Chemical networks (with modeling)

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Funded by the European Union

NanoSpace Astrochemistry Training School

Astrochemistry - strategy



Chemical models – gas and grain coupling

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Chemical models – grain surface processes

Surface processes :

- Thermal diffusion
- Tunneling
- Non-diffusion chemistry

Desorption:

- Thermal
- Cosmic-ray heating
- Chemical desorption
- Photpo-desorption
- Cosmic-ray sputtering

- ...

Photo-processes



Depending on species binding energies and diffusion energies. In most models diffusion energies are proportional to the binding energies

Chemical models – general considerations

Rate equation approximation (for surface reactions) -> each surface process is represented by a reaction

Solving differential equations for each species at each time step

$$\frac{dn_{i}(t)}{dt} = \sum_{l} \sum_{j} (k_{lj}n_{l}(t)n_{j}(t)) - n_{i}(t) \sum_{j} (k_{ij}n_{j}(t)) - k_{\text{ads},i}n_{i}(t)n_{\text{gr}} + (k_{\text{evap},i} + k_{\text{crd},i}) n_{i}^{s}(t), \quad (2.1)$$

$$\frac{dn_{i}^{s}(t)}{dt} = \sum_{l} \sum_{j} (k_{lj}n_{l}^{s}(t)n_{j}^{s}(t)) - n_{i}^{s}(t) \sum_{j} (k_{ij}n_{j}^{s}(t)) + k_{\text{ads},i}n_{i}(t)n_{\text{gr}} - (k_{\text{evap},i} + k_{\text{crd},i}) n_{i}^{s}(t), \quad (2.2)$$

Model parameters:

- Gas and dust temperature
- Irradiation fields (UV, secondary UV, cosmic-rays)
- Density of gas and dust
- Initial conditions (with elemental abundances)
- Geometry of the source
- Chemical network (and many parameters for surface processes)
- ++++

Chemical networks

Chemical networks:

List of chemical reactions (including surface processes and gas-grain interactions.

Each reaction is associated with a number of parameters tabulated to compute the rate coefficients in the conditions of the simulations (can be T dependent, UV or cosmic-ray dependent etc).

As an example, in the chemical networks provided with Nautilus:

584 chemical species

7667 gas-phase chemical reactions

4837 grain-surface reactions and gas-grain interactions (absorption, desortion reactions)

Chemical models – general considerations



Chemical models – general considerations



Chemical models – importance of surface processes



Chemical models – importance of surface processes



Chemical models – importance of surface processes



Parameters uncertainties for 0D a gas-phase chemical models:

Gas temperature and density, elemental abundances, initial conditions, cosmic-ray ionization rate, reaction rate coefficients.



Theoretical error bars Comparison with observations

Reliability of the models Model improvements



Parameters uncertainties for 0D a gas-phase chemical models:

Gas temperature and density, elemental abundances, initial conditions, cosmic-ray ionization rate, reaction rate coefficients.



HC₇N gas-phase abundance in a typical dark cloud



HC₇N gas-phase abundance in a typical dark cloud – With error bars due to rate coefficient uncertainties



Comparison with observations:

- Find which molecules are really not reproduced by the model to look for missing processes or wrong chemistry.

- Constrain "best models" (i.e. sets of parameters)



Parameters uncertainties for 0D a gas-phase chemical models:

Gas temperature and density, elemental abundances, initial conditions, cosmic-ray ionization rate, reaction rate coefficients.



For example: finding the most crucial parameters

-> Mean standard on the chemical abundances while varying each parameter individually

$$\sigma(t) = \sqrt{\frac{1}{N} \sum_{n=1}^{N} (\log(X_n(t)) - \overline{\log(X(t))})^2}$$



Sensitivity analysis are also for grain processes

Variation of the ratio between binding and diffusion energies between 0.25 and 0.75.

→ Iqbal et al. (2018)

Other references: Penteado et al. 2017 ++



~8000 gas-phase reactions and ~500 species

Most of them not studied in the lab but they are not all important.

