

# Uncertainty of experimental data and model parameters

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CYPHER COST Action

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optimization, and reduction of combustion kinetic mechanisms*

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# Using thermodynamics data in combustion simulations

$\Delta H_f$   $\Rightarrow$  calculation of heat production in a reacting mixture  
     $\rightarrow$  calculation of temperature changes  
 $\Rightarrow$  calculation of  $\Delta_r G^\ominus$

$c_p$   $\Rightarrow$  calculation of temperature changes

$S_m$   $\Rightarrow$  calculation of  $\Delta_r G^\ominus = \Delta_r H^\ominus - T\Delta_r S^\ominus$   
     $\rightarrow$  calculation of the equilibrium constant  
     $\rightarrow$  calculation of the rate coefficient of reverse reactions

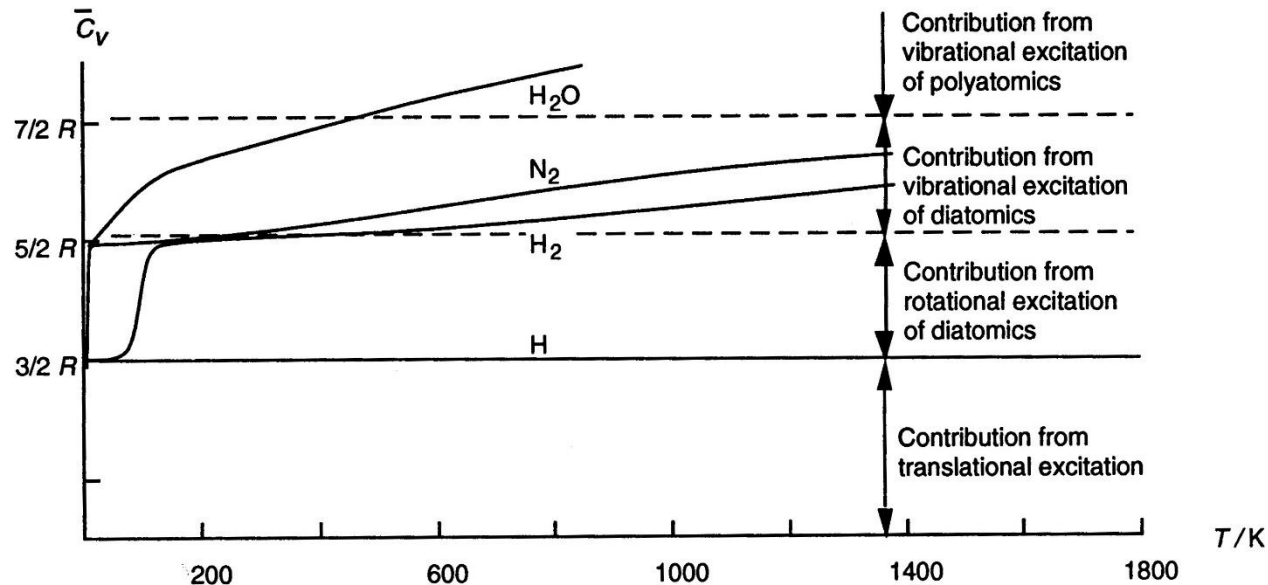
# Temperature dependence of thermodynamic data

## NASA polynomials

$$\frac{H^\theta}{RT} = a_1 + \frac{a_2}{2} T + \frac{a_3}{3} T^2 + \frac{a_4}{4} T^3 + \frac{a_5}{5} T^4 + \frac{a_6}{T}$$

$$\frac{c_p}{R} = a_1 + a_2 T + a_3 T^2 + a_4 T^3 + a_5 T^4$$

$$\frac{S^\theta}{R} = a_1 \ln T + a_2 T + \frac{a_3}{2} T^2 + \frac{a_4}{3} T^3 + \frac{a_5}{4} T^4 + a_7$$



# Uncertainty of thermodynamic data

thermodynamic data influence the reaction kinetic calculations in two ways:

- Calculated temperature
- Calculation of the rate coefficients of backward reaction steps

Thermodynamic data used:

- heat capacity (can be calculated using statistical thermodynamics)
- entropy (can be calculated using statistical thermodynamics)
- standard enthalpy of formation (measurement or high level calculation)



- The databases contain the recommended values and variances
- Are the enthalpies of formation correlated?

# Uncertainty of thermodynamics data

$c_p$  and  $S_m$  can be calculated from the IR spectrum  
using methods of statistical thermodynamics

$\Delta H_f$  - can be computed using high level theoretical chemistry methods  
(for small molecules only; not easy)

- can be determined experimentally by

- measuring the equilibrium constant of a reaction  
→ reaction enthalpy → enthalpy of formation
- measuring ionization energy by mass spectrometry

# Uncertainty of thermodynamic data 2

Typical uncertainty of  $\Delta H_f$  ( $1\sigma$ ):

molecules and small radicals: 0.1-0.5 kJ/mole

e.g. CO= 0.17 kJ/mole, CH<sub>4</sub>= 0.4 kJ/mole, CH<sub>3</sub>=0.4 kJ/mole

large radicals: 1.0 – 5.0 kJ/mole

e.g. HO<sub>2</sub>= 3.35 kJ/mole, CH<sub>2</sub>OH= 4.2 kJ/mole

less known radicals: 8-10 kJ/mole

e.g. HCCO= 8.8 kJ/mole, CH<sub>2</sub>HCO= 9.2 kJ/mole

Most thermodynamics databases contain „uncertainty limits”,  
which can be interpreted as  $2\sigma$  uncertainties.

# Uncertainty of thermodynamic data 3

Question: Reaction enthalpy is changed by 1 kJ mole<sup>-1</sup>

What is the consequence on the calculated equilibrium constant?

Answer:  $\Delta_r H$  is changed by 1 kJ mol<sup>-1</sup>

$\Delta_r S$  is assumed to be accurate  $\Rightarrow$

$$\Delta_r G = \Delta_r H - T \Delta_r S \Rightarrow \Delta_r G \text{ is also changed by 1 kJ mole}^{-1}$$

$$-\Delta_r G = RT \ln K$$

$$-\Delta_r G - (-\Delta_r G') = 1 \text{ kJ mole}^{-1} = RT \ln K - RT \ln K' = RT \ln (K/K')$$

$$1000 \text{ J mole}^{-1} = 8.3145 \text{ J mole}^{-1} \text{ K}^{-1} \times 2000 \text{ K} \ln (K/K')$$

$$K/K' = 1.062$$

1 kJ mole<sup>-1</sup> change in  $\Delta_r H \Rightarrow 6.2\%$  change of  $K$

# Determination of the enthalpies of formation

Methods for the determination of enthalpies of formation  $\Delta H_f$  :

1) direct calorimetry experimental determination

calorimetry; synthesis from reference state elements



2) direct experimental determination from MS ionization energies

applicable for few compounds only; not very accurate

3) direct theoretical calculation

high level *ab initio* method required: accurate for small molecules only

4) traditional indirect method

indirectly from experimentally measured reaction enthalpies  $\Delta_r H^\ominus$

determination of  $\Delta H_f$  after a chain of calculations



# Determination of the enthalpies of formation 2

„4) determination of  $\Delta H_f$  after a chain of calculations”

- starting from directly determined  $\Delta H_f$  values

$$\Delta_r H^\theta = \sum_j \nu_j H_f^\theta(j)$$

a) combining it with a  $\Delta_r H^\theta$  value provides a new  $\Delta H_f^\theta$  value

⇒ indirectly determined  $\Delta H_f^\theta$

b) GO TO a)      until we get the required  $\Delta H_f^\theta$

⇒ the chain of calculation provides the required  $\Delta H_f^\theta$

## PROBLEMS:

- Going on in the chain of calculations, the errors are accumulated

$\Delta H_f^\theta$  values at the end of a long chain are not very accurate.

-  $\Delta H_f^\theta$  values for the same species can be obtained at the ends of two different calculation chains ⇒ different  $\Delta H_f^\theta$  values are obtained ?????

# Active Thermochemical Tables (ATcT)

Idea of Branko Ruscic (Argonne National Lab) <http://atct.anl.gov/>

the determination of many enthalpies of formation  $\Delta H_f^\theta$  in one step:

using  $n$  direct experimental determination:  $H_f^\theta(j) = A_j \quad j = 1, \dots, n$

using  $m$  measured  $\Delta_r H^\theta$  values:  $\Delta_r H_i^\theta = \sum_j \nu_{ij} H_f^\theta(j) \quad j = n+1, \dots, n+m$

The aim is the determination of  $k$  values of  $\Delta H_f^\theta$ :

- if  $k > n+m \Rightarrow$  not enough info
- if  $k < n+m \Rightarrow$  overdetermined linear algebraic system of equations  
 $\Rightarrow$  determination of the  $\Delta H_f^\theta$  values by the least squares method

If the errors of the measurements are also taken into account

$\Rightarrow$  **weighted least squares method**

B. Ruscic, R. E. Pinzon, M. L. Morton, G. von Laszewski, S. J. Bittner, S. G. Nijssure, K. A. Amin, M. Minkoff, A. F. Wagner: Introduction to Active Thermochemical Tables: Several „key“ enthalpies of formation revisited. *J. Phys. Chem. A* **108**, 9979-9997 (2004)

# Active Thermochemical Tables (ATcT) 2

## NOTES:

The reason of the name: the original idea was that the tables would be „active”: on a Web site adding new measurement data all enthalpies of formation would be recalculated.

It never worked this way: Dr. Ruscic is continuously adding new measurements and sometimes publishes  $\Delta_f H^\theta$  values.

Please observe the **similarity** and **difference** between ATcT and the optimization of kinetic reaction mechanisms:

- using both direct and indirect measurements
- the error of measurements is used for the calculation of the uncertainty of parameters
- **ATcT**: the simulated data are a linear functions of the parameters
- kinetics**: the simulated data are obtained by solving ODEs or PDEs (strongly nonlinear functions of parameters)

B. Ruscic, R. E. Pinzon, G. von Laszewski, D. Kodeboyina, A. Burcat, D. Leahy, D. Montoya, A. F. Wagner, Active Thermochemical Tables: Thermochemistry for the 21st Century. *J. Phys. Conf. Ser.* **16**, 561-570 (2005)

# Network of computed reaction enthalpies to atom-based thermochemistry (NEAT)

Quantum chemically computed 0 K reaction enthalpies are determined, and these data yield an overdetermined linear system of equations for 0 K enthalpies of formation for the species. These enthalpies are calculated using a weighted, linear least-squares approximation, providing internally consistent enthalpies of formation. Different quantum chemical approximations have different sources of error; thus, the reaction enthalpies computed this way have “random” residual errors.

Species	NEAT	ATcT
H <sub>2</sub> O	918.034(150)	917.83(3)
C <sub>2</sub> H <sub>2</sub>	1625.826(360)	1626.16(24)
CH	334.675(150)	334.66(23)
NH <sub>3</sub>	1157.341(290)	1157.25(4)
CO	1071.936(260)	1072.13(9)
CH <sub>3</sub>	1209.576(280)	1209.63(13)
CH <sub>2</sub>	752.409(200)	752.70(26)
OH	425.84(150)	425.62(3)
CO <sub>2</sub>	1597.927(370)	1598.27(9)

enthalpies of formation  
at 0 K (kJ mol<sup>-1</sup>)

**The ReSpecTh / Th website contains computed reaction enthalpies for 355 reactions. This dataset was used to determine 0 K enthalpies of formation for 188 species.**

Császár, A. G. & Furtenbacher, T.: From a network of computed reaction enthalpies to atom-based thermochemistry (NEAT), *Chem. Eur. J.*, **16**, 4826–4835 (2010).

# Internet sources of thermochemical data

## Burcat's Thermodynamic Data

This database was originally published on Prof. Alexander Burcat's Technion Web site. It was continuously updated till July 2023. The Chemkin-II thermo database was based on the Burcat collection. ReSpecTh contains a mirror of the last version of the original site + added search services. NASA polynomials are provided!

<https://respecth.elte.hu/burcat.php>

## NIST Chemistry WebBook

Thermochemical data for over 7000 organic and small inorganic compounds (enthalpy of formation, heat capacity, entropy)  
temperature dependence: yes, NASA polynomials: no

<https://webbook.nist.gov/>

## Caltech's Thermodynamic Data collection

Data collected from NIST-JANAF Tables, NIST Chemistry Webbook, NASA CEA (Chemical Equilibrium Computation) website, DLR website, ANL ATcT website.

