

Opportunities for Automation in the Microkinetic Assessment of Complex Reactions: from Conventional to Renewable Feeds

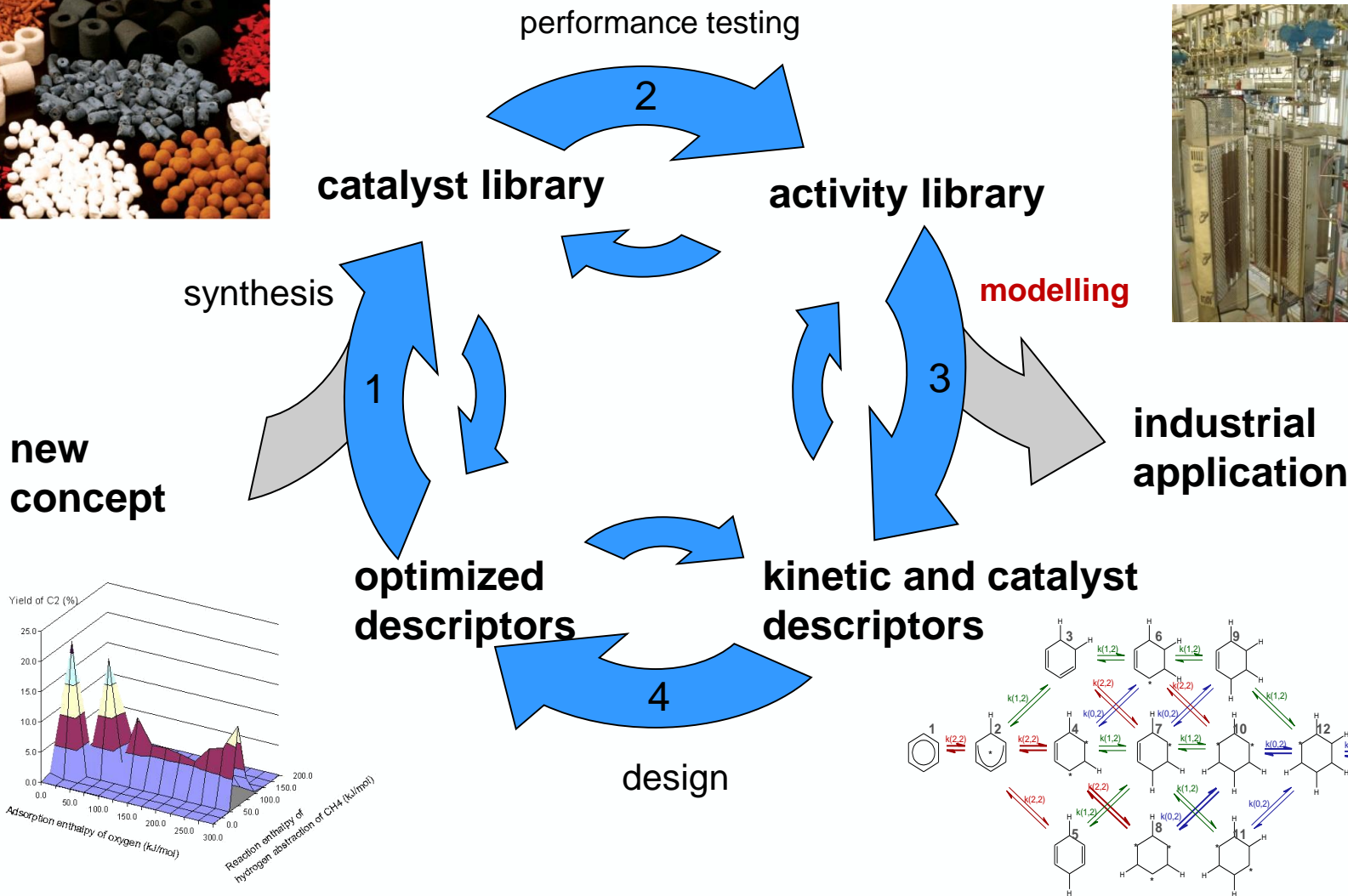
Tapas Rajkhowa, Brigitte R. Devocht, Kenneth Toch,
Guy B. Marin Joris W. Thybaut

Laboratory for Chemical Technology, Ghent University

<http://www.lct.UGent.be>

PETROTECH-2016, New Delhi, India, December 5-7

information driven catalyst & reactor design



Single-Event MicroKinetics (SEMK)



- thermal cracking
- acid catalysis
 - catalytic cracking
 - methanol to olefins

Sabbe et al. *AIChE J.* 57 (2011) 482-496

Quintana-Solorzano et al. *Chem. Eng. Sci.* 62 (2007) 5033-5038

Kumar et al. *Catal. Today* 215 (2013) 224-232

Kumar et al. *Ind. Eng. Chem. Res.* 52 (2013) 1491-1507

- metal catalysis
 - Fischer Tropsch synthesis
 - hydrogenation

Lozano-Blanco et al. *Ind. Eng. Chem. Res.* 47 (2008) 5879-5891

J. Van Belleghem et al. *Appl. Catal. A Gen.* 524 (2016) 149-162

Bera et al. *ACS Catalysis* 2 (2012) 1305-1318

- bifunctional catalysis
 - hydrocracking
 - catalytic reforming
 - ethene oligomerization

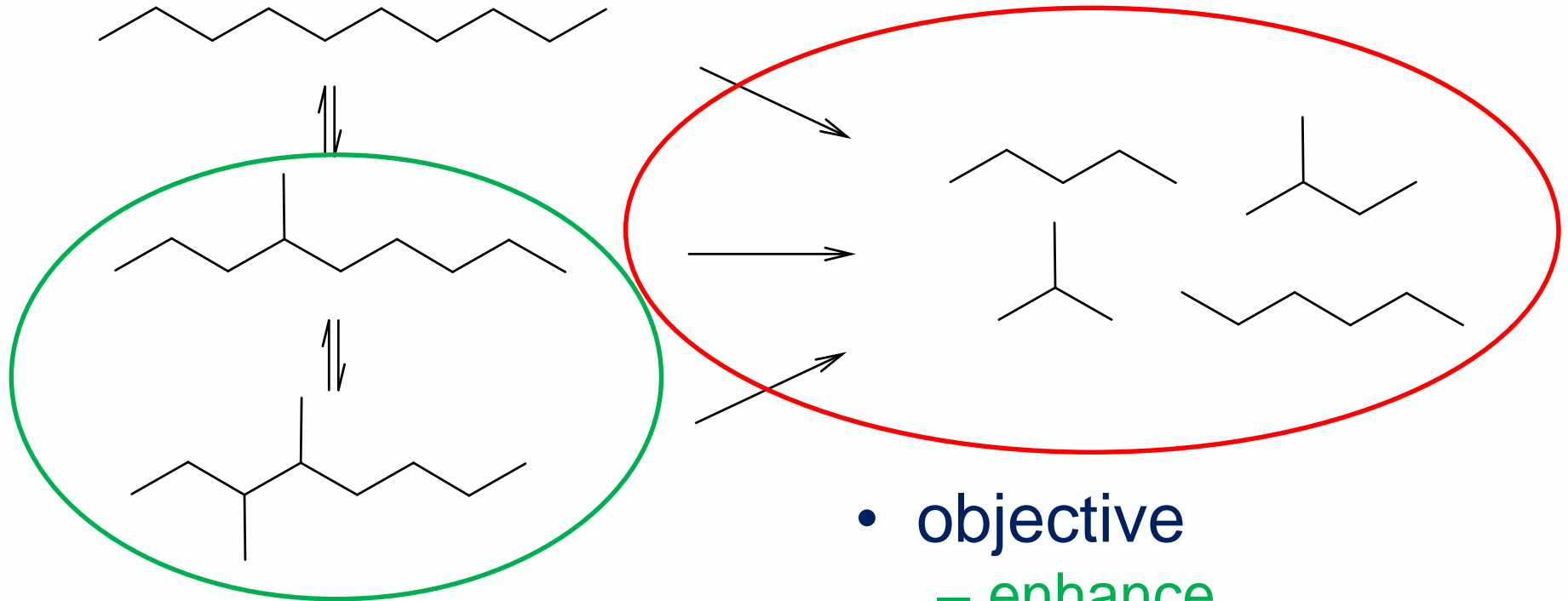
Thybaut et al. *J. Catal.* 202 (2001) 324-339