Reaction that produces most or destroys most a species.

Complicated because :

- Depends on the rate coefficient itself but also abundance of the reactants
- → Depends on time
- Physical parameters
- Chemical network

$$\frac{dn(i)}{dt} = \sum_{l} \sum_{j} k_{l,j} n(l) n(j) - n(i) \sum_{m} k_{i,m} n(m)$$
Flux producing the molecule

Identification of the most important reaction for O_2 : $OH + O \rightarrow O_2 + H$

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VALUES USED FOR RATE COEFFICIENT k ₁ at 10 K		
$k_1 (\text{cm}^3 \text{ s}^{-1})$	Remarks	Reference
$\begin{array}{c} 1.76 \times 10^{-10} \\ 3.5 \times 10^{-11} \\ 7.84 \times 10^{-12} \\ 5.4 \times 10^{-13} \end{array}$	osu.1.2007 Experimental (39–142 K) Theoretical without <i>J</i> -shifting Theoretical with <i>J</i> -shifting	Smith et al. (2004) Carty et al. (2006) This work Xu et al. (2007b)





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Quan et al. 2010

Identification of the most important reaction for O_2 : $OH + O \rightarrow O_2 + H$

TABLE 2 Values Used for Rate Coefficient k_1 at 10 K		
$\frac{k_1}{(\text{cm}^3 \text{ s}^{-1})}$	Remarks	Reference
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 $\rightarrow\,$ main reaction of destruction of OH



Quan et al. 2010

How does CO form ?

Main reactions for CO at 1e5yr :

	PRODUCTION (cm-3 s-1)		
8	HCO+ + e> H + CO	2.6566927E-13	84.6%
4	C + O2 -> O + CO	1.0045830E-14	3.2%
4	H20 + HCO+ -> CO + H3O+	6.8215483E-15	2.2%
4	02 + C+ -> CO + O+	3.3839354E-15	1.1%
	DESTRUCTION (cm-3 s-1)		
4	CO + H3+ -> H2 + HCO+	2.4430818E-13	54.6%
99	CO -> JCO	1.4877065E-13	33.3%
4	CO + He+ -> He + O + C+	2.3702264E-14	5.3%
4	CO + H3+ -> H2 + HOC+	1.4322406E-14	3.2%
4	C0 + CH5+ -> CH4 + HCO+	6.2696774E-15	1.4%







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Main reactions for HCO+ at 1e5yr :

	PRODUCTION (cm-3 s-1)		
4	C0 + H3+ -> H2 + HC0+	2.4430818E-13	86.6%
4	H2 + H0C+ -> H2 + HCO+	1.9626701E-14	7.0%
4	CO + CH5+ -> CH4 + HCO+	6.2696774E-15	2.2%
4	CO + N2H+ -> N2 + HCO+	4.4706682E-15	1.6%
4	H2 + CO+ -> H + HCO+	2.9677614E-15	1.1%
	DESTRUCTION (cm-3 s-1)		
8	HCO+ + e> H + CO	2.6566927E-13	94.2%
4	H20 + HCO+ -> CO + H3O+	6.8215483E-15	2.4%





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4	H20 + HC0+ -> C0 + H30+	6.8215483E-15	2.2%
4	02 + C+ -> CO + O+	3.3839354E-15	1.1%
	DESTRUCTION (cm-3 s-1)	
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Many reactions contribute to the formation of CO.

Reaction which variation in rate coefficient impacts the most one species.

- Independent random variation of all rate coefficients (within a factor)
- Compute coefficient correlation







Reaction which variation in rate coefficient impacts the most one species.

- Independent random variation of all rate coefficients (within a factor)
- Compute coefficient correlation
- Best way to identify indirect impact

Table 3 List of key reactions by number of species influenced.