<https://shepherd.caltech.edu/EDL/PublicResources/sdt/thermo>

# Internet sources of thermochemical data 2

## Ruscic's Active Thermochemical Tables / Argonne National Laboratory

ATcT enthalpies of formation based on  
version 1.220 of the Thermochemical Network (as of 03/26/2025).

0 K and 298.15 K enthalpies of formation for 3444 species.

„As opposed to traditional sequential thermochemistry, where the provenance of a given enthalpy of formation is typically a single measurement, the provenances of ATcT enthalpies of formation are obtained by analysing and solving a large Thermochemical Network”

- entropy and heat capacity values are not provided
- NASA polynomials are not provided
- the covariance matrix of the enthalpies of formation is calculated, but not published (only the diagonal elements)

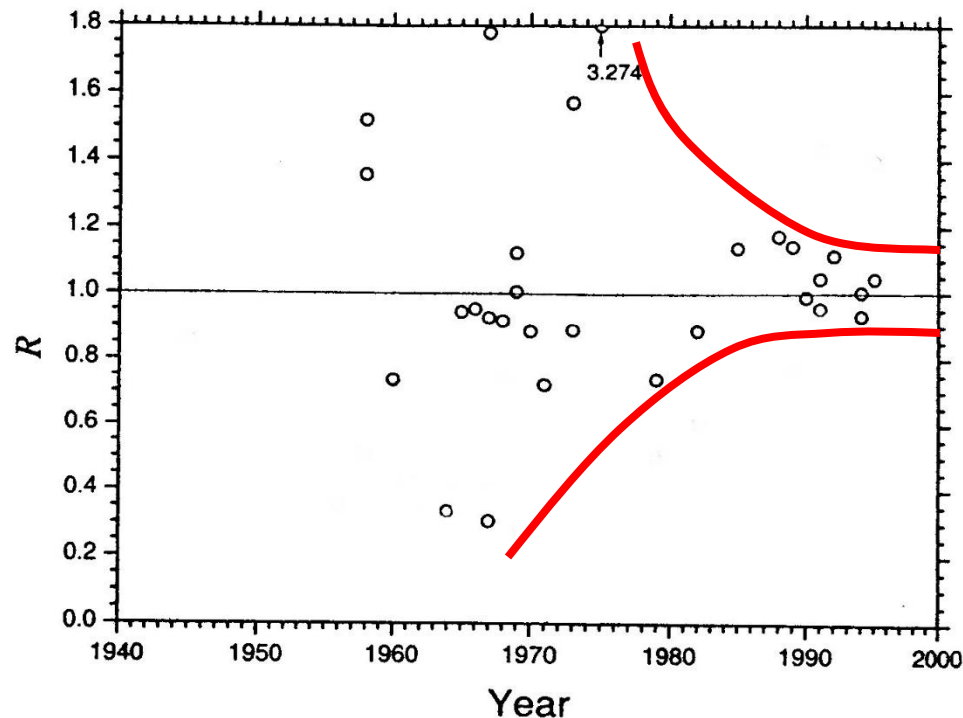
<https://atct.anl.gov/>

# Few reaction rate coefficients are known

rate coefficients of about 300 reaction steps is well known

(with accuracy of about  $\pm 30\%$ )

although in a combustion mechanism several hundred/thousand reaction steps are present



rate coefficient of reaction  $\text{H} + \text{O}_2 \rightarrow \text{OH} + \text{O}$  vs. year of measurement

# Why is the quantitative modelling of combustion systems possible?

- **many common reactions**

there are many common reactions in the combustion mechanisms of basic fuels; these rate coefficients are known



- **chemical compounds with similar structures**

if the rate coefficient is known for a given compound the rate coefficient for a similar compound can be estimated

- **Only a small fraction of the rate parameters determine the simulation results**

(these parameters can be identified with sensitivity analysis)

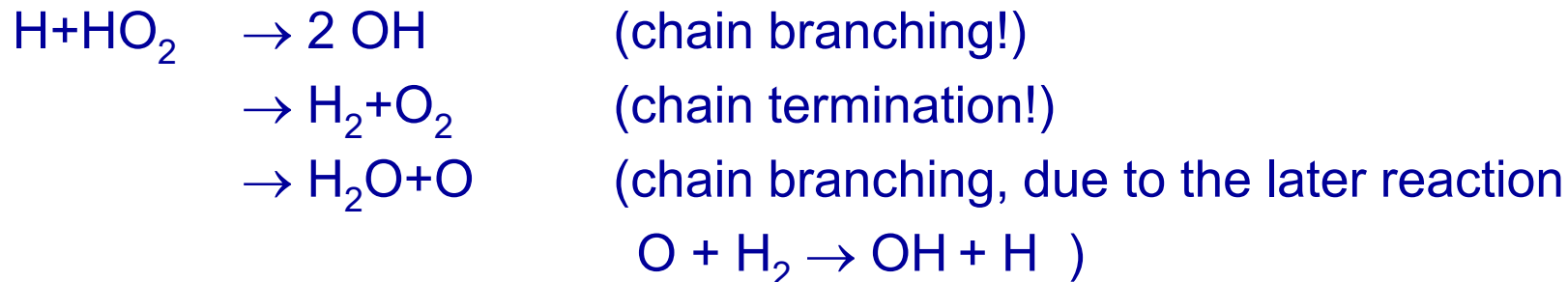


# Features of rate coefficient data

- ⊖ many measurements only near 300 K  
(atmospheric chemistry measurements,  
easier to measure at room temperature,  
less data at high temperature)
- ⊖ The rate coefficients of radical recombination reactions  
(e.g.  $2 \text{CH}_3 + \text{M} \leftrightarrow \text{C}_2\text{H}_6 + \text{M}$ )  
may depend on the the pressure and bath gas,  
but usually few data are available for the  
 $p$  and third body dependence
- ⊖ multichannel reactions  
only the rate coefficient of the overall reaction is known  
for many reactions  
(sum of the rate coefficients of the individual channels)  
frequently the individual rate coefficients / branching ratios are not known

# Multichannel reactions

example:



The change of branching ratio with temperature have a high influence on the rate of overall reaction

„energy barrier is not discriminative at high temperature”

low temperature:

the channel with the lowest activation energy is fast

high temperature:

no simple rule for the preferred channels

# Source of high-temperature chemical kinetics data

measured and calculated  
chemical kinetic data



journal publications

data compilation



books. data bases.  
e.g. **NIST database**  
[www.nist.gov](http://www.nist.gov)

data evaluation  
reevaluation and comparison  
of several articles



review articles

evaluated/recommended data

# NIST Chemical Kinetics Database

[www.nist.gov](http://www.nist.gov)

⇒ Databases ⇒ Chemical Kinetics

⇒ NIST Chemical Kinetics Online (<http://kinetics.nist.gov/kinetics/>)

NIST Chemical Kinetics Database

11.700 gas phase reactions

38.000 data entry

12.000 referenced articles

The screenshot shows the NIST Scientific and Technical Databases homepage. At the top, there is a blue banner with the NIST logo and the text "NIST Scientific and Technical Databases". Below the banner, there is a search bar with the text "SEARCH OUR WEBSITE" and a "SEARCH" button. On the left side, there is a vertical list of database categories: Analytical Chemistry, Atomic and Molecular Physics, Biometrics, Biotechnology, Chemical and Crystal Structure, Chemical Kinetics, Chemistry, Communications, Construction, and Environmental Data. The "Chemical Kinetics" category is highlighted in green. To the right of the list, there is a section titled "Chemical Kinetics" with a green header. The text below the header describes the NIST Program on Chemical Kinetics and mentions that the new web version of the database is located at [kinetics.nist.gov/index.php](http://kinetics.nist.gov/index.php). At the bottom, there is a table with two columns: "Code" and "Description". The table contains three rows: "PC" (Product, most available for purchase, some are free), "Online" (Free online system), and "Incl" (Inclusion in the NIST Data Gateway - a portal providing access to many NIST scientific and technical data).

Code	Description
PC	Product, most available for purchase, some are free
Online	Free online system
Incl	Inclusion in the NIST Data Gateway - a portal providing access to many NIST scientific and technical data

The screenshot shows the "Chemical Kinetics Database on the Web" homepage. At the top, there is a blue banner with the NIST logo and the text "NIST National Institute of Standards and Technology". Below the banner, there is a search bar with the text "SEARCH OUR WEBSITE" and a "SEARCH" button. On the left side, there is a vertical list of database categories: Analytical Chemistry, Atomic and Molecular Physics, Biometrics, Biotechnology, Chemical and Crystal Structure, Chemical Kinetics, Chemistry, Communications, Construction, and Environmental Data. The "Chemical Kinetics" category is highlighted in green. To the right of the list, there is a section titled "Chemical Kinetics Database on the Web" with a green header. The text below the header describes the NIST Program on Chemical Kinetics and mentions that the new web version of the database is located at [kinetics.nist.gov/index.php](http://kinetics.nist.gov/index.php). At the bottom, there is a table with two columns: "Code" and "Description". The table contains three rows: "PC" (Product, most available for purchase, some are free), "Online" (Free online system), and "Incl" (Inclusion in the NIST Data Gateway - a portal providing access to many NIST scientific and technical data).

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# NIST Chemical Kinetics Database 2

**Author(s):** Gierczak. T.; Talukdar. R.K.; Herndon. S.C.; Vaghjiani. G.L.

Ravishankara. A.R.

**Title:** Rate coefficients for the reactions of hydroxyl radicals with methane and deuterated methanes

**Journal:** J. Phys. Chem. A:

**Volume:** 101

**Page(s):** 3125 - 3134

**Year:** 1997

**Reference type:** Journal article

**Squib:** 1997GIE/TAL3125-3134

**Reaction:**  $\text{CH}_4 + \cdot\text{OH} \rightarrow \cdot\text{CH}_3 + \text{H}_2\text{O}$

**Reaction order:** 2

**Temperature:** 196 - 420 K

**Pressure:** 0.13 Bar

**Rate expression:**  $1.76 \times 10^{-13} (\text{cm}^3/\text{molecule s}) (T/298 \text{ K})^{2.82} e^{-1.96 (\pm 0.02 \text{ kcal/mole})/RT}$

**Bath gas:** He

**Data type:** Absolute value measured directly

**Excitation technique:** Flash photolysis (laser or conventional)

**Analytical technique:** Laser induced fluorescence

# Rate coefficient uncertainties

Uncertainty factor  $f_j$  as defined in data evaluations

(Tsang, Warnatz, Baulch, Konnov):

uncertainty factor  $u_j$

$$u_j = \frac{k_j^0}{k_j^{\min}} = \frac{k_j^{\max}}{k_j^0}$$

uncertainty parameter  $f_j$

$$f_j = \log_{10}(u_j)$$

$k_j^0$  recommended value of the rate coefficient of reaction  $j$

$k_j^{\min}$  possible minimal value of  $k_j$

$k_j^{\max}$  possible maximal value of  $k_j$

$\Rightarrow [k_j^{\min}, k_j^{\max}]$  is the physically realistic range for the rate coefficients

assume that  $\ln k^{\min}$  and  $\ln k^{\max}$  deviate  $3\sigma$  from  $\ln k^0$

$$\Rightarrow \sigma^2(\ln k_j) = ((f_j \ln 10)/3)^2$$

$1\sigma$  uncertainty limit (assuming that  $u$  corresponds to  $3\sigma$ ):  $l = 10^{f/3}$  22

# Uncertainty of $k$ at a given temperature

## Uncertainty of (direct) rate coefficient measurements:

very high quality data	uncertainty factor $u = 1.26 \Leftrightarrow f = 0.1 \Leftrightarrow \pm 8 \% (1\sigma)$
typical good data	uncertainty factor $u = 2.00 \Leftrightarrow f = 0.3 \Leftrightarrow \pm 26 \% (1\sigma)$
typical data	uncertainty factor $u = 3.16 \Leftrightarrow f = 0.5 \Leftrightarrow \pm 47 \% (1\sigma)$