Cochegrue et al. *Oil Gas Sci. Technol.* 66 (2011) 367-397

Toch et al. *Appl. Catal. A Gen* 489 (2015) 292-304



lube oil production

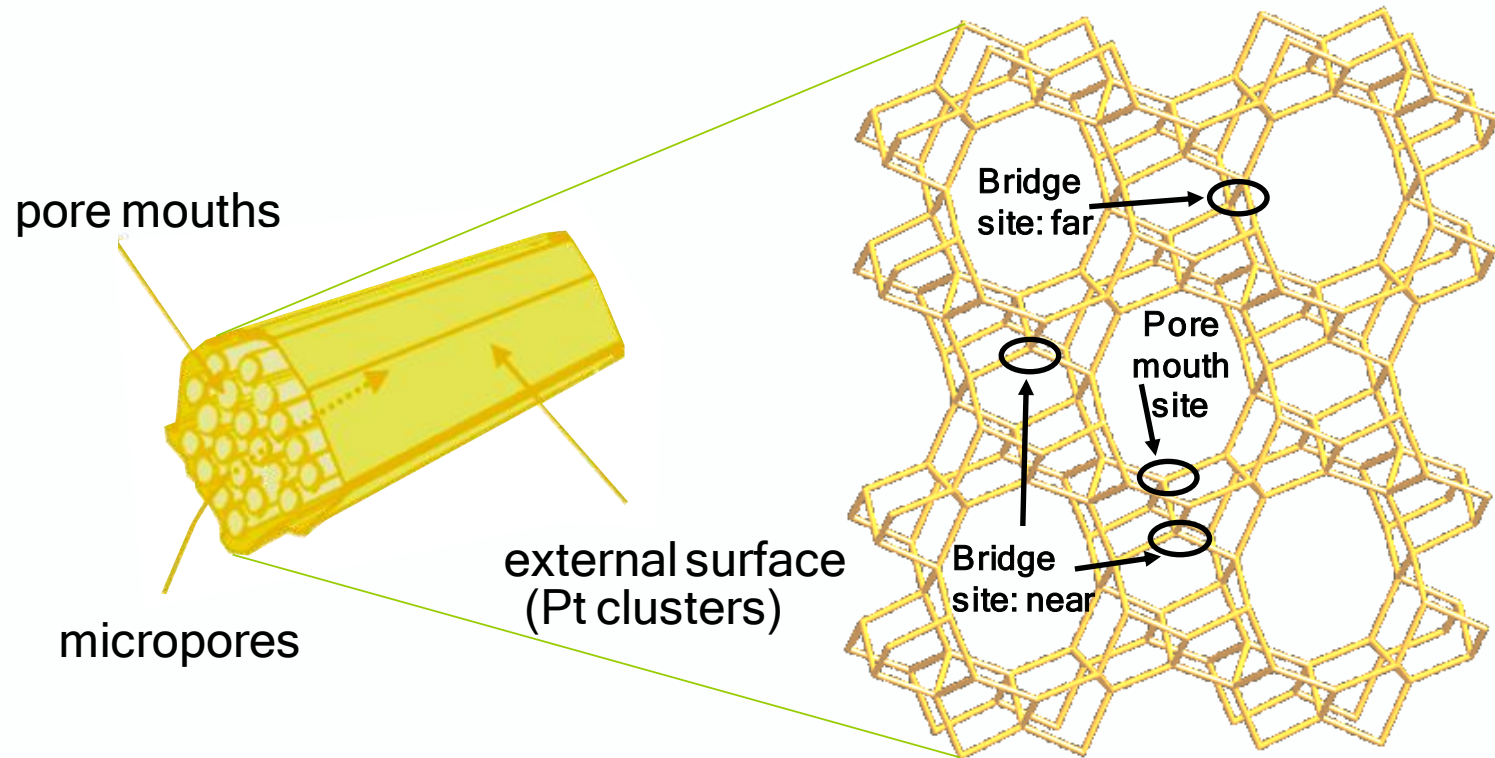


- pour point reduction
- slight decrease in viscosity index

- objective
 - enhance isomerization
 - avoid product losses via cracking

J.A. Martens et al. *Angew. Chem. Intl. Ed.* 34 (1995) 2528
 W. Souverijns et al. *J. Catal.* 174 (1998) 177

ZSM-22 as catalyst

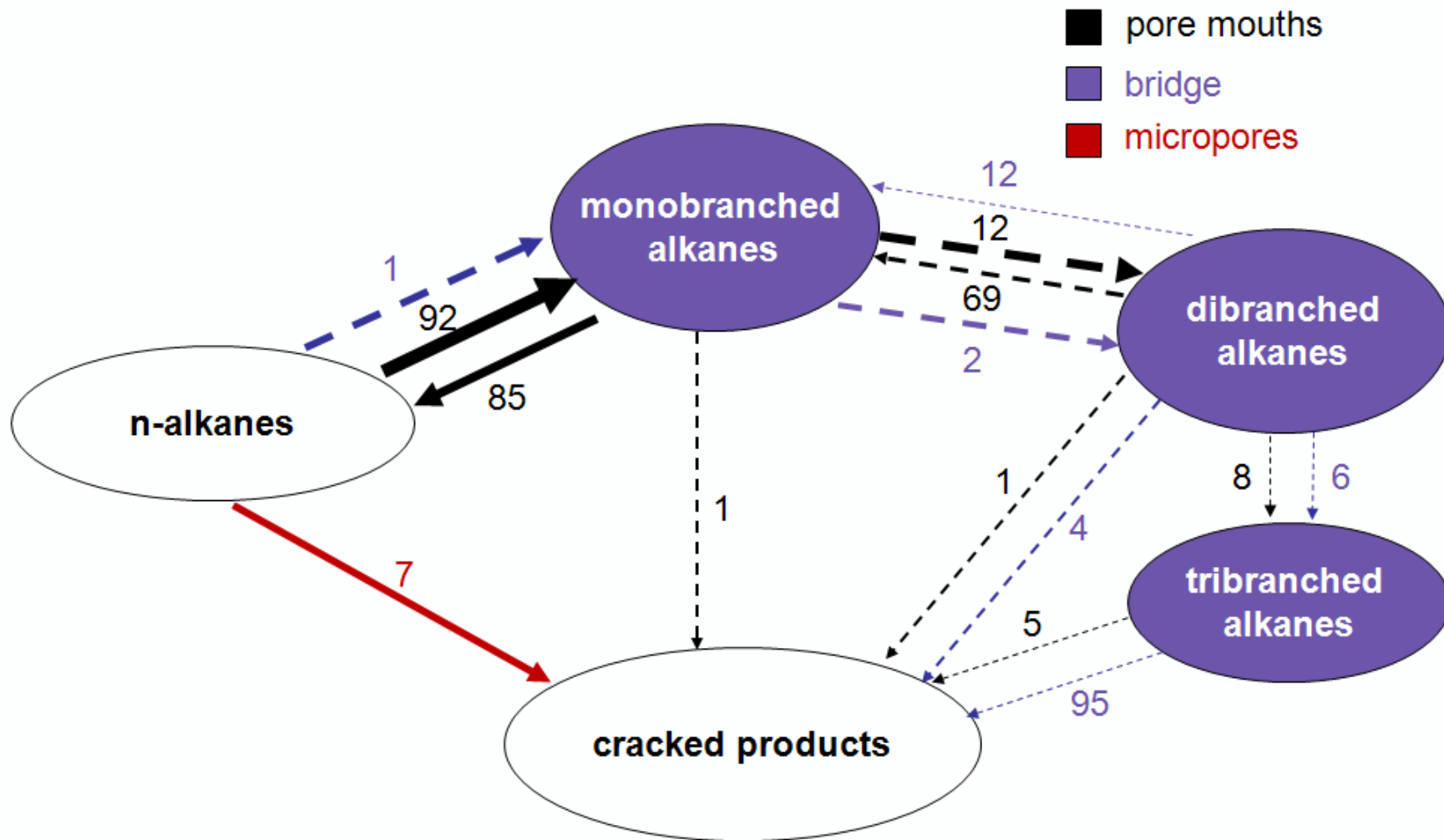


- pore mouth sites: isomerization
- micropore sites: cracking linear alkanes
- bridge sites: aselective reactions

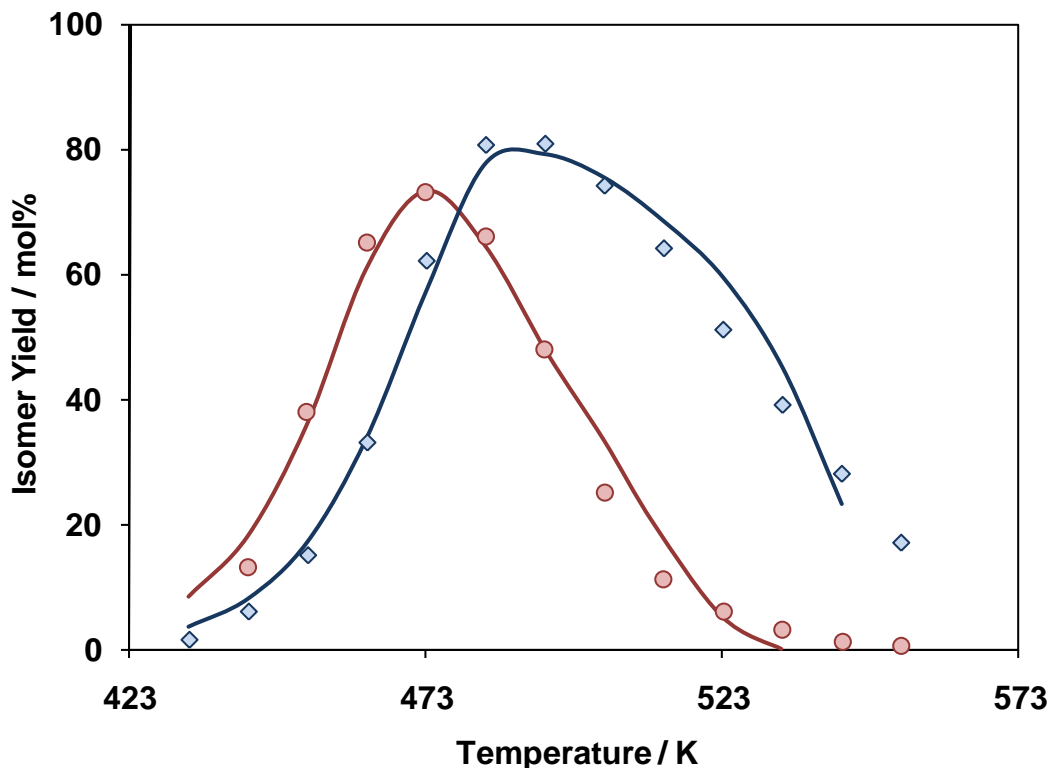
C.S.L. Narasimhan et al. J. Catal. 218 (2003) 135-147

