



# Chemical Kinetic Optimization and Uncertainty Quantification

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Greetings to all women here!



**Greetings on the International Women's Day!**



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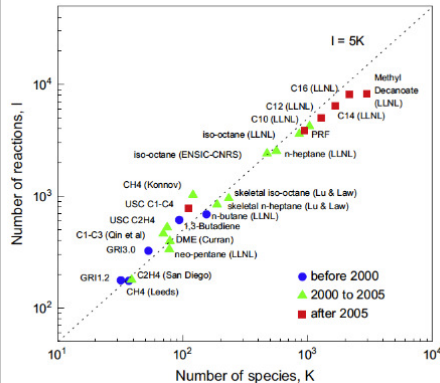
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## Using detailed reaction mechanisms



The reaction mechanisms are getting larger, because

- increasing chemical knowledge
- faster computers with larger memory are available



hydrogen combustion  
natural gas combustion  
petrol combustion  
Diesel oil combustion

30 reaction steps  
300 reaction steps  
3000 reaction steps  
15000 reaction steps

Lu T, Law CK: Toward accommodating realistic fuel chemistry in large-scale computations. *Prog. Energ. Combust. Sci.* **35**:192-215 (2009)



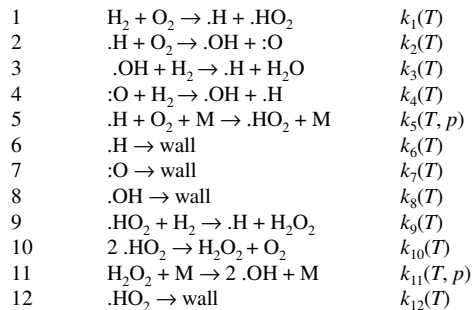
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## Using detailed reaction mechanisms

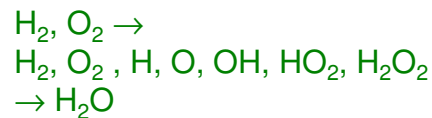


This is a simplified 12-step hydrogen combustion mechanism:



Overall chemical equation:  
 $2 \text{H}_2 + \text{O}_2 = \text{H}_2\text{O}$

reality:



$k(T, p)$  temperature-dependence: 3-parameter Arrhenius-equation  
pressure-dependence: several more parameters

Further parameters to each species: thermodynamical data, diffusion coefficients, viscosity



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## Predictive chemical kinetic models



### Applications of chemical kinetic models:

design of new equipment:  
development of existing devices  
real-time control  
legislation (e.g. pollution control)

automotive engines  
gas turbines (aerospace industry, power generation)  
manufacturing (e.g. CVD technology)  
chemical engineering

### Parameters used:

thermodynamics: enthalpies of formation  
temperature dependence of  $C_p$   
chemical kinetics:  $k(T,p)$  of the reaction steps

### Needed:

- 1) accurate values of the parameters
- 2) accurate estimation of the uncertainty of the parameters



## Direct vs. indirect measurements in chemical kinetics



### direct measurement:

- determination of the rate coefficient of a single elementary reaction at a given temperature, pressure, and bath gas
- the rate coefficients are published

### (direct) theoretical determinations:

TST/master equation calculations

- the rate coefficients are published at given  $T, p$
- $\rightarrow$  parameterised  $T, p$  dependence of rate coefficient  $k$

### indirect measurements:

simulation with a detailed mechanism is needed for the interpretation

- ignition delay times measured in shock tubes and RCMs
- laminar flame velocities
- exit concentrations in PSRs, final concentrations in shock tubes
- measured concentration–distance and/or concentration–time profiles in flames and tubular reactors



## Uncertainty of reaction rate parameters



### Reaction rate parameters:

Arrhenius parameters  $A$ ,  $n$ ,  $E$ ,  
3<sup>rd</sup> body collision efficiencies,  
(parameters of pressure dependence: Lindemann and Troe parameters)  
(enthalpies of formation)

### prior uncertainty of reaction rate parameters:

uncertainty of reaction rate parameters, deduced from  
available direct measurement data and theoretical calculations

### posterior uncertainty of reaction rate parameters:

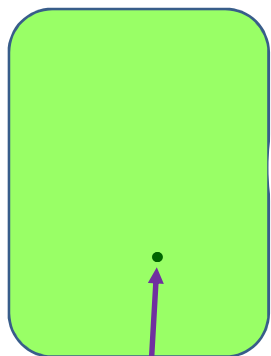
uncertainty of reaction rate parameters, deduced from fitting to  
direct measurement data + theoretical calculations results +  
indirect measurement data



## Prior uncertainty of rate coefficients



### space of rate parameters



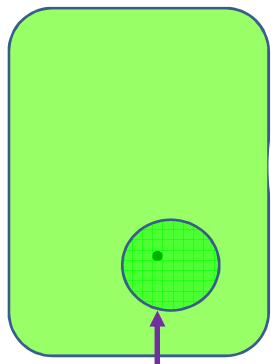
nominal parameter set  
of the kinetic model



## Prior uncertainty of rate coefficients



space of rate parameters



prior uncertainty  
of the rate parameters  
from the direct measurements



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## Uncertainty of rate coefficients



uncertainty of a rate coefficient is defined via uncertainty parameter  $f$ :

$$f(T) = \log_{10}(k^0(T)/k^{\min}(T)) = \log_{10}(k^{\max}(T)/k^0(T))$$

alternative: uncertainty factor  $u=10^f$

### Uncertainty of a directly measured rate coefficient:

very high quality  $k$  uncertainty ( $3\sigma$ ) factor of  $u=1.3$  ( $f=0.1$ )  $\pm 8\%$  ( $1\sigma$ )

good quality  $k$  uncertainty ( $3\sigma$ ) factor of  $u=2.0$  ( $f=0.3$ )  $\pm 26\%$  ( $1\sigma$ )

typical  $k$  uncertainty ( $3\sigma$ ) factor of  $u=3.2$  ( $f=0.5$ )  $\pm 47\%$  ( $1\sigma$ )



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## Uncertainty of Arrhenius parameters



the prior uncertainty domain of the Arrhenius parameters is needed

original Arrhenius expression:  $k(T) = A \exp(-E/RT)$

linearized form:  $\ln\{k(T)\} = \ln\{A\} - (E/R)T^{-1}$

extended Arrhenius expression:  $k(T) = AT^n \exp(-E/RT)$

linearized form:  $\ln\{k(T)\} = \ln\{A\} + n \ln(T) - (E/R)T^{-1}$

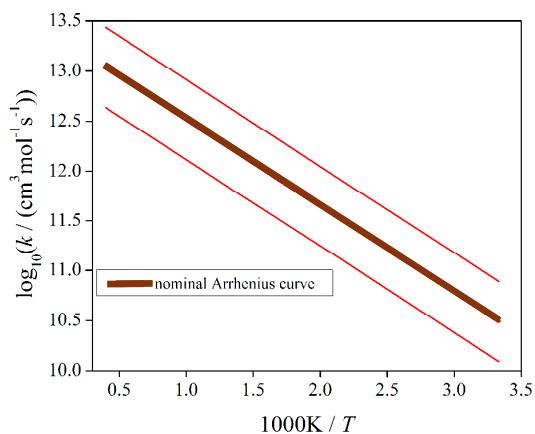
$$\kappa = \alpha + n \ln \theta - \epsilon \theta^{-1}$$



## Domain of uncertainty of Arrhenius parameters



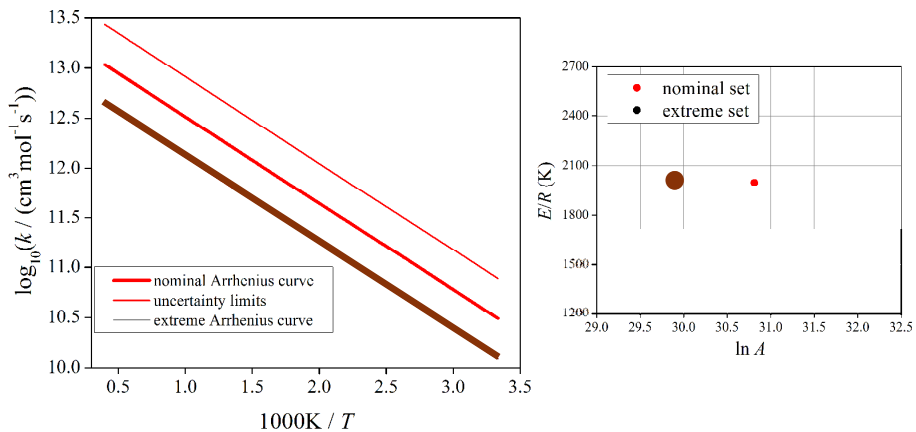
The simplest case: temperature independent uncertainty of  $k$   
two Arrhenius parameters  $\ln A$ ,  $E/R$



## Domain of uncertainty of Arrhenius parameters



The simplest case: temperature independent uncertainty of  $k$   
two Arrhenius parameters  $\ln A, E/R$



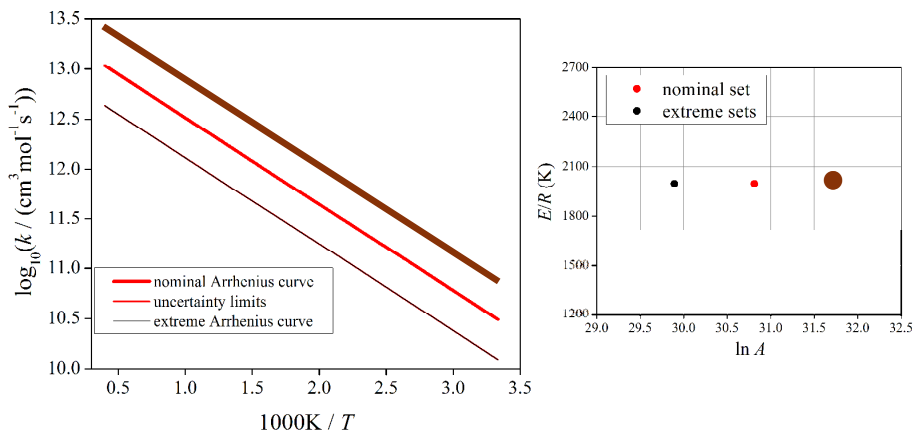
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## Domain of uncertainty of Arrhenius parameters



The simplest case: temperature independent uncertainty of  $k$   
two Arrhenius parameters  $\ln A, E/R$