## (high level) theoretical determinations:

TST/master equation calculations

best systems	uncertainty factor $u = 2.00 \Leftrightarrow f = 0.3 \Leftrightarrow \pm 26 \% (1\sigma)$
multi well, main channels	uncertainty factor $u = 3.16 \Leftrightarrow f = 0.5 \Leftrightarrow \pm 47 \% (1\sigma)$
multi well, minor channels	uncertainty factor $u = 10 \Leftrightarrow f = 1.0$

C. F. Goldsmith, A. S. Tomlin, S. J. Klippenstein: Uncertainty propagation in the derivation of phenomenological rate coefficients from theory: A case study of *n*-propyl radical oxidation  
*Proc. Combust. Inst.*, **34**, 177-185 (2013)

J. Prager, H. N. Najm, J. Zádor: Uncertainty quantification in the *ab initio* rate-coefficient calculation for the  $\text{CH}_3\text{CH}(\text{OH})\text{CH}_3 + \text{OH} \rightarrow \text{CH}_3\text{C}(\text{OH})\text{CH}_3 + \text{H}_2\text{O}$  reaction, *Proc. Combust. Inst.*, **34**, 583-590 (2013)

# Example: the uncertainty of methane flame simulation results

## The investigated methane flames:

- one dimensional, adiabatic, freely propagating, laminar, premixed stationary flame investigated at equivalence ratios  $\phi = 0.70$  (lean), 1.00 (stoichiometric), and 1.20 (rich)
- cold boundary conditions  $p = 1.0$  atm and  $T = 298.15$  K

## Monitored outputs:

- laminar flame velocity
- maximum temperature
- maximum species concentration of H, O, OH, CH, CH<sub>2</sub>



# Uncertainty analysis of a laminar methane flame

Leeds Methane Oxidation Mechanism:  
37 species and 175 reversible reactions  
stationary, laminar 1D simulations

37 species: the recommended values of the enthalpies of formation and their variance was calculated from thermodynamic databases

175 reactions: uncertainty parameteres  $f$  were collected from Baulch *et al.*

## The investigated simulation results:

maximal flame temperature, laminar flame velocity,  
maximal concentrations of radicals H, O, OH, CH, CH<sub>2</sub>

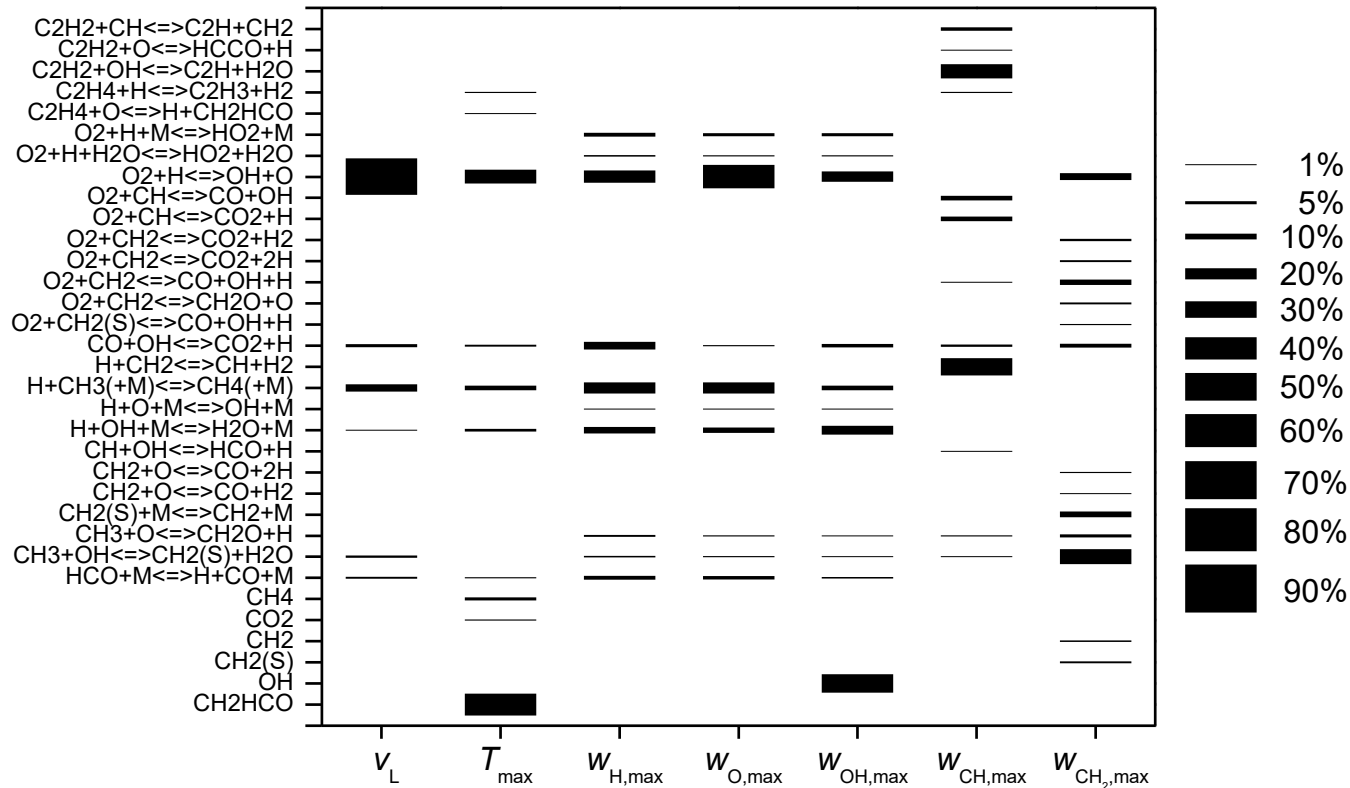
## Uncertainty analysis methods:

local uncertainty analysis, Morris' method,  
Monte Carlo method, sensitivity indices

J. Zádor, I. Gy. Zsély, T. Turányi, M. Ratto, S. Tarantola, A. Saltelli: Local and global uncertainty analyses of a methane flame model, *J. Phys. Chem. A*, **109**, 9795-9807 (2005)

# Local uncertainty analysis results

% contribution of parameter uncertainties to the uncertainty of the simulated results



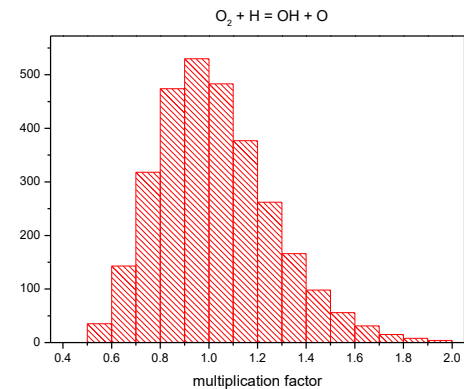
$$\phi = 1.0$$

# Assumed probability density functions of kinetic and thermodynamic parameters

The Monte Carlo and the sensitivity index methods require an assumption on the probability density functions (*pdfs*) of parameters

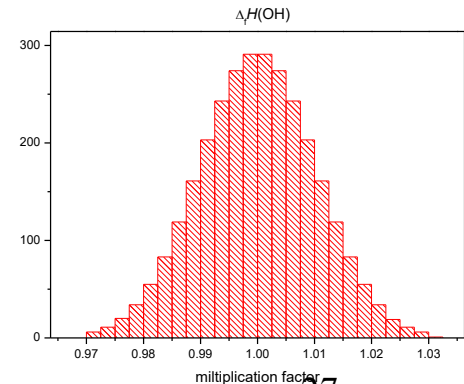
## Rate coefficients:

- log-normal distribution
- $\sigma_j$  was calculated from the  $f_j$  uncertainty factor
- the log-normal distribution is clipped at  $\pm 3\sigma$  ( $\ln k_j$ )

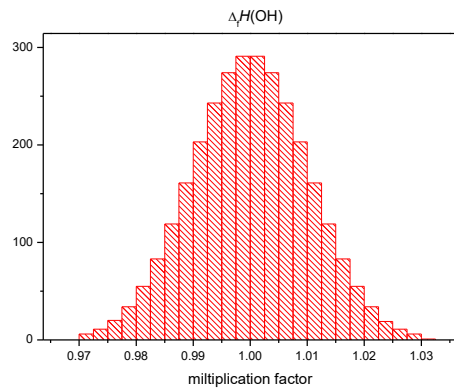
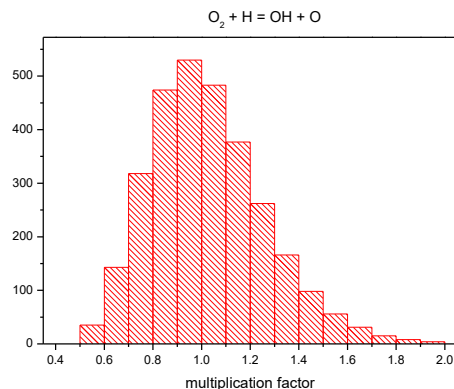
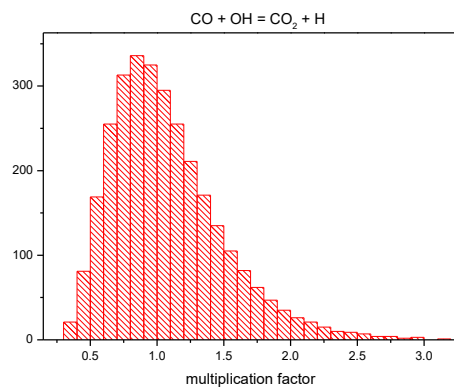


## Enthalpies of formation:

- normal distribution
- $\sigma$  is assessed on the basis of thermodynamic tables
- the normal distribution is clipped at  $\pm 3\sigma$

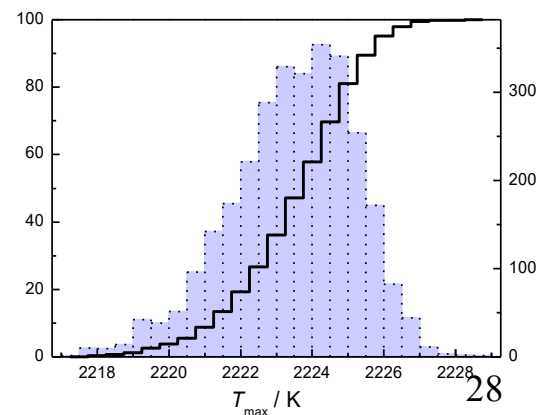
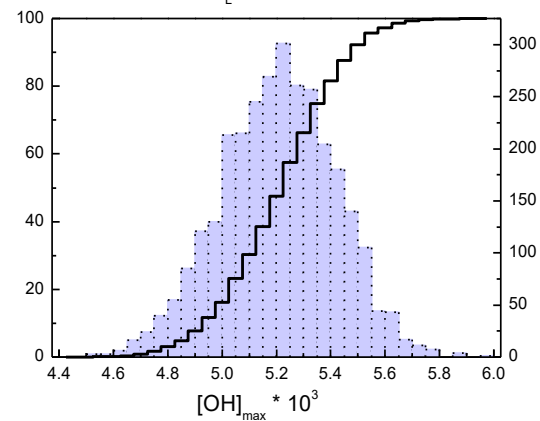
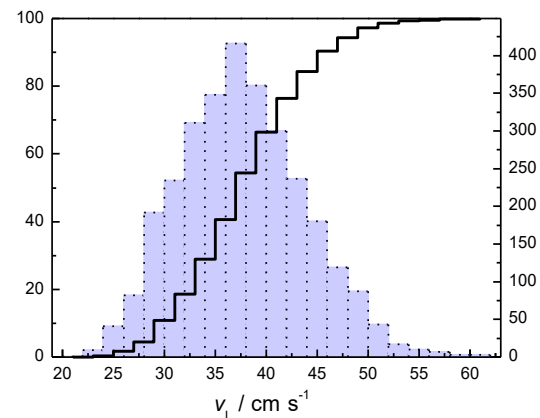


## pdf of parameters



3,000 Monte Carlo  
simulations

## pdf of simulation results



# Comparison of the results of local and global (Monte Carlo) uncertainty analyses for a stoichiometric, stationary, flat methane-air flame

	result	calculated variances from local                      Monte Carlo uncertainty analyses	
flame velocity	38.1 cm/s	4.6 cm/s	6.2 cm/s
max. T	2224.2 K	2.8 K	1.7 K
max. $w_H$	$2.14 \times 10^{-4}$	14.7%	12.6%
max. $w_O$	$1.74 \times 10^{-3}$	13.3%	10.4%
max. $w_{OH}$	$5.27 \times 10^{-3}$	3.6%	4.0%
max. $w_{CH}$	$8.07 \times 10^{-7}$	46.3%	49.2%
max. $w_{CH_2}$	$2.54 \times 10^{-5}$	23.8%	24.0%

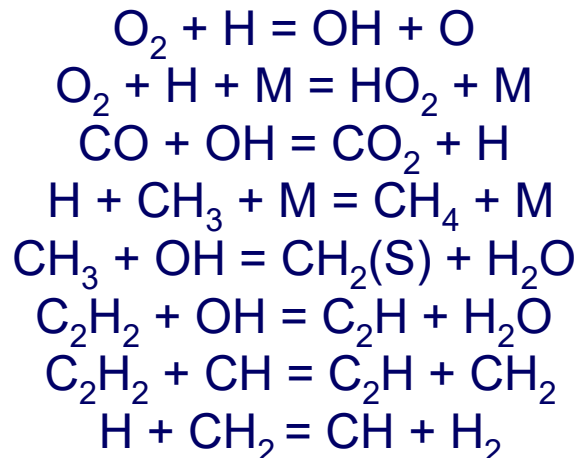
# Methane flame uncertainty analysis: general conclusions

Good agreement is observed between the calculated total variances obtained through the local uncertainty analysis and the Monte Carlo method.