C.S.L. Narasimhan et al. J. Catal. 220 (2003) 399-413

reaction pathway analysis



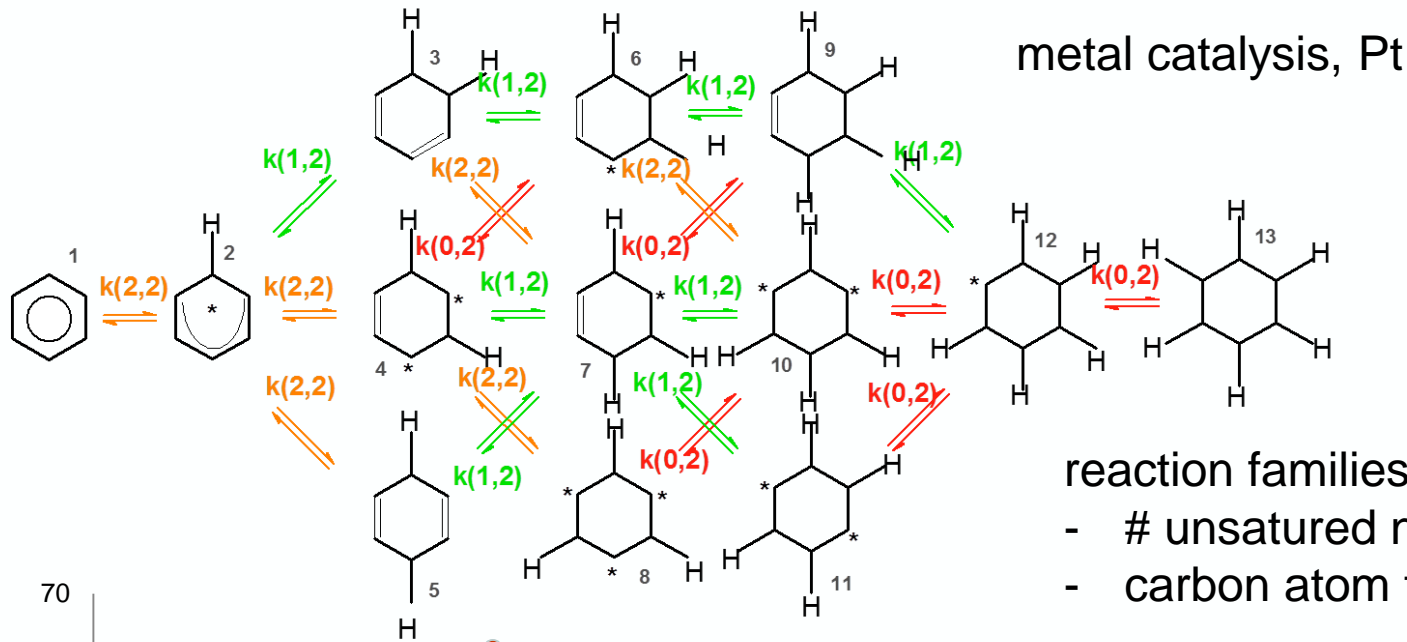
superior ZSM-22 synthesis



- original ZSM-22
 - calcination
 - “stronger” sites
 - additional micropore sites creation
- novel ZSM-22
 - dual ion exchange
 - “weaker” sites
 - comparatively less micropore sites.

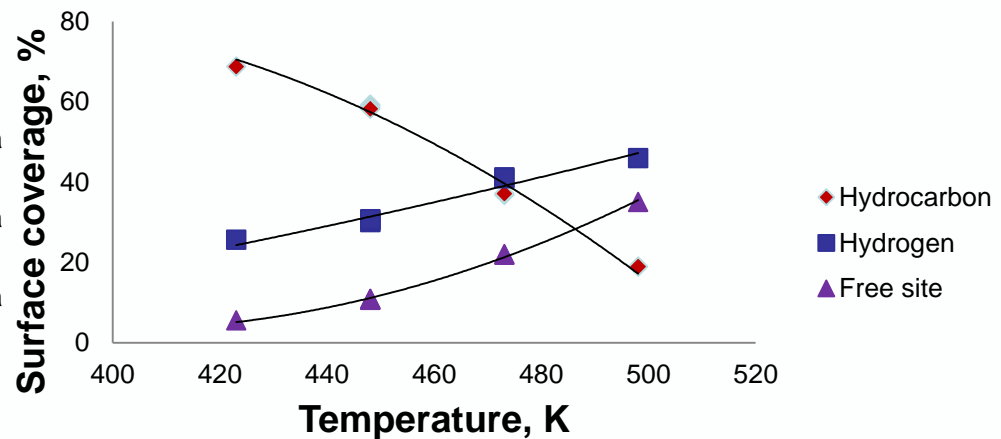
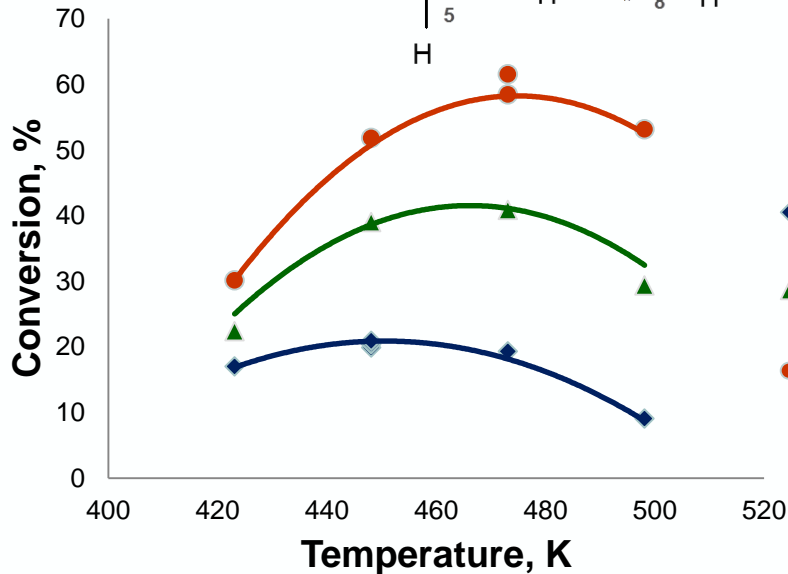
H. Kazuaki et al. Chem. Eur. J. 13 (2007) 10070-10077
 US20100181229 (catalyst synthesis)
 US20110042267 (lube oil dewaxing process)

aromatic hydrogenation



reaction families

- # unsaturated neighbouring C atoms
- carbon atom type



T. Bera et al. Ind. Eng. Chem. Res. 50 (2011) 12933-12945
 T. Bera et al. ACS Catalysis 2 (2012) 1305-1318

xylene isomerization: SEMK catalyst design

Xylene isomerization on a bifunctional Pt/H-ZSM-5 catalyst

Reaction network consists out of:

