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Reaction Mechanism Generator:

Toward High-Throughput Transition State Calculations, and Interpreting Existing Kinetic Models

Richard H. West 4 August 2014





Presented at the 2nd International Workshop on Flame Chemistry in San Francisco

1. Represent molecules (and identify duplicates)



The common theme to the two projects in the talk is Reaction Mechanism Generator software. First, a brief introduction to it.

2. Create reactions (and then new species)



3. Choose which reactions to include (and which to leave out)

You'll notice a lot of slide designs are top-heavy.

This is because the room layout meant most people couldn't see the bottom of the screen!

4. Estimate thermo and kinetic parameters (quickly!)

Molecules are represented as 2D graphs



Reaction families propose all possible reactions with given species

- Template for recognizing reactive sites
- **Recipe** for changing the bonding at the site
- Rules for estimating the rate

There are ~40 reaction families such as as Hydrogen abstraction, unimolecular homolysis, radical addition to a double bond...

All possible reactions are found, then core is expanded by following the fastest pathways.



Model can be started from "seed mechanism" (if you have this in RMG format)



Getting it in "RMG format" is the hard part, and will be addressed in the second half of the talk.

Rate estimates are based on the local structure of the reacting sites.



- Hydrogen abstraction: XH + Y. → X. + YH
- Rate depends on X and Y.

Rate estimation rules are organized in a tree



Part of the tree for X

The most generic expression goes at the top of the tree. You use the most precise node that you can, then fall up until you find data.



Part of the tree for Y

New "RMG-Py" designed to be more extensible and developer-friendly.

See poster on Wednesday



Ve presented two posters describing this work at the 35th International Symposium on Combustior occurring the week following this presentation.



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New "RMGmore extens

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Toward High-Throughput Transition State Calculations

Pierre L. Bhoorasingh



Acknowledgment is made to the Donors of the American Chemical Society Petroleum Research Fund for support of this research.





Now that you understand RMG, here's the first of the two projects.



Ideally we climb the tree, find the matching node for our reaction, and pluck the leaf containing the rate expression.



Transition State calculations can provide missing data



Transition State calculations can provide missing data





Heat release (red) and progress variable (purple) of a turbulent lean methane-air Bunsen flame simulated using S3D. DOE

At my first Combustion Symposium (in 2006) I was impressed by the computer resources used by the CFD modelers

160000000 CPU-hours

Heat release (red) and progress variable (purple) of a turbulent lean methane-air Bunsen flame simulated using S3D. DOE

At my first Combustion Symposium (in 2006) I was impressed by the computer resources used by the CFD modelers



This is one of the large federal computers they use. Imagine what we could do if combustion *chemists* had 16M CPU hours!...



We'd need 16,000 graduate students to set up the calculations!



We'd need 16,000 graduate students to set up the calculations!

Automatic TS searches remain an important energy research goal



"An accurate description of the often intricate mechanisms of large-molecule reactions requires a characterization of all relevant transition states... Development of automatic means to search for chemically relevant configurations is the computational-kinetics equivalent of improved electronic structure methods."

 Basic Research Needs for Clean and Efficient Combustion of 21st Century Transportation Fuels.
 US Dept of Energy (2006)

Automatic TS searches remain an important energy research goal

Concernent From From Research Combustion Learny Frontier Research Center (CERR) Beptember 23-24, 2010 Princeton

"...transformation from by-hand calculations of single reactions to automated calculations of millions of reactions would be a game-changer for the field of chemistry, and would be a good 'Grand Challenge' target..."

- Combustion Energy Frontier Research Center (2010) Can you predict TS geometries from molecular groups alone?

(this would be great)

Can you predict TS geometries from molecular groups alone?

Molecule

Radical

Length of bond being broken, at TS for Hydrogen abstraction

Can you predict TS geometries from molecular groups alone?

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,	1.149	1.155	1.168	1.179
ð	1.272	1.286	1.309	1.314
? ••	1.278	1.295		1.355
٢	1.280	1.306	1.362	1.369

in Å with M06-2X/6-31+G(d,p)

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You can predict TS geometries from molecular groups alone!

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,	1.149	1.155	1.168	1.179
ð	1.272	1.286	1.309	1.314
? ••	1.278	1.295	1.345	1.355
۲	1.280	1.306	1.362	1.369
	in Å wit	h MOG OV	16 21 01	1 0)

in Å with M06-2X/6-31+G(d,p)

So you can predict distances! But...

- (1) I gave you 15 numbers and you gave be one; and
- (2) you only gave me a distance, not a 3D geometry.



in Å with M06-2X/6-31+G(d,p)

First challenge: getting more data out than you put in. Now, I give you 8 numbers and you can give me 16! Arrange these groups in a tree as mentioned before, and job done.