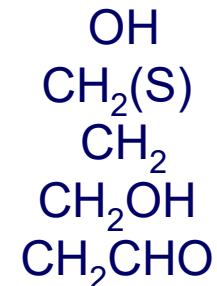
**Better simulation results can be achieved, if the rate coefficients of a few reactions and the enthalpies of formation of a few species are known better (= with smaller variance)**

**These represent a small fraction of the total number of species/reactions.**

Significant rate coefficients:



Significant enthalpies of formation:



# Uncertainty analysis study of the laminar methane flame

## the points to be corrected

Which were the weak points of  
the previously discussed uncertainty analysis study?

„uncertainty of the rate coefficient” = uncertainty of Arrhenius parameter  $A$   
was considered only

→ What is the uncertainty of each Arrhenius parameter?

The used uncertainty parameters  $f$  were based on the direct measurements

→ Considering also the indirect measurements decreases the uncertainty

At the development of detailed reaction mechanisms,  
the direct and indirect experimental results are both considered;  
the nominal parameter set contains correlations  
that have to be taken into account.

→ Considering the parameter correlations is needed

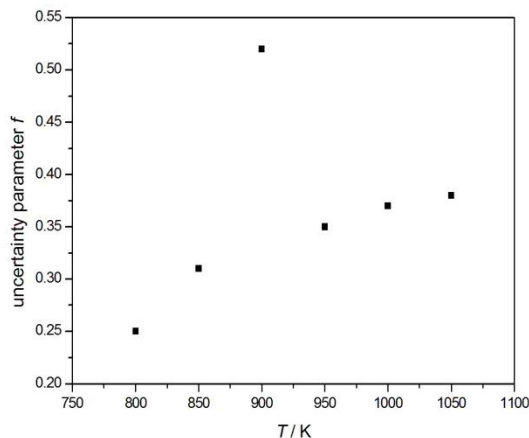
# Temperature dependence of uncertainty factor $f$

Uncertainty parameter  $f$  is either constant (Tsang, Warnatz, Konnov) or defined in temperature regions (Baulch *et al.* evaluations):

$$f(T) = \begin{cases} f_1 & \text{if } T \in (T_1, T_2) \\ f_2 & \text{if } T = T_3 \\ \vdots & \vdots \end{cases}$$

$f_1, f_2, f_3, \dots$  corresponds to the actual scatter of measurements in this temperature region.

We will call them  $f_{\text{original}}$  values.



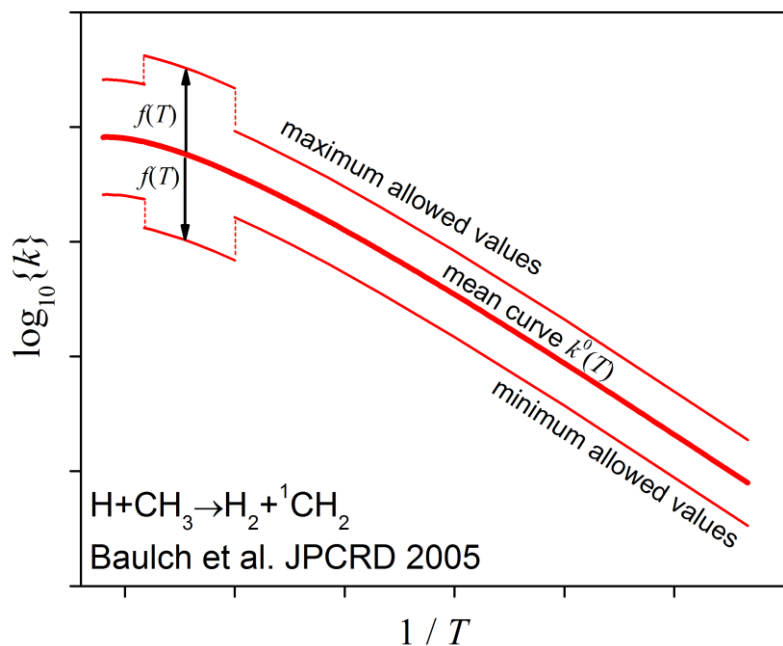
The temperature dependence of the rate coefficients imposes a relation among the uncertainty parameter  $f$  values at different temperatures.

**The  $f_{\text{original}}$  values are not in accordance with the temperature dependence of the rate coefficient  $k$**



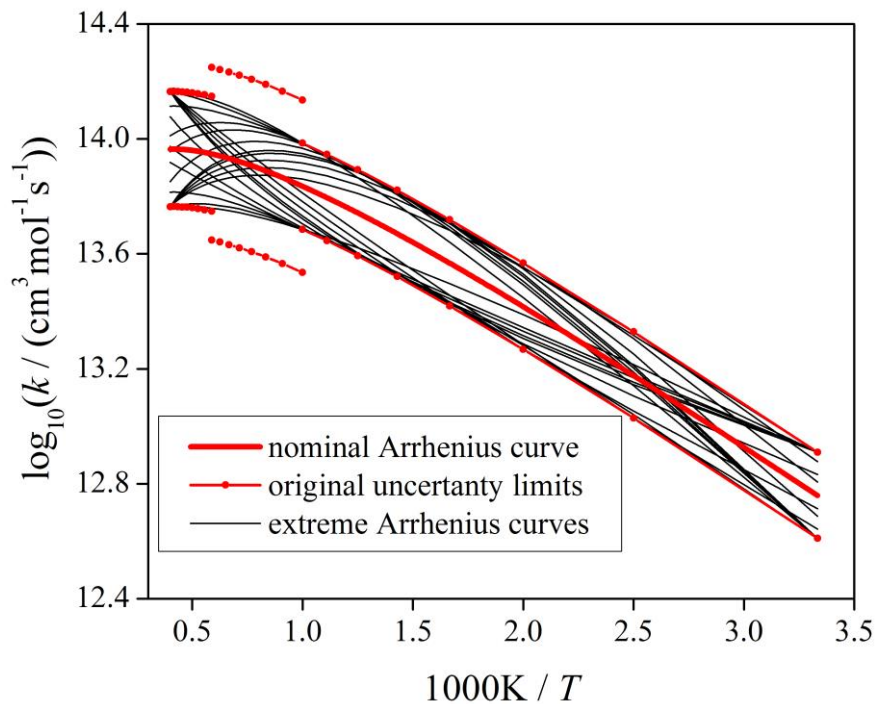
# Getting consistent uncertainty factors $f$

Example from the  
Baulch *et al.* (2005) evaluation:



## Solution:

Drawing the possible extreme Arrhenius curves span the realistic uncertainty limits of the rate coefficient  $k$ :



The corrected  $f$  values are called  $f_{\text{extreme}}$

# Domain of uncertainty of Arrhenius parameters

The  $f_{\text{extreme}}(T)$  values define the uncertainty domain of the rate coefficient  $k$  in interval  $[T_1, T_2]$  with the temperature dependence of the rate coefficient  $k$

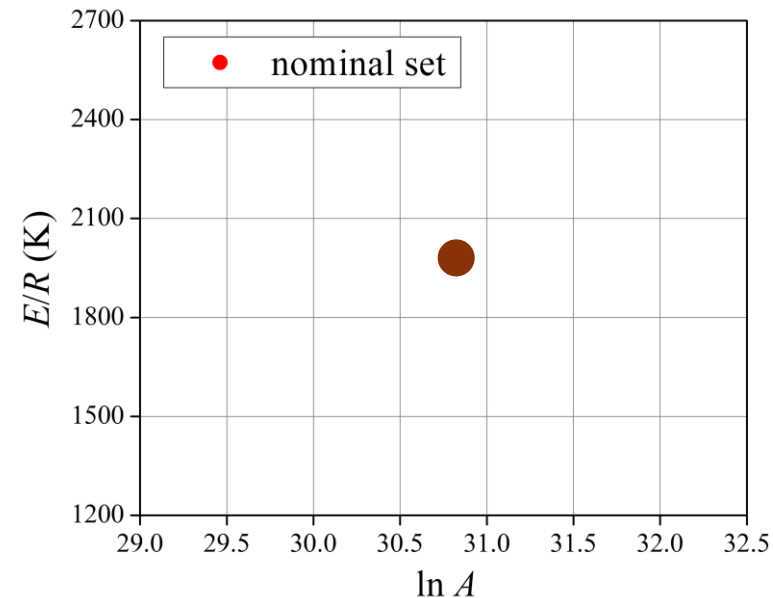
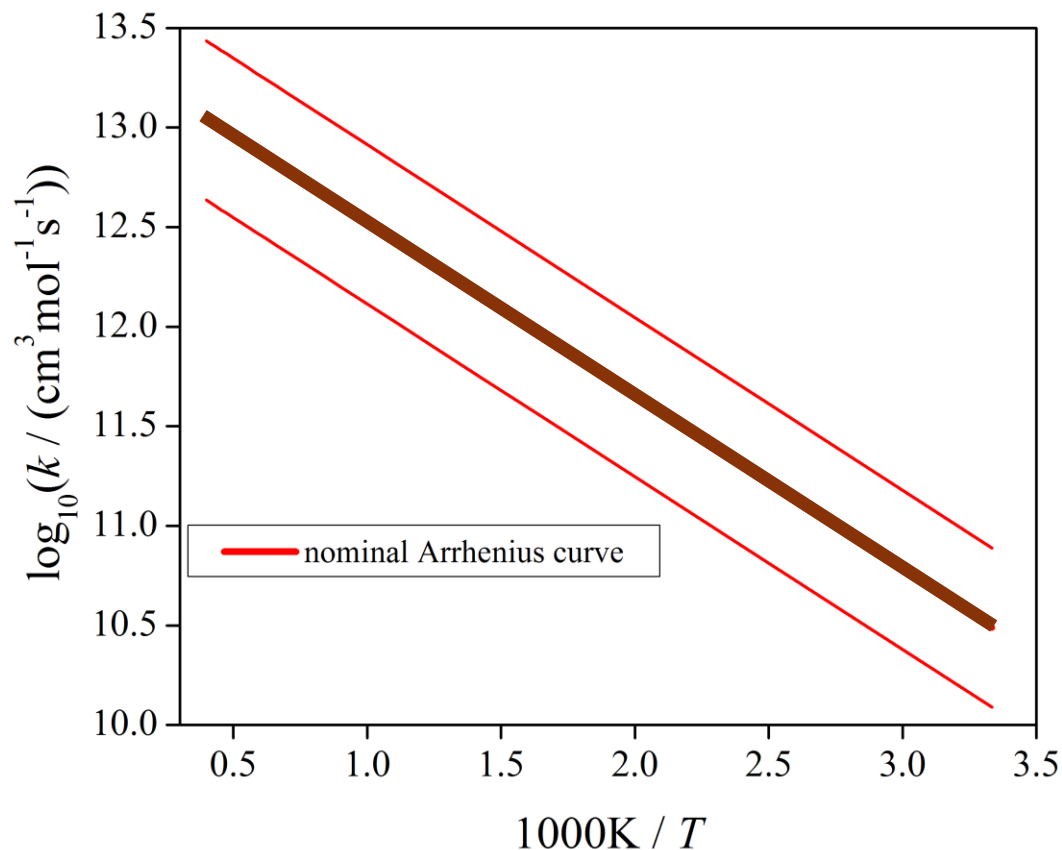
The evaluations provide the uncertainty of  $k$ , but the real parameters of the model are Arrhenius parameters  $A, n, E$