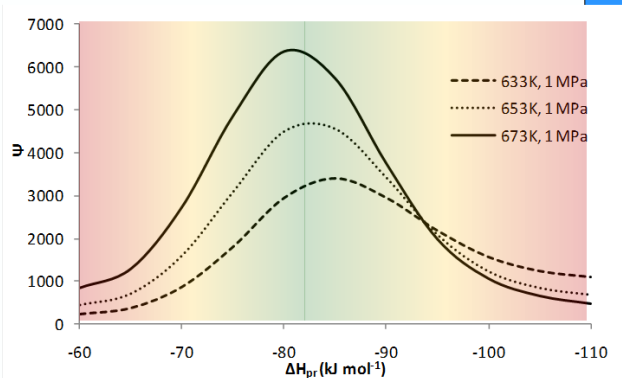
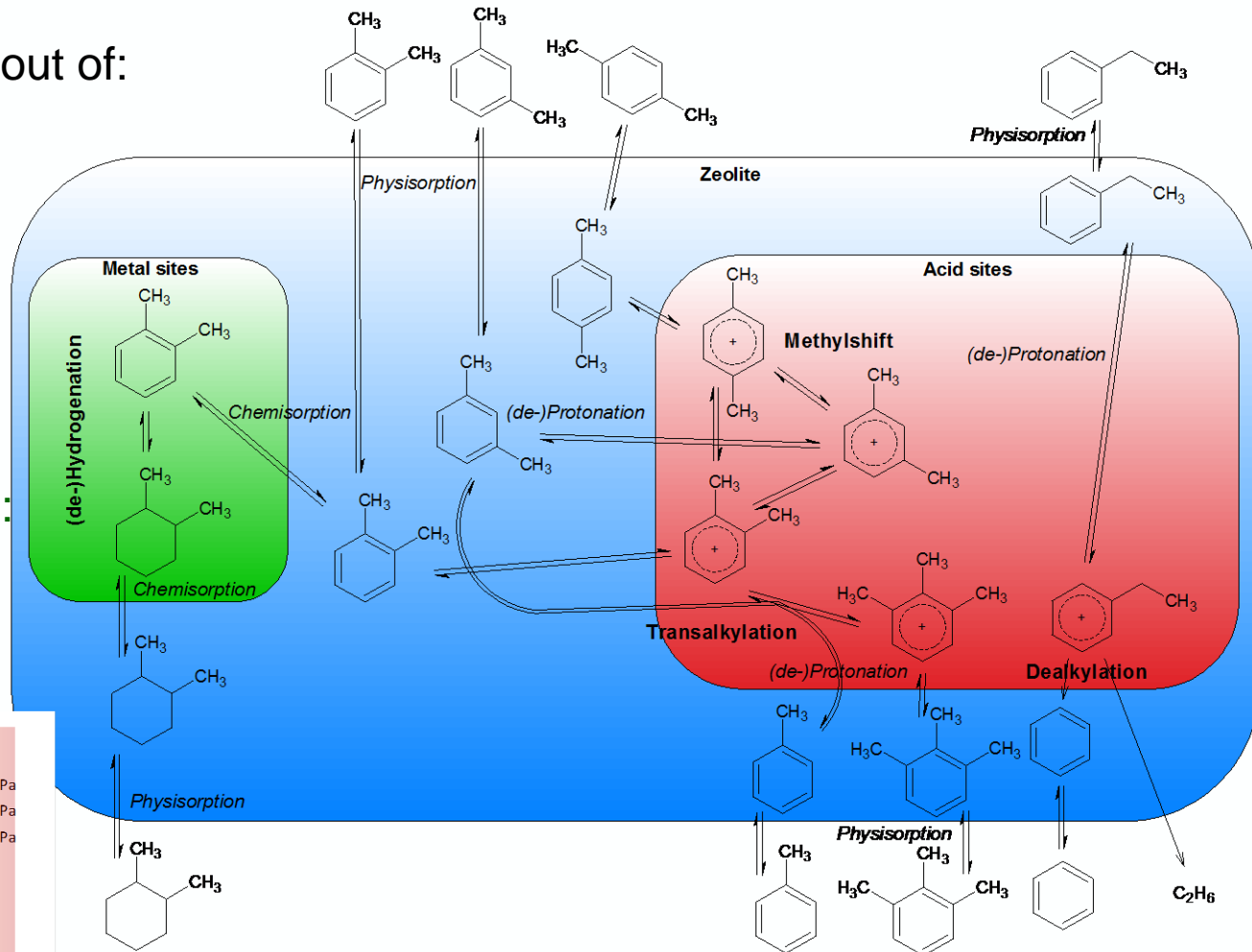
- acid catalyzed reactions:

- (de-)protonation,
- alkyl shift (MS),
- dealkylation, (DA)
- transalkylation (TA)

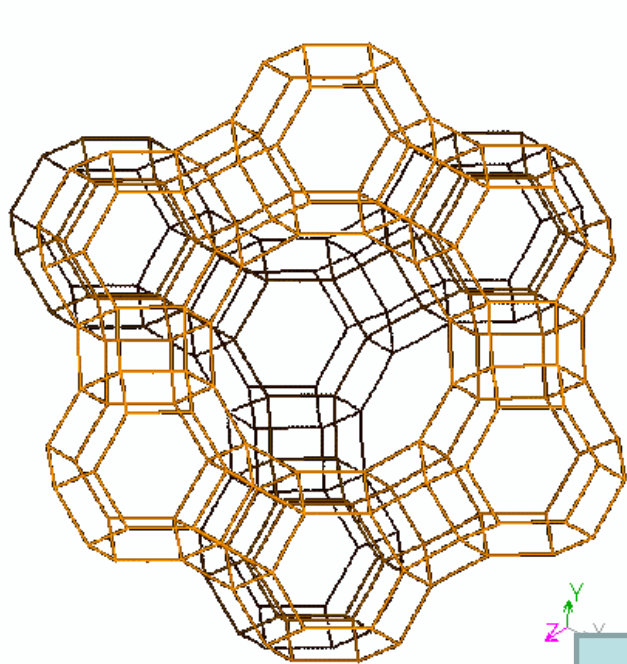
- metal catalyzed reactions:

- Hydrogenation (HYD)

