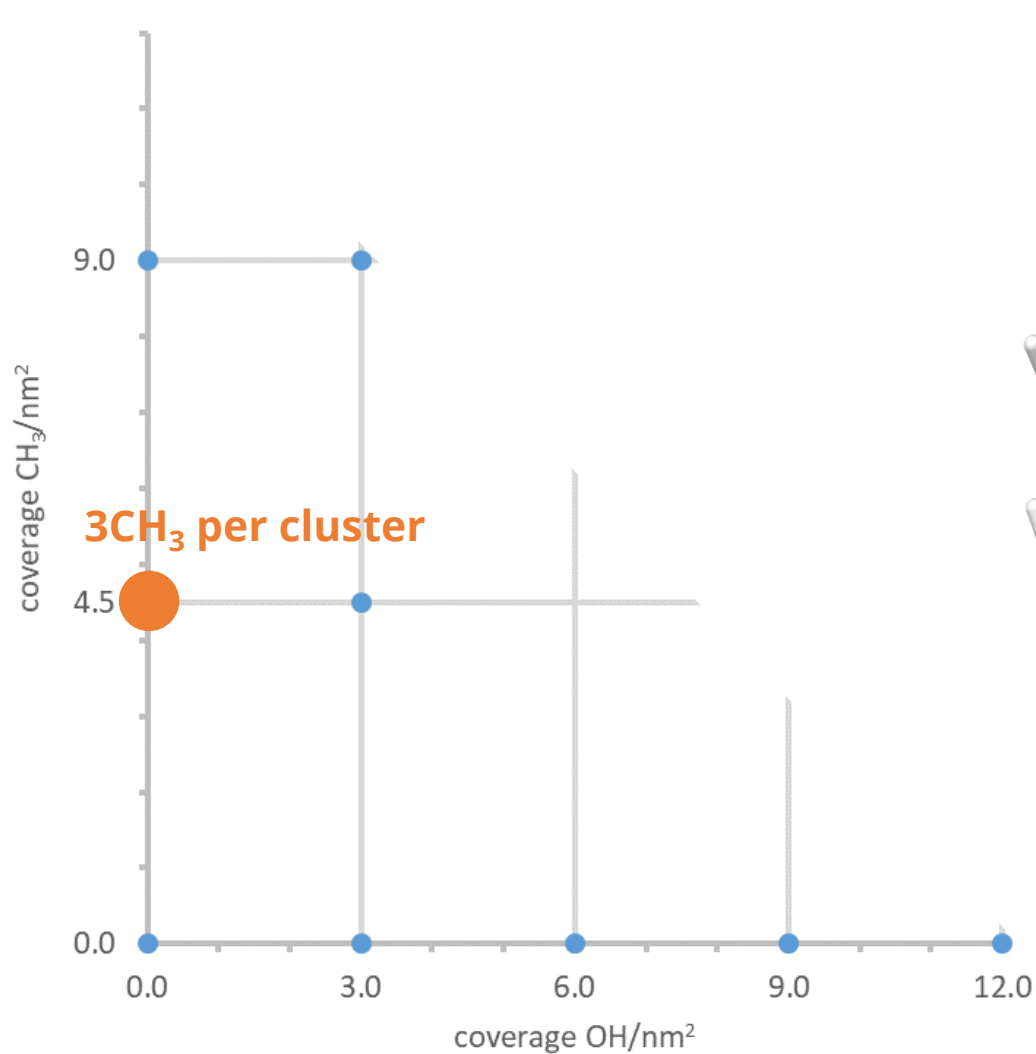
## APPROACH:

- At each surface concentration, systematically enumerate all symmetry-distinct isomers:
  - 24 isomers across range of methyl concentrations
  - 24 isomers across range of hydroxyl coverages.
- Optimize those structures at DFT level (B3LYP-D3/LACVP\*) and select valid structures.
- Add H<sub>2</sub>O adsorbate to chosen site and reoptimize with DFT.
- Optimizations each take 50-70 cpu-hours; total time 110 cpu-days.

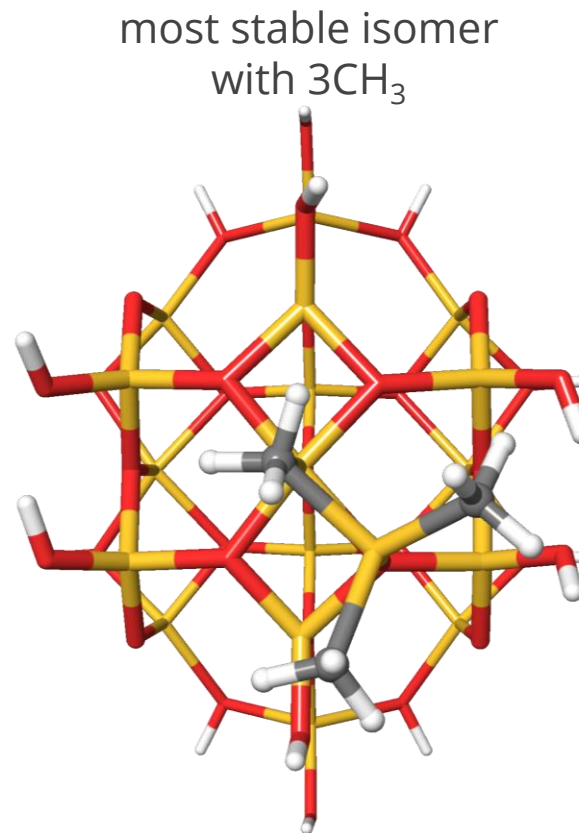
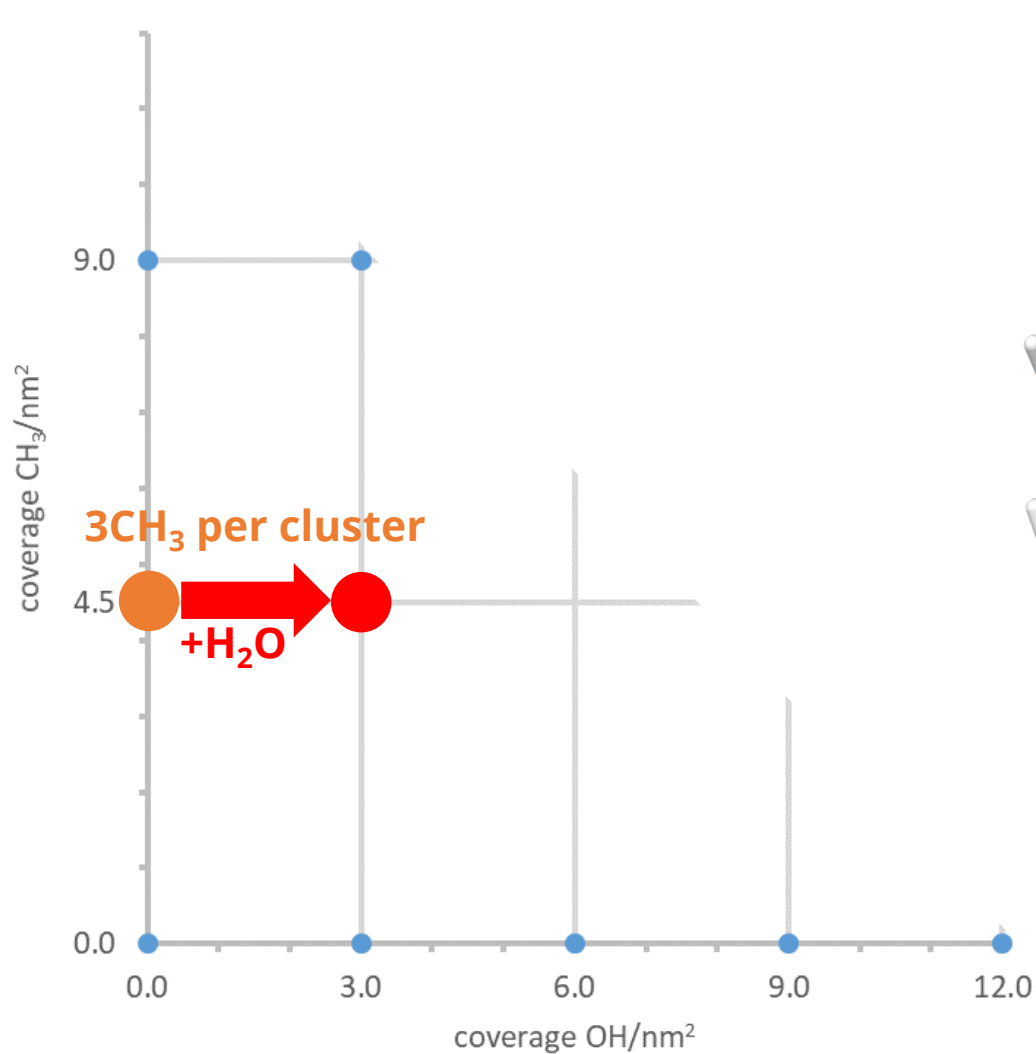
# Adsorption of H<sub>2</sub>O onto methylated surface