Better to deal with the transformed Arrhenius parameters  $\ln A, n, E/R$

**Statement:** the extreme Arrhenius curves span the domain of uncertainty of the Arrhenius parameters.

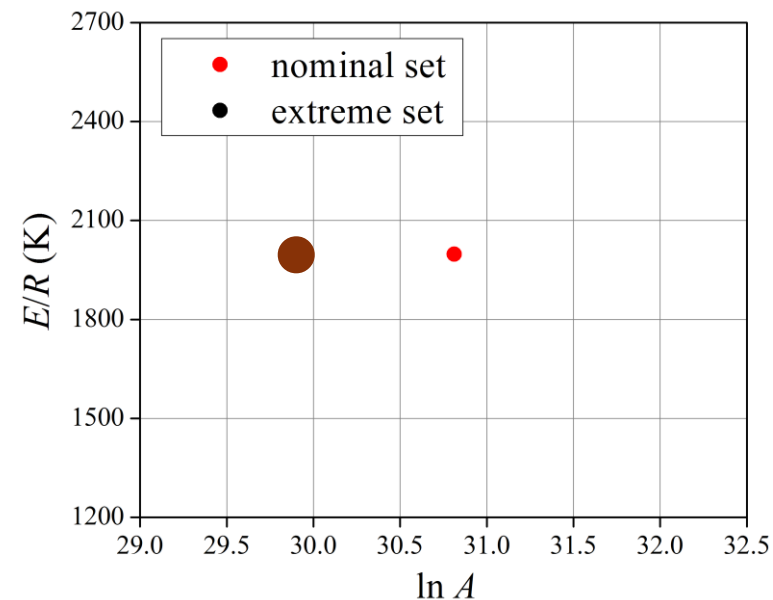
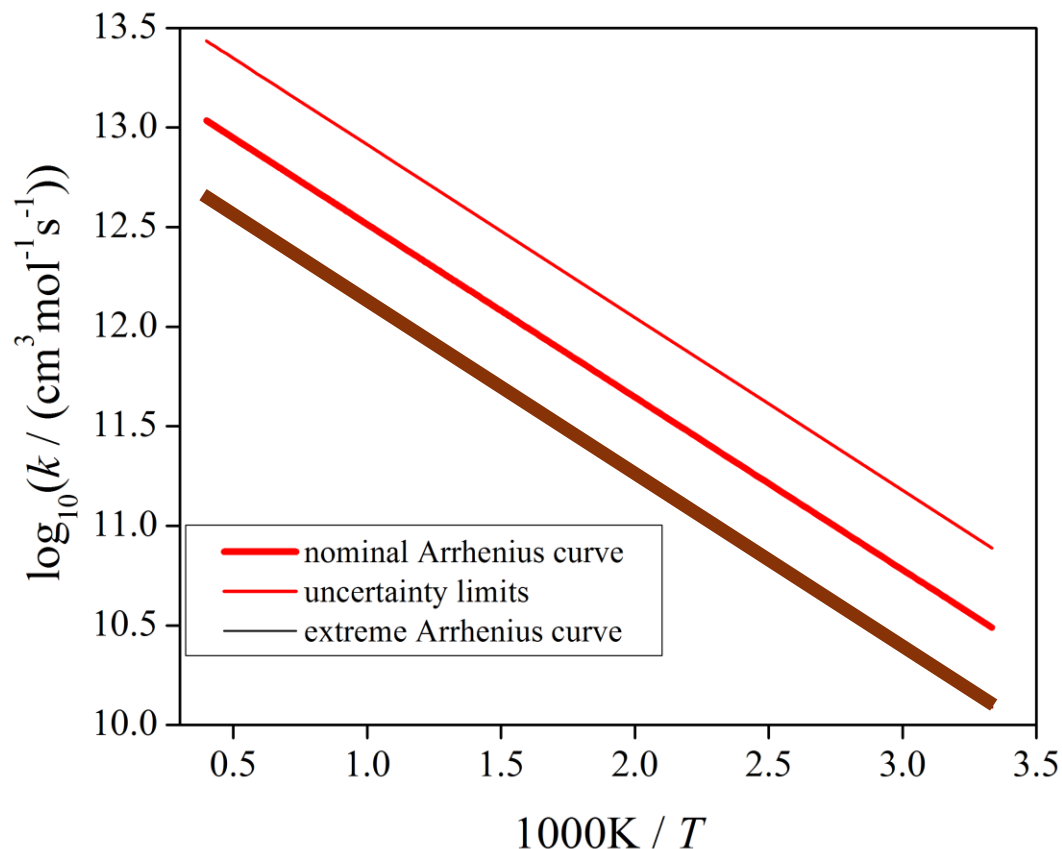
# Domain of uncertainty of Arrhenius parameters

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



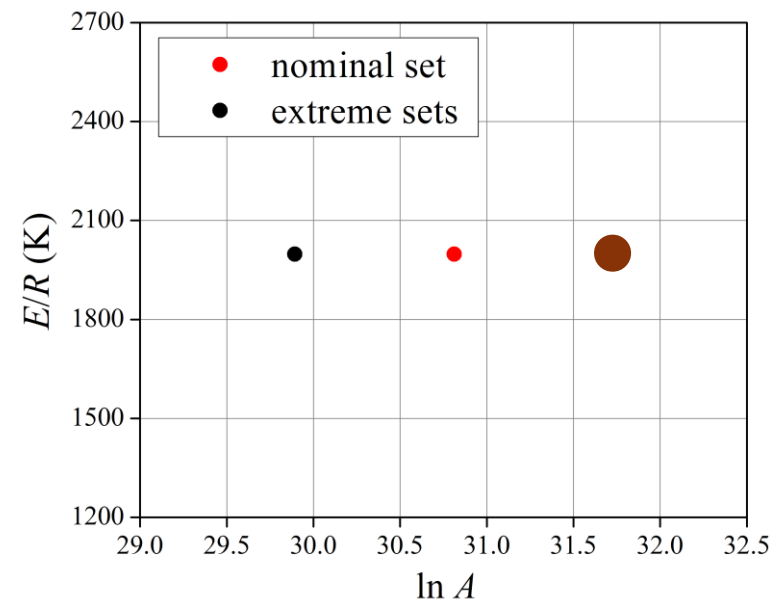
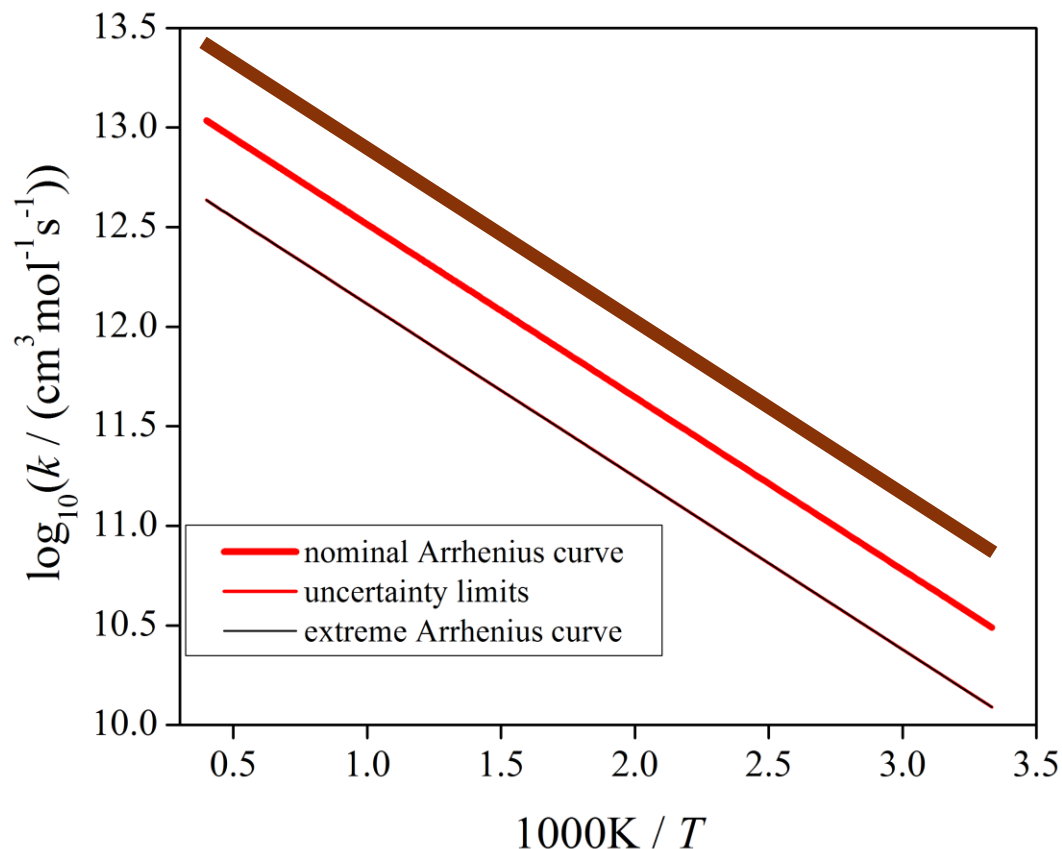
# Domain of uncertainty of Arrhenius parameters

The simplest case: temperature independent uncertainty of  $k$   
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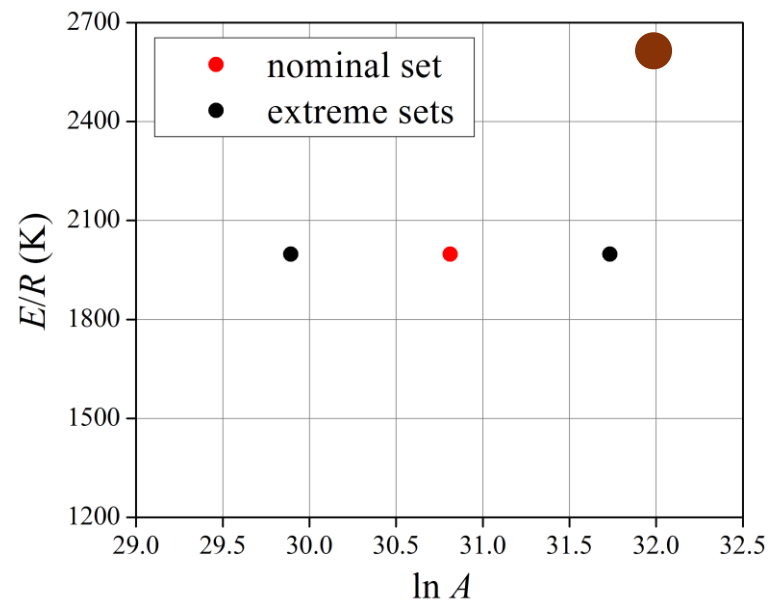
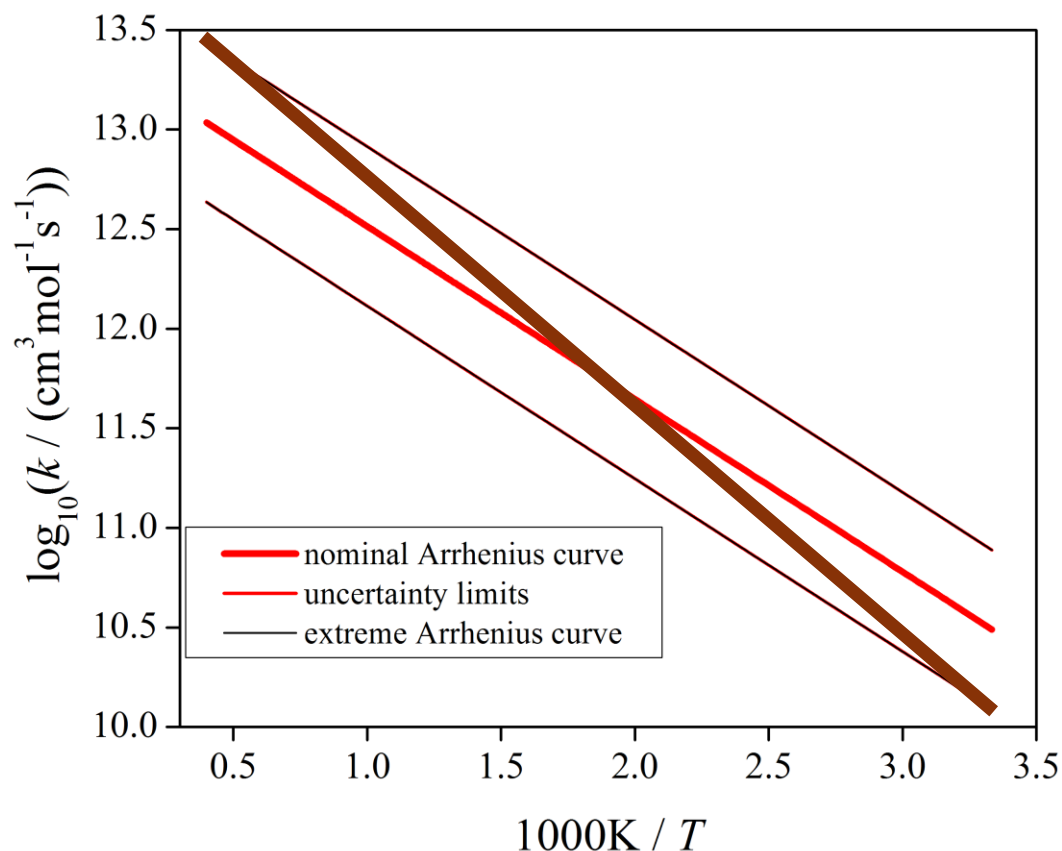
# Domain of uncertainty of Arrhenius parameters