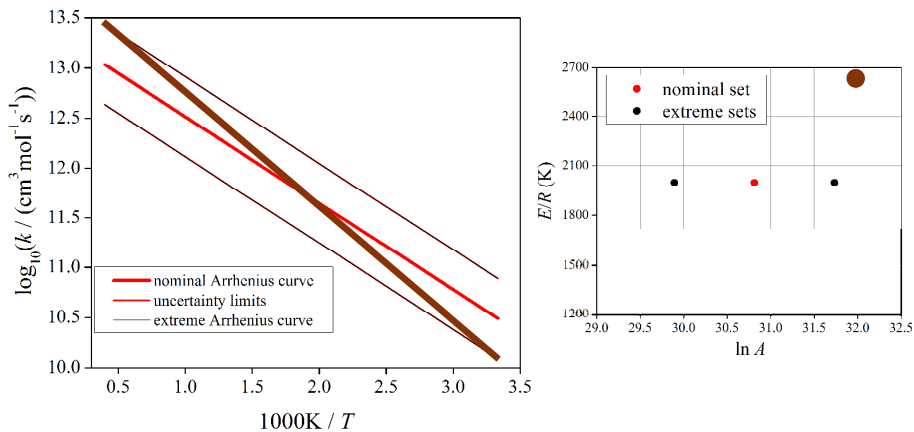
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## Domain of uncertainty of Arrhenius parameters



The simplest case: temperature independent uncertainty of  $k$   
two Arrhenius parameters  $\ln A, E/R$



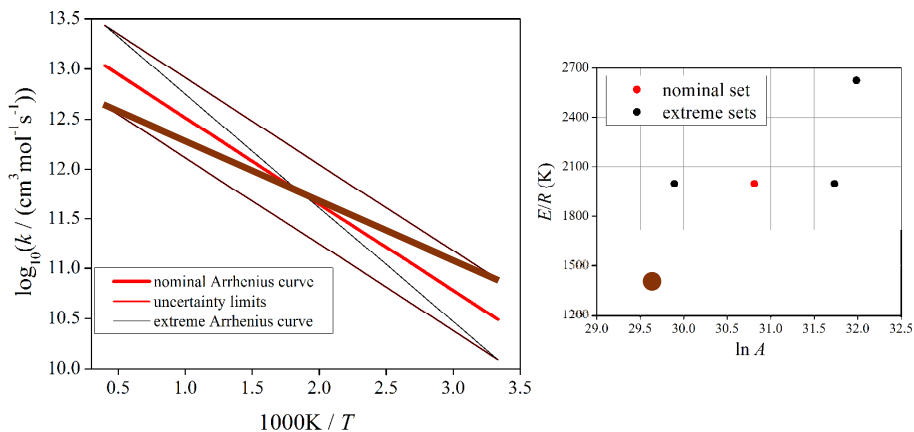
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## Domain of uncertainty of Arrhenius parameters



The simplest case: temperature independent uncertainty of  $k$   
two Arrhenius parameters  $\ln A, E/R$



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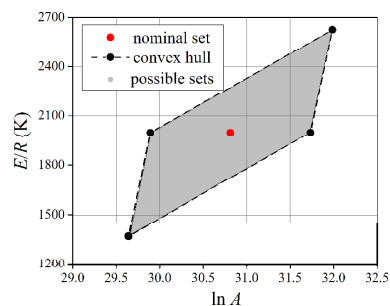
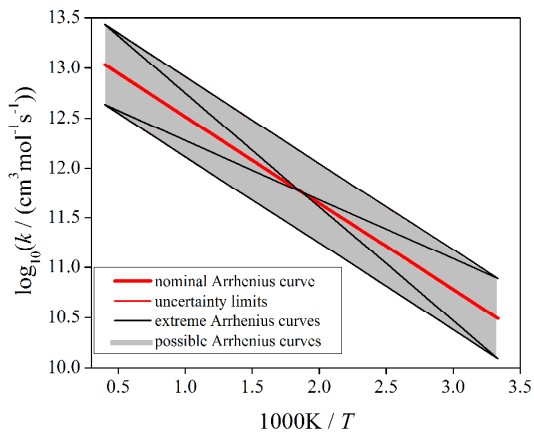
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## Domain of uncertainty of Arrhenius parameters



The simplest case: temperature independent uncertainty of  $k$   
two Arrhenius parameters  $\ln A, E/R$



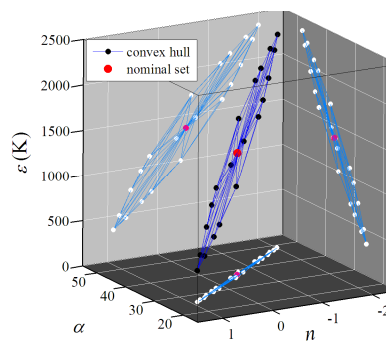
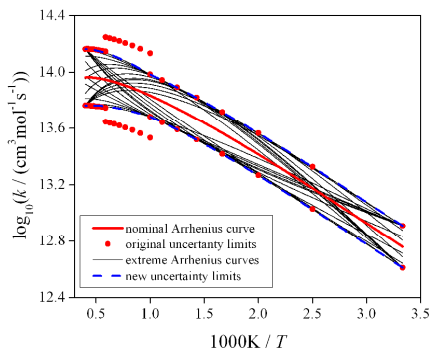
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## 3D domain of Arrhenius parameters



The most complex case: temperature dependent uncertainty of  $k$   
three Arrhenius parameters  $\alpha = \ln A, n, \varepsilon = E/R$



T. Nagy, É. Valkó, I. Sedyó, I. Gy. Zsély, M. J. Pilling, T. Turányi: Uncertainty of the rate parameters of several important elementary reactions of the  $\text{H}_2$  and syngas combustion systems *Combust. Flame*, **162**, 2059-2076 (2015)



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## Uncertainty of Arrhenius parameters



Calculation of the variance of  $\ln k$  from uncertainty parameter  $f$ :  
(assuming  $3\sigma$  deviation between  $\log_{10} k^0$  and  $\log_{10} k^{\max}$ )

$$\sigma(\ln k) = \frac{\ln 10}{3} f$$

Instead of temperature dependent  $\sigma(\ln k)$

the prior uncertainty domain of the Arrhenius parameters is needed

defined by the covariance matrix of the Arrhenius parameters



## $\sigma(\ln k) \Rightarrow$ covariance matrix of the Arrhenius parameters



Matrix-vector form of the linearized Arrhenius equation:

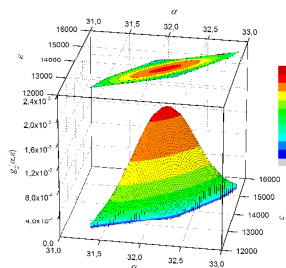
$$\kappa(\theta) = \mathbf{p}^T \theta$$

$$\mathbf{p}^T := [\alpha \quad n \quad \varepsilon]$$

$$\theta^T := [1 \quad \ln \theta \quad -\theta^{-1}]$$

The covariance matrix of the Arrhenius parameters and its relation to the uncertainty of the rate coefficient:

$$\Sigma_{\mathbf{p}} = \overline{(\mathbf{p} - \bar{\mathbf{p}})(\mathbf{p} - \bar{\mathbf{p}})^T} = \begin{bmatrix} \sigma_{\alpha}^2 & r_{\alpha n} \sigma_{\alpha} \sigma_n & r_{\alpha \varepsilon} \sigma_{\alpha} \sigma_{\varepsilon} \\ r_{\alpha n} \sigma_{\alpha} \sigma_n & \sigma_n^2 & r_{n \varepsilon} \sigma_n \sigma_{\varepsilon} \\ r_{\alpha \varepsilon} \sigma_{\alpha} \sigma_{\varepsilon} & r_{n \varepsilon} \sigma_n \sigma_{\varepsilon} & \sigma_{\varepsilon}^2 \end{bmatrix}$$



$$\sigma_{\kappa}(\theta) = \sqrt{\theta^T \Sigma_{\mathbf{p}} \theta} \quad \text{equation for the conversion } \sigma(\ln k) \Leftrightarrow \text{covariance matrix of the Arrhenius parameters}$$

Nagy, T.; Turányi, T. Uncertainty of Arrhenius parameters  
*Int. J. Chem. Kinet.*, **43**, 359-378 (2011)