Use distance geometry to position atoms



Second challenge: getting from a distance to a 3D structure. We use the distance-geometry algorithms in RDKit.

Use distance geometry to position atoms



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Use distance geometry to position atoms



Second challenge: getting from a distance to a 3D structure. We use the distance-geometry algorithms in RDKit.

Estimate geometry directly via group additive distance estimates



- · Database arranged in tree structure as for kinetics
- Trained on successfully optimized transition states
- Direct guess much faster than double ended search
- Success depends on training data

Test the group-additive method on H-abstraction reactions in Diisopropyl Ketone





engine trials then provide feasibility truts for facts and most

engine water were protected from the biorelynessing of the same and should be a supervised at the biorelynessing of the combination chemistry and synchrotic histogy is a strategy to pare comparison mentionly and systems, nationly is a stranger or identify and investigate the most promising fiel compluants through manual feedback. Moreover, the development of combus-

through mathial feerback. Moreover, the an-exoposers of Commu-tion module will provide the predictive capability meded for eventual efficient ornigation of the new biology stream. A similar

These data were hot off the press.

We tried finding every H-abstraction reaction in this large published kinetic model.

Parity plots of Estimated against Optimized X-H distances at the transition state



We'll see how well we predict the distances as we re-train the groups on more and more data.

Trained on 44 reactions, estimates not so great...



Trained on 148 reactions, estimates improve...



Trained on 230 reactions, estimates improve...



Trained on 767 reactions, estimates are very good.



See Pierre Bhoorasingh's poster on Wednesday



For more details, talk to Pierre (who was up all night generating those results)

Interpreting Existing Kinetic Models







Now for the second project, that is also built on RMG-Py.



Available online at www.sciencedirect.com

ScienceDirect

Proceedings of the Combustion Institute 31 (2007) 125-140

Proceedings of the Combustion Institute

www.elsevier.com/locate/proci

Transforming data into knowledge-Process Informatics for combustion chemistry

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Abstract

The present frontier of combustion chemistry is the development of predictive reaction models, namely, chemical kinetics models capable of accurate numerical predictions with quantifiable uncertainties. While the usual factors like deficient knowledge of reaction pathways and insufficient accuracy of individual measurements and/or theoretical calculations impede progress, the key obstacle is the inconsistency of accumulating data and proliferating reaction mechanisms. Process Informatics introduces a new paradigm. It relies on three major components: proper organization of scientific data, availability of scientific tools for analysis and processing of these data, and engagement of the entire scientific community in the data collection and analysis. The proper infrastructure will enable a new form of scientific method by considering the entire content of information available, assessing and assuring mutual scientific consistency of the data, rigorously assessing data uncertainty, identifying problems with the available data, evaluating model predictability, suggesting new experimental and theoretical work with the highest possible impact, reaching community consensus, and merging the assembled data into new © 2006 The Combustion Institute. Published by Elsevier Inc. All rights r

Again, we go back to my first Combustion Symposium in 2006,

where I was introduced to the idea of Process Informatics / Data Collaboration.

"the key obstacle is the inconsistency of accumulating data and proliferating reaction mechanisms.

Process Informatics introduces a new paradigm. It relies on three major components:

- · proper organization of scientific data,
- availability of scientific tools for analysis and processing of these data,
- and engagement of the entire scientific community in the data collection and analysis."

M. Frenklach, Proc. Combust. Inst. 31 (2006)

assumed the entire scientific community would go home and properly organize their scientific data.

Model Complexity is Increasing



So is everything published since 2006 in PrIMe format? No. It's mostly in CHEMKIN format. (This chart is very incomplete random sampling)



And again, here is a photo of a large federal computer. This time at NASA



is is the computer model Gordon and McBride used when they devised the NASA polynomial form for thermochemistry (now used in CHEMKIN). It was designed to fit on 80-column punch-cards.