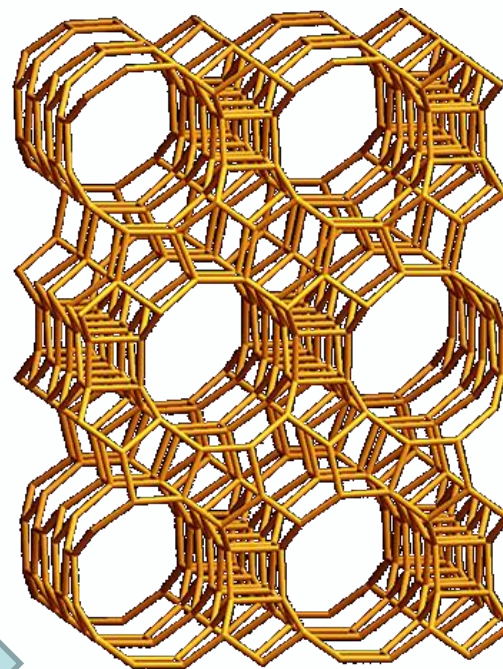
- physisorption



long alkane hydrocracking over BETA



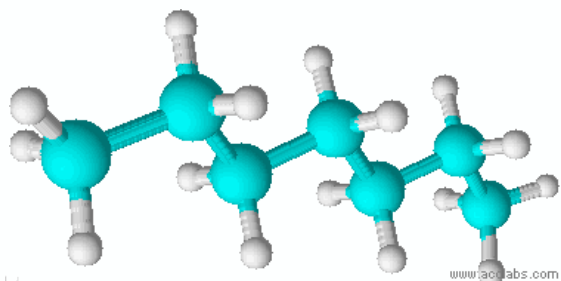
USY n-octane



BETA n-hexadecane

shape selectivity

size entropy effects

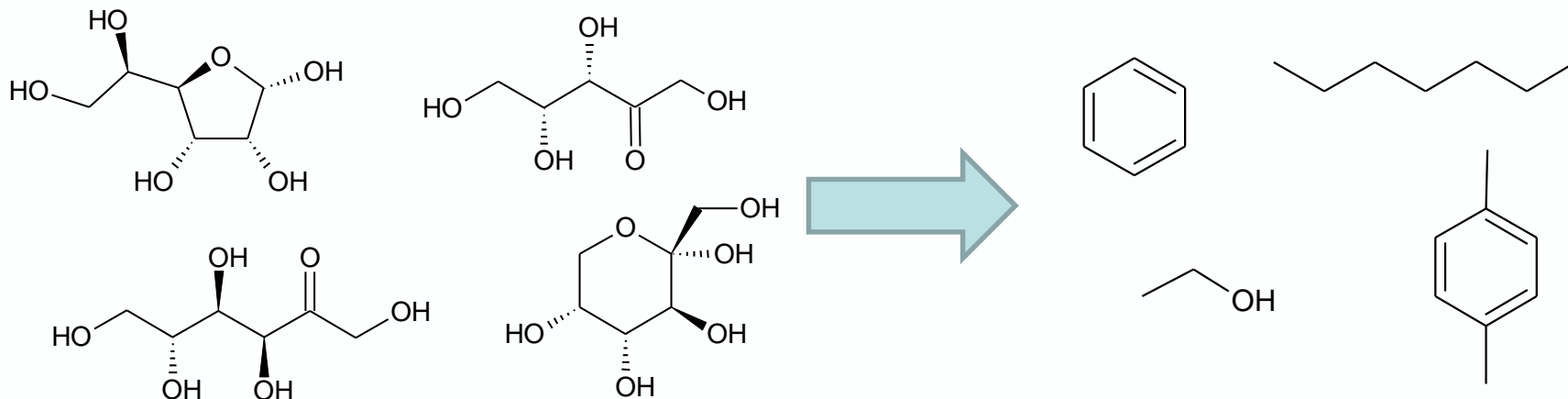


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renewable feed conversion

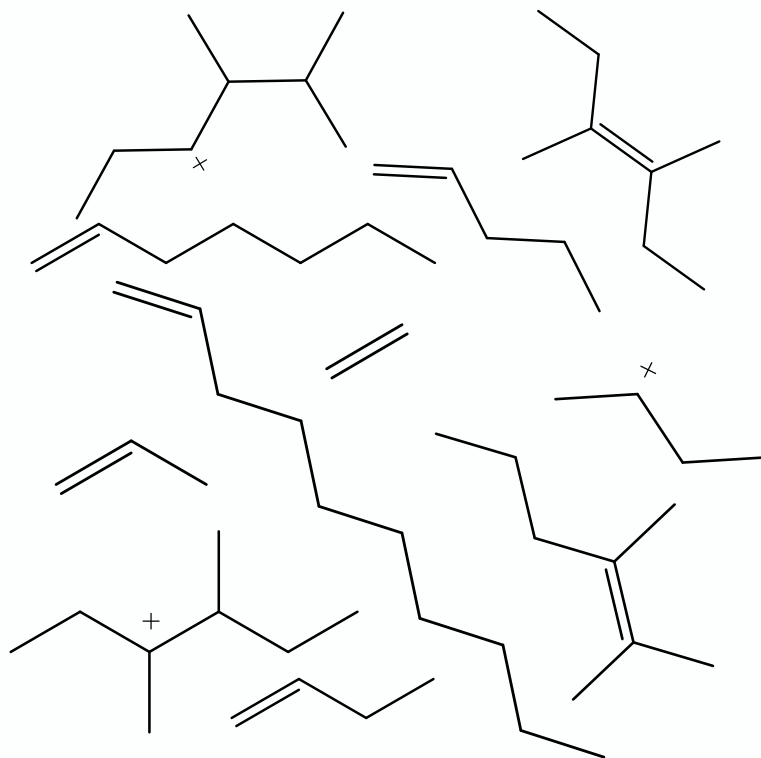


complex mixtures → model compounds

- introduction
- kinetics assessment automation
 - opportunities
 - Fischer Tropsch synthesis
 - network generation algorithm
- renewable feeds
 - challenges and strategy
 - glycerol hydrogenolysis
- conclusions

opportunities for automation

complex mixture

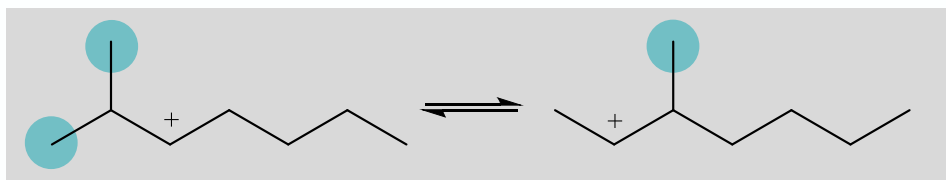


energy - enthalpy

reaction families

- reaction types
 - (de)protonation
 - pcp-branching
 - β -scission
 - alkylation
- intermediate stability
 - carbon atom type
 - nearest neighbour effects

entropy

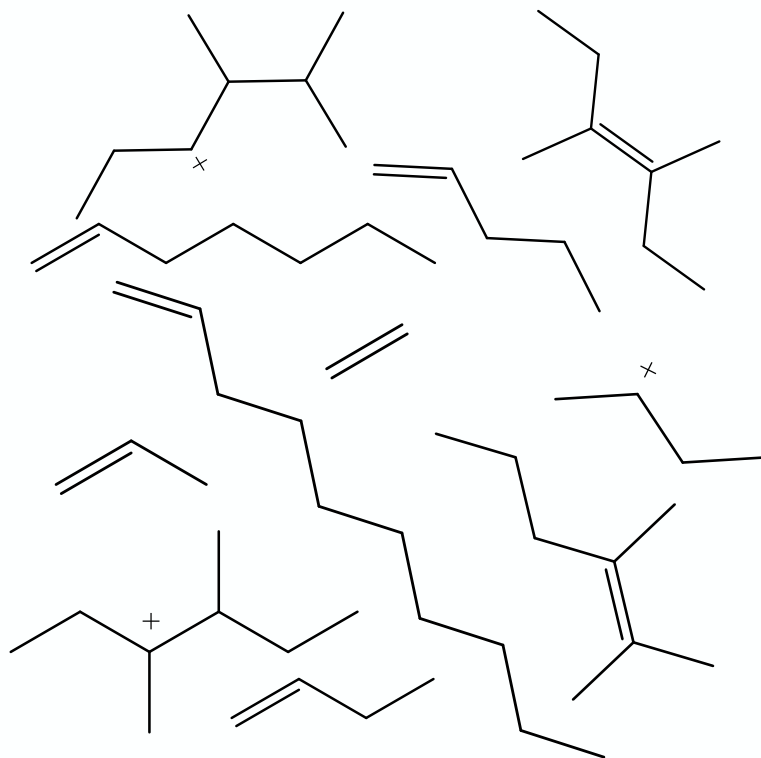


$$k = \frac{\sigma_{\text{global}}^{\text{reactant}}}{\sigma_{\text{global}}^{\#}} k_b \frac{T}{h} \exp\left(\frac{\Delta\tilde{S}^{0,\#}}{R}\right) \exp\left(-\frac{\Delta H^{0,\#}}{RT}\right)$$

/ n_e / \tilde{k}

opportunities for automation

complex mixture



ethene oligomerization on
Ni on acid support

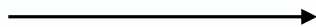
number of alkenes	1220
number of carbenium ions	972
number of elementary steps	
metal-ion oligomerization	5
protonation	1985
deprotonation	1985
pcp-branching	1096
1,2 alkyl shift	668
alkylation	330
β -scission	330

example: Fischer-Tropsch synthesis

natural gas



GTL



coal



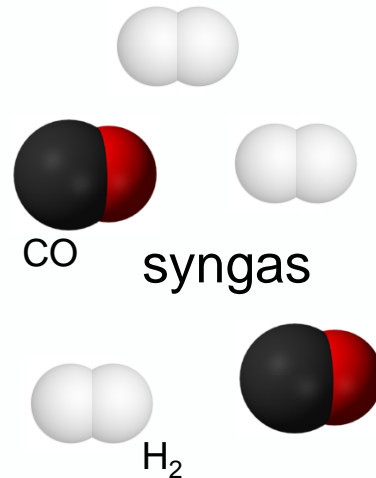
Gasification



biomass



Gasification



FT



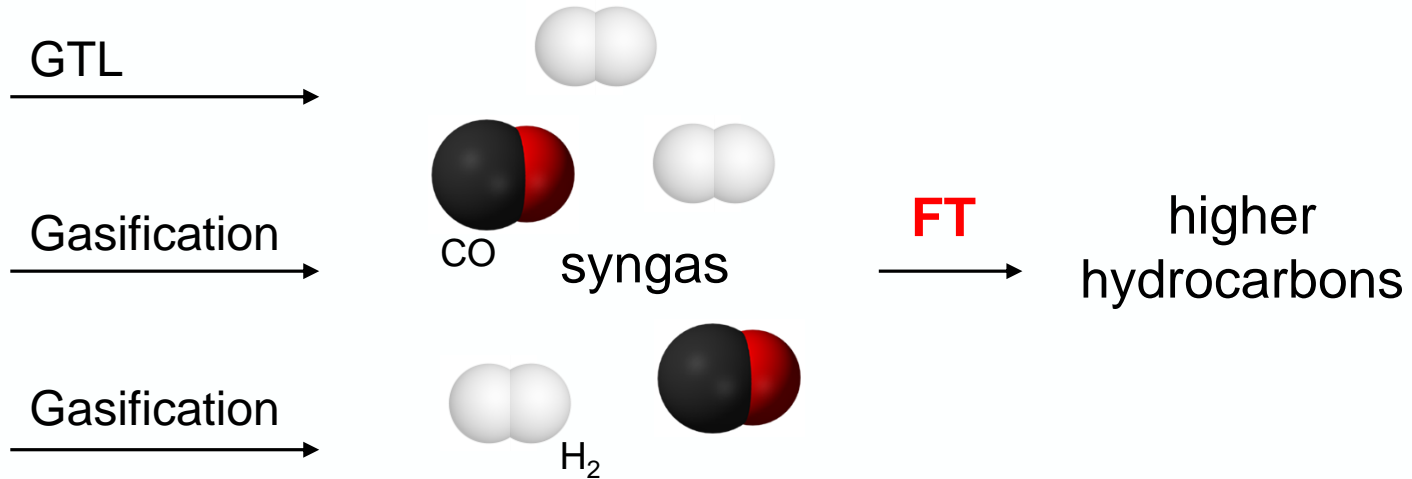
higher hydrocarbons

reaction families
based on carbene
insertion
mechanism

- 1. initiation:** dissociation of hydrogen and CO formation of CH_x groups on the surface
- 2. chain growth:** CH₂ group insertion into adsorbed alkyl species
- 3. termination:** hydrogenation or recombination of surface species to paraffins and desorption of olefins

example: Fischer-Tropsch synthesis

natural gas
coal
biomass



reaction families

reaction families
based on carbene
insertion
mechanism

1. **initiation**
2. **chain growth**
3. **termination**

hydrogen adsorption
 hydrogen desorption
 CO adsorption
 CO desorption
 CO dissociation
 oxygen hydrogenation

carbon hydrogenation
 carbene insertion
 carbene deinsertion
 olefin desorption
 olefin adsorption
 β - Hydrogen elimination