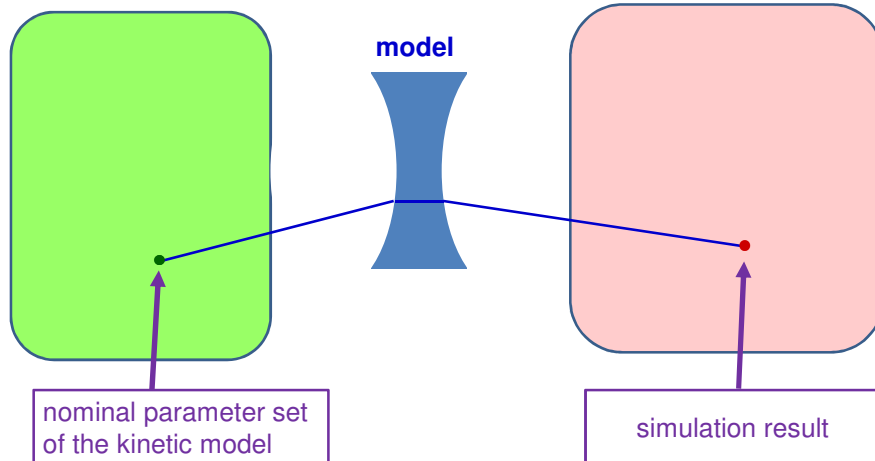


## Parameters and simulation results



space of rate parameters

space of simulation results

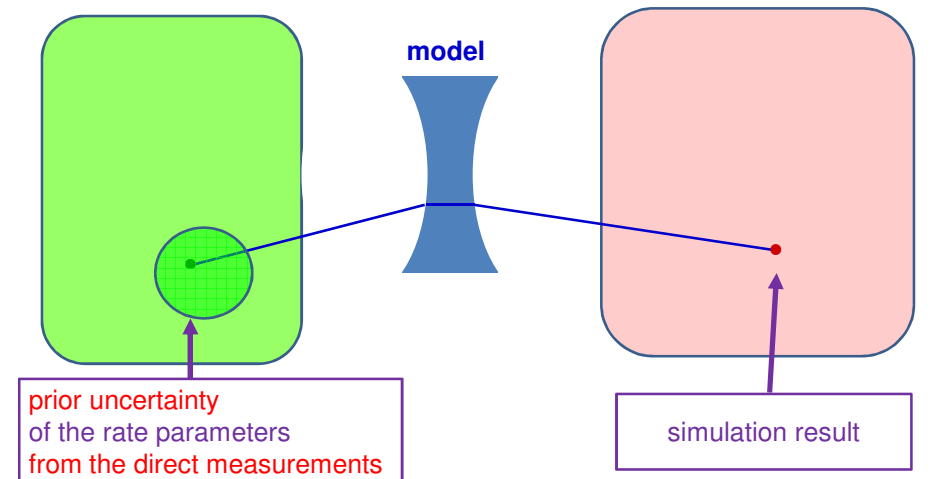


## Considering the uncertainties



space of rate parameters

space of simulation results

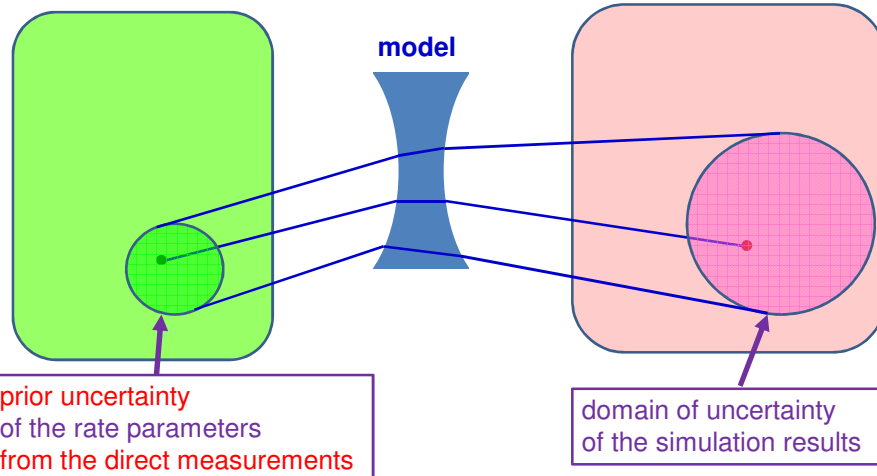


## Uncertainty of simulation results



space of rate parameters

space of simulation results



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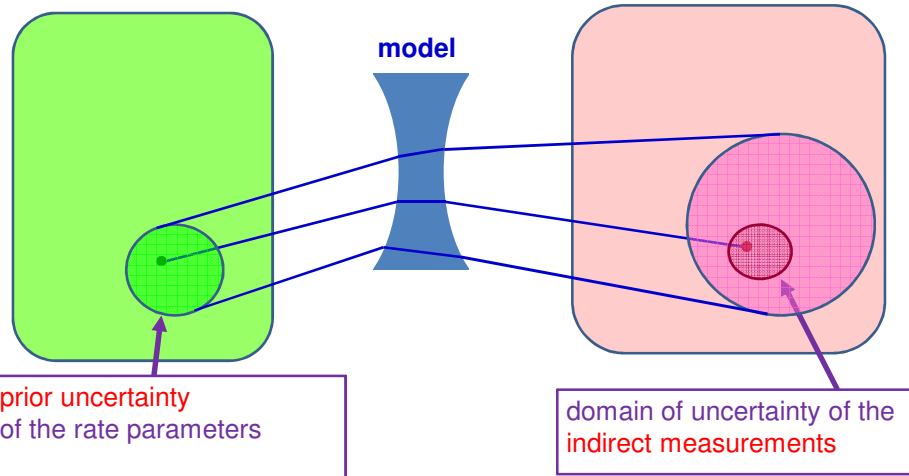
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## Simulation uncertainty vs. indirect measurement uncertainty



space of rate parameters

space of simulation results



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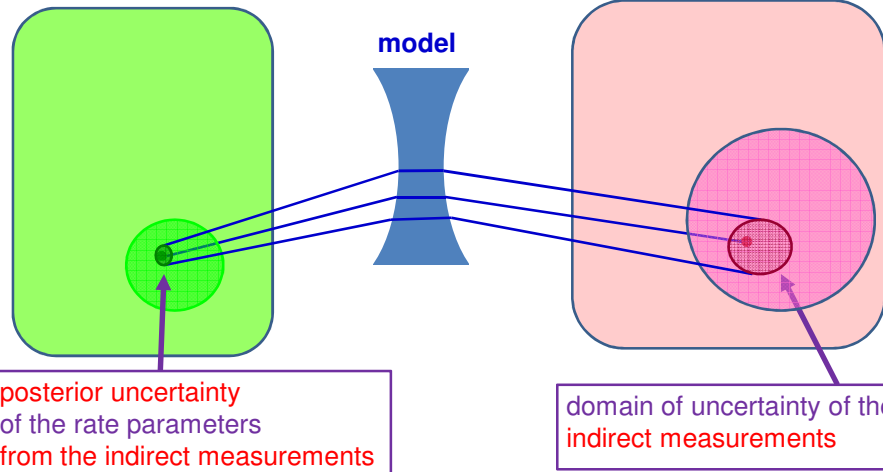
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## Result of parameter optimisation



space of rate parameters

space of simulation results



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## Mechanism optimisation



First suggestion for the systematic optimisation of a mechanism based on the low (projected) uncertainty of the indirect measurements:

- Michael Frenklach, *Combust. Flame*, **58**, 69-72 (1984)
- M. Frenklach, H. Wang, M.J. Rabinowitz, *Prog. Energy Combust. Sci.*, **18**, 47-73 (1992)

The „GRI-Mech approach”:

- ✓ representative indirect experimental values are selected („targets”)
- ✓ parameters, highly sensitive with respect to the targets are identified („active parameters”)
- ✓ these active parameters are **A-factors**, 3rd body collision efficiencies and enthalpies of formation
- ✓ the fitting is assisted with surrogate models („response surfaces”)
- ✓ the fitted *A*-factors are limited by their uncertainty limits (calculated from uncertainty parameter  $f$ )



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## Further developments by Frenklach *et al.*



The objective function was extended:  
it is penalized if the fitted *A*-factor deviates from the evaluated value

You, X.; Russi, T.; Packard, A.; Frenklach, M.  
*Proc. Combust. Inst.*, **33**, 509-516 (2011)

Extension of the methodology with the investigation of the  
consistency of the experimental data. See *e.g.*

Russi, T.; Packard, A.; Feeley, R.; Frenklach, M.  
*J. Phys. Chem. A*, **112**, 2579-2588(2008)

Encoding the indirect data using the PRiMe XML format:

Frenklach, M.  
<http://www.primekinetics.org/>



## Further developments by Sheen and Wang



The objective function was extended:  
penalized if the fitted *A* factor deviates from the evaluated value

D. Sheen, H. Wang:  
*Combust. Flame*, **158**, 645-656(2011)

Calculation of the covariance matrix of the parameters (*A*-factors)  
Method of Uncertainty Minimization using  
Polynomial Chaos Expansions (MUM-PCE)

D. Sheen, X. You, H. Wang, T. Løvås:  
*Proc. Combust. Inst.*, **32**, 535-542(2009).

Fitting to original experimental datapoints  
(not only fitting to selected targets)

Sheen, D.; Wang, H.  
*Combust. Flame*, **158**, 645-656(2011)



## Further developments by Cai and Pitsch



- Optimization of rate rules for larger hydrocarbon models
- ⇒ less fitted parameters
  - ⇒ consistency of rate coefficients of kinetically similar reactions
- L. M. Cai, H. Pitsch: *Combust. Flame* **161**, 405-415 (2014).



## Our optimisation method



The aim is not only getting an optimised mechanism,  
but also the determination of the  
**„real” values of the rate parameters**  
and their joint domain of uncertainty.

### Main features:

- ✓ original indirect experimental data are used (not „targets”)
- ✓ utilization of direct experimental data  
(instead of forcing  $k$  to the evaluated value)
- ✓ all Arrhenius parameters ( $A$ ,  $n$ ,  $E$ ) are fitted + 3<sup>rd</sup> body efficiencies  
(+ enthalpies of formation)
- ✓ determination of the prior uncertainty domain of the rate parameters  
based on direct measurements and theoretical calculations
- ✓ global optimisation within the prior uncertainty domain
- ✓ calculation of the joint posterior uncertainty of the fitted rate parameters  
from the experimental scatter of all (direct+indirect) experimental data



## Selection of parameters to be fitted

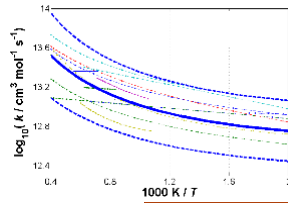


Local sensitivity analysis is carried out at each experimental data point

The rate parameters having high sensitivity were selected for optimization  
(e.g. fitting)

Determination of the uncertainty range of the Arrhenius parameters

- ✓ based on direct measurements and theoretical calculations
- ✓  $f(T)$  functions consistent with the mean Arrhenius expression are determined
- ✓ The shape and the prior *pdf* of the uncertainty domain of Arrhenius parameters are stored in their prior covariance matrix



## Optimisation and uncertainty calculation



Optimisation = minimisation of this error function:

$$E(\mathbf{p}) = \frac{1}{N} \sum_{i=1}^N \frac{1}{N_i} \sum_{j=1}^{N_i} \left( \frac{Y_{ij}^{mod}(\mathbf{p}) - Y_{ij}^{exp}}{\sigma(Y_{ij}^{exp})} \right)^2$$

$Y_{ij}$  measured/calculated rate coefficient OR  
measured/calculated ignition time/flame velocity  
in data point  $j$  of data series  $i$

$\sigma$  standard deviation of the measured data

$$Y_{ij} = \begin{cases} y_{ij} & \text{if } \sigma(y_{ij}^{exp}) \approx \text{constant} \\ \ln y_{ij} & \text{if } \sigma(\ln y_{ij}^{exp}) \approx \text{constant} \end{cases}$$

$N_i$  number of data points in data series  $i$

$N$  number of data series (different experiments)

Calculation of the covariance matrix of the estimated parameters:

$$\Sigma_p = \left[ \left( \mathbf{J}_o^T \mathbf{W} \Sigma_Y^{-1} \mathbf{J}_o \right)^{-1} \mathbf{J}_o^T \mathbf{W} \Sigma_Y^{-1} \right] (\Sigma_Y + \Sigma_\Delta) \left[ \left( \mathbf{J}_o^T \mathbf{W} \Sigma_Y^{-1} \mathbf{J}_o \right)^{-1} \mathbf{J}_o^T \mathbf{W} \Sigma_Y^{-1} \right]^T$$





## Transformation of the covariance matrix to other measures of uncertainty



covariance matrix of the Arrhenius parameters →

→ covariance matrix of  $\ln k \rightarrow \sigma(\ln k) \rightarrow$  uncertainty parameter  $f(T)$

$$\text{cov}(\kappa_i(T), \kappa_j(T)) = (\kappa_i(T) - \bar{\kappa}_i(T))(\kappa_j(T) - \bar{\kappa}_j(T)) = \Theta^T (p_i - \bar{p}_i)(p_j - \bar{p}_j)^T \Theta = \Theta^T \Sigma_{p_i, p_j} \Theta$$

$$\Theta^T := \begin{bmatrix} 1 & \ln T & -T^{-1} \end{bmatrix}$$

$$\sigma(\ln k) = \ln 10 \sigma(\log_{10} k) = \frac{\ln 10}{3} f(T)$$

covariance matrix of the Arrhenius parameters →

→ covariance matrix of  $\ln k \rightarrow$  correlation  $r(T)$  between  $\ln k_i$  and  $\ln k_j$

$$r_{\kappa_i, \kappa_j}(T) = \frac{\text{cov}(\kappa_i(T), \kappa_j(T))}{\sigma_{\kappa_i}(T) \sigma_{\kappa_j}(T)}$$