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APPENDIX D

THERMO DATA (FORMAT AND LISTING)

IDENTIFICATION

The order and format of the input data cards in this appendix are given in the following table:

	Castants	Format	Card
CARG		1	eolumo
01041		144	1.10.6
1	THERMO	7510.3	1 to 30
2	Temperature ranges for 2 sets of coefficients:	25.76.4	1 10 00
	lowest T, common T, and highest T		1 10 12
3	Species name	343	10 10 24
	Date		25 10 44
	Atomic symbols and formula	4(A2, P3.0)	45
	Phase of species (S. L. or G for solid, liquit,	~	
	or gas, respectively)		45.1.45
	Temperature range	2110.3	60.00
1	Integer 1	CIDAL OL	110.75
4	Coefficients a (1: 1 to 5) in equations (90) to (92)	2615.07	1.0.10
	(for upper temperature interval)		
	Integer 2		
1.5	Coefficients in equations (90) to (92) (ag. a, for	MELD.61	1 40 73
· ·	upper temperature interval, and a1, 02, and a3		
	for lowerh		
	Integer 3	10	
	Coeffectents in equations (SO) to (92) (ag. ag. ag.	4(E15.8)	1 1 10 00
1	a., for lower temperature interval)		
2	Integer 4	120	80
643	Repeat cards numbered i to 4 in cc 80 for each	1	
	SDCC105		
(Find	END (Indicates end of thermodynamic data)	344	1.03
rar			1
^D Gas RAY SP	cous species and condensed species with only one con order. However, the sets for two or more condense cires must be adjacent. If there are more than two co cires, their sets must be either in increasing or Gecr.	densed phase d phases of th ndensed phase easing order a	ean be in e same os of a seconding

is is the computer model Gordon and McBride used when they devised the NASA polynomial form for thermochemistry (now used in CHEMKIN). It was designed to fit on 80-column punch-cards.

NASA (Chemkin) format is very dense – not much room for species identifiers

Species Name Chemical Form	ula Parameters for H(T), S	S(T)
ch3chocho 11/14/95 thermc 3h 5o 2	0g 300.000 5000.000 1395.000	21
1.27827539e+01 1.21529347e-02-4.21228103e	e-06 6.59844007e-10-3.85228684e-14	2
-2.15946846e+04-3.94512036e+01 5.06096897e	e-01 4.26121702e-02-3.37628379e-05	3
1.39422914e-08-2.35317319e-12-1.74952136e	e+04 2.58742916e+01	4
ch3chcho 12/ 1/99 thermc 3h 5o 1	0g 300.000 5000.000 1385.000	21
1.02647528E+01 1.17295061E-02-4.06267561	E-06 6.36086751E-10-3.71220190E-14	2
-7.25910488E+03-2.91646638E+01 1.54196914	E+00 3.03297391E-02-1.88922690E-05	3
5.92263358E-09-7.53762316E-13-4.01761098	E+03 1.83707011E+01	4
<u>sc3h5cho</u> 11/15/95 <u>therc</u> 4h 6o 1	0g 300.000 5000.000 1390.000	21
1.31695904e+01 1.42484434e-02-4.90843998e	e-06 7.65789041e-10-4.45834896e-14	2
-2.04032613e+04-4.43673205e+01 4.35795171e	e-01 4.48719314e-02-3.36582931e-05	3
1.33066870e-08-2.17839128e-12-1.60394651e	e+04 2.37597452e+01	4
sc3h5co 11/15/95 thermc 4h 5o 1	0g 300.000 5000.000 1392.000	21
1.25514754e+01 1.22521948e-02-4.22382101e	e-06 6.59184896e-10-3.83818826e-14	2
-4.25349795e+03-4.02864145e+01 1.74191343e	e+00 3.97229536e-02-3.20061901e-05	3
1.38227925e-08-2.46272017e-12-6.64428100e	e+02 1.70762023e+01	4
ic3h6cho 2/22/96 thermc 4h 7o 1	0g 300.000 5000.000 1390.000	31
1.33102250e+01 1.62097959e-02-5.57575891e	e-06 8.69003718e-10-5.05554202e-14	2
-7.62177931e+03-4.25050854e+01 5.21481767e	e-01 4.43114357e-02-2.86617314e-05	3
9.30319894e-09-1.20761563e-12-2.99677086e	e+03 2.68182130e+01	4
c3h6cho-1 9/27/95 thermc 4h 7o 1	0g 300.000 5000.000 1379.000	31
1 202220540+01 1 624102720 02 5 54200124	A6 0 50772605A 10 / 00/50726A 1/	<u> </u>

Space constraints led to "creative" naming schemes



Notice hydroperoxypropan-2-one has two different names, often in the same mechanism file!

Space constraints led to "creative" naming schemes



- C3KET21 is generated from alkyl peroxy radical isomerization pathway
- CH3COCH2O2H is generated from low-temperature oxidation of acetone

Notice hydroperoxypropan-2-one has two different names, often in the same mechanism file!

Human-Computer team can identify species more quickly



- Our new tool uses RMG to generate reactions to compare with the target model
- A human reviews the evidence and confirms matches.

