# Ensemble Forecast

#### Polyphemus Training Session

May 15, 2007

## About

 ${\bf Purpose:}\ {\rm generation}\ {\rm of}\ {\rm ensembles},\ {\rm Monte}\ {\rm Carlo}\ {\rm simulations},\ {\rm ensemble}\ {\rm combination}$ 

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Polyphemus version: 1.1

Location: http://www.enpc.fr/cerea/polyphemus/sessions.html

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## Introduction

Among Polyphemus specific features, there is uncertainty analysis through ensemble forecasts. This explains why the system is made of many parts (see Figure 1).

A simulation is defined by

- its input data (raw data such as land use cover);
- the physical parameterizations used to compute new fields, that is, the physical formulation;
- the numerical algorithms.

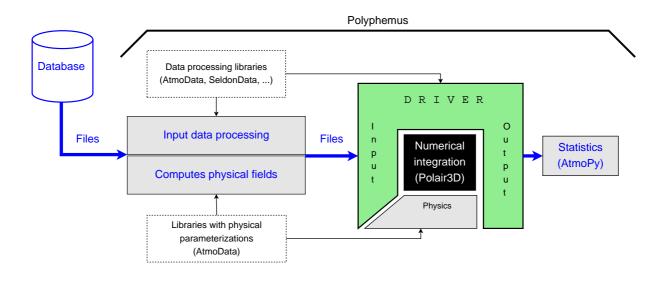


Figure 1: Polyphemus overall work flow. Data is first processed with dedicated C++ libraries (mainly SeldonData and AtmoData). The library AtmoData provides in addition most physical parameterizations