## Results of optimisation



- **Optimised detailed reaction mechanism**
  - Usually describes the experimental data much better
- **Set of optimised rate parameters**
  - All rate parameters are within the prior uncertainty domain
- **Posterior covariance matrix of the optimised parameters**
  - Temperature independent
  - $\Rightarrow f(T)$  uncertainty function of each optimised rate coefficient
  - $\Rightarrow$  correlation coefficients between pairs of rate coefficients

**The same optimisation methodology can be used for**  
 $\Rightarrow$  interpretation of indirect experimental data  
 $\Rightarrow$  development of detailed combustion mechanisms



## Our publications related to the interpretation of experimental data



### Shock tube, H-ARAS concentration profiles

I. Gy. Zsély, T. Varga, T. Nagy, M. Cserhádi, T. Turányi, S. Peukert, M. Braun-Unkhoff, C. Naumann, U. Riedel  
Determination of rate parameters of cyclohexane and 1-hexene decomposition reactions  
*Energy*, **43**, 85-93(2012)

### Shock tube, H-ARAS and I-ARAS concentration profiles

T. Varga, I. Gy. Zsély, T. Turányi, T. Bentz, M. Olzmann  
Kinetic analysis of ethyl iodide pyrolysis based on shock tube measurements  
*Int.J.Chem.Kinet.*, **46**, 295-304 (2014)

### Shock tube, end product analysis

V. Samu, T. Varga, K. Brezinsky, T. Turányi  
Investigation of ethane pyrolysis and oxidation at high pressures using global optimization based on shock tube data  
*Proc. Combust. Inst.*, **36**, 691-698 (2017)

### Flow reactor, exit concentration measurements

N. A. Buczkó, T. Varga, I. Gy. Zsély, T. Turányi  
Formation of NO in N<sub>2</sub>/O<sub>2</sub>/H<sub>2</sub>O mixtures – re-evaluation of flow reactor experiments  
*Fuel and Energy*, to be submitted

### Flame, NH<sub>2</sub> concentration profiles measured by ICLAS

V. Samu, T. Varga, I. Rahinov, S. Cheskis, T. Turányi  
Determination of rate parameters based on NH<sub>2</sub> concentration profiles measured in ammonia-doped methane-air flames, *Fuel*, **212**, 679-683 (2018)



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## Pyrolysis of ethyl-iodide



Dr. Tobias Bentz and Prof. Matthias Olzmann  
(Karlsruhe Institute of Technology, Germany)  
investigated the decomposition of ethyl-iodide (C<sub>2</sub>H<sub>5</sub>I)  
in reflected shock wave experiments:



- 23 experiments with H-ARAS detection
- reflected shock wave experiments in Ar bath gas
- 6 experiments with I-ARAS detection
- Typical range of experiments:  
 $T = 957 - 1530 \text{ K}$   
 $p = 1.3 - 1.8 \text{ bar}$   
 $c_0 = 2 - 5 \text{ ppm} \quad (2.1-6.6 \times 10^{13} \text{ cm}^{-3})$
- the results were described with a model of 5 reaction steps

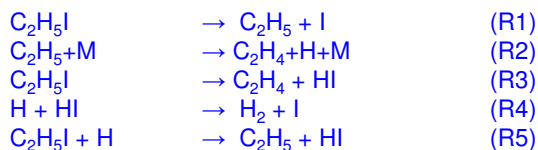
Bentz, T., Szőri, M., Viskolcz, B., Olzmann, M.  
Pyrolysis of ethyl iodide as hydrogen atom source:  
kinetics and mechanism in the temperature range 950-1200K  
*Zeitschrift für Physikalische Chemie* **225**, 1117-1128 (2011)



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## The initial mechanism



In the original mechanism of Bentz *et al.* the rate parameters of R1 were obtained by fitting to their H-ARAS measurement data, R3 and R5: TST calculations; R2 and R4: Baulch recommendations.

Sensitivity analysis considering the H-ARAS and I-ARAS concentration profiles indicated that the **Arrhenius parameters of reactions R1, R3, R4, R5** can be determined from the measured H-atom and I-atom concentration profiles.



## Utilization of external information



Our method allows the consideration of external information, like

- experimental data points measured in another laboratory
- published rate coefficient values measured at given  $T$ ,  $p$ , bath gas.

In this work the measured rate coefficient values for reaction  $\text{H}_2 + \text{I} \rightarrow \text{H} + \text{HI}$  (-R4) were used from

Michael, J. V.; Kumaran, S.; Su, M. C.; Lim, K. P.  
*Chem. Phys. Lett.* **319**, 99-106 (2000).

13 rate coefficient values were measured using shock tube and light absorption detection.  
temperature range of 1755 – 2605 K

Vasileiadis S.; Benson S. W.  
*Int. J. Chem. Kinet.* **29**, 915-925 (1997)

1 measured rate coefficient  
 $T = 298 \text{ K}$   
Very low pressure reactor, MS detection



## Results of optimization



data used:

- 23 H-ARAS concentration profiles
- 6 I-ARAS concentration profiles
- 14 measurements for the rate coefficients of reaction  $\text{H} + \text{HI} \Rightarrow \text{H}_2 + \text{I}$  (R4)  
(from Michael, Kumaran, Su, Lim: *Chem. Phys. Lett.* **319**, 99-106 (2000) and Vasileiadis S.; Benson S. W.: *Int. J. Chem. Kinet.* **29**, 915-925 (1997) )

The description of the experimental data improved significantly:

	original model	optimized model
<b>Total objective function value</b>	<b>5.07</b>	<b>3.57</b>
Objective function value of the H-ARAS measurements	3.54	2.35
Objective function value of the I-ARAS measurements	1.17	1.14
Objective function value of the direct measurements	0.36	0.08



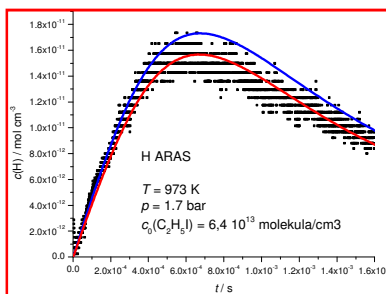
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## Optimized rate parameters



	initial model		optimized model	
	$\log_{10}(A)$	$E/R$	$\log_{10}(A)$	$E/R$
<b>R1: <math>\text{C}_2\text{H}_5\text{I} \rightarrow \text{C}_2\text{H}_5 + \text{I}</math></b>	<b>13.00</b>	<b>23200</b>	<b>13.66</b>	<b>24422</b>
<b>R2: <math>\text{C}_2\text{H}_5 + \text{M} \rightarrow \text{C}_2\text{H}_4 + \text{H} + \text{M}</math></b>	<b>18.00</b>	<b>16800</b>	<b>18.00</b>	<b>16800</b>
<b>R3: <math>\text{C}_2\text{H}_5\text{I} \rightarrow \text{C}_2\text{H}_4 + \text{HI}</math></b>	<b>13.23</b>	<b>26680</b>	<b>13.52</b>	<b>27110</b>
<b>R4: <math>\text{H} + \text{HI} \rightarrow \text{H}_2 + \text{I}</math></b>	<b>13.68</b>	<b>330</b>	<b>13.82</b>	<b>492</b>
<b>R5: <math>\text{C}_2\text{H}_5\text{I} + \text{H} \rightarrow \text{C}_2\text{H}_5 + \text{HI}</math></b>	<b>15.62</b>	<b>3940</b>	<b>15.00</b>	<b>2594</b>



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## Covariance matrix of the rate parameters



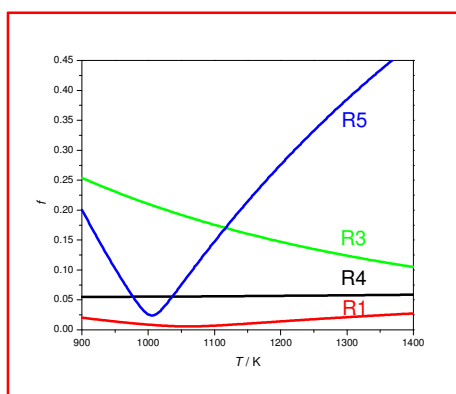
	$\ln A_1$	$E_1/R$	$\ln A_3$	$E_3/R$	$\ln A_4$	$E_4/R$	$\ln A_5$	$E_5/R$
$\ln A_1$	2.674E-02	4.872E+01	-8.606E-03	-2.127E+01	4.681E-03	1.182E+01	1.521E-01	3.578E+02
$E_1/R$	4.872E+01	9.679E+04	-9.214E+00	-2.270E+04	1.706E+00	3.860E+03	1.522E+02	3.587E+05
$\ln A_3$	-8.606E-03	-9.214E+00	7.153E-03	7.558E+00	-3.814E-03	-4.025E+00	-1.035E-01	-1.041E+02
$E_3/R$	-2.127E+01	-2.270E+04	7.558E+00	8.008E+03	-1.009E+00	-1.100E+03	-1.105E+02	-1.112E+05
$\ln A_4$	4.681E-03	1.706E+00	-3.814E-03	-1.009E+00	3.711E-03	1.750E+00	5.954E-02	6.017E+01
$E_4/R$	1.182E+01	3.860E+03	-4.025E+00	-1.100E+03	1.750E+00	1.595E+03	1.692E+01	1.682E+04
$\ln A_5$	1.521E-01	1.522E+02	-1.035E-01	-1.105E+02	5.954E-02	1.692E+01	1.698E+00	1.707E+03
$E_5/R$	3.578E+02	3.587E+05	-1.041E+02	-1.112E+05	6.017E+01	1.682E+04	1.707E+03	1.717E+06



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## Posterior uncertainty parameters $f(T)$



R1  $\text{C}_2\text{H}_5\text{I} \rightarrow \text{C}_2\text{H}_5 + \text{I}$   
 $f = 0.02\text{--}0.04 \Rightarrow$  very well known

R3  $\text{C}_2\text{H}_5\text{I} \rightarrow \text{C}_2\text{H}_4 + \text{HI}$   
 $f = 0.10\text{--}0.25 \Rightarrow$  well known

R4  $\text{H} + \text{HI} \rightarrow \text{H}_2 + \text{I}$   
 $f = 0.06\text{--}0.07 \Rightarrow$  very well known

R5  $\text{C}_2\text{H}_5\text{I} + \text{H} \rightarrow \text{C}_2\text{H}_5 + \text{HI}$   
 $f = 0.02\text{--}0.50 \Rightarrow$  well known  
 only near 1000 K

$$f(T) = \log_{10} \left( k^0(T) / k^{\min}(T) \right) = \log_{10} \left( k^{\max}(T) / k^0(T) \right)$$