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



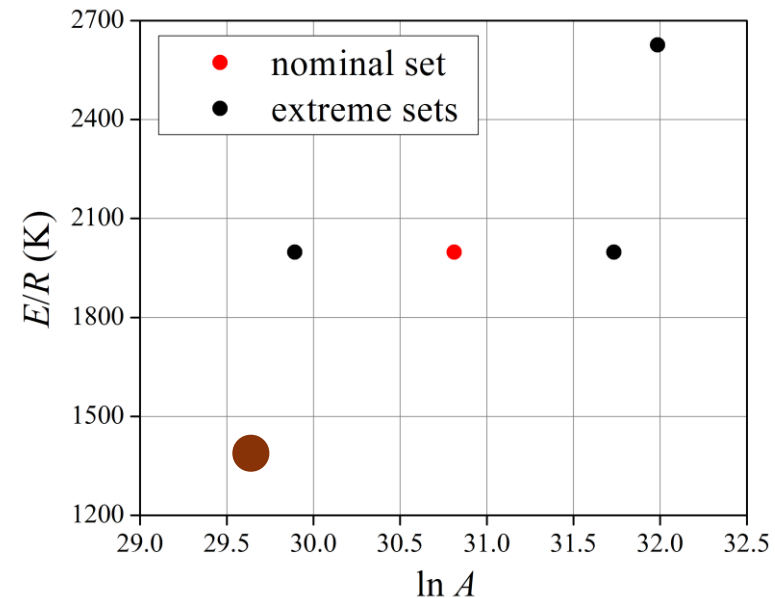
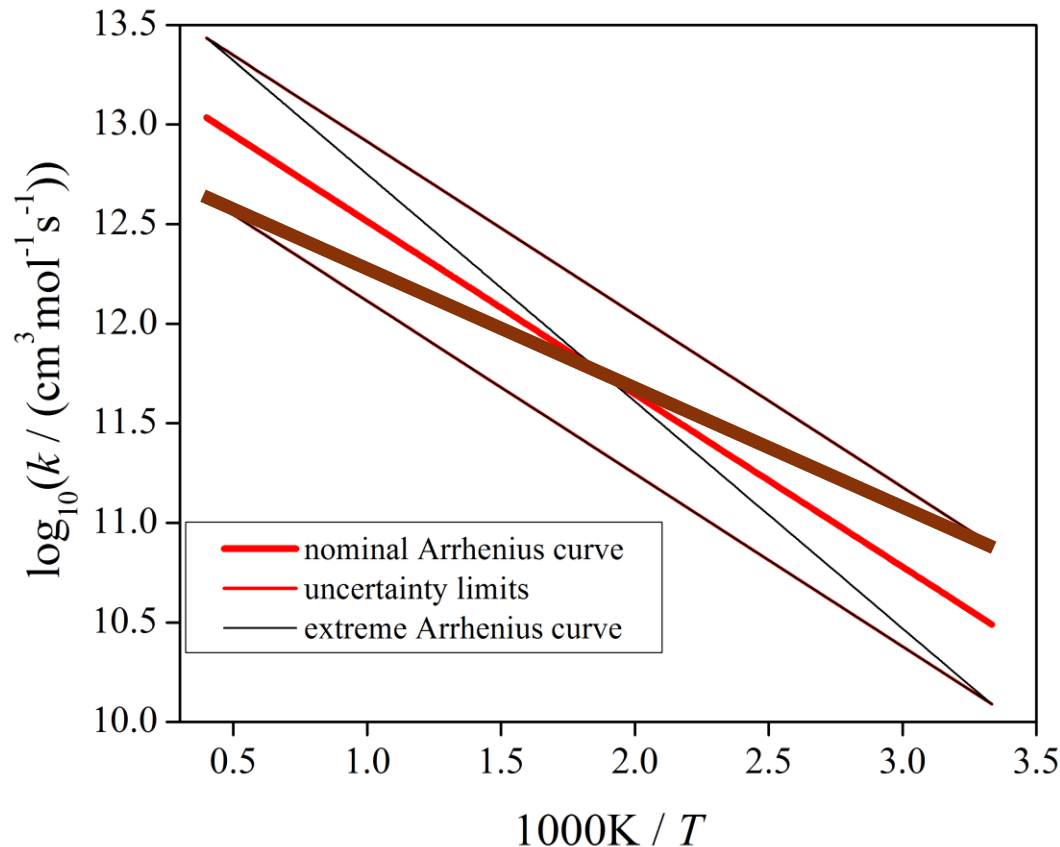
# Domain of uncertainty of Arrhenius parameters

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



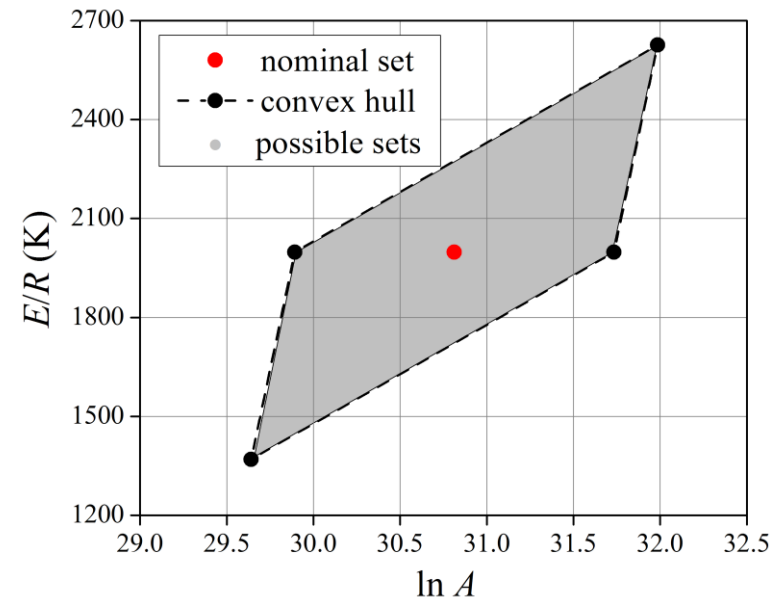
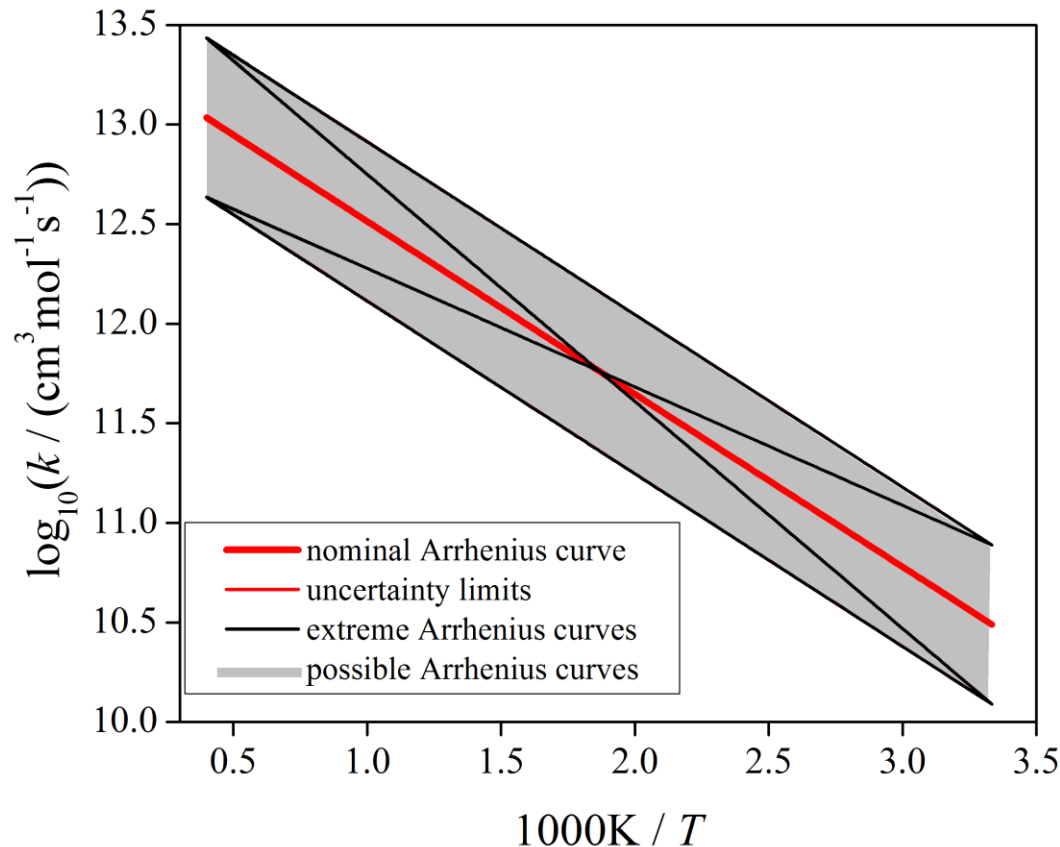
# Domain of uncertainty of Arrhenius parameters