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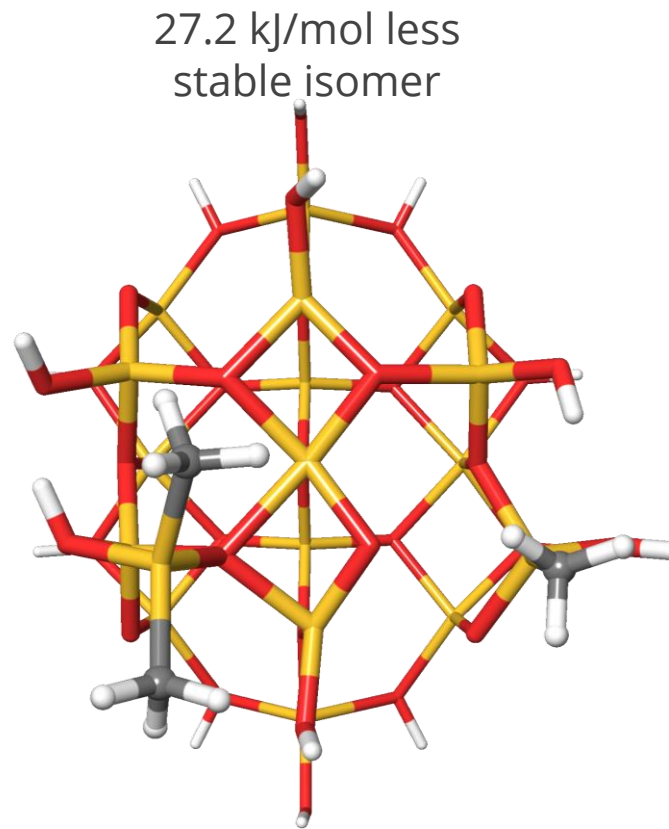
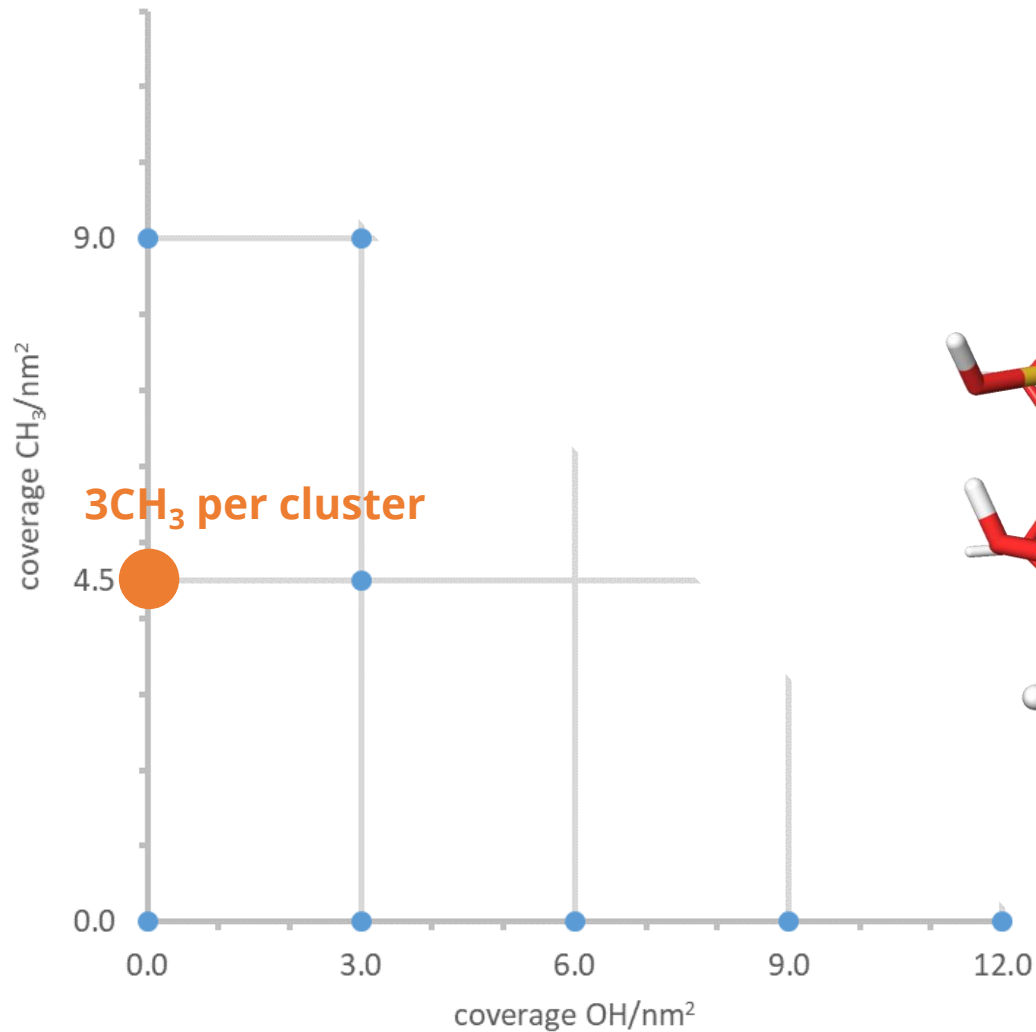


# Adsorption of H<sub>2</sub>O onto methylated surface



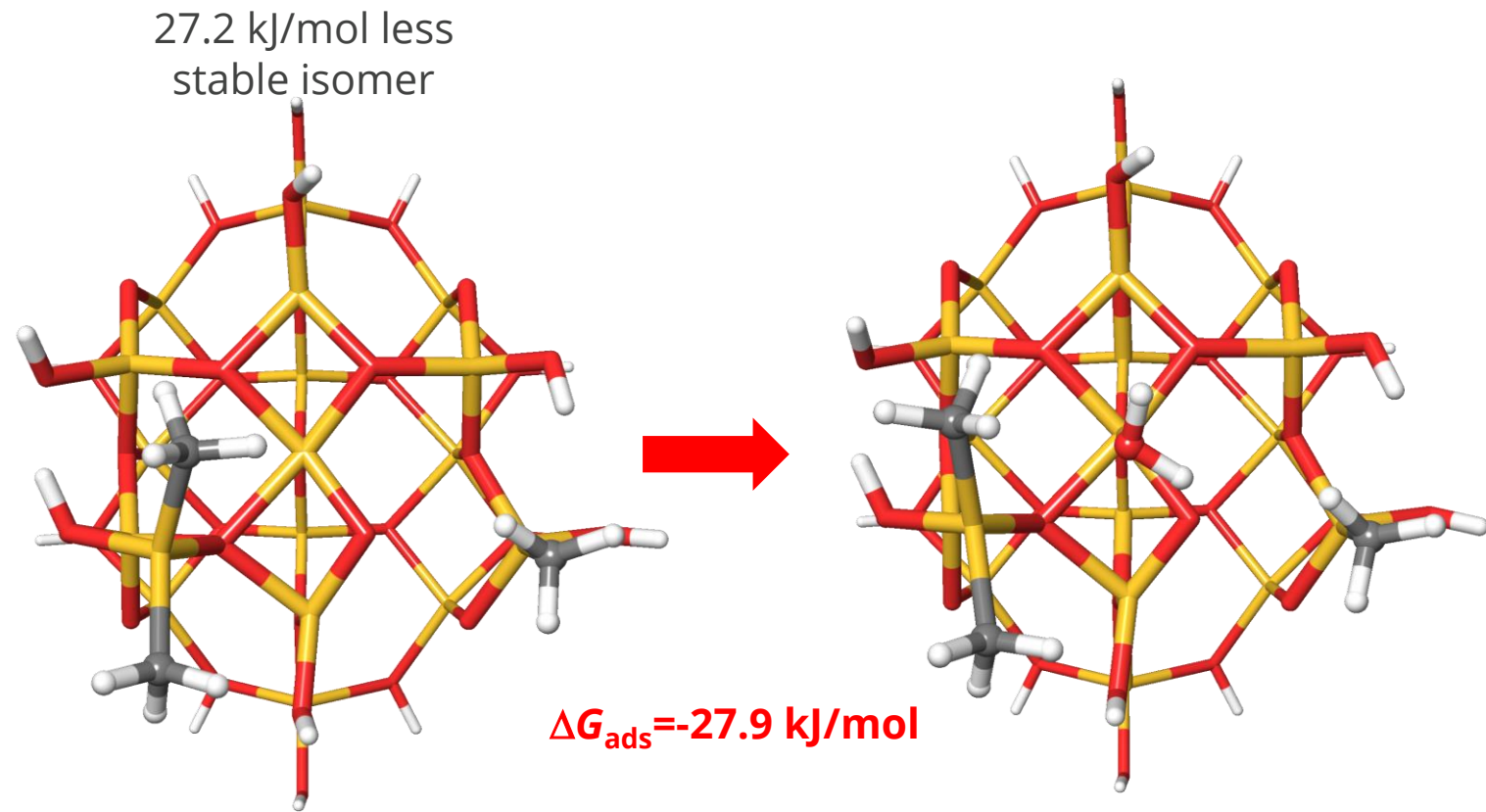
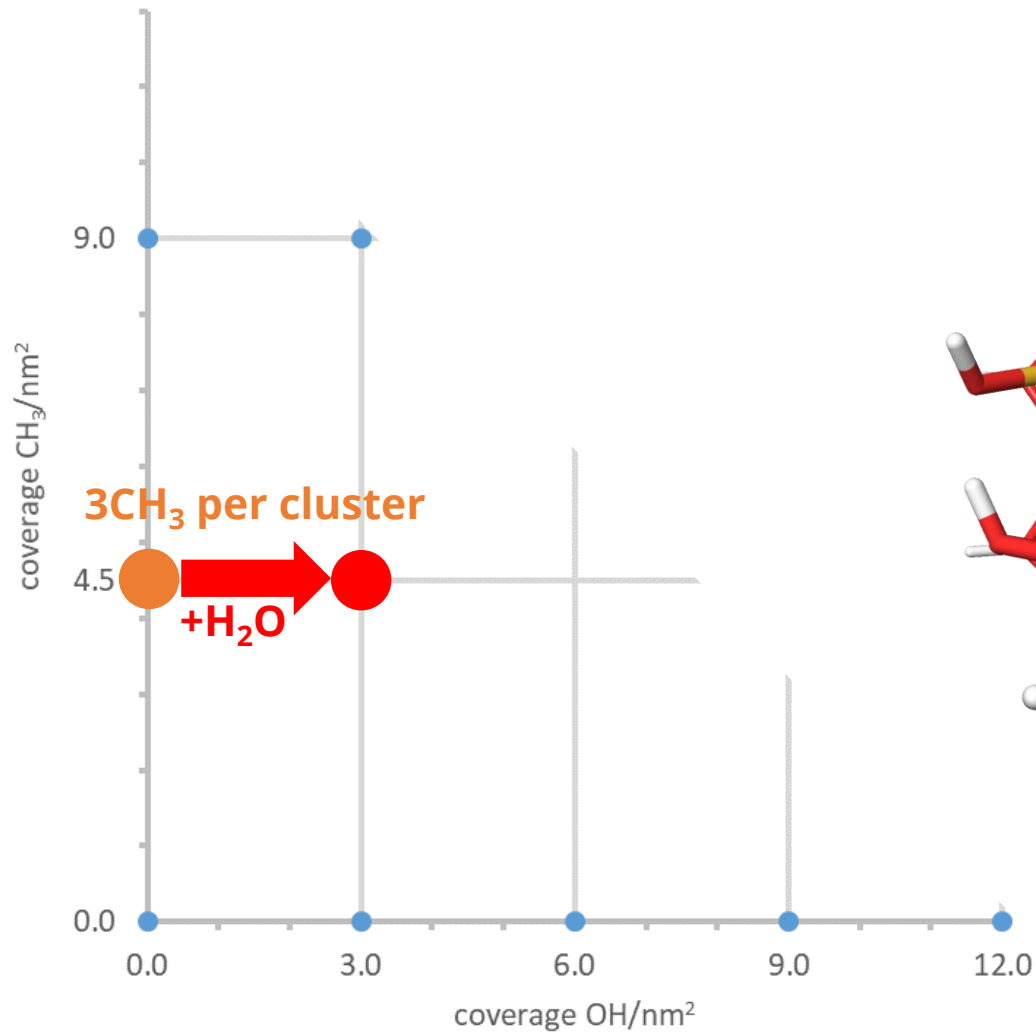
→ adsorption site for H<sub>2</sub>O  
is already occupied