**Reminder:**

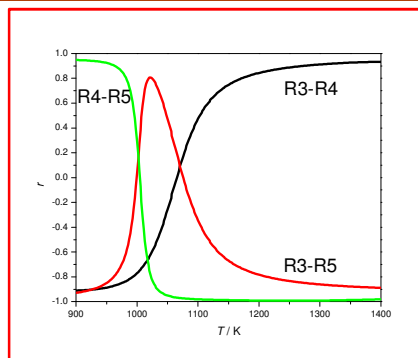
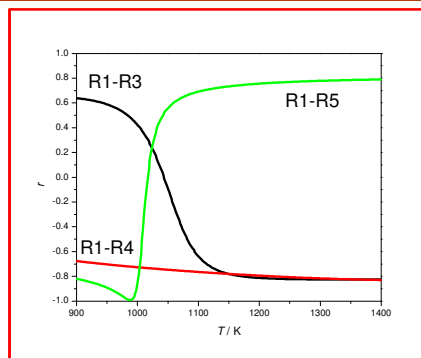
$f = 0.1 \Rightarrow$  very well known;  $f = 0.3 \Rightarrow$  well known;  $f = 0.5$  typical good uncertainty



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## Correlation coefficients $r(T)$ between the rate coefficients



strong correlation between the rate coefficients at all conditions

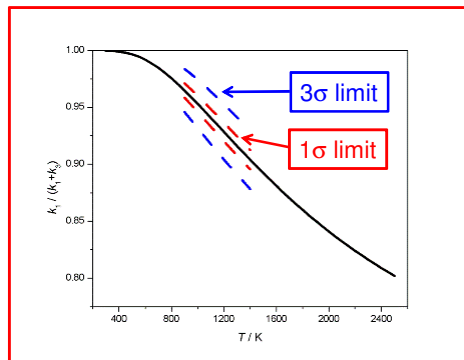
the correlation significantly changes with temperature



## Branching ratio $k(R1)/(k(R1)+k(R3))$



$C_2H_5I \rightarrow C_2H_5 + I$  (R1) compared to  $C_2H_5I \rightarrow$  products



Kumaran, Su, Lim, Michael  
*Proc. Combust. Inst.* **26**, 605–611 (1996).  
shock tube, H-ARAS and I-ARAS  
 $b = 0.87 \pm 0.11$  in range 950 K – 2050 K

Yang and Tranter  
*Int. J. Chem. Kinet.* **44**, 433–443 (2012).  
incident shock wave,  
laserschlieren (LS) densitometry  
 $b > 0.87$  in range 1150 K – 1870 K

Miyoshi, Yamauchi, Kosaka, Koshi, Matsui  
*J. Phys. Chem. A* **103**, 46–53 (1999).  
shock tube, I-ARAS  
 $b = 0.92 \pm 0.06$  in range 950 K – 1400 K.

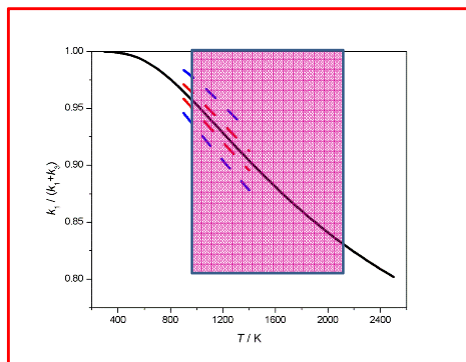
Weber, Lemieux, Zhang  
*J. Phys. Chem. A* **113**, 583–591 (2009).  
flash pyrolysis / VUV-SPI-TOFMS  
 $b = 0.7 \pm 0.1$  in range 770 K – 1200 K



## Branching ratio $k(R1)/(k(R1)+k(R3))$



### $C_2H_5I \rightarrow C_2H_5 + I$ (R1) compared to $C_2H_5I \rightarrow$ products



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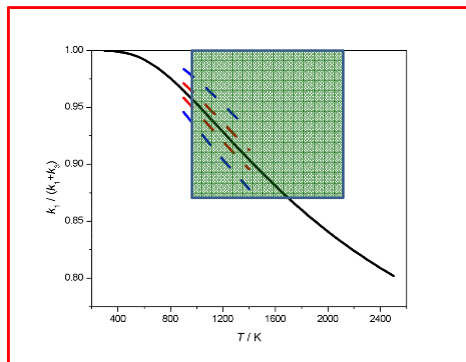
Weber, Lemieux, Zhang  
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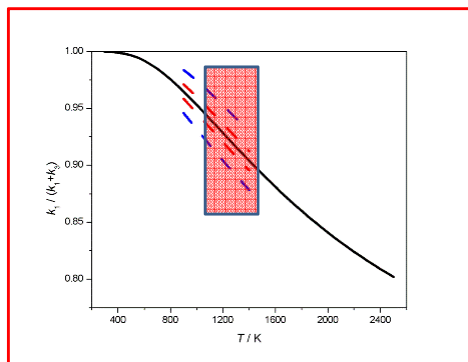
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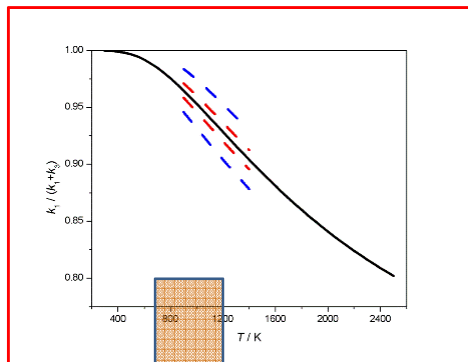
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## Branching ratio $k(R1)/(k(R1)+k(R3))$



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 $b = 0.7 \pm 0.1$  in range 770 K – 1200 K



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# Development of detailed reaction mechanisms



## Our publications related to the development of detailed reaction mechanisms



### Determination of the prior uncertainty of rate coefficients

T. Varga, T. Nagy, É. Valkó, I. Sedyó, I. Gy. Zsély, M. J. Pilling, T. Turányi

Uncertainty of the rate parameters of several important elementary reactions of the

H<sub>2</sub> and syngas combustion systems

*Combust. Flame*, **162**, 2059-2076 (2015)

### Optimized hydrogen combustion mechanism

T. Varga, T. Nagy, C. Olm, I. Gy. Zsély, R. Pálvölgyi, É. Valkó, G. Vincze, M. Cserhádi, H. J. Curran, T. Turányi

Optimization of a hydrogen combustion mechanism using both direct and indirect measurements

*Proc. Combust. Inst.*, **35**, 589-596 (2015)

### Optimized syngas combustion mechanism

T. Varga, C. Olm, T. Nagy, I. Gy. Zsély, É. Valkó, R. Pálvölgyi, H. J. Curran, T. Turányi

Development of a joint hydrogen and syngas combustion mechanism based on an optimization approach

*Int. J. Chem. Kinet.*, **48**, 407-422 (2016)

### Optimized ethanol combustion mechanism

C. Olm, T. Varga, É. Valkó, S. Hartl, C. Hasse, T. Turányi

Development of an ethanol combustion mechanism based on a hierarchical optimization approach

*Int. J. Chem. Kinet.*, **48**, 423-441 (2016)

### Optimized methanol combustion mechanism

C. Olm, T. Varga, É. Valkó, H. J. Curran, T. Turányi

Uncertainty quantification of a newly optimized methanol and formaldehyde combustion mechanism

*Combust. Flame*, **186**, 45-64 (2017)



## Example: optimization of a methanol and formaldehyde combustion mechanism



- **Methanol** is an alternative automotive fuel, fuel additive and feedstock in various industrial processes
- **Model system** for studies of **C<sub>1</sub> combustion**: important radicals include CH<sub>2</sub>OH and CH<sub>3</sub>O
- **Relevance** for the oxidation of higher hydrocarbons/ oxygenates
- **Not all** experimentally observed **combustion characteristics** (e.g. ignition, flame propagation, speciation profiles) are **well-described** by available kinetic mechanisms



## Data collection of methanol combustion



	Type of measurement experimental facility	Data sets	Data points	p / atm	T / K
• <b>Indirect measurements</b>	<b>Ignition delay times</b>	<b>81</b>	<b>574</b>		
	Shock tube	67	421	0.3–51.7	963–2180
	Shock tube (CH <sub>2</sub> O)	7	99	1.6	1363–2304
	Rapid compression machine	7	54	9.3–40.6	817–980
• <b>Direct measurements of rate coefficients</b> (926 data points/ 66 data sets)	<b>Burning velocity measurements</b>	<b>87</b>	<b>632</b>		
	Outwardly/ spherically propagating flame	35	170	0.5–9.9	298–500
	Counterflow twin-flame	5	90	1	298–368
	Heat flux method / laminar flat flame	41	280	0.2–1	298–358
	Flame-cone method	6	92	1	298–413
• <b>Theoretical rate determinations</b> (33 data sets)	<b>Concentration measurements</b>	<b>97</b>	<b>23,694</b>		
	Flow reactor concentration–time profiles	18	1,452	1–20	752–1043
	Flow reactor conc.–time profiles (CH <sub>2</sub> O)	13	462	1–6	852–1095
	Flow reactor outlet concentrations	13	444	1–98.7	600–1443
	Flow reactor outlet concentrations (CH <sub>2</sub> O)	3	156	1.05	712–1279
	Jet-stirred reactor outlet concentrations	9	711	1–20	697–1200
	Shock tube concentration–time profiles	14	12,756	0.3–2.5	1266–2100
Shock tube conc.–time profiles (CH <sub>2</sub> O)	27	7,713	1.5–2.0	1244–1907	



# Initial mechanism for optimization



## Starting point: CH<sub>3</sub>OH/CH<sub>2</sub>O/CO mechanism of Li *et al.* (2007)

J. Li; Z. W. Zhao; A. Kazakov; M. Chaos; F. L. Dryer; J. J. Scire Jr.,  
*Int. J. Chem. Kinet.* 39 (2007) 109–136

## Update of rate coefficients in the H<sub>2</sub>/CO sub-mechanism

using values from our recently optimized joint hydrogen and syngas mechanism

T. Varga; C. Olm; T. Nagy; I. Gy. Zsély; É. Valkó; R. Pálvölgyi;  
H.J. Curran; T. Turányi, *Int. J. Chem. Kinet.* 48 (2016) 407–422

## Further modifications:

- Thermochemistry updated  
S. M. Burke; J. M. Simmie; H. J. Curran,  
*J. Phys. Chem. Ref. Data* 44 (2015) 013101  
Burcat database (March 13, 2015)
- CH<sub>3</sub>OH+HÖ<sub>2</sub> = CH<sub>3</sub>Ö+H<sub>2</sub>O<sub>2</sub>  
abstraction channel added  
S. J. Klippenstein; L. B. Harding; M. J. Davis; A. S. Tomlin;  
R. T. Skodje, *Proc. Combust. Inst.* 33 (2011) 351–357