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



# Domain of uncertainty of Arrhenius parameters

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



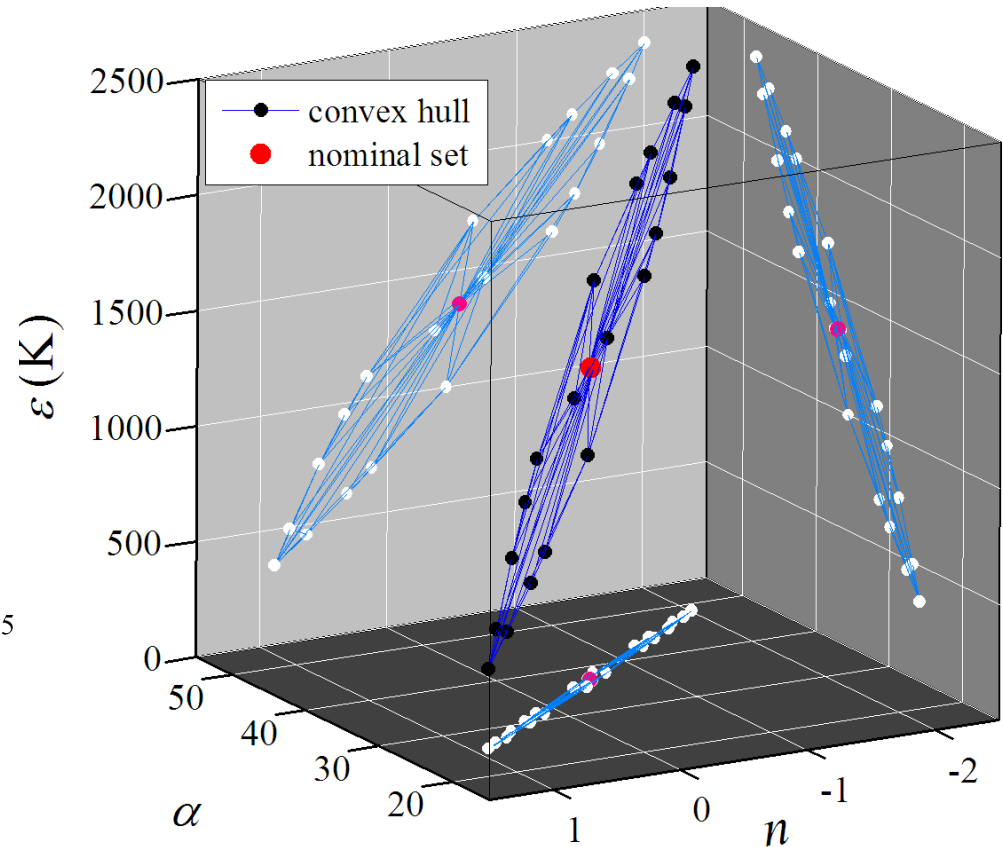
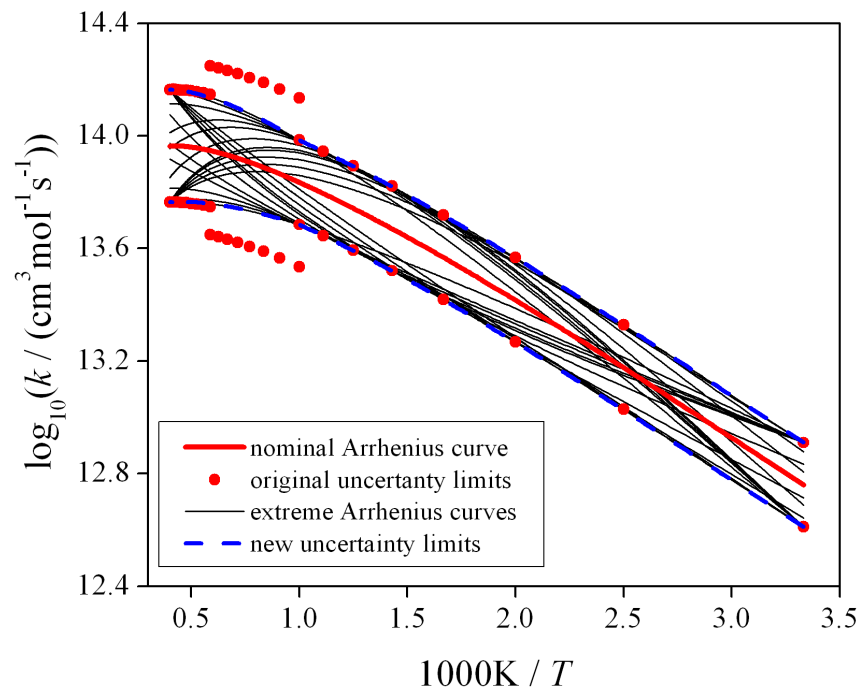


# 3D domain of Arrhenius parameters

**The most complex case:** temperature dependent uncertainty of  $k$

three Arrhenius parameters  $\alpha = \ln A$ ,  $n$ ,  $\varepsilon = E/R$

the extreme Arrhenius curves = vertices of the convex hull



# Uncertainty parameter $f$

Definition of uncertainty factor  $f$ :

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

Calculation of the variance of  $\ln k$  from uncertainty factor  $f$ :

(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 covariance matrix of the Arrhenius parameters is needed!**

extended Arrhenius expression:

$$k(T) = AT^n \exp(-E/RT)$$

linearized form:

$$\underbrace{\ln \{k(T)\}}_{\kappa(\theta)} = \underbrace{\ln \{A\}}_{\alpha} + \underbrace{n}_{n} \cdot \underbrace{\ln \{T\}}_{\theta} - \underbrace{\{E/R\}}_{\varepsilon} \cdot \underbrace{\{T\}^{-1}}_{\theta}$$

# Relation between the $\sigma$ of the rate coefficient and the covariance matrix of the Arrhenius parameters

Matrix-vector form of the linearized Arrhenius equation:

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

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

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

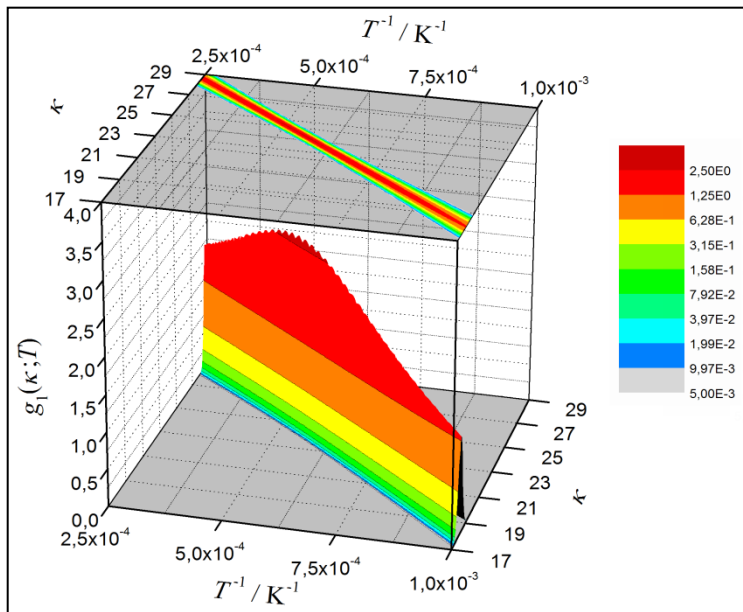
The covariance matrix of the Arrhenius parameters and its relation to the uncertainty of the rate coefficient:

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

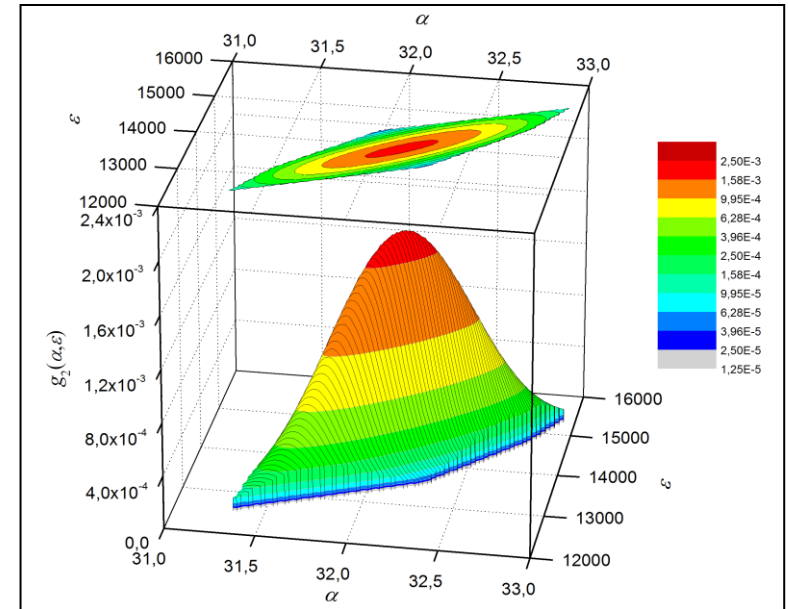
$$\sigma_\kappa(\theta) = \sqrt{\boldsymbol{\theta}^T \boldsymbol{\Sigma}_p \boldsymbol{\theta}}$$

**$\Rightarrow$  the temperature dependent standard deviation of  $k$  can be calculated from a quadratic form.**

# Example: reaction $\text{O} + \text{N}_2\text{O} \rightarrow \text{NO} + \text{NO}$

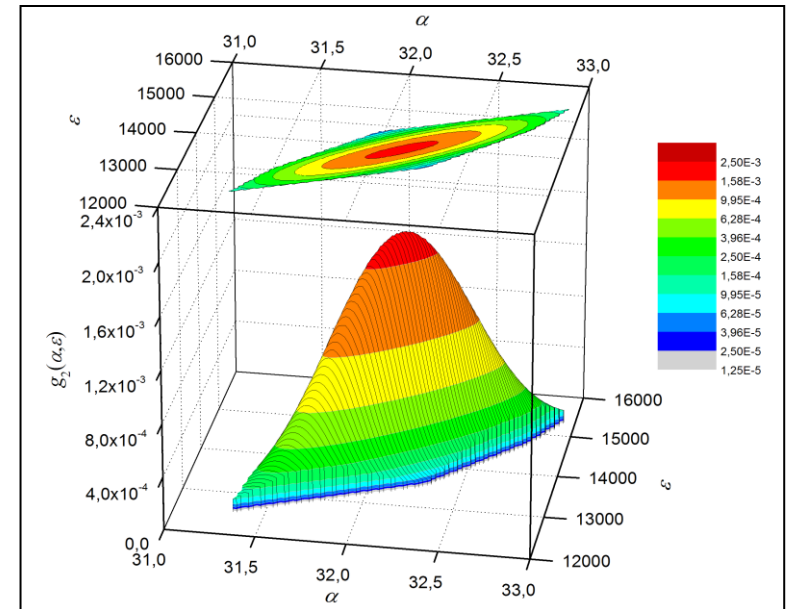
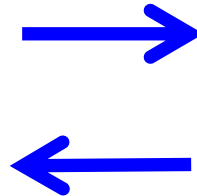
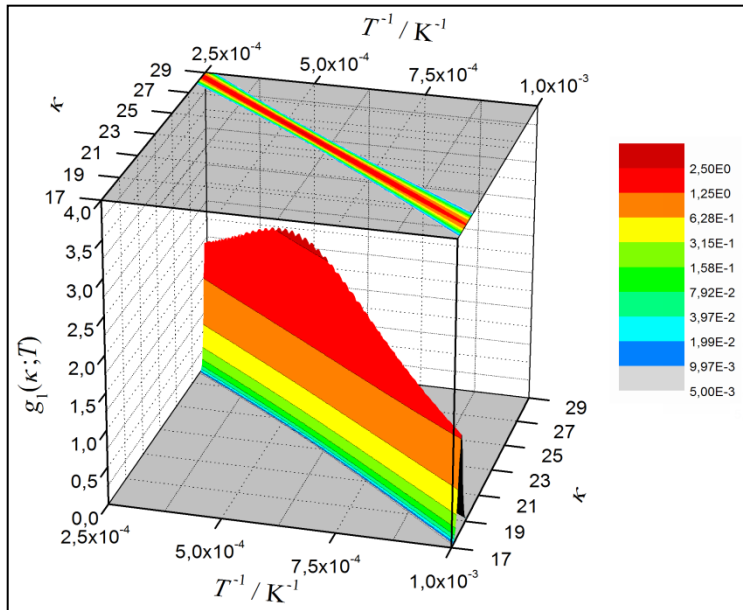


**Temperature dependent  
1D normal  
probability density function (*pdf*)  
of the rate coefficient  
(1000 K – 4000 K)**



**Temperature independent  
multivariate joint normal  
probability density function (*pdf*)  
of the Arrhenius parameters**

# Example: reaction $\text{O} + \text{N}_2\text{O} \rightarrow \text{NO} + \text{NO}$



**Temperature dependent  
1D normal  
probability density function (*pdf*)  
of the rate coefficient  
(1000 K – 4000 K)**

**Temperature independent  
multivariate joint normal  
probability density function (*pdf*)  
of the Arrhenius parameters**

# Calculation of the covariance matrix of the Arrhenius parameters

$$\sigma_k(\theta) = \sqrt{\theta^T \Sigma_p \theta}$$

For the 3-parameter Arrhenius equation:

$$\sigma_k(\theta) = \sqrt{\sigma_\alpha^2 + \sigma_n^2 \ln^2 \theta + \sigma_\varepsilon^2 \theta^{-2} + 2r_{\alpha n} \sigma_\alpha \sigma_n \ln \theta - 2r_{\alpha \varepsilon} \sigma_\alpha \sigma_\varepsilon \theta^{-1} - 2r_{n \varepsilon} \sigma_n \sigma_\varepsilon \ln \theta \cdot \theta^{-1}}$$

variance of  $\ln k$  is known  
at least at 6 temperatures  
(at least in 6 points )

calculation of a continuous  
 $f(T)$  function

definition of the domain of  
allowed  $A$ ,  $n$ ,  $E$  values



elements of the  
covariance matrix  
of Arrhenius parameters

$$\sigma_\alpha, \sigma_n, \sigma_\varepsilon, r_{\alpha \varepsilon}, r_{n \alpha}, r_{n \varepsilon}$$

# Features of the uncertainty parameter $f$

Baulch et al. (2005):

temperature independent  $f$  ( constant  $f(T)$  function) about 50%

OR

a verbally defined  $f(T)$  function about 50%

" $f = 0.1$  at 800 K raising to 0.2 at 2000 K "

Other sources:

NIST Chemical Kinetics Database, Tsang, Warnatz, Konnov

temperature independent  $f$  values.