Reaction	Strongly affected species ¹
$C + H_2 \rightarrow CH_2 + h\nu$	73
$\mathrm{CH}_3^+ + \mathrm{H}_2 \to \mathrm{CH}_5^+ + \mathrm{h}\nu$	18
$C_2H_2^+ + H_2 \rightarrow C_2H_4^+ + h\nu$	$C_2H_2O, C_2H_3, C_2H_2^+, C_2HO^+, C_2H_2N^+, C_2H_4^+$
$CH_3^+ + CO \rightarrow C_2H_3O^+ + h\nu$	$C_2H_2O, C_2H_3O^+$
$C_2H_4^+ + e^- \rightarrow C_2H_3 + H$	C_2H_2O, C_2H_3
$HSiO^+ + e^- \rightarrow SiO + H$	Si, SiO
$HSiO^+ + e^- \rightarrow Si + OH$	Si, SiO
$C_3H^+ + H_2 \rightarrow C_3H_3^+ + h\nu$	$C_{3}H_{2}, H_{2}C_{3}, C_{3}H^{+}, C_{3}H_{2}^{+}, C_{3}H_{3}^{+}, H_{3}C_{3}^{+}$
$C_3H^+ + H_2 \rightarrow H_3C_3^+ + h\nu$	$C_{3}H_{2}, H_{2}C_{3}, C_{3}H^{+}, C_{3}H_{2}^{+}, C_{3}H_{3}^{+}, H_{3}C_{3}^{+}$
$CH_3^+ + HCN \rightarrow C_2H_4N^+ + h\nu$	C_2H_2N , HC_3N , C_2H_3N , $C_2H_4N^+$
$C_4H_2^+ + H \rightarrow C_4H_3^+ + h\nu$	$C_4H_2, C_5H, C_6H_6, C_4H_3^+$
$\mathrm{CH}_3^+ + \mathrm{NH}_3 \to \mathrm{CH}_6\mathrm{N}^+ + \mathrm{h}\nu$	CH_3N, CH_5N
$C_4 \tilde{H}_2^+ + O \rightarrow HC_4 O^+ + H$	C_3O, HC_4O^+

¹Right column indicates the number or names of the species influenced strongly by each reaction. Wakelam et al. (2010)

List of reactions with largest correlation coefficients for species with abundance larger than 1e-12 at 1e5 yr ('last kida.uva network).