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# Local sensitivity analysis

## Important reactions in formaldehyde and methanol combustion



Brute force method (parameters varied by +5%) using the initial mechanism, shown: ( $|S|_{\text{avg}} \geq 0.1$ )

CH <sub>3</sub> OH shock tube IDTs	CH <sub>3</sub> OH RCM IDTs	CH <sub>3</sub> OH speciation data	CH <sub>2</sub> O speciation data
CH <sub>3</sub> OH+HO <sub>2</sub> = CH <sub>3</sub> OH+H <sub>2</sub> O <sub>2</sub> 0.80	CH <sub>3</sub> OH+HO <sub>2</sub> = CH <sub>3</sub> OH+H <sub>2</sub> O <sub>2</sub> 1.00	CH <sub>3</sub> OH+HO <sub>2</sub> = CH <sub>3</sub> OH+H <sub>2</sub> O <sub>2</sub> 0.36	HCO(+M) = H+CO(+M) 0.46
OH+OH(+M) = H <sub>2</sub> O <sub>2</sub> (+M) 0.54	OH+OH(+M) = H <sub>2</sub> O <sub>2</sub> (+M) 0.55	CH <sub>3</sub> OH+OH = CH <sub>3</sub> O+H <sub>2</sub> O 0.29	CH <sub>2</sub> O+H = HCO+H <sub>2</sub> 0.38
H <sub>2</sub> O <sub>2</sub> = O+OH 0.41	OH+OH(+M) = H <sub>2</sub> O <sub>2</sub> (+M) 0.31	CH <sub>3</sub> OH+O <sub>2</sub> = CH <sub>3</sub> OH+HO <sub>2</sub> 0.25	CH <sub>2</sub> O+O <sub>2</sub> = HCO+HO <sub>2</sub> 0.34
OH+CH <sub>3</sub> (+M) = CH <sub>3</sub> OH(+M) 0.26	HO <sub>2</sub> +HO <sub>2</sub> = H <sub>2</sub> O <sub>2</sub> +O <sub>2</sub> 0.28	CH <sub>3</sub> OH+OH = CH <sub>3</sub> OH+H <sub>2</sub> O 0.25	HCO+O <sub>2</sub> = CO+HO <sub>2</sub> 0.30
CH <sub>3</sub> OH+OH = CH <sub>3</sub> O+H <sub>2</sub> O 0.24	HO <sub>2</sub> +HO <sub>2</sub> = H <sub>2</sub> O <sub>2</sub> +O <sub>2</sub> 0.19	OH+OH(+M) = H <sub>2</sub> O <sub>2</sub> (+M) 0.23	CH <sub>2</sub> O+HO <sub>2</sub> = HCO+H <sub>2</sub> O <sub>2</sub> 0.30
CH <sub>3</sub> OH+H = CH <sub>3</sub> OH+H <sub>2</sub> 0.20	CH <sub>3</sub> O+HO <sub>2</sub> = HCO+H <sub>2</sub> O <sub>2</sub> 0.13	HO <sub>2</sub> +OH = H <sub>2</sub> O+O <sub>2</sub> 0.23	CH <sub>2</sub> O+M = CO+H <sub>2</sub> +M 0.27
HO <sub>2</sub> +HO <sub>2</sub> = H <sub>2</sub> O <sub>2</sub> +O <sub>2</sub> 0.18	CH <sub>3</sub> OH+O <sub>2</sub> = CH <sub>3</sub> OH+HO <sub>2</sub> 0.10	CH <sub>3</sub> O+OH = HCO+H <sub>2</sub> O 0.21	CH <sub>2</sub> OH+HCO = CH <sub>2</sub> O+CH <sub>2</sub> O 0.27
HO <sub>2</sub> +OH = H <sub>2</sub> O+O <sub>2</sub> 0.17		HO <sub>2</sub> +HO <sub>2</sub> = H <sub>2</sub> O <sub>2</sub> +O <sub>2</sub> 0.20	CH <sub>2</sub> OH+M = CH <sub>2</sub> O+H+M 0.19
H+HO <sub>2</sub> = H <sub>2</sub> +O <sub>2</sub> 0.14		H+O <sub>2</sub> = O+OH 0.20	CH <sub>2</sub> OH+HCO = CH <sub>2</sub> OH+CH <sub>2</sub> O 0.19
HCO(+M) = H+CO(+M) 0.12		CO+OH = CO <sub>2</sub> +H 0.20	OH+OH(+M) = H <sub>2</sub> O <sub>2</sub> (+M) 0.17
OH+CH <sub>3</sub> (+M) = CH <sub>3</sub> OH(+M) 0.11	CH <sub>3</sub> OH burning velocities	CH <sub>3</sub> O+M = CH <sub>2</sub> O+H+M 0.20	H+O <sub>2</sub> = O+OH 0.17
CH <sub>2</sub> OH+O <sub>2</sub> = CH <sub>2</sub> OH+HO <sub>2</sub> 0.10	H+O <sub>2</sub> = O+OH 0.99	CH <sub>2</sub> OH+H = CH <sub>2</sub> OH+H <sub>2</sub> 0.19	CH <sub>2</sub> O+M = HCO+H+M 0.17
CH <sub>2</sub> OH+OH = CH <sub>2</sub> OH+H <sub>2</sub> O 0.10	HCO(+M) = H+CO(+M) 0.60	CH <sub>2</sub> O+HO <sub>2</sub> = HCO+H <sub>2</sub> O <sub>2</sub> 0.19	CH <sub>2</sub> O+OH = HCO+H <sub>2</sub> O 0.13
	CO+OH = CO <sub>2</sub> +H 0.52	CH <sub>3</sub> +HO <sub>2</sub> = CH <sub>3</sub> +O <sub>2</sub> 0.18	CO+OH = CO <sub>2</sub> +H 0.13
	HO <sub>2</sub> +H = OH+OH 0.38	H+O <sub>2</sub> (+M) = HO <sub>2</sub> (+M) 0.18	CH <sub>2</sub> O+O = HCO+OH 0.12
CH <sub>2</sub> O shock tube IDTs	CH <sub>2</sub> OH+OH = CH <sub>2</sub> O+H <sub>2</sub> O 0.35	CH <sub>2</sub> OH+M = CH <sub>2</sub> O+H+M 0.17	OH+OH(+M) = H <sub>2</sub> O <sub>2</sub> (+M) 0.12
HCO(+M) = H+CO(+M) 0.86	HO <sub>2</sub> +OH = H <sub>2</sub> O+O <sub>2</sub> 0.32	CH <sub>2</sub> OH+H = HCO+H <sub>2</sub> 0.16	HCO+HO <sub>2</sub> = CO <sub>2</sub> +H+OH 0.12
CH <sub>2</sub> O+HO <sub>2</sub> = HCO+H <sub>2</sub> O <sub>2</sub> 0.53	H+HO <sub>2</sub> = H <sub>2</sub> +O <sub>2</sub> 0.30	HCO(+M) = H+CO(+M) 0.16	HO <sub>2</sub> +H = OH+OH 0.12
CH <sub>2</sub> O+O <sub>2</sub> = HCO+HO <sub>2</sub> 0.43	HCO+O <sub>2</sub> = CO+HO <sub>2</sub> 0.29	CH <sub>3</sub> +HO <sub>2</sub> = CH <sub>3</sub> +O <sub>2</sub> 0.15	HO <sub>2</sub> +OH = H <sub>2</sub> O+O <sub>2</sub> 0.12
CH <sub>2</sub> O+H = HCO+H <sub>2</sub> 0.42	H+OH+M = H <sub>2</sub> O+M 0.23	HO <sub>2</sub> +HO <sub>2</sub> = H <sub>2</sub> O <sub>2</sub> +O <sub>2</sub> 0.15	HO <sub>2</sub> +HO <sub>2</sub> = H <sub>2</sub> O <sub>2</sub> +O <sub>2</sub> 0.11
H+O <sub>2</sub> = O+OH 0.41	H+O <sub>2</sub> (+M) = HO <sub>2</sub> (+M) 0.23	OH+CH <sub>3</sub> (+M) = CH <sub>3</sub> OH(+M) 0.15	HCO(+M) = H+CO(+M) 0.11
HCO+O <sub>2</sub> = CO+HO <sub>2</sub> 0.40	HCO+OH = CO+H <sub>2</sub> O 0.18		CH <sub>2</sub> OH+O <sub>2</sub> = CH <sub>2</sub> O+HO <sub>2</sub> 0.11
CH <sub>2</sub> O+M = HCO+H+M 0.32	CH <sub>2</sub> O+M = CH <sub>2</sub> O+H+M 0.18		HCO+H = CO+H <sub>2</sub> 0.11
OH+OH(+M) = H <sub>2</sub> O <sub>2</sub> (+M) 0.23	OH+OH(+M) = H <sub>2</sub> O <sub>2</sub> (+M) 0.17		HO <sub>2</sub> +HO <sub>2</sub> = H <sub>2</sub> O <sub>2</sub> +O <sub>2</sub> 0.10
HCO+H = CO+H <sub>2</sub> 0.18	CH <sub>3</sub> OH+H = CH <sub>3</sub> OH+H <sub>2</sub> 0.16		
CH <sub>2</sub> O+OH = HCO+H <sub>2</sub> O 0.16	OH+H <sub>2</sub> = H+H <sub>2</sub> O 0.15		
CH <sub>2</sub> OH+HCO = CH <sub>2</sub> O+CH <sub>2</sub> O 0.15	HCO+H = CO+H <sub>2</sub> 0.14		
CH <sub>2</sub> O+M = CO+H <sub>2</sub> +M 0.13			
CH <sub>2</sub> O+O = HCO+OH 0.12			
CH <sub>2</sub> O+CH <sub>3</sub> = HCO+CH <sub>4</sub> 0.10			
H+HO <sub>2</sub> = H <sub>2</sub> +O <sub>2</sub> 0.10			
CH <sub>2</sub> OH+M = CH <sub>2</sub> O+H+M 0.10			

Legend: Optimized reactions (this work)  
Already optimized H<sub>2</sub>/CO reactions  
Not optimized reactions



