Py4CAtS — PYthon for Computational ATmospheric Spectroscopy

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Introduction

Why radiative transfer?
- Sensitivity studies: detectability of molecules, etc.
- Forward model for atmospheric inverse problems

Why line-by-line (lbl)?
- Modeling and analysis of high resolution spectra
- "Training set" and benchmark for parameterized models

Why Python?
- Rapid prototyping
- Most (?) lbl models kind of "black-box"
- Difficult to see intermediate quantities

InfraRed Radiative Transfer

Schwarzschild equation: $\boldsymbol{I}(\nu)$ radiance/intensity at wavenumber ν

$$\boldsymbol{I}(\nu) \;=\; \boldsymbol{I}_\mathrm{b}(\nu)\,\mathrm{e}^{-\tau_\mathrm{b}(\nu)} \;+\; \int_0^{\tau_\mathrm{b}(\nu)} \boldsymbol{B}(\nu, \boldsymbol{T}(\tau'))\,\mathrm{e}^{-\tau'}\,\mathrm{d}\tau'$$

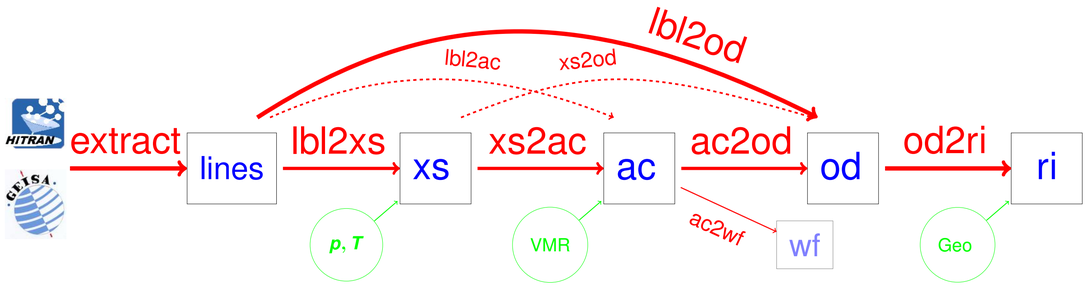
Beer's law: transmission $\mathcal{T}$ and optical depth τ

$$\mathcal{T}\,(\nu, \boldsymbol{s}) = \mathrm{e}^{-\tau} = \mathbf{exp}\left(-\int_0^{\boldsymbol{s}} \mathrm{d}\boldsymbol{s}' \sum_{\boldsymbol{m}} \boldsymbol{k}_{\boldsymbol{m}}\,(\nu, \boldsymbol{p}(\boldsymbol{s}'), \boldsymbol{T}(\boldsymbol{s}'))\;\boldsymbol{n}_{\boldsymbol{m}}(\boldsymbol{s}')\right)$$

Absorption coefficient α and cross section $\boldsymbol{k}$: line-by-line

$$\boldsymbol{k}(\nu, \boldsymbol{p}, \boldsymbol{T}) = \sum_{\boldsymbol{l}} \boldsymbol{S}_{\boldsymbol{l}}(\boldsymbol{T})\;\boldsymbol{g}(\nu;\, \hat{\nu}_{\boldsymbol{l}}, \gamma_{\boldsymbol{l}}(\boldsymbol{p}, \boldsymbol{T}))$$

Line shape function $\boldsymbol{g}$: Voigt, Lorentz, VVH, VVW, ...
Line parameters: position $\hat{\nu}_{\boldsymbol{l}}$, strength $\boldsymbol{S}_{\boldsymbol{l}}$, width(s) $\gamma_{\boldsymbol{l}}$, ...



Py4CAtS — Implementation

- (Numeric and Scientific) *Python* version of Fortran 2008 "Generic Atmospheric Radiation Lbl Ir Code" GARLIC [4]
- Series of scripts for IR & μWave radiative transfer, e.g.,
  - `extract` lines of relevant molecules in the spectral range of interest
  - `lbl2xs` line-by-line cross sections for given pressure(s) & temperature(s)
  - `xs2ac` multiply cross sections with densities and sum over all molecules
  - `ac2od` integrate absorption coefficients along line-of-sight to optical depth
  - `od2ri` integrate Schwarzschild eq. along line-of-sight to radiance/intensity
  - `ac2wf` compute weighting functions $\partial\mathcal{T}/\partial\boldsymbol{z} \propto \alpha\mathcal{T}$
  - ..... and some shortcuts, e.g., `lbl2ac` or `lbl2od`
- *New:* functions accessible within (I)Python shell
- Sub-classed numpy arrays `xsArray`, `acArray`, `odArray`, ... for cross sections, absorption coefficients, optical depths, ... to store "spectra" along with attributes (e.g. `xs.p` and `xs.t`)
- Numerics:
  - Complex error function: Humlíček [1] – Weideman [5] combination [3]
  - Multigrid line-by-line (fine grid near line center only) [2]
  - Schwarzschild integral: $\boldsymbol{B}$ linear or exponential in τ
- Limitations:
  - Plots for quicklook only, not "publication-ready"
  - Plane-parallel atmosphere, no scattering, continua, ...
  - No "package" yet, no distutils etc. (coming soon)