# Adsorption of H<sub>2</sub>O onto methylated surface

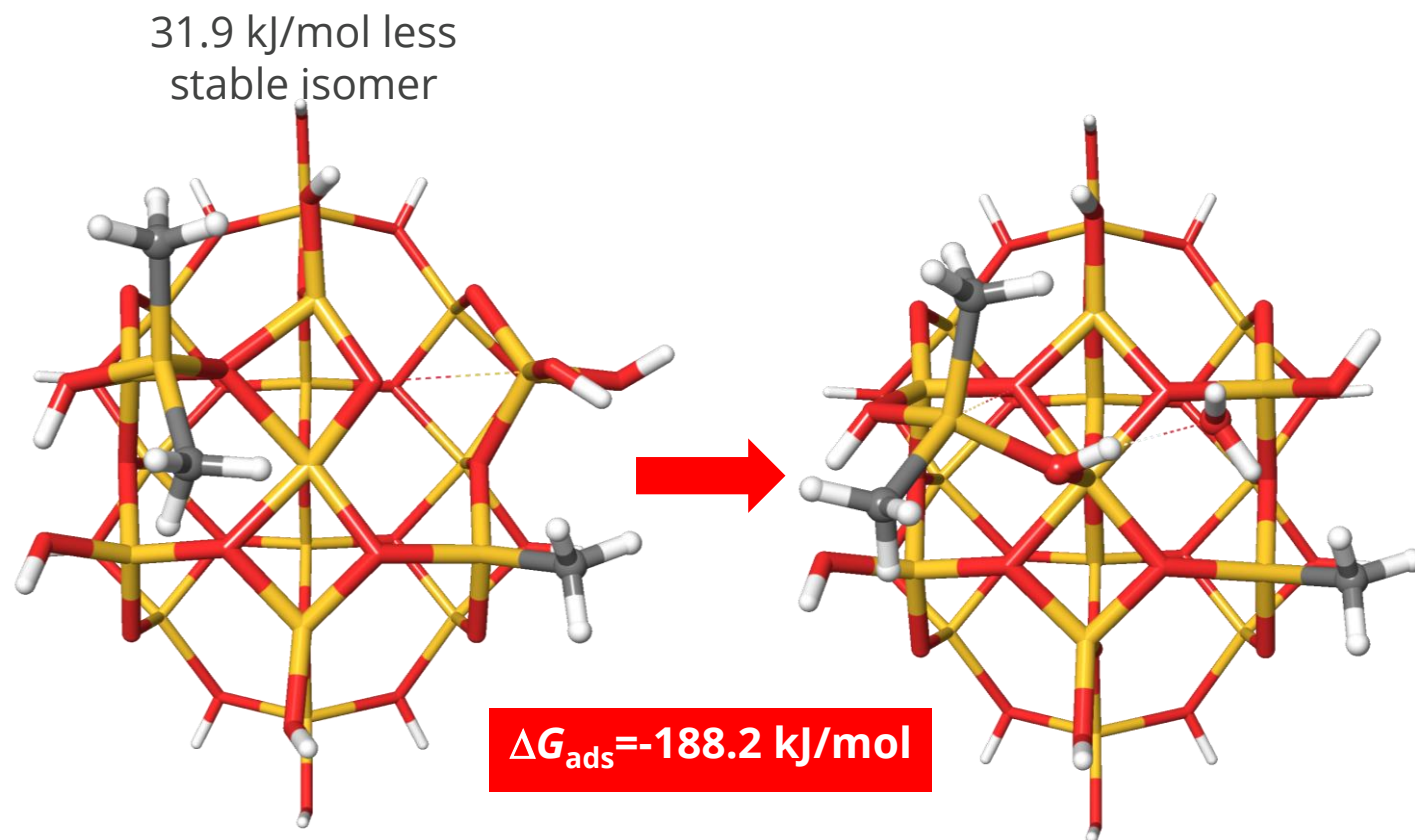
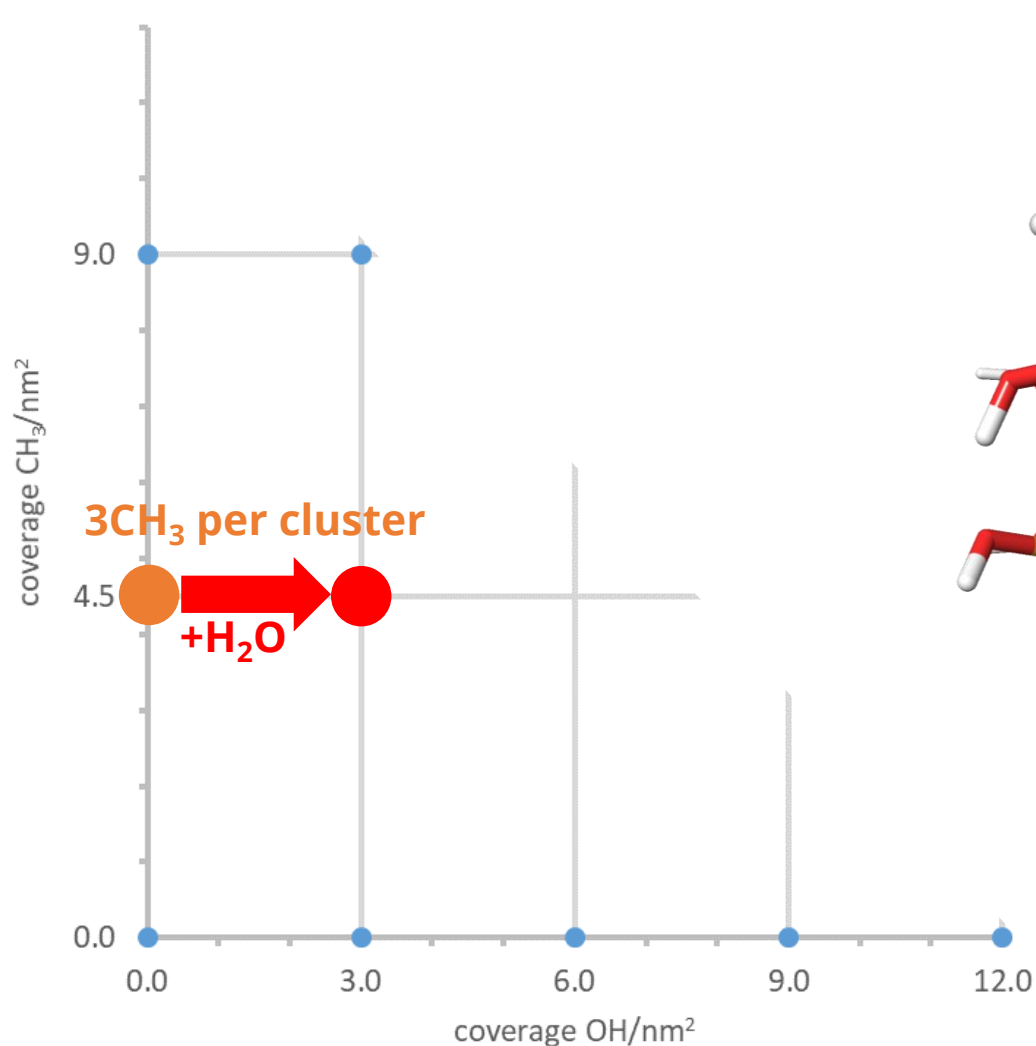