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## Mechanism optimization

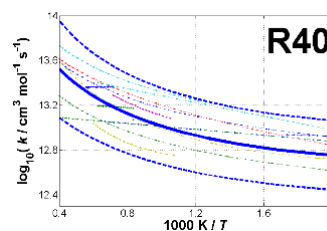


- 57 Arrhenius parameters of 17 reactions optimized

No.	Reaction	$f_{\text{prior}}$
R14/R15	$\text{HO}_2 + \text{HO}_2 = \text{H}_2\text{O}_2 + \text{O}_2$	0.30–0.70
R37 LPL	$\text{CH}_2\text{O} + \text{M} = \text{CO} + \text{H}_2 + \text{M}$	0.50
R38	$\text{CH}_2\text{O} + \text{H} = \text{HCO} + \text{H}_2$	0.60
R40	$\text{CH}_2\text{O} + \dot{\text{O}}\text{H} = \text{HCO} + \text{H}_2\text{O}$	0.34–0.43
R41	$\text{CH}_2\text{O} + \text{O}_2 = \text{HCO} + \text{HO}_2$	1.20
R47	$\dot{\text{C}}\text{H}_3 + \text{HO}_2 = \text{CH}_3\dot{\text{O}} + \dot{\text{O}}\text{H}$	0.46–0.76
R53	$\dot{\text{C}}\text{H}_3 + \text{HO}_2 = \text{CH}_4 + \text{O}_2$	1.00
R60	$\dot{\text{C}}\text{H}_2\text{OH} + \text{O}_2 = \text{CH}_2\text{O} + \text{HO}_2$	0.50
R67 LPL	$\text{CH}_3\dot{\text{O}} + \text{M} = \text{CH}_2\text{O} + \text{H} + \text{M}$	0.84–1.24
R77 HPL	$\dot{\text{O}}\text{H} + \dot{\text{C}}\text{H}_3 = \text{CH}_3\text{OH}$	0.34–0.84
R77 LPL	$\dot{\text{O}}\text{H} + \dot{\text{C}}\text{H}_3 + \text{M} = \text{CH}_3\text{OH} + \text{M}$	1.20
R80	$\text{CH}_3\text{OH} + \text{H} = \dot{\text{C}}\text{H}_2\text{OH} + \text{H}_2$	0.44–1.07
R81	$\text{CH}_3\text{OH} + \text{H} = \text{CH}_3\dot{\text{O}} + \text{H}_2$	1.70
R83	$\text{CH}_3\text{OH} + \dot{\text{O}}\text{H} = \text{CH}_3\dot{\text{O}} + \text{H}_2\text{O}$	0.70
R84	$\text{CH}_3\text{OH} + \dot{\text{O}}\text{H} = \dot{\text{C}}\text{H}_2\text{OH} + \text{H}_2\text{O}$	0.46–0.87
R85	$\text{CH}_3\text{OH} + \text{O}_2 = \dot{\text{C}}\text{H}_2\text{OH} + \text{HO}_2$	0.80
R87	$\text{CH}_3\text{OH} + \text{HO}_2 = \dot{\text{C}}\text{H}_2\text{OH} + \text{H}_2\text{O}_2$	1.10
R88	$\text{CH}_3\text{OH} + \text{HO}_2 = \text{CH}_3\dot{\text{O}} + \text{H}_2\text{O}_2$	0.70

Temperature-dependent **prior uncertainty limits** from direct rate coefficient measurements and theoretical studies of the rate coefficient (method of Nagy *et al.*)

T. Nagy; É. Valkó; I. Sedyó; I. Gy. Zsély; M. J. Pilling; T. Turányi, *Combust. Flame* 162 (2015) 2059–2076



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## Mechanism optimization



- **Optimization targets:**
  - 517 Shock tube, 59 RCM ignition delay points
  - 153 Laminar burning velocity points
  - 2,508 Flow reactor species concentration points
  - 706 Jet-stirred reactor species concentration points
  - 20,460 Shock tube species concentration points
  - 926 Direct measurements of reaction rate coefficients
  - 33 Theoretical determinations of reaction rate coefficients
- **Polynomial surrogate model** (“response surfaces”) used for computationally expensive **flame simulations**
- **Hierarchical optimization strategy:** Step-by-step inclusion of reactions and optimization targets



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## Mechanism optimization results



No.	Reaction	$f_{\text{prior}}$	$f_{\text{posterior}}$	$f_{\text{posterior+H2/CO}}$	
R14/R15	$\text{H}\dot{\text{O}}_2 + \text{H}\dot{\text{O}}_2 = \text{H}_2\text{O}_2 + \text{O}_2$	0.30–0.70	0.08–0.71	0.09–0.57	↘
R37 LPL	$\text{CH}_2\text{O} + \text{M} = \text{CO} + \text{H}_2 + \text{M}$	0.50	0.09–0.12	0.09–0.12	→
R38	$\text{CH}_2\text{O} + \text{H} = \text{HCO} + \text{H}_2$	0.60	0.08–0.10	0.09–0.11	→
R40	$\text{CH}_2\text{O} + \dot{\text{O}}\text{H} = \text{HCO} + \text{H}_2\text{O}$	0.34–0.43	0.22–0.30	0.19–0.27	↘
R41	$\text{CH}_2\text{O} + \text{O}_2 = \text{HCO} + \text{H}\dot{\text{O}}_2$	1.20	0.19–0.20	0.18–0.20	→
R47	$\dot{\text{C}}\text{H}_3 + \text{H}\dot{\text{O}}_2 = \text{CH}_3\text{O} + \dot{\text{O}}\text{H}$	0.46–0.76	0.26–0.49	0.26–0.38	↘
R53	$\dot{\text{C}}\text{H}_3 + \text{H}\dot{\text{O}}_2 = \text{CH}_4 + \text{O}_2$	1.00	0.25–0.45	0.25–0.32	↘
R60	$\dot{\text{C}}\text{H}_2\text{OH} + \text{O}_2 = \text{CH}_2\text{O} + \text{H}\dot{\text{O}}_2$	0.50	0.27–0.38	0.27–0.33	↘
R67 LPL	$\text{CH}_3\dot{\text{O}} + \text{M} = \text{CH}_2\text{O} + \text{H} + \text{M}$	0.84–1.24	0.16–0.26	0.16–0.21	→
R77 HPL	$\dot{\text{O}}\text{H} + \dot{\text{C}}\text{H}_3 = \text{CH}_3\text{O}\text{H}$	0.34–0.84	0.20–0.31	0.19–0.28	↘
R77 LPL	$\dot{\text{O}}\text{H} + \dot{\text{C}}\text{H}_3 + \text{M} = \text{CH}_3\text{O}\text{H} + \text{M}$	1.20	0.07–0.39	0.07–0.27	↘
R80	$\text{CH}_3\text{O}\text{H} + \text{H} = \dot{\text{C}}\text{H}_2\text{OH} + \text{H}_2$	0.44–1.07	0.18–0.27	0.17–0.24	→
R81	$\text{CH}_3\text{O}\text{H} + \text{H} = \text{CH}_3\text{O} + \text{H}_2$	1.70	0.24–0.38	0.24–0.31	→
R83	$\text{CH}_3\text{O}\text{H} + \dot{\text{O}}\text{H} = \text{CH}_3\dot{\text{O}} + \text{H}_2\text{O}$	0.70	0.13–0.44	0.12–0.25	↘
R84	$\text{CH}_3\text{O}\text{H} + \dot{\text{O}}\text{H} = \dot{\text{C}}\text{H}_2\text{OH} + \text{H}_2\text{O}$	0.46–0.87	0.19–0.41	0.18–0.40	→
R85	$\text{CH}_3\text{O}\text{H} + \text{O}_2 = \dot{\text{C}}\text{H}_2\text{OH} + \text{H}\dot{\text{O}}_2$	0.80	0.78–1.01	0.72–0.91	↘
R87	$\text{CH}_3\text{O}\text{H} + \text{H}\dot{\text{O}}_2 = \dot{\text{C}}\text{H}_2\text{OH} + \text{H}_2\text{O}_2$	1.10	0.20–0.25	0.16–0.21	↘
R88	$\text{CH}_3\text{O}\text{H} + \text{H}\dot{\text{O}}_2 = \text{CH}_3\dot{\text{O}} + \text{H}_2\text{O}_2$	0.70	0.15–0.42	0.15–0.26	↘

When also considering all sensitive H<sub>2</sub>/CO reactions:

R01	$\text{H} + \text{O}_2 = \dot{\text{O}} + \dot{\text{O}}\text{H}$
R03	$\dot{\text{O}}\text{H} + \text{H}_2 = \text{H} + \text{H}_2\text{O}$
R08 LPL	$\text{H} + \dot{\text{O}}\text{H} + \text{M} = \text{H}_2\text{O} + \text{M}$
R09 LPL	$\text{H} + \text{O}_2 + \text{M} = \text{H}\dot{\text{O}}_2 + \text{M}$
R10	$\text{H} + \text{H}\dot{\text{O}}_2 = \text{H}_2 + \text{O}_2$
R11	$\text{H}\dot{\text{O}}_2 + \text{H} = \dot{\text{O}}\text{H} + \dot{\text{O}}\text{H}$
R13	$\text{H}\dot{\text{O}}_2 + \dot{\text{O}}\text{H} = \text{H}_2\text{O} + \text{O}_2$
R16 LPL	$\dot{\text{O}}\text{H} + \dot{\text{O}}\text{H} + \text{M} = \text{H}_2\text{O}_2 + \text{M}$
24	$\text{CO} + \dot{\text{O}}\text{H} = \text{CO}_2 + \text{H}$
R25	$\text{CO} + \text{H}\dot{\text{O}}_2 = \text{CO}_2 + \dot{\text{O}}\text{H}$
R26 LPL	$\text{HCO} + \text{M} = \text{H} + \text{CO} + \text{M}$
R28	$\text{HCO} + \text{H} = \text{CO} + \text{H}_2$

and the corresponding H<sub>2</sub>/CO data

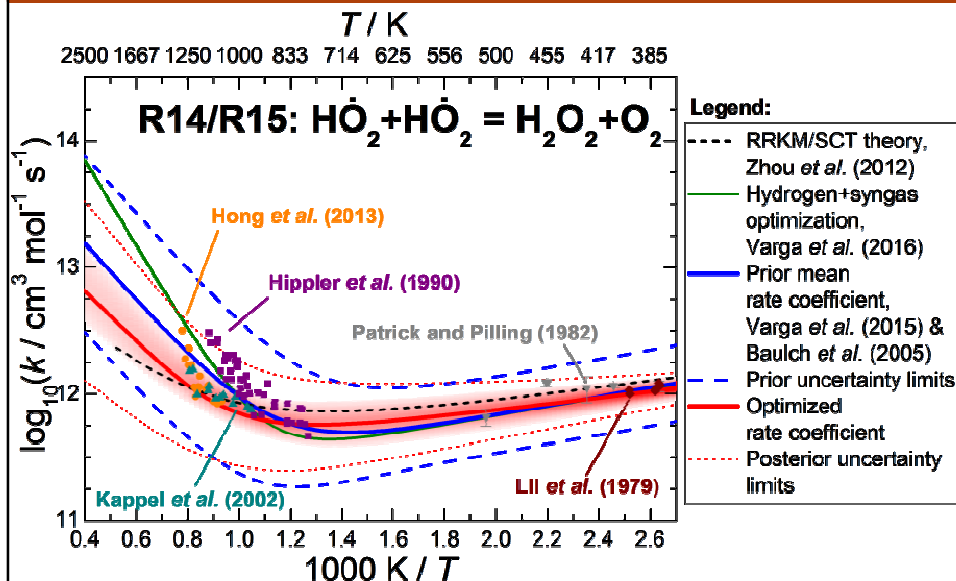


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## Arrhenius plots (I)