References:

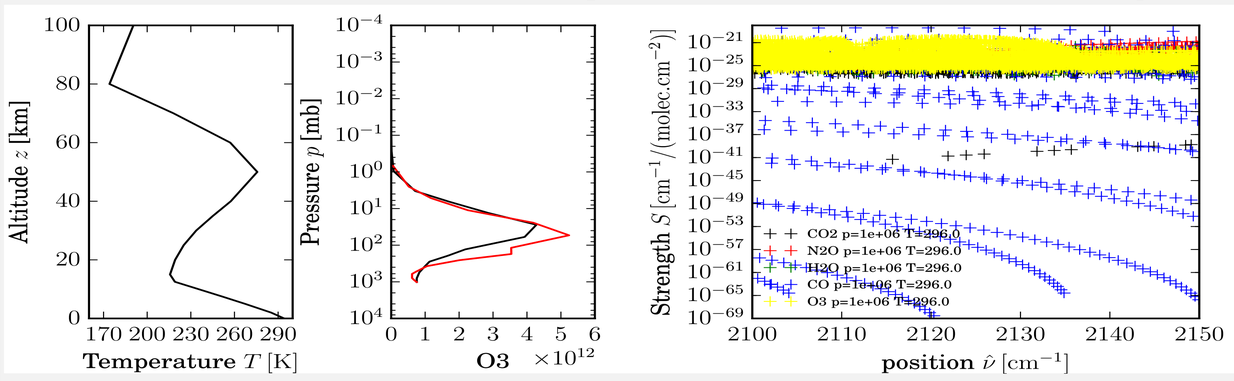
[1] J. Humlíček. Optimized computation of the Voigt and complex probability function. *JQSRT*, 27:437–444, 1982.
[2] F. Schreier. Optimized evaluation of a large sum of functions using a three-grid approach. *Comp. Phys. Comm.*, 174:783–802, 2006.
[3] F. Schreier. Optimized implementations of rational approximations for the Voigt and complex error function. *JQSRT*, 112:1010, 2011.
[4] F. Schreier, S. Gimeno García, P. Hedelt, M. Hess, J. Mendrok, M. Vasquez, and J. Xu. GARLIC – a general purpose atmospheric radiative transfer line-by-line infrared-microwave code: Implementation and evaluation. *JQSRT*, 137:29–50, 2014.
[5] J.A.C. Weideman. Computation of the complex error function. *SIAM J. Num. Anal.*, 31:1497–1518, 1994.

http://atmos.eoc.dlr.de/tools/Py4CAtS/

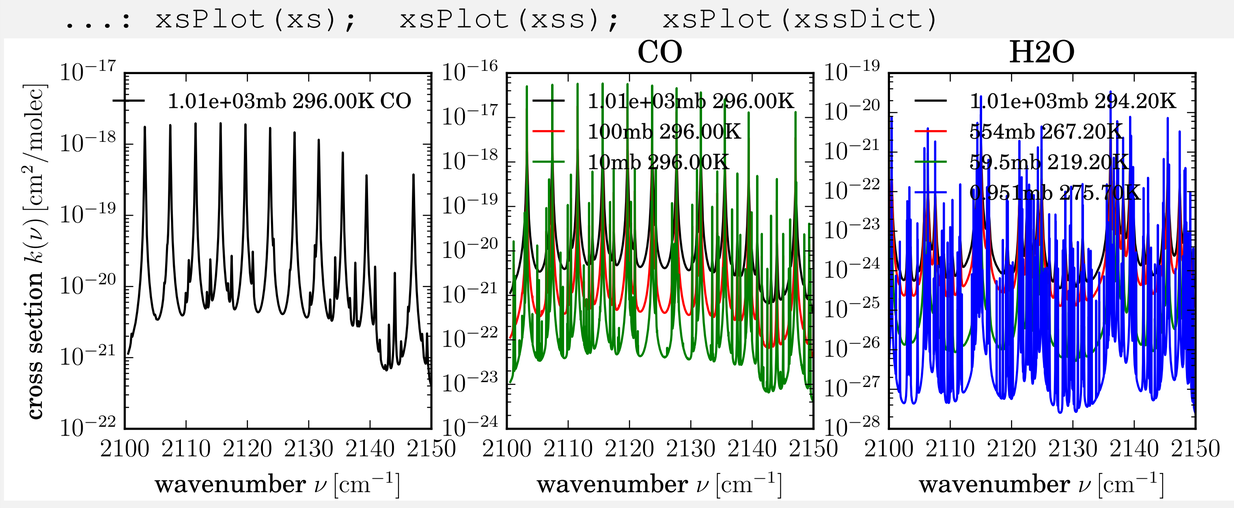
IPython Demo

(output largely deleted)