# Adsorption of H<sub>2</sub>O onto methylated surface

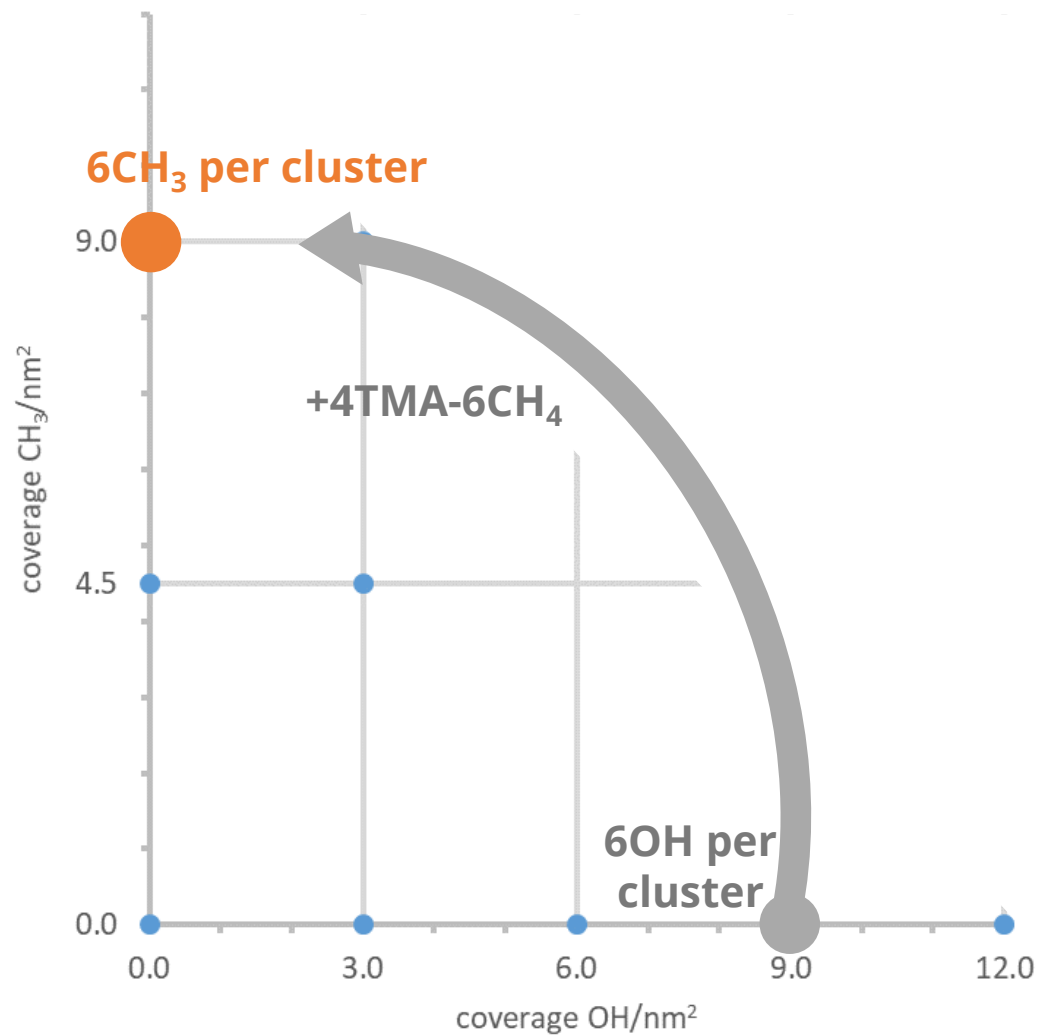


# Adsorption of H<sub>2</sub>O onto methylated surface

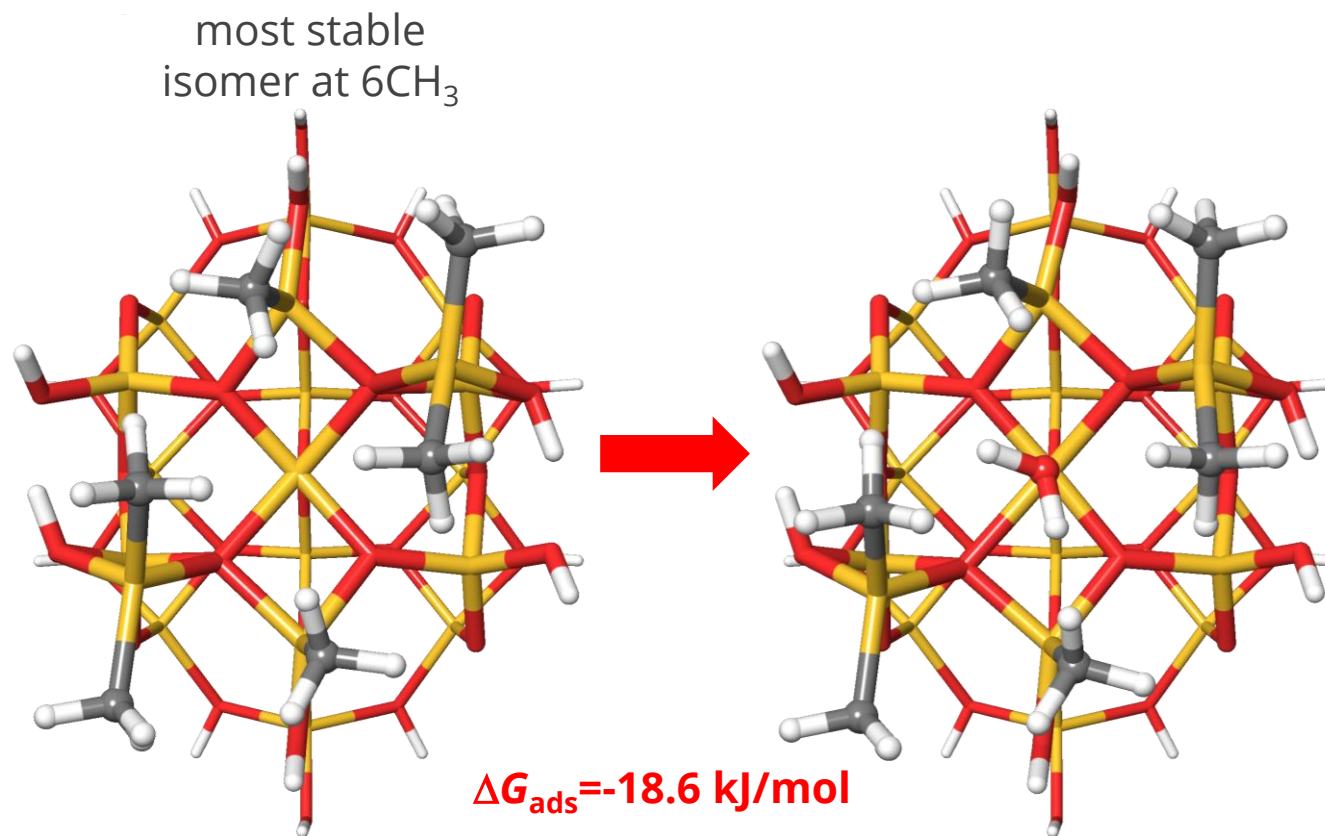
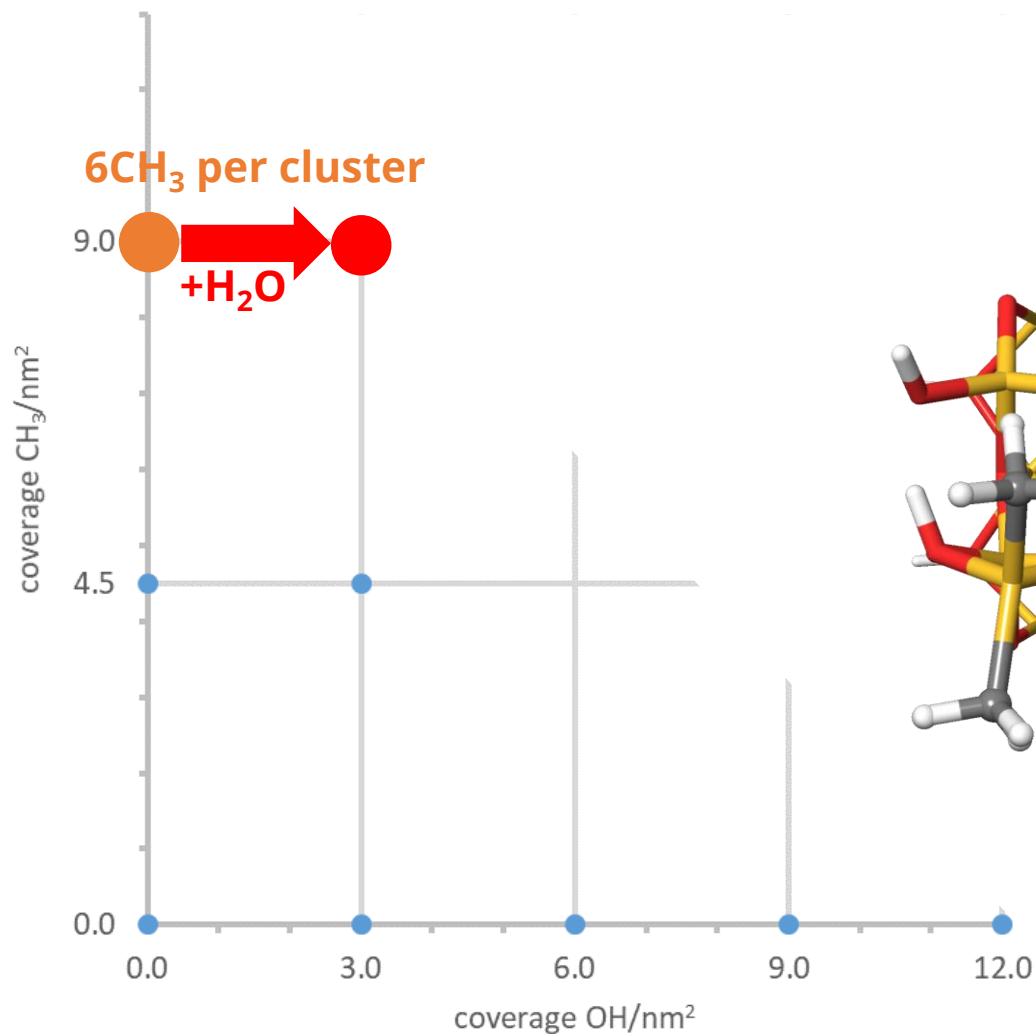


Need to check outliers like this one – they may flag up a different category of chemistry.

# Adsorption of H<sub>2</sub>O onto methylated surface

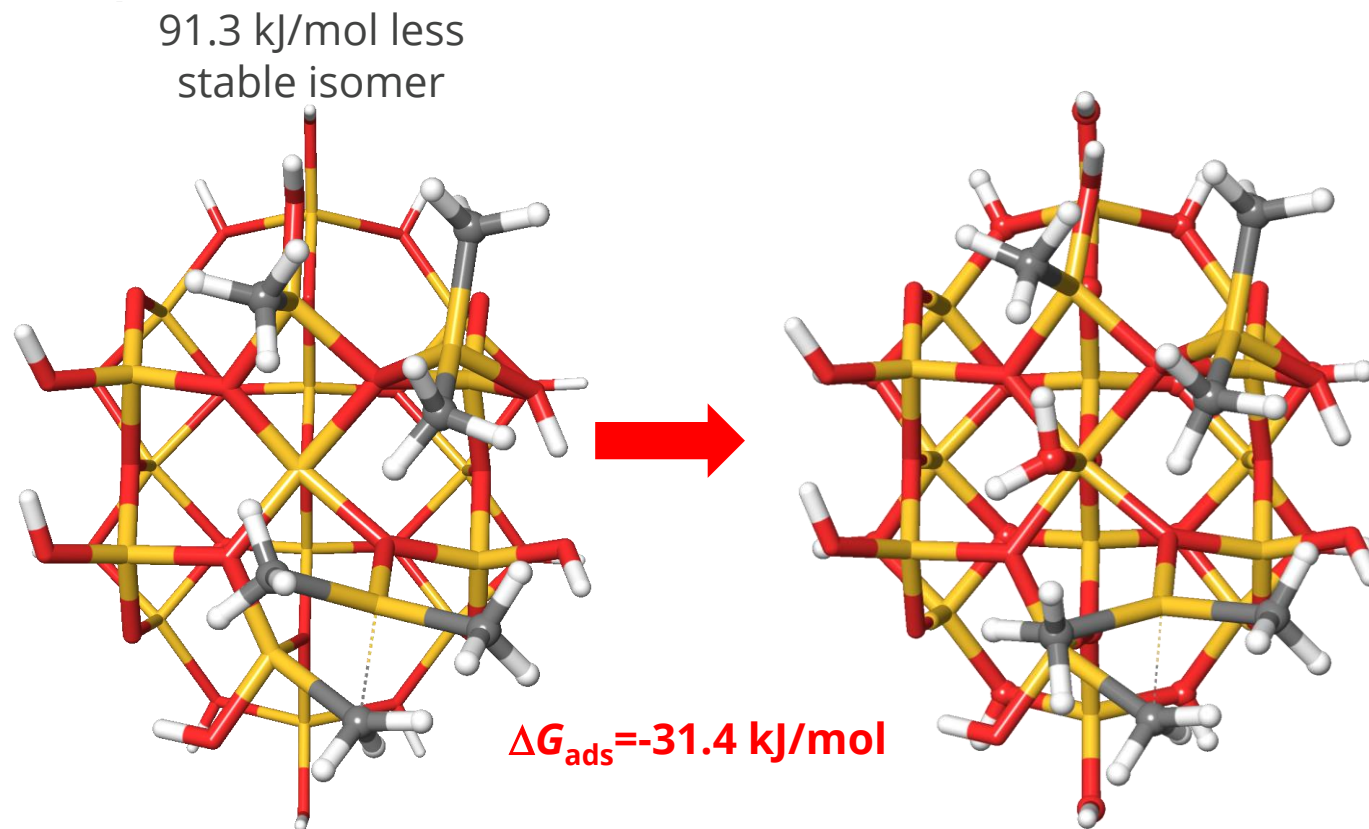
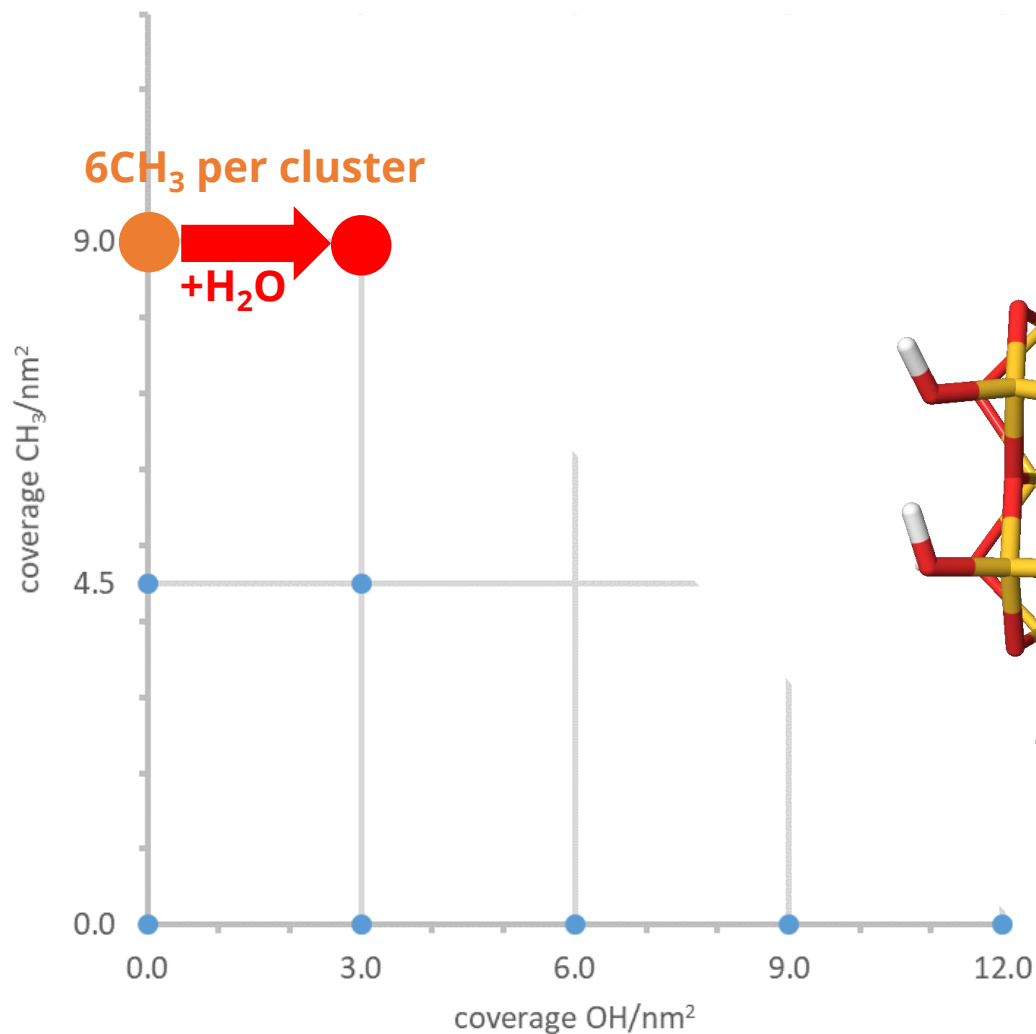