Prior and posterior uncertainty ranges

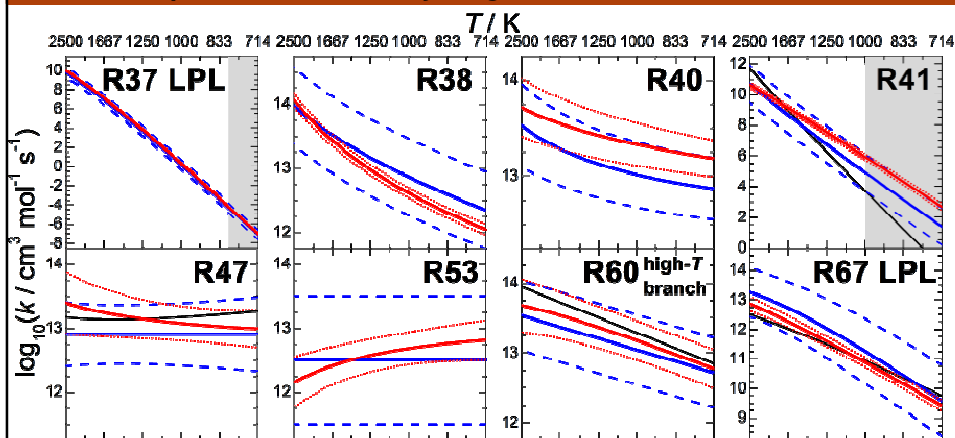


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## Arrhenius plots (II)

Prior and posterior uncertainty ranges



### List of reactions:

R37 LPL  $\text{CH}_2\text{O} + \text{M} = \text{CO} + \text{H}_2 + \text{M}$  R38  $\text{CH}_3\text{O} + \text{H} = \text{HCO} + \text{H}_2$  R40  $\text{CH}_2\text{O} + \text{OH} = \text{HCO} + \text{H}_2\text{O}$  R41  $\text{CH}_2\text{O} + \text{O}_2 = \text{HCO} + \text{HO}_2$   
 R47  $\text{CH}_2 + \text{HO}_2 = \text{CH}_2\text{O} + \text{OH}$  R53  $\text{CH}_2 + \text{HO}_2 = \text{CH}_2 + \text{O}_2$  R60  $\text{CH}_3\text{OH} + \text{O}_2 = \text{CH}_2\text{O} + \text{HO}_2$  R67 LPL  $\text{CH}_2\text{O} + \text{M} = \text{CH}_2\text{O} + \text{H} + \text{M}$

**Legend:** — Prior mean rate coefficient — Optimized rate coefficient — Li-2007 mechanism (if differing from —)  
 - - - Prior uncertainty limits ..... Posterior uncertainty limits



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## Mechanism comparison results

Error function values for each type of data and overall



Mechanism	Average error function value						Overall
	Ignition delay times		Burning velocities		Concentration profiles		
	$\text{CH}_3\text{OH}$	$\text{CH}_2\text{O}$	$\text{CH}_3\text{OH}$	$\text{CH}_3\text{CH}$	$\text{CH}_3\text{OH}$	$\text{CH}_2\text{C}$	
AAU-2008	28.4	2.6	no transport		21.3	18.9	—
Alzueta-2001	103.9 <sup>a</sup>	11.3	no transport		32.1	15.9	—
Christensen-2016	35.4	3.3	5.2		15.7	8.4	<b>16.3</b>
Hamdane-2012	41.2	6.4	(72.2)		109.6	12.9	<b>(59.8)</b>
Klippenstein-2011	131.8	3.4	1.7		14.9	6.4	<b>41.5</b>
Li-2007	7.6	3.4	1.9		14.8	6.4	<b>6.9</b>
Rasmussen-2008	32.2	5.2	17.9		40.9	12.3	<b>25.3</b>
CaltechMech2.3-2015	51.4	2.5	3.0		15.9	6.4	<b>19.7</b>
Johnson-2009	11.8	10.9	no transport		19.9	13.1	—
Kathrotia-2011	10.7	8.2	[3.0]		60.9	43.0	<b>[23.6]</b>
Konnov-2009	54.6	7.5	[76.0]		25.6 <sup>b</sup>	37.2	<b>[51.7]<sup>b</sup></b>
Leplat-2011	410.5 <sup>a</sup>	6.1	22.2		52.6	38.1	<b>131.6<sup>a</sup></b>
Marinov-1999	260.7	20.7	(14.1)		36.7	30.4	<b>(90.4)</b>
SanDiego-2014	24.7	1.6	3.8		31.4	10.0	<b>16.2</b>
SaxenaWilliams-2007	86.2	1.7	2.3		17.3	9.6	<b>30.0</b>
USC-II-2007	602.8 <sup>a</sup>	2.3	(8.5)		27.8	19.1	<b>(178.4)<sup>a</sup></b>
Aramco1.3-2013	(41.3)	(11.1)	(4.3)		(16.0)	(12.7)	<b>(18.6)</b>
NUIG-16.09-2016	(51.6)	(11.0)	(4.2)		(20.0)	(12.4)	<b>(22.2)</b>
<b>Initial mechanism</b>	<b>8.1</b>	<b>2.3</b>	<b>2.1</b>		<b>15.1</b>	<b>12.4</b>	<b>8.1</b>
<b>Optimized mechanism</b>	<b>6.8</b>	<b>2.0</b>	<b>1.6</b>		<b>12.0</b>	<b>6.3</b>	<b>5.9</b>
<b>No. of data sets</b>	<b>74</b>	<b>7</b>	<b>87</b>		<b>54</b>	<b>43</b>	<b>265</b>
<b>No. of data points</b>	<b>475</b>	<b>99</b>	<b>632</b>		<b>15,363</b>	<b>8,331</b>	<b>24,900</b>

$$E = \frac{1}{N} \sum_{i=1}^N \frac{1}{N_i} \sum_{j=1}^{N_i} \left( \frac{Y_{ij}^{\text{mod}} - Y_{ij}^{\text{exp}}}{\sigma(Y_{ij}^{\text{exp}})} \right)^2$$

$E = 9$ : data can be described within a  $3\sigma$  uncertainty

**Improvement for all types of data!**

<sup>a</sup> Some RCM simulation results could not be obtained. Numbers shown are for the remaining data

<sup>b</sup>  $\text{CH}_2$  profiles cannot be captured by the mechanism. Results shown do not include those profiles

— Some simulation results could not be obtained or transport data were not available



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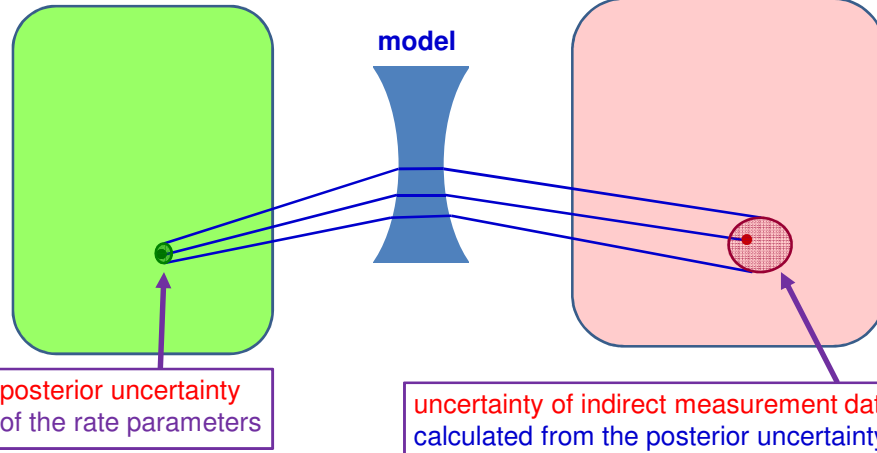
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## Result of parameter optimisation



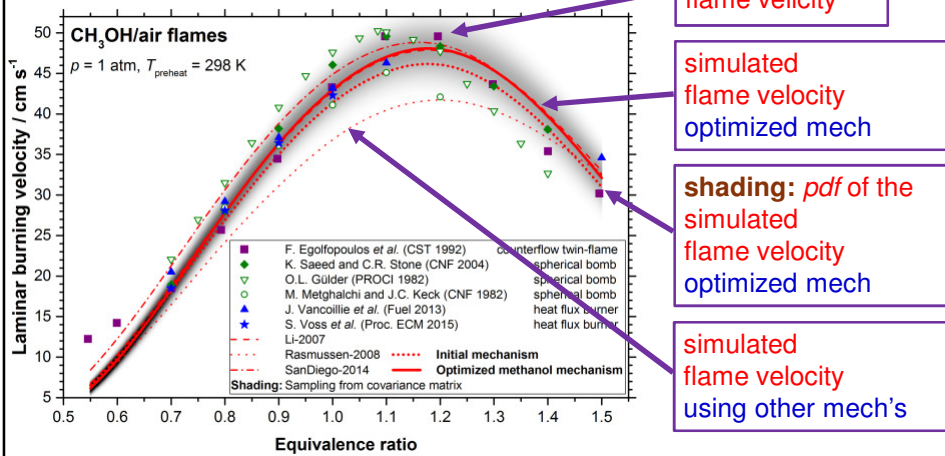
space of rate parameters

space of simulation results



## Comparison of simulation results

Propagation of rate coefficient posterior uncertainties



## Summary



- **New optimized mechanism** for **methanol** and **formaldehyde combustion** simulations
- **Best reproduction** of indirect experimental data, while optimized rate coefficients are **consistent with direct measurements** and **theoretical calculations** within their uncertainty limits
- Determination of the **posterior uncertainty domain** of the rate parameters



## ReSpecTh information web site



**All computer codes for chemical kinetic optimisation and uncertainty quantification;**  
**all direct and indirect data files**

**are freely available at web site** <http://respecth.hu/>

Reaction kinetics, high-resolution molecular spectroscopy, and thermochemistry data

### RESPECTH



#### What is RESPECTH?

RESPECTH is an information system of the MTA-ELTE Complex Chemical Systems Research Group, prepared in collaboration with the Laboratory of Molecular Structure and Dynamics and the Chemical Kinetics Laboratory research laboratories of the Institute of Chemistry, Eötvös University, Budapest, Hungary.

If you are interested in data from reaction kinetics (Re), spectroscopy (Spec), or thermochemistry (Th), please click on RE, SPEC, or TH, respectively.

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## Thank you for your attention!



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