Reactions	Impacted species
$H_2 + CR \rightarrow H_2^+ + e_2^-$	187
$He^+ CR \rightarrow He^+ + e^-$	49
$C_3 + CRP \rightarrow C + C_2$	30
$C + C_3 \rightarrow C_4 + Photon$	CCH, C3, CCO, HCO, OCN, C2H2, c-C3H, C3N, C3O, C3S, 1-C3H, c-C3H2,
	HC3N, HNCCC, 1-C3H2, HC3S, HC3O, HC4N, C5O, C3H+, CH3+, c-C3H2+,
	HC3O+, SiC3H+, HC3NH+, c-C3H3+, H2C3O+, 1-C3H3+, H2C3S+, C5H3+
$O + CN \rightarrow N + CO$	N, CN, N2, NC6N, NC8N, N2H+
$H_2 + CH_3^+ \rightarrow CH_5^+ + Photon$	CH4, SiCH3, CH2CCH, C4H3, C2H3+, CH5+
$CO + H_3^+ \rightarrow H_2 + HCO_+$	OH+, H2F+, H2O+, H3+, H3O+
$H_2 + Si^+ \rightarrow SiH_2^+ + Photon$	SiH, SiS, HNSi, SiH2+
$O + H_3^+ \rightarrow H_2 + OH +$	OH+, H2O+, H3O+
$c-C_3H_2^- + Si^+ \rightarrow H + SiC_3H^+$	c-SiC2, 1-SiC3, SiC3H+
$C + NH_3 \rightarrow H_2CN + H$	NH3, CH3NH2, CH3NH3+
$H_3O^+ + e^- \rightarrow H + H + OH$	H2O, HCOOH, H3O+
$HF + C^+ \rightarrow H + CF^+$	HF, CF+
$S + CH_3 \rightarrow H + H_2CS$	H2CS, HCCS
$CO + He^+ \rightarrow He + O C+$	He+, NH4+
$N + CN \rightarrow C + N_2$	N, N2
$O + CCH \rightarrow CH + CO$	CCH, CCO
$Cl + H_3^+ \rightarrow H_2 + HCl+$	Cl, HCl
$C + C_5 O \rightarrow CO + C_5$	C50, HC50+
$C + H_2CO \rightarrow CO + CH_2$	HS, H2CO
$Mg + HCO^+ \rightarrow HCO + Mg^+$	Mg, Mg+
$H_2 + C_2H_2^+ \rightarrow C_2H_4^+ + Photon$	C2H2+, C2HO+
$H_2 + C_3 H^{\mp} \rightarrow l - C_3 H_3^{+} + Photon$	C3H+, 1-C3H3+
$H_2 + C_3H^+ \rightarrow c-C_3H_3^+ + Photon$	C3H+, 1-C3H3+
$NH_3 + CH_3^+ \rightarrow CH_3NH_3^+ + Photon$	CH3NH2, CH3NH3+
$C_2H_4^+ + e^- \rightarrow H + C_2H_3$	C2H3, CH3CO
$HC_3NH^+ + e \rightarrow H + HNCCC$	HNCCC, C3N-
$CF^+ + e^- \rightarrow C + F$	HF, CF+
$HCS^+ + e^- \rightarrow S + CH$	HCS+, OCS+
$SiNC^+ + e^- \rightarrow Si + CN$	SiN+, SiNC+
$NH_4^+ + e^- \rightarrow H + NH_3$	NH2, NH4+
$C_5H + e^- \rightarrow C_5H^- + Photon$	C5H2, C5H-

Finding weird behaviors with sensitivity analysis



 \rightarrow Bistability means that the system can exist in two different stable states.

 \rightarrow Bistability means that the system can exist in two different stable states.

→ In chemistry, it means that a system can evolve in two different states of equilibrium for the same set of physical parameters but depending on the initial conditions.



What do I call initial conditions in this case?

 \rightarrow Bistability means that the system can exist in two different stable states.



 \rightarrow Bistability means that the system can exist in two different stable states.



 \rightarrow Bistability means that the system can exist in two different stable states.









References :

- Pineau des Forêts et al. (1992)
- Le Bourlot et al. (1993, 1995a,b)
- Shalabiea & Greenberg (1995)
- Wakelam et al. (2006)
- Dufour (2019, 2021, 2023)
- + many more

Databases of chemical reactions

Interstellar medium : UMIST/UDFA (http://www.udfa.net/), KIDA (https://kida.astrochem-tools.org) Meudon databases (PdR, Shock ...)

Planetary atmospheres :

NASA-JPL Chemical Kinetics and Photochemical Data for Use in Atmospheric Studies http://jpldataeval.jpl.nasa.gov/ Critical reviews from Journal of Physical and Chemical Reference Data (Atkinson et al., Baulch et al., Herron et al., Tsang et al.,...) http://www.nist.gov/srd/reprints.htm

General databases :

NIST http://kinetics.nist.gov/kinetics/index.jsp, Anicich (ion-neutral) - word or pdf documents

Photo-dissociations :

- * Database from LISA http://w3.lisa.univ-paris12.fr/GPCOS/SCOOPweb/SCOOP.html
- * Harvard-Smithsonian Center for Astrophysics Molecular Data http://www.cfa.harvard.edu/amp/tools.html
- * MPI-Mainz-UV-VIS Spectral Atlas of Gaseous Molecules http://www.atmosphere.mpg.de/enid/2295
- * science-softCon UV/Vis+ Spectra Data Base (UV/Vis+Photochemistry Database) http://www.uv-spectra.de/
- * SWRI Photo cross sections and rate coefficients http://amop.space.swri.edu/