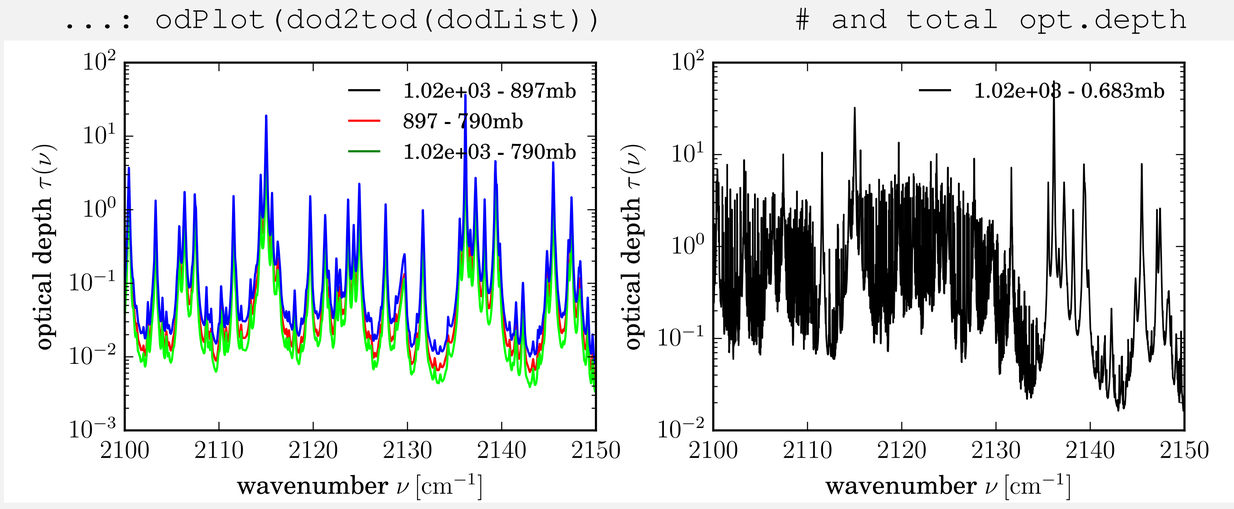
```
Python 2.7.3 (default, Apr 14 2012, 08:58:41) [GCC]
IPython 2.0.0 -- An enhanced Interactive Python.

In[1]: # get two mid latitude atmospheres
  ...: mls = atmos1D('/data/atmos/20/mls.xy')
  ...: mlw = atmos1D('/data/atmos/20/mlw.xy', zToA=50)

Atmos1d: got p, T, air and 7 gases at 20 levels
Atmos1d: got p, T, air and 7 gases at 16 levels

In [2]: # IASI microwindow for CO retrieval: HItran-GeiSa-exTRACT
   ...: dictLineLists = higstract('/data/geisa/87/lines',
                                  (2100,2150), molecule='main')
9771  lines of  5  molecule(s), returning a dictionary

In [3]: atmPlot(mls);  atmPlot([mls,mlw], 'O3', 'mb')
   ...: atlas(dictLineLists) # plot line data (default strength)
```




```
In [4]: # CO cross section at database pressure and temperature
   ...: xs  = lbl2xs(dictLineLists['CO'])
   ...: # a list of cross sections for three pressures
   ...: xss = lbl2xs(dictLineLists['CO'], [1013,100,10,'mb'])
   ...: # a dictionary of x-section lists (for all p, T, gases)
   ...: xssDict = lbl2xs(dictLineLists,mls['p'],mls['T'])
   ...: # ... and some plots (not all are shown here)
   ...: xsPlot(xs);  xsPlot(xss);  xsPlot(xssDict)
```




```
In [5]: # proceed step-by-step
   ...: acList  = xs2ac(mls, xssDict) # absorption coefficients
   ...: odList = ac2od(acList)        # delta optical depths

In [6]: # alternatively bypass intermediate quantities, e.g.
   ...: odList = lbl2od(mls,dictLineLists)  # delta opt.depths

In [7]: # sum/combine optical depths and plot
   ...: odPlot([odList[0], odList[1]])  # the bottom layers,
   ...: odPlot(odList[0]+odList[1])     # ... their sum,
   ...: odPlot(od2tod(odList))          # and total opt.depth
```




```
In [8]: # radiation intensity seen by uplooking observer at BoA
   ...: vGrid, radUp = dod2ri(odList)
   ...: # and downlooking observer at ToA (incl. surface @ 294K)
   ...: vGrid, radNadir = dod2ri(odList, 180, 294.2)
```

"Main" functions can be used from Unix (Windows?) console, too!

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