# Adsorption of H<sub>2</sub>O onto methylated surface

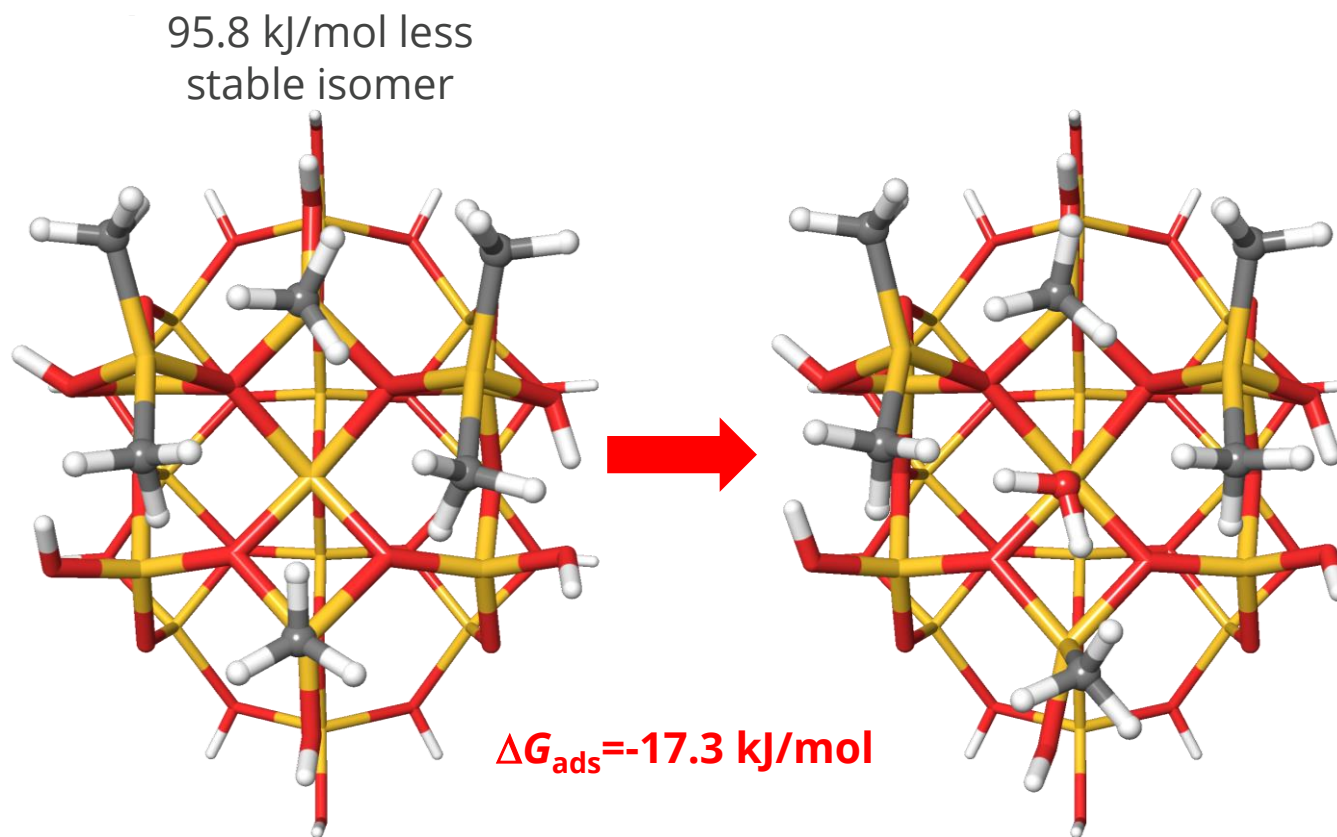
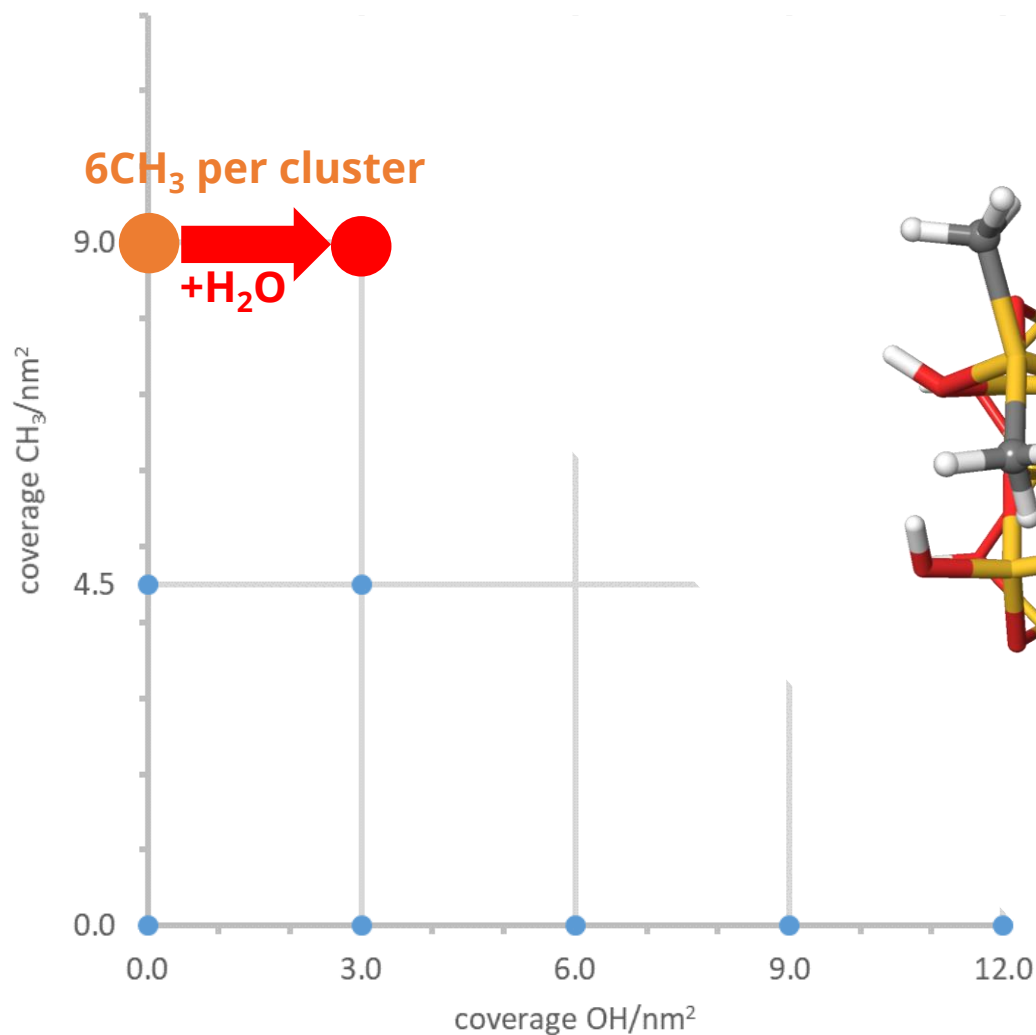