The KInetic Database for Astrochemistry http://kida.astrochem-tools.org/



•Database of chemical reactions and associated parameters for the interstellar medium and planetary atmospheres

•Uncritical compilation of data with detailed information (uncertainties, temperature range, bibliographic reference, etc)

•Online consulting interface

•Form to download list of reactions

•You can contribute by submitting data with cvs templates

•Subsets of chemical reactions for specific applications (Titan atmosphere, Hot Jupiters, ISM)

The KInetic Database for Astrochemistry http://kida.astrochem-tools.org/

For gas-phase reactions:

Temperature dependent partial reaction rate coefficients for bimolecular reactions
Photodissociation and ionisation rates (integrated over the ISRF radiation field)
Photodissociation and ionisation rates due to UV photons induced by cosmic-ray particles (Prasad-Tarafdar mechanism)

•Direct dissociation and ionisations rates by cosmic-ray particles

For surface reactions:

- Possible pathways (with branching ratios)
- Activation energies and barrier width

For species:

- Polarizability, dipole moment and enthalpy of formation
- Diffusion and desorption energies

Comparing gas-phase chemical networks

udf2006 from UMIST osu-01-2009 kida.uva.2011



Reduced networks

Why reducing the networks :

- To have a fast model to couple the chemistry with hydrodynamics
- To run grids of models to compare with observations

Many solutions proposed in the literature:

Estimate the significance of particular species or reactions -> Wiebe et al. (2003) Flux-reduction scheme -> Grassi et al. (2012) Iterative sensitive method -> Xu et al. (2009) Using autoencoders -> Grassi et al. (2022)

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However, reduced networks come weaknesses:

- loss of precision (not necessarily a problem)
- valid over a range of conditions.
- valid for a limited number of species.

Emulators of chemical models

- Using grids of gas-grain models to teach neural networks the chemical abundances as a function of time.
- Get a fast emulator of interstellar chemistry over the conditions used for the training.

- What are the main characteristics of the source?
 - Important chemical processes to include
 - Geometry to consider
- What scenario (time evolution?)?
 - If you do not have the full history : different steps of the modeling to simulate the different steps.
- What are the approximations and are they negligeable?



Exercise: I want to model the diffuse medium.



Exercise: I want to model the diffuse medium.



Exercise: I want to model a cold core.



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Exercise: I want to model a proto-stellar envelop.



Exercise: I want to model a proto-stellar envelop.



Exercise: I want to model a proto-stellar envelop.

- Need to think about the scenario:
 - Pre-collapse phase (what conditions, how long...)
 - Infall phase (how does the temperature and density increase? For how long?)
 - Deal with the formation of H₂

Example:

- Step 1 of pre-collapse (start from atoms, run the model for cold core conditions for 10⁵ or 10⁶ yrs)
- Step 2 : isothermal free-fall (increase of the density with a low temperature)
- Step 3: warm-up phase (increase of the temperature with a high density).

Example : Garrod & Hersbt (2006)



Classic approach:

- Hypothesis: physical conditions evolve faster than chemistry.
- Atomic initial conditions (except for H2)
- Keep physical conditions contant (10K, 10⁴cm⁻³)
- Compute time dependent chemical abundances

Is this approach valid?







Extracting the physical conditions for parcels forming cold cores.

Post-process computation of the chemistry for each parcel at each time step.

Classic approach:







Ruaud et al. 2018

Reservoirs of oxygen, nitrogen and sulphur



Take home messages

- In interstellar chemistry, grain-surface reactions need to be considered even though very uncertain.
- Complicated to identify key reactions. So complicated to know in advance if a new rate coefficient estimate will change the model or not.
- The more processes in a network the more stable it will be.
- Different public networks will have different results.
- Your model predictions will depend on the network but also on the physical conditions and their time evolution.