## Good features:

- $f$  factors are available for several hundred reactions
- $f$  factors are very realistic (to our experience)

## Bad features:

- derivation of the  $f$  parameter is not documented
- temperature dependence is missing or not well defined
  - = cannot be used for the calculation of the uncertainty of the Arrhenius parameters

⇒ Reassessment of the uncertainty parameters is needed!

# Reassessment of the $f(T)$ functions is needed!

We have created an interactive website <https://k-evaluation.elte.hu/> for the semiautomatic calculation of the  $f(T)$  functions.

Major steps for a given elementary reaction:

- 1 collection of all direct measurements and theoretical calculations  
source: NIST Chemical Kintics Database + recent reviews
- 2 foreward direction: selected (direction with more data)  
backward direction: converted to forward direction Arrhenius parameters
- 3 preparation of a datafile: each line one measurement/calculation  
squib + temperature range + Arrhenius parameters
- 4 selection of a mean line ( $\ln k - 1/T$ )  
in the middle of uncertainty band is usually from Baulch *et al.*, 2005
- 5 Interactive website: interactive elimination of outliers
- 6 automatic calculation of „empirical”  $f$  points at several temperatures  
fitting the elements of the covariance matrix to these points  
plotting the experimental/theoretical results + the recalculated  $f(T)$



## Example: reaction $\text{H} + \text{O}_2 + \text{M} = \text{HO}_2 + \text{M}$

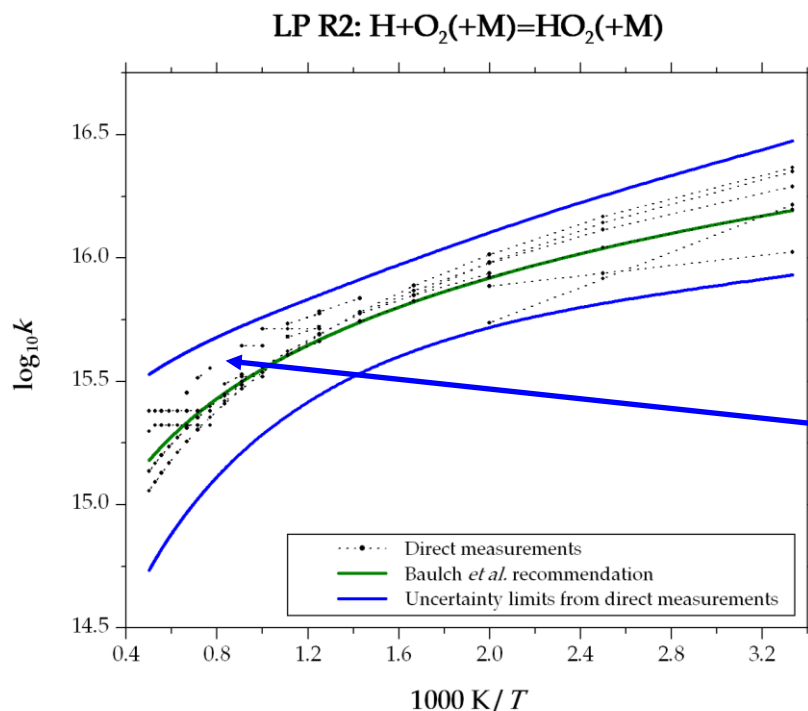
We found about 60 experimental/theoretical rate expressions.

After the selection remained:

Ar bath gas: 9 experimentally determined and  
1 theoretically calculated rate coefficient expressions

N<sub>2</sub> bath gas: 10 experimentally determined and  
2 theoretically calculated rate coefficient expressions

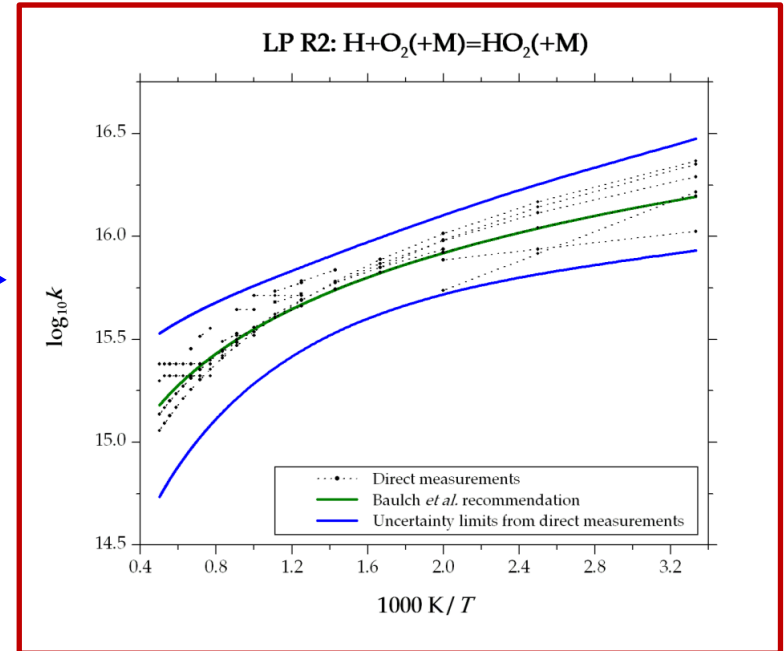
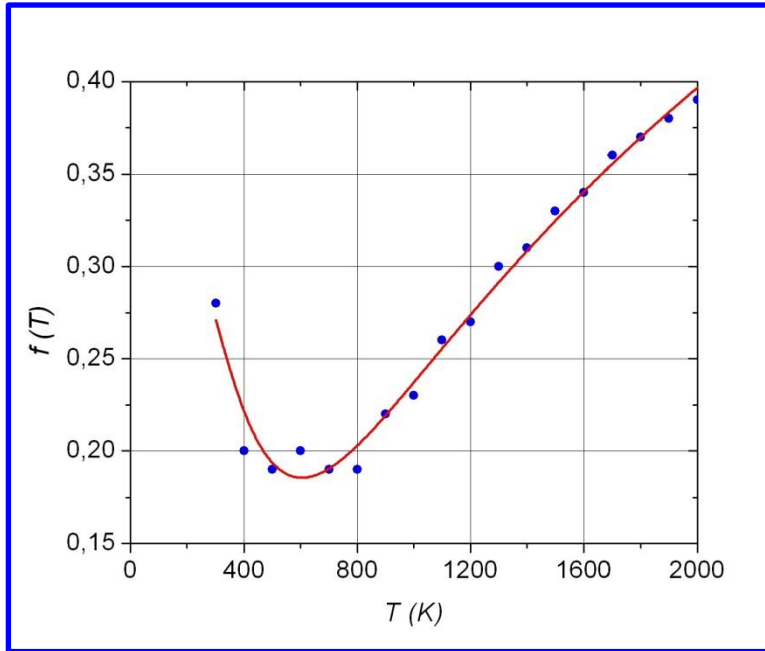
used together assuming  $m=0.5$  (relative collision efficiency Ar to N<sub>2</sub>)



mean line:  
Baulch *et al.*, 2005

rate expressions from  
experiments and theory

# Example: reaction $\text{H} + \text{O}_2 + \text{M} = \text{HO}_2 + \text{M}$



**blue dots:**

distance from the extreme  
experimental/theoretical values  
(„empirical  $f$  points”)

**red line:**

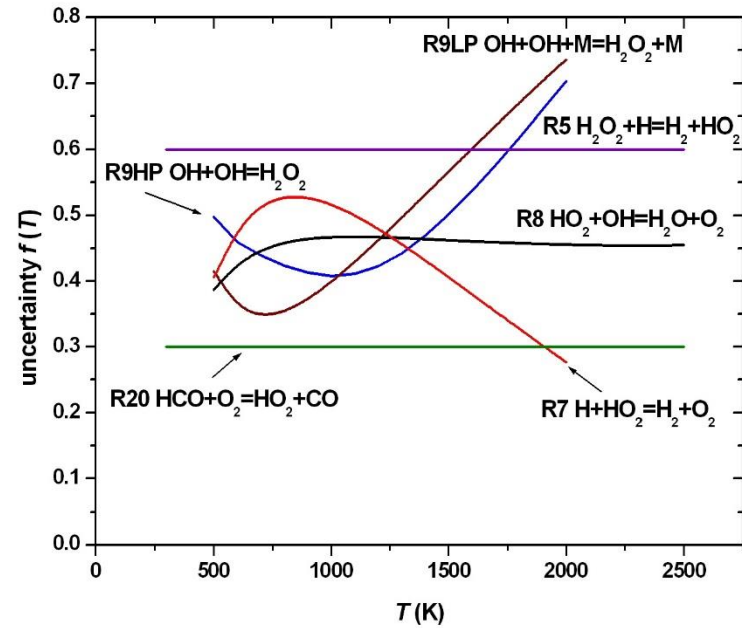
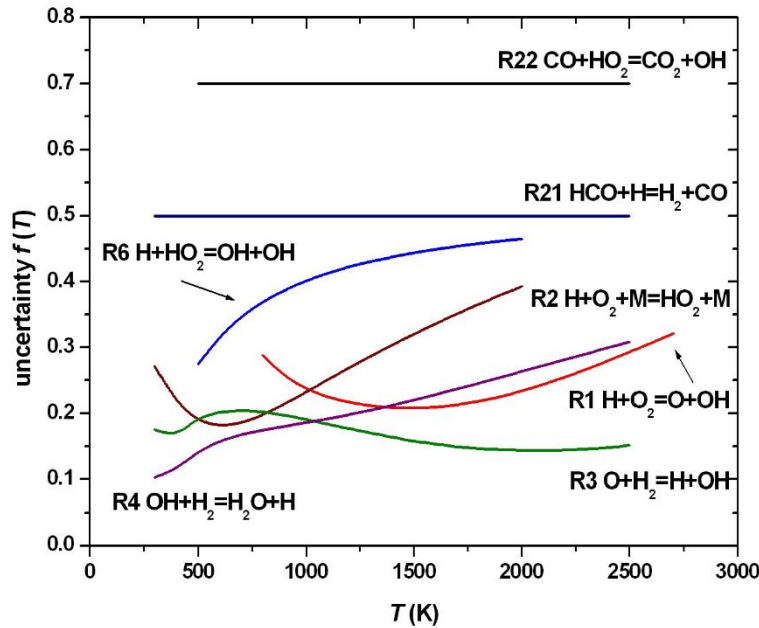
calculated from the fitted  
elements of the covariance matrix  
 $\Rightarrow$  *a priori*  $f(T)$  function

**blue line:**

*a priori*

temperature dependent  
 $k^{\min}$  and  $k^{\max}$  bounds  
calculated from the  
covariance matrix  
of Arrhenius parameters

# Evaluation of the $T$ -dependent uncertainty of the rate coefficients is available for 208 reaction steps



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)

The  $k$ -evaluation website contains  $f(T)$  functions of 208 elementary reactions, stored as elements of the covariance matrix of Arrhenius parameters



*Thank you for  
your attention!*