# Adsorption of H<sub>2</sub>O onto methylated surface

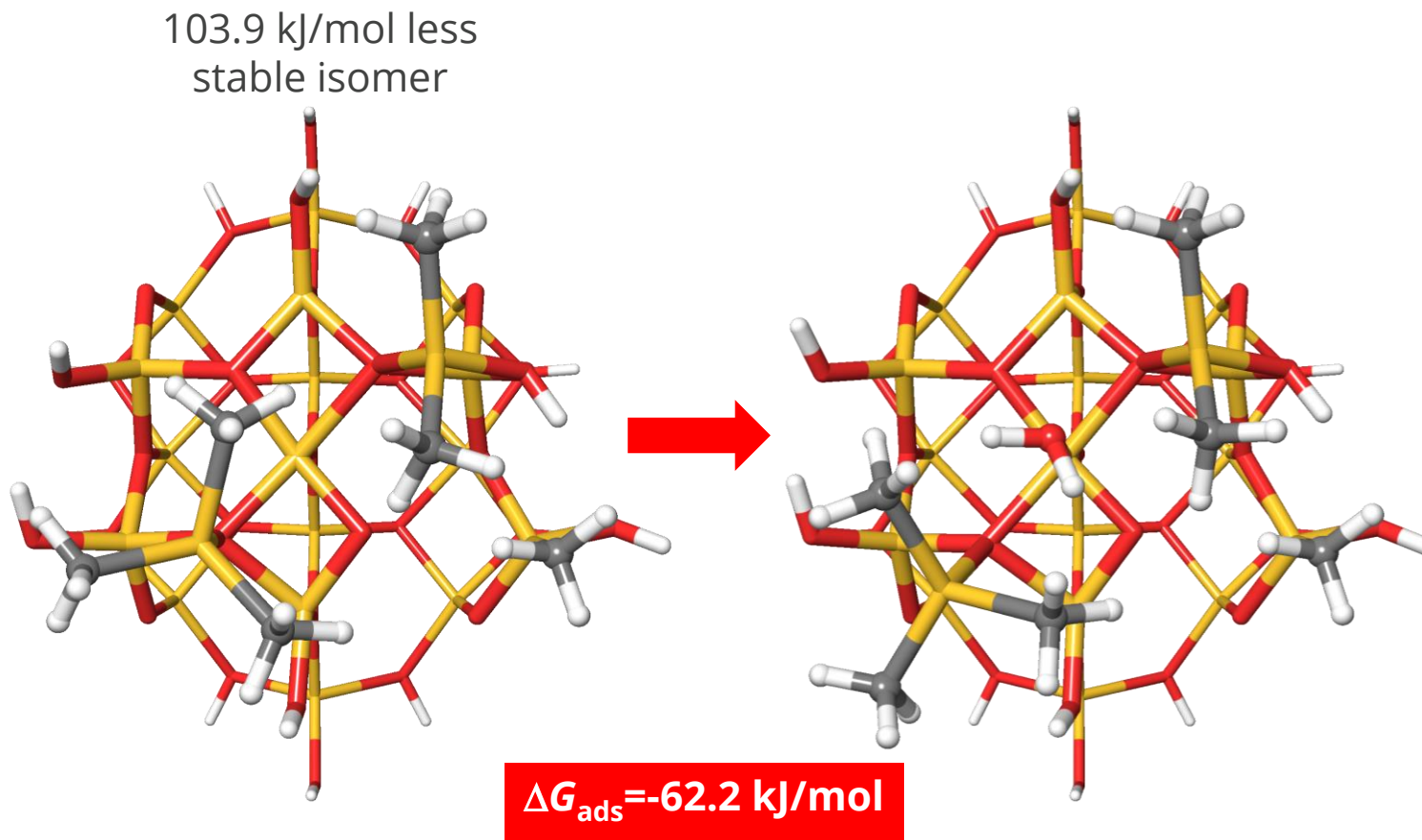
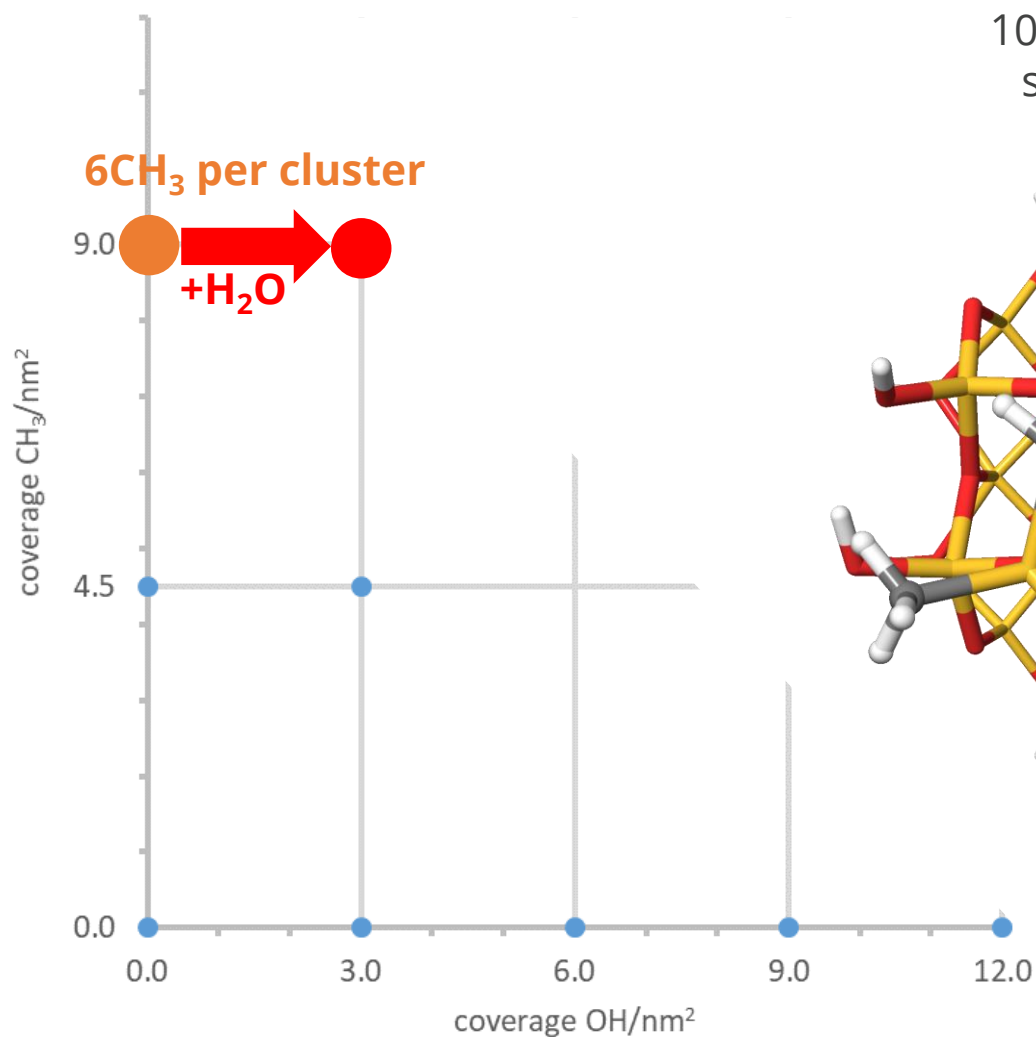


# Adsorption of H<sub>2</sub>O onto methylated surface



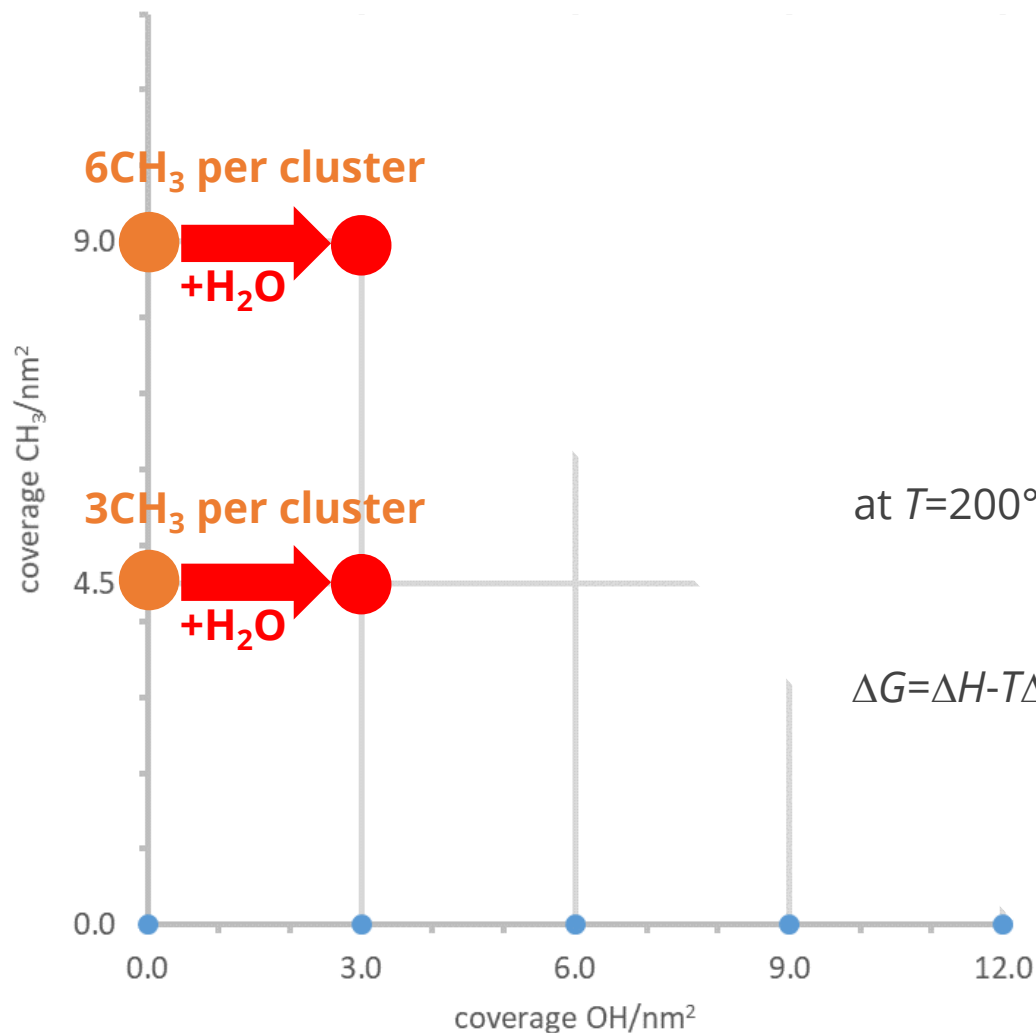
average over 5 methylated surfaces  
is  $\Delta G_{\text{ads}} = -30 \pm 20 \text{ kJ/mol}$

# Adsorption of H<sub>2</sub>O onto methylated surface



Contrary to what one would expect from sterics alone.

# Adsorption of H<sub>2</sub>O onto methylated surface



Predominant thermal effect is entropy of free H<sub>2</sub>O molecule.