Fischer Tropsch reaction network

reaction families

hydrogen adsorption
 hydrogen desorption
CO adsorption
 CO desorption
 CO dissociation
 oxygen hydrogenation
 carbon hydrogenation
 carbene insertion
 carbene deinsertion
 olefin desorption
 olefin adsorption
 β- Hydrogen elimination

user input

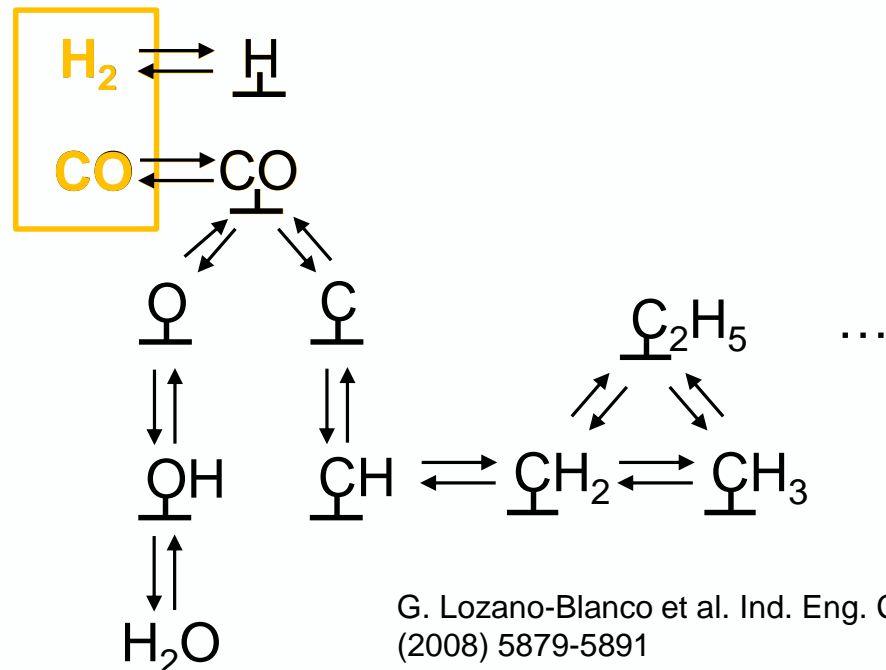
iterate over species

check each reaction family

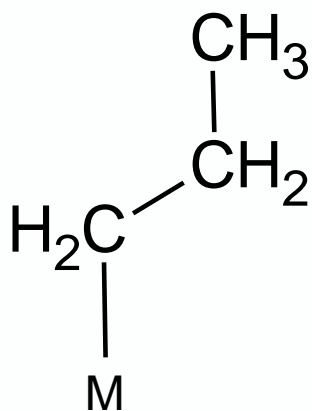
execute reaction family recipe

add products and reactions to network

are termination criteria met?



species representation



Standardized label

$$\begin{bmatrix} 1 & 2 & 2 & 1 \\ 1 & 2 & 3 & 3 \end{bmatrix}$$

Boolean matrix

$$\begin{bmatrix} M & 0 & 1 & 0 & 0 \\ C & 1 & 0 & 1 & 0 \\ C & 0 & 1 & 0 & 1 \\ C & 0 & 0 & 1 & 0 \end{bmatrix}$$

Used to store the species

Used to generate the reactions



Are
interconverted
at runtime

kinetic model parameters

for each reaction family:

$$k = \frac{\sigma_{gl,r}}{\sigma_{gl,\ddagger}} \frac{k_B T}{h} \exp\left(\frac{\Delta\tilde{S}^{0,\ddagger}}{R}\right) \exp\left(\frac{\Delta H^{0,\ddagger}}{RT}\right)$$

determined by the reaction network generation code

constant for a reaction family (chain length independent)

$\Delta\tilde{S}^{0,\ddagger}$ single-event activation entropy

Calculated based on changes in translational degrees of freedom

$\Delta H^{0,\ddagger}$ activation enthalpy

obtained by regression to experimental data

$$n_{parameters} = n_{reaction\ families}$$

thermodynamic model parameters

Thermodynamic consistency of the overall Fischer Tropsch reaction is guaranteed by using the principle of microscopic reversibility:

$$E_a^{rev} = E_a^{for} - \Delta H_{R,surf}^0 \longrightarrow \Delta H_{R,surf}^0 = \Delta H_{R,gas}^0 + \sum_{i=1}^{react} \nu_i \Delta H_{chem,i}^0 - \sum_{i=1}^{prod} \nu_i \Delta H_{chem,i}^0$$

$$\tilde{A}^{rev} = \frac{\tilde{A}^{for}}{\exp\left(\frac{\Delta \tilde{S}_R^0}{R}\right)}$$

$$\Delta H_{chem,i}^0 = f(Q_C, Q_O, Q_H) \text{ by UBI-QEP}$$

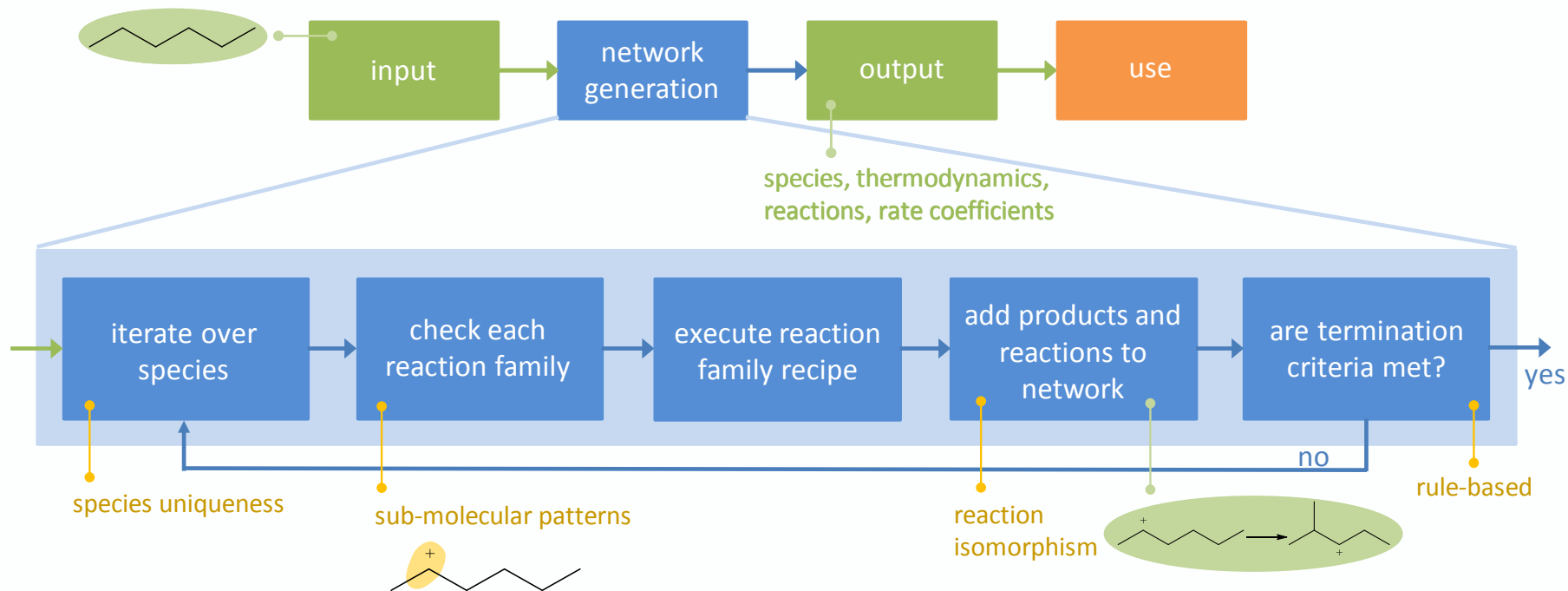
$$\Delta H_{R,gas}^0 = \sum_{i=1}^{prod} \nu_i \Delta_f h_i^0 - \sum_{i=1}^{react} \nu_i \Delta_f h_i^0$$

parameters in the model and are determined by regression

are taken from existing databases

$$\longrightarrow n_{parameters} = \frac{1}{2} n_{reaction\ families} + 3$$

network generation algorithm



ReNGeP – Reaction Network Generation Program

↳ reaction family concept, nearest neighbour effects

- introduction
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 - glycerol hydrogenolysis
- conclusions

challenges renewable feedstocks



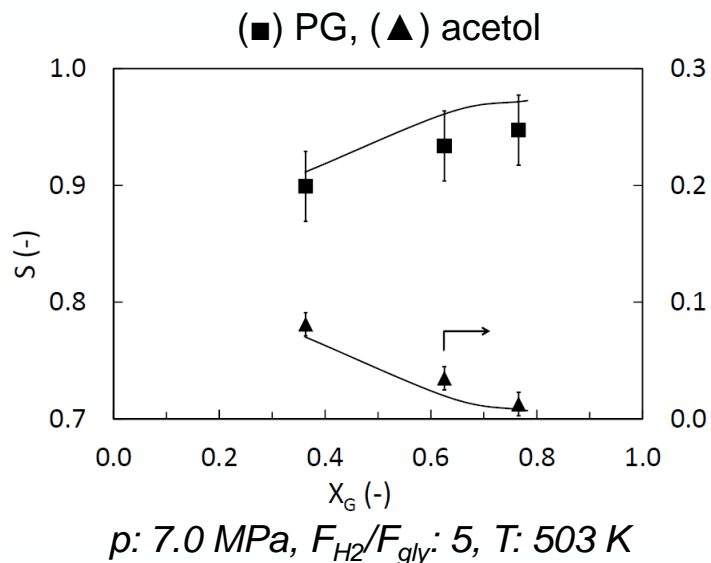
new **challenges** for network generation and kinetic model construction?