Identify small molecules first

- · Identify species with only one possible structure
 - CO₂
 - H₂O
 - C₃H₈
- Then species with "borrowed" thermochemistry
- Then boot-strap based on how these react

Identifying 'sc3h5co' from its reactions

- R1 sc3h5cho + o2 \neq sc3h5co + ho2
- R2 sc3h5cho + oh \neq sc3h5co + h2o
- R3 sc3h5cho + o \neq sc3h5co + oh
- R4 sc3h5cho + ch3 ≠ sc3h5co + ch4
- R5 sc3h5cho + h \Rightarrow sc3h5co + h2
- R6 sc3h5cho + ho2 ≠ sc3h5co + h2o2
- R7 sc3h5co ≠ c3h5-s + co



The first 6 reactions are all H-abstractions giving 4 possibilities for sc3h5co. The 7th reaction is beta-scission, also giving 4 possibilities.

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- R1 sc3h5cho + o2 \neq sc3h5co + ho2
- R2 sc3h5cho + oh \neq sc3h5co + h2o
- R3 sc3h5cho + o ≠ sc3h5co + oh
- R4 $sc3h5cho + ch3 \neq sc3h5co + ch4$
- R5 sc3h5cho + h \Rightarrow sc3h5co + h2
- R6 sc3h5cho + ho2 ≠ sc3h5co + h2o2
- R7 sc3h5co ≠ c3h5-s + co

$$0 + O_2 \neq HO_2 + sc3h5co$$

$$0 + OH \neq H_2O + sc3h5co$$

$$0 + OH \neq H_2O + sc3h5co$$

$$0 + OH \neq OH + sc3h5co$$

$$0 + OH + sc3h5co$$

$$0 + H + cH_2 + sc3h5co$$

$$0 + H + cH_2 + sc3h5co$$

$$0 + HO_2 \neq H_2O_2 + sc3h5co$$

$$sc3h5co \neq HC + cOO$$

The first 6 reactions are all H-abstractions giving 4 possibilities for sc3h5co. The 7th reaction is beta-scission, also giving 4 possibilities.

Identifying 'sc3h5co' from its reactions

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The first 6 reactions are all H-abstractions giving 4 possibilities for sc3h5co. The 7th reaction is beta-scission, also giving 4 possibilities.

Identifying 'sc3h5o' from its reactions

- R1 sc3h5cho + o2 \Rightarrow sc3h5co + ho2
- R2 sc3h5cho + oh \Rightarrow sc3h5co + h2o
- R3 sc3h5cho + o ≠ sc3h5co + oh
- R4 $sc3h5cho + ch3 \neq sc3h5co + ch4$
- R5 sc3h5cho + h \Rightarrow sc3h5co + h2
- R6 sc3h5cho + ho2 ≠ sc3h5co + h2o2
- R7 sc3h5co ≠ c3h5-s + co





By considering all seven reactions, we can deduce the most likely isomer.

'sc3h5o' is but-2-enoyl

Interact with a Web UI

- Computers make mistakes, and humans can see patterns
- All matches must be approved by an operator using a web user interface

Name	Molecule	$\Delta H^{\circ}_{f}(298K)$	Matching Thermo	
CH2O	$H_2C = 0$	0.9 kJ/mol	GRI-Mech3.0	confirm
HCO	HĊ= <mark>O</mark>	1.0 kJ/mol	-	confirm
HOCHO	ONOH	0.8 kJ/mol		confirm
C2H2	нс≡сн	-3.2 kJ/mol	-2- 5-	confirm
CH2CO	O=C=CH ₂	-3.0 kJ/mol	2	confirm



Two undergraduates this summer imported models from recent volumes of the journals Combustion & Flame and Proceedings of the Combustion Institute. More details on our poster.



Two undergraduates this summer imported models from recent volumes of the journals Combustion & Flame and Proceedings of the Combustion Institute. More details on our poster.

Identified 8,299 species from 58 models

- Malformed chemkin files
- Incorrect glossary entries
- 100 kJ/mol disagreements in enthalpies of formation
- 30 orders of magnitude disagreements in rates
- Only about 10% pressure-dependent

We frequently hear we can get 1 kJ/mol errors in energy and 30% in rate constants, yet our supplementary material differ by 100 kJ/mol and 10 respectively! These discrepancies are usually undetected.

Some recent developments in RMG

- Developer-friendly "RMG-Py" being released
 - New features (Nitrogen!)
 - Web tools
- Group-Additive Transition State Estimates
 - Fast estimates of TS geometries
 - Gets better at guessing the more it guesses
- Mechanism Importer tool
 - Facilitates identification of species in chemkin files
 - Started to collect and curate data

Richard H. West 4 August 2014





And of course, http://www.slideshare.net/richardhwest