average  $\Delta H_{\text{ads}} = -106 \pm 14$  kJ/mol

constant  $T\Delta S_{\text{H}_2\text{O}} = -89.4$  kJ/mol

average  $T\Delta S_{\text{surf}} = +14 \pm 6$  kJ/mol

at  $T = 200^\circ\text{C}$

$\Delta G = \Delta H - T\Delta S$

average  $\Delta G_{\text{ads}} = -30 \pm 20$  kJ/mol

$\Delta H_{\text{ads}} = -128.7$  kJ/mol

$T\Delta S_{\text{H}_2\text{O}} = -89.4$  kJ/mol

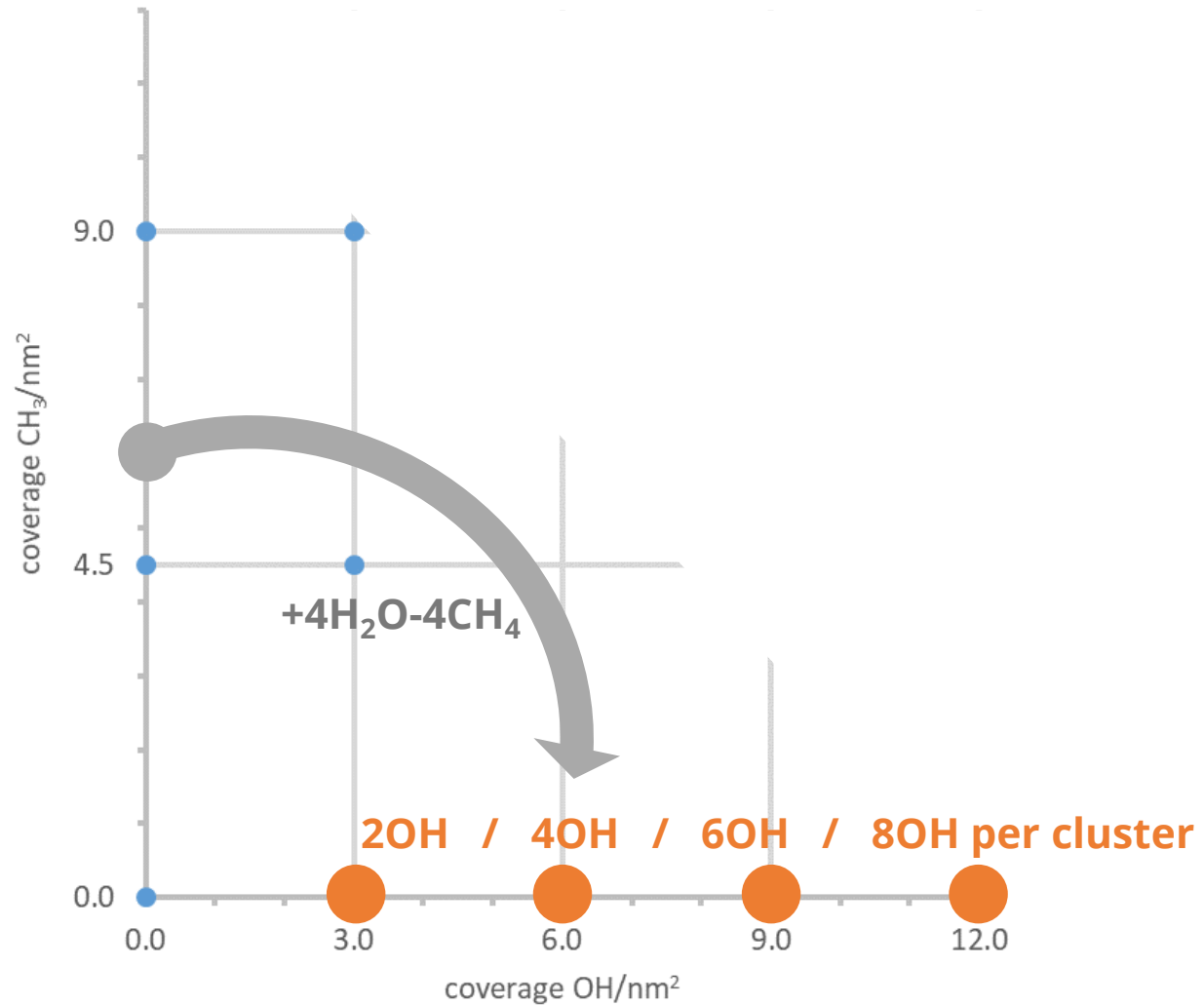
$T\Delta S_{\text{surf}} = +22.8$  kJ/mol

$\Delta G_{\text{ads}} = -62.2$  kJ/mol

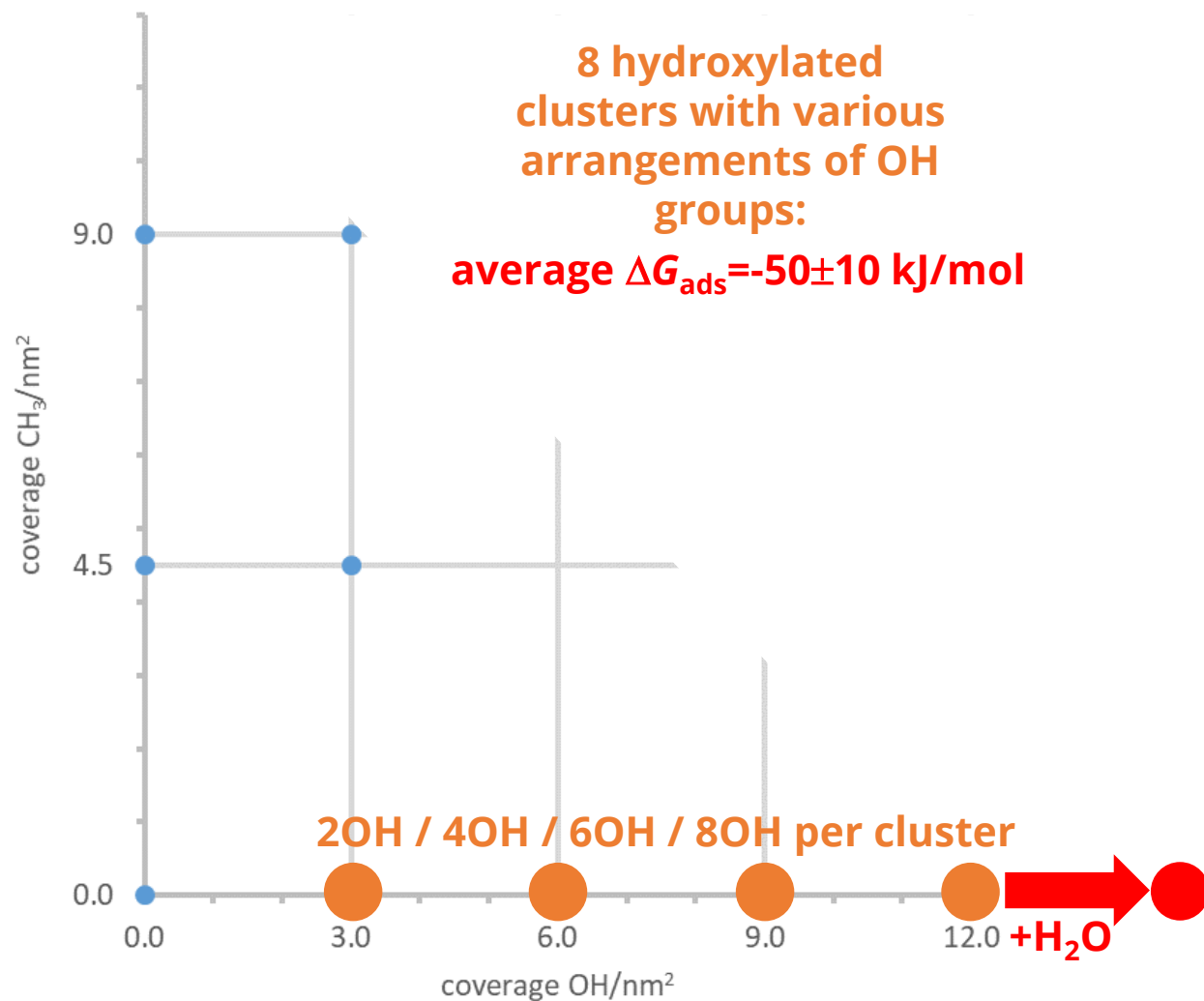
Entropy (=surface motion) plays a role here, but less than enthalpy (=bonding).



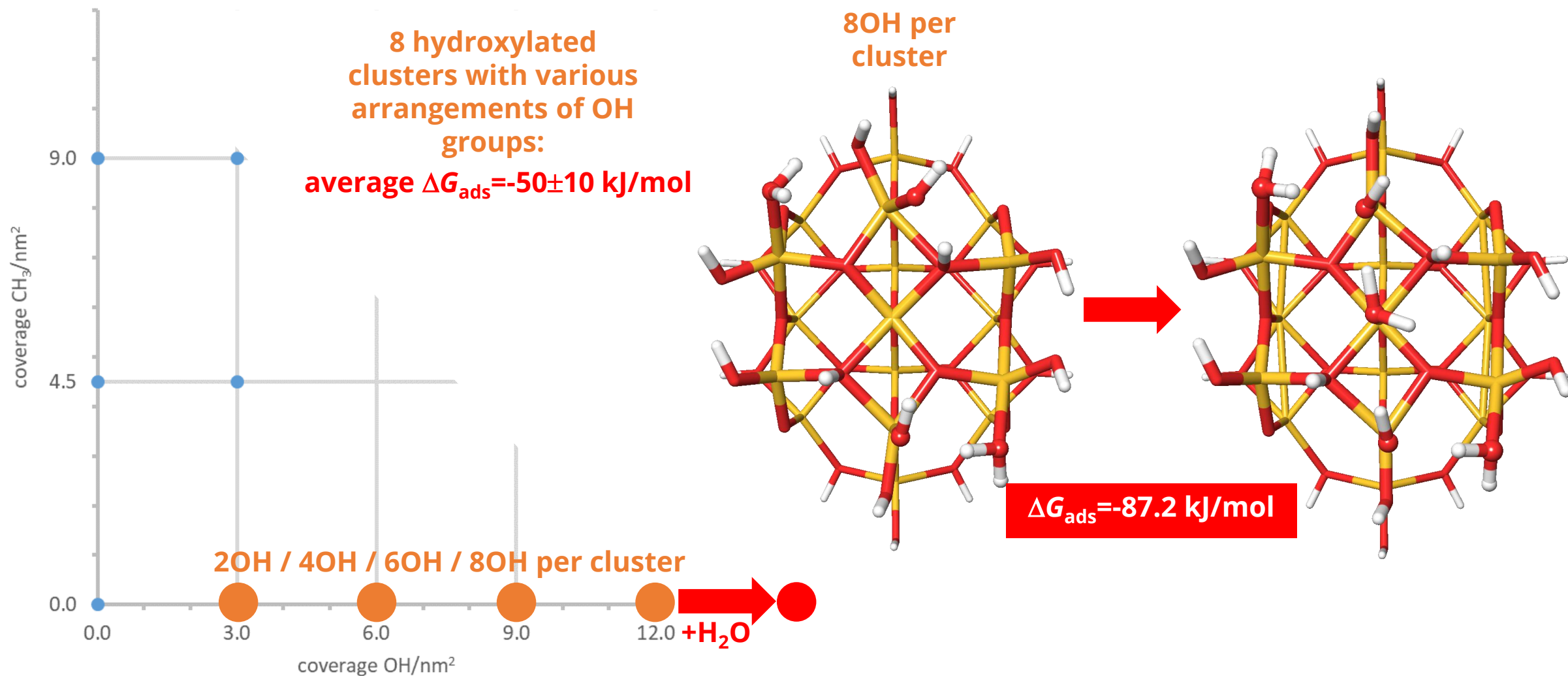
# Adsorption of H<sub>2</sub>O onto hydroxylated surface