- accounting for heteroatoms
- new functions → new reaction families, next nearest neighbour effects,...
- smarter (adaptive) network size control

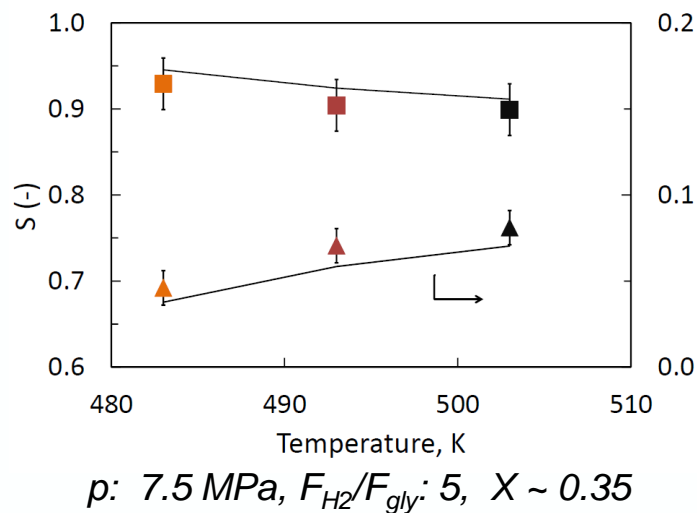
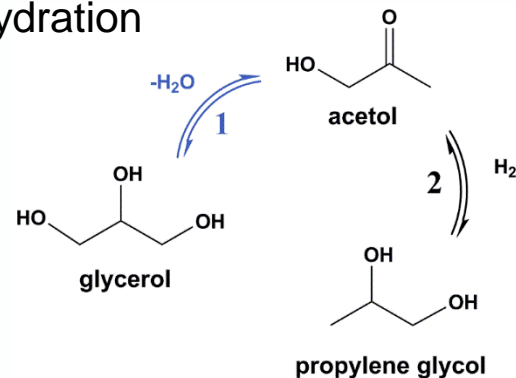
corresponding **strategy**

- assessment of simple reaction network: glycerol hydrogenolysis
- extension towards more complex ones: hydrodeoxygenation

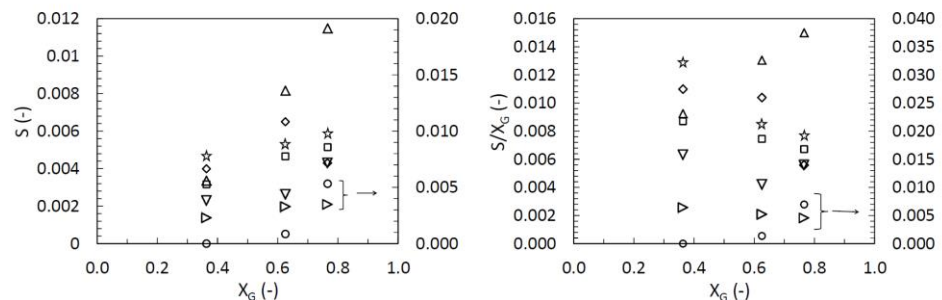
glycerol hydrogenolysis kinetics



- acetol is a primary product (from glycerol dehydration)
- acetol hydrogenation is faster than glycerol dehydration

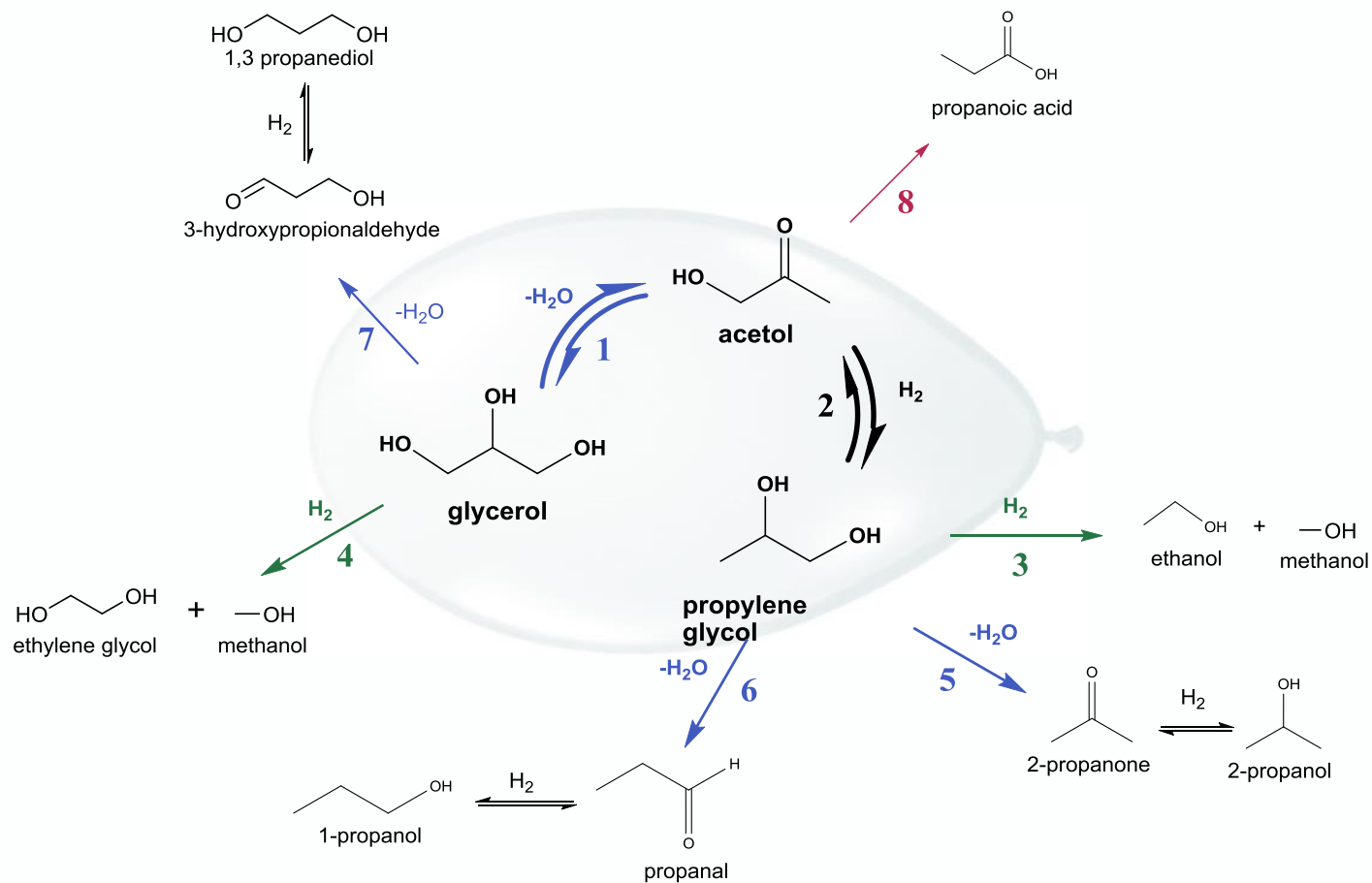


- higher activation energy for dehydration step



(◇) 1,3-propanediol; (▷) ethylene glycol; (□) propionic acid; (★) ethanol; (△) methanol;
 (▽) 1-propanol; (○) 2-propanol.