# Adsorption of H<sub>2</sub>O onto hydroxylated surface



# Adsorption of H<sub>2</sub>O onto hydroxylated surface

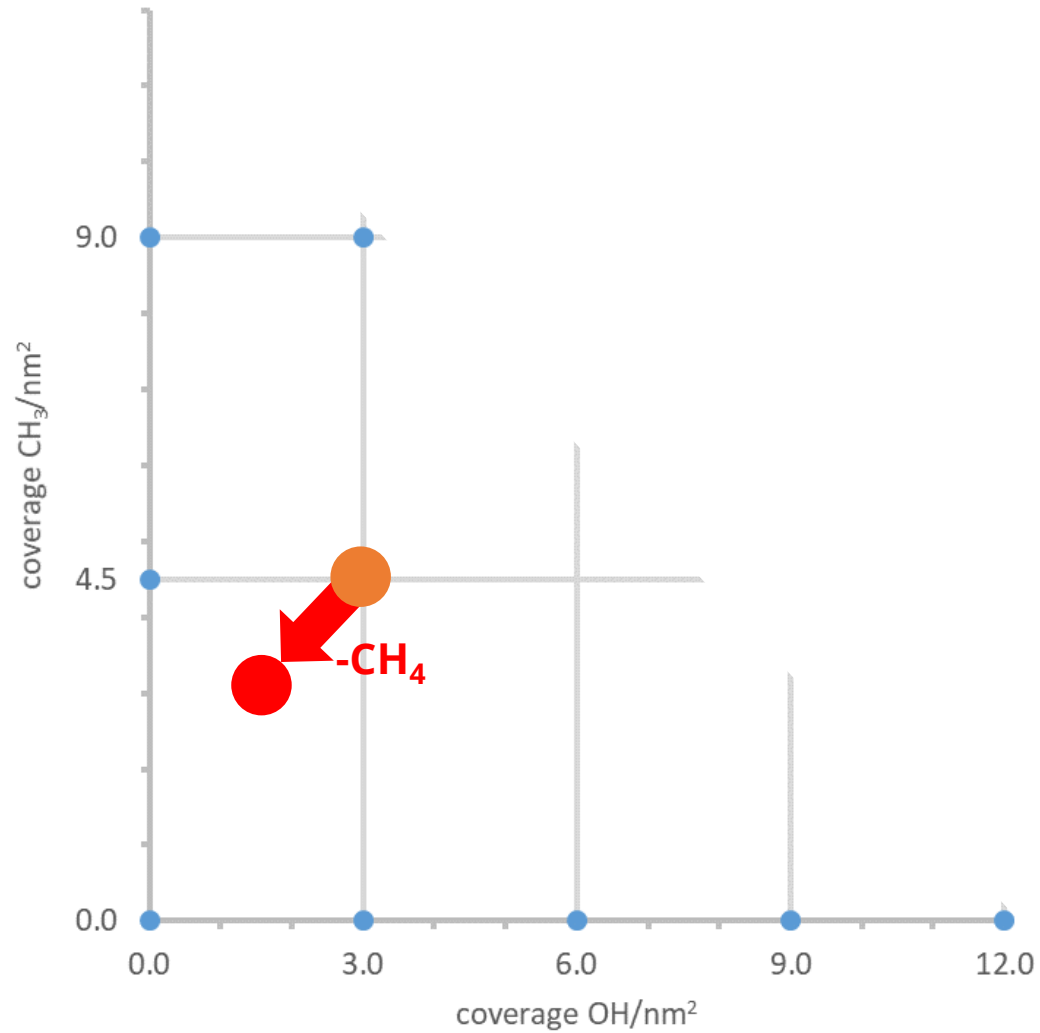




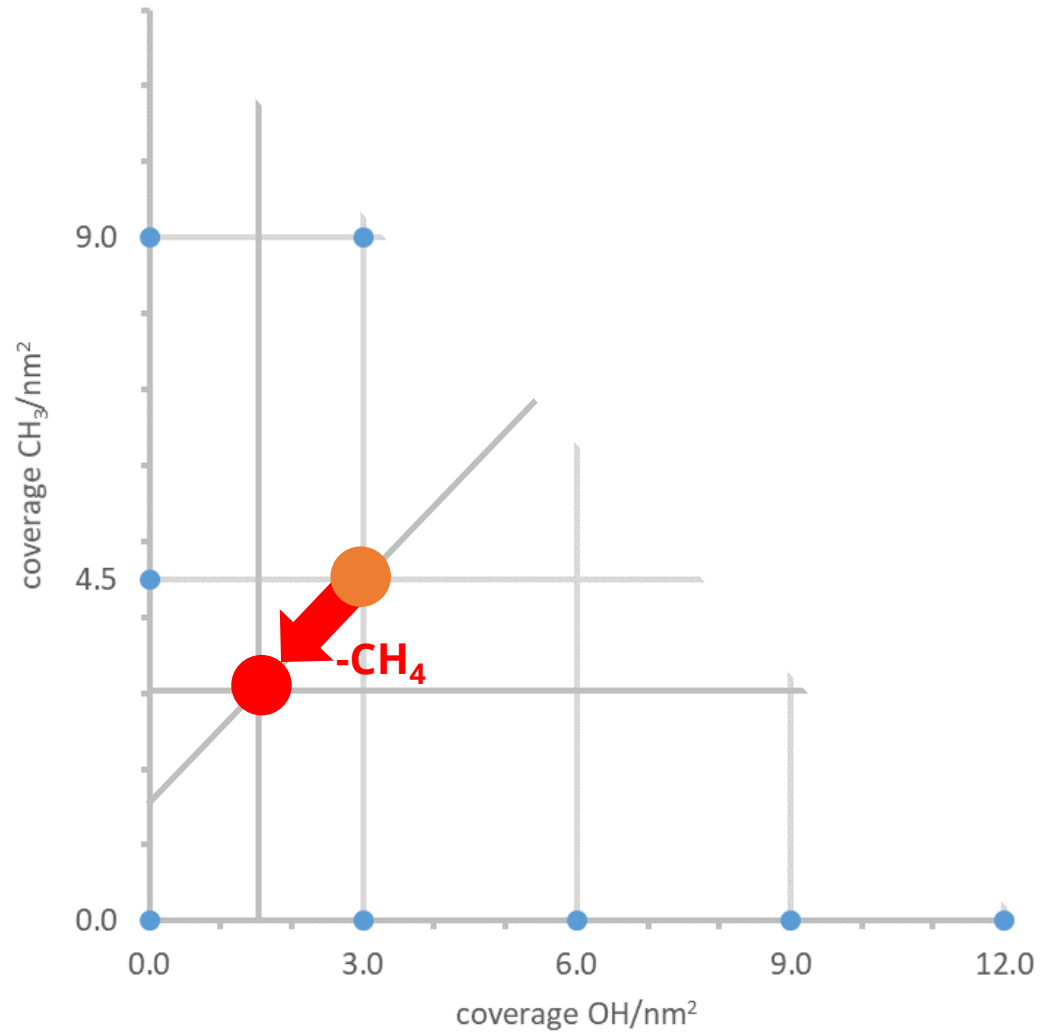
Next step:  
enumeration of reactions of adsorbed H<sub>2</sub>O



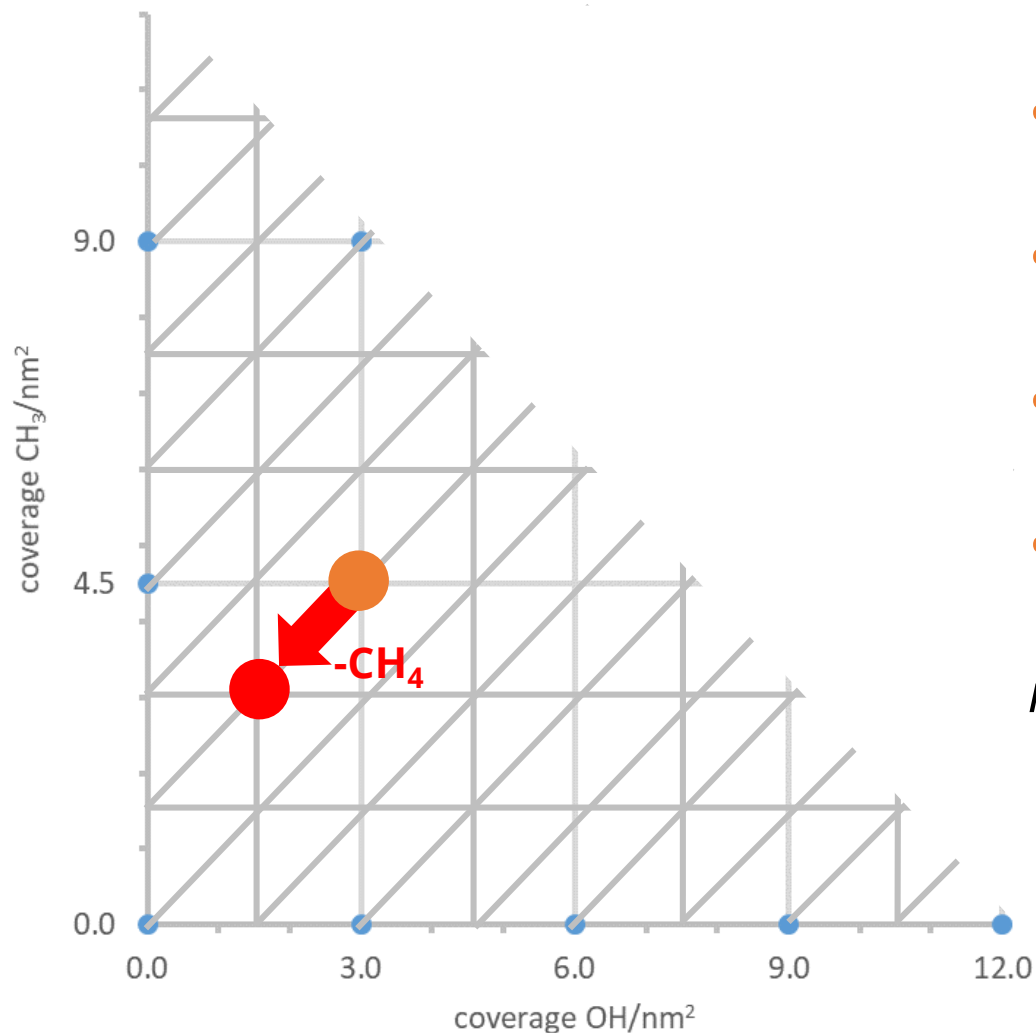
# CH<sub>3</sub>/H-transfer and elimination of CH<sub>4</sub>



# CH<sub>3</sub>/H-transfer and elimination of CH<sub>4</sub>



# CH<sub>3</sub>/H-transfer and elimination of CH<sub>4</sub>



- About 5x more concentrations to consider in chemical space.
- Enumeration of isomers at each concentration, as before.
- Multiple reaction paths for H-transfer are possible for each isomer.
- Finding transition states takes more cpu time and is less reliable than finding minima.

*i.e.* **MUCH MORE DEMANDING CALCULATIONS**

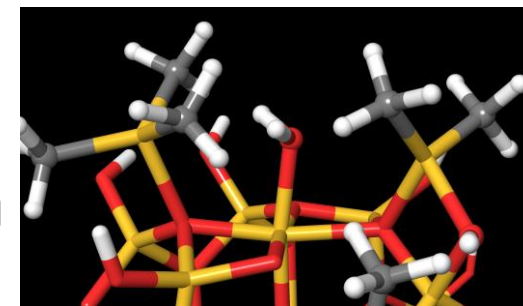
# Conclusions about automated enumeration

## Chemical space is big!

- Systematic enumeration over structural isomers is achievable.
  - However, not entirely automatic: must check for exotic/outlier chemistries, as they may skew results.
- Enumeration over all possible reaction pathways between isomers is currently a challenge.
- CPU time required for quantum mechanical calculations remains a significant limiting factor.

# Conclusions about cooperative effect

- Molecular adsorption of H<sub>2</sub>O onto a 5-coordinate surface Al site is computed to be barrierless in nearly all cases studied.
- Little evidence of cooperative effect on thermodynamics:
  - Onto methylated surface, average  $\Delta G_{\text{ads}} = -30 \pm 20$  kJ/mol at 200°C.
  - Onto hydroxylated surface, average  $\Delta G_{\text{ads}} = -50 \pm 10$  kJ/mol at 200°C.except for some individual cases outside these ranges, which merit more detailed study.
- Contribution from 3D-flexibility of the surface (in terms of both enthalpy and entropy) can be effectively treated with cluster model.





The background of the slide is a solid blue color. Overlaid on this background are several faint, light blue molecular structures. These structures are composed of interconnected hexagons and pentagons, resembling carbon-based molecules or drug-like compounds. They are scattered across the slide, with some appearing more prominent than others, creating a subtle scientific theme.

# SCHRÖDINGER

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