reaction network



reaction families

dehydration

hydrogenation

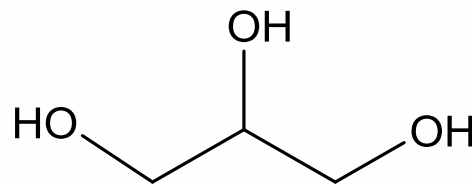
C-C bond scission

isomerization

graph representation

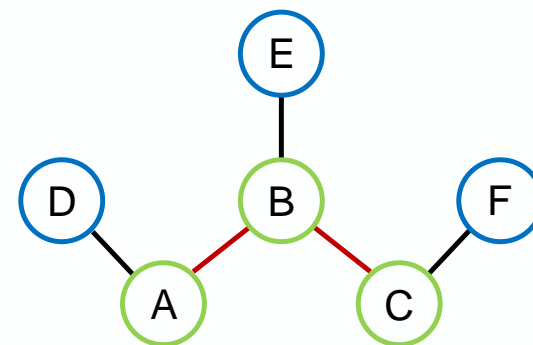
boolean matrix

$$\begin{bmatrix} C & 0 & 1 & 0 & 1 & 0 & 0 \\ C & 1 & 0 & 1 & 0 & 1 & 0 \\ C & 0 & 1 & 0 & 0 & 0 & 1 \\ O & 1 & 0 & 0 & 0 & 0 & 0 \\ O & 0 & 1 & 0 & 0 & 0 & 0 \\ O & 0 & 0 & 1 & 0 & 0 & 0 \end{bmatrix}$$



graph theory
object-oriented programming

graph

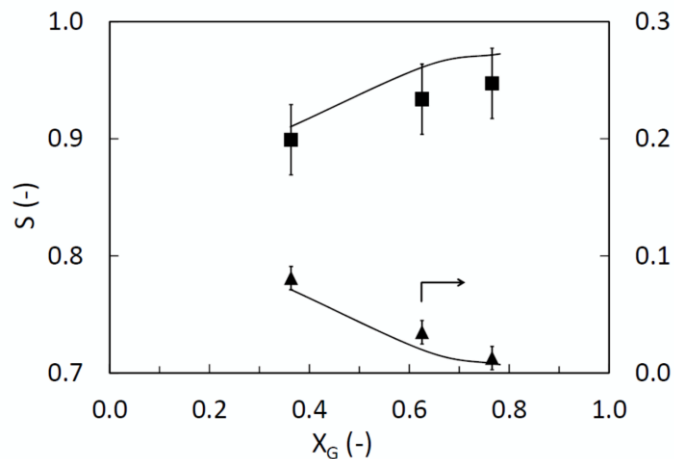


- ✓ simplicity
- ✗ covers small range of possible elements possible structures

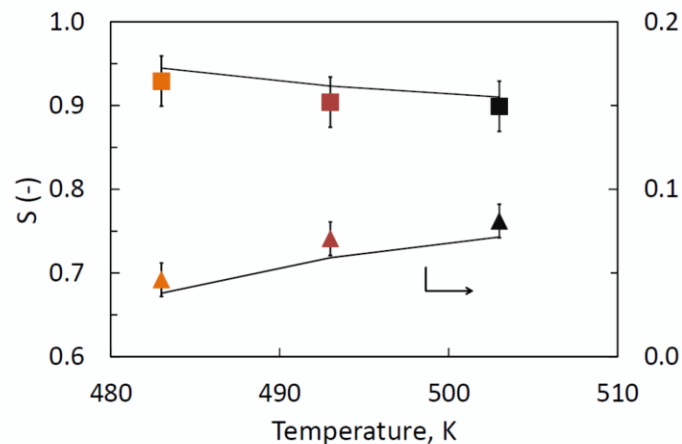
- ✓ more complex, flexible data structures
- ✓ application graph-theoretic algorithms chemoinformatics e.g. calculation symmetry numbers

kinetics assesment and model performance

(■) PG, (▲) acetol



$p: 7.0 \text{ MPa}, F_{\text{H}_2}/F_{\text{gly}}: 5, T: 503 \text{ K}$



$p: 7.5 \text{ MPa}, F_{\text{H}_2}/F_{\text{gly}}: 5, X \sim 0.35$

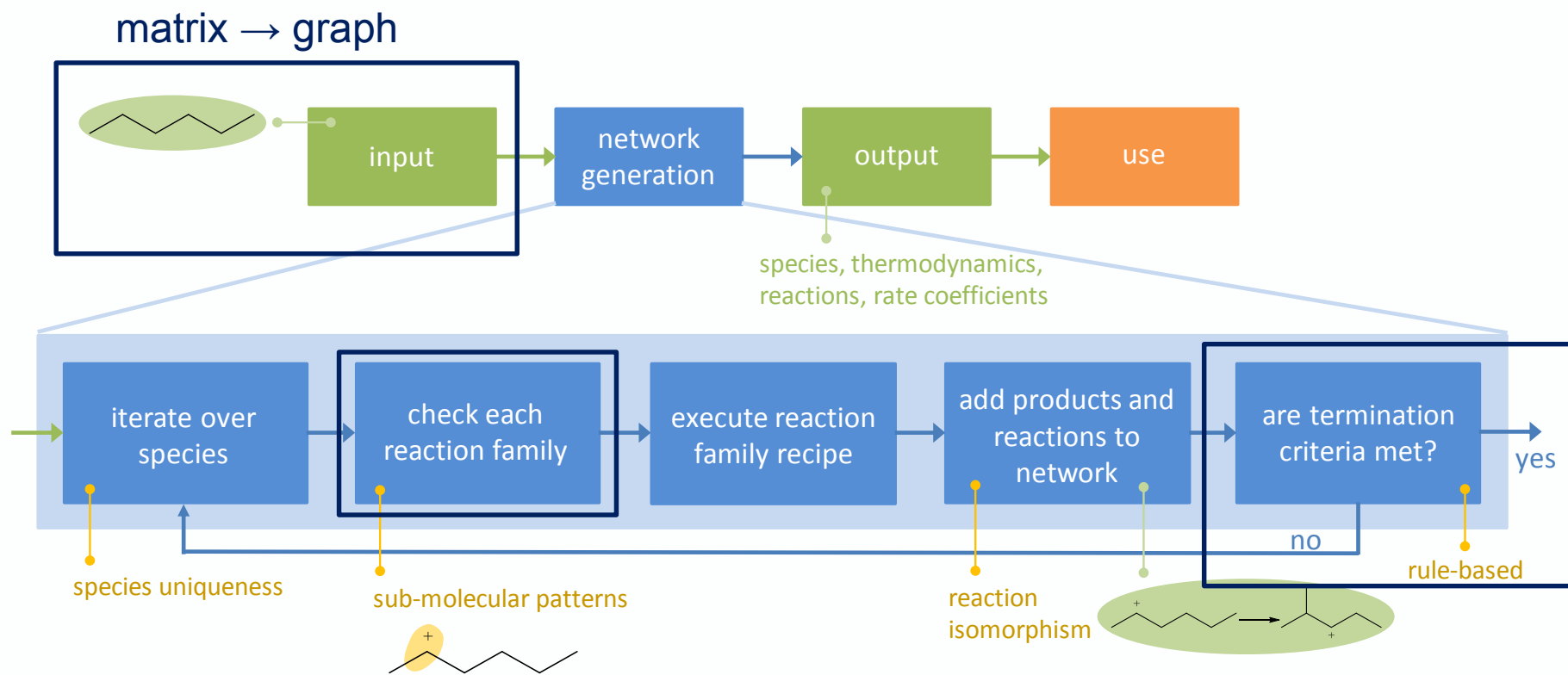
Rate coefficient	A	E_a	k_{483}
k_1^{comp}	10^{15}	78.5 ± 2.15	3.2×10^6
k_2^{comp}	10^{13}	59.8 ± 1.07	3.4×10^6
k_3	10^{13}	98.9 ± 11.2	2.0×10^2
k_4	10^{13}	93.8 ± 11.1	7.1×10^2
k_5	10^{14}	91.6 ± 1.26	1.2×10^4
k_6	10^{14}	91.6 ± 0.97	1.3×10^4
k_7	10^{14}	88.8 ± 1.18	2.5×10^4
k_8	10^{12}	112.4 ± 3.51	0.70

Adsorption coefficient	ΔS^0	$-\Delta H^0$	K_{483}
K_G	-168	71.2 ± 1.09	8.4×10^{-2}
K_A	-166	68.0 ± 3.97	4.8×10^{-2}
K_{PG}	-143	53.6 ± 1.45	2.1×10^{-2}
K_H	-136	64.8 ± 10.6	8.0×10^{-1}
$K_{\text{H}_2\text{O}}$	-154	53.3 ± 1.27	5.3×10^{-3}

Equilibrium coefficient	ΔS^0	$-\Delta H^0$	K_{483}
K_{AH}	0	5.3 ± 1.8	1.00

F value	$1.7 \times 10^5 (F_{\text{tab}} : 2.79)$		
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network generation algorithm



- accounting for heteroatoms
- new functions → new reaction families, next nearest neighbour effects
- adaptive network size control

conclusions

- elementary kinetics based models
 - detailed insight in reaction mechanism
 - information driven catalyst and reactor design
- complex mixtures → automated assessment
 - reaction families
 - kinetic and thermodynamic parameter estimation and calculation
- transition from conventional to renewable feeds
 - hetero-atoms (oxygen, nitrogen, sulfur)
 - reaction family definition, (next) nearest neighbour effects
 - species representation and reaction generation
 - network size control

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ir. Tapas Rajkhowa
ir. Brigitte Devocht
prof. Guy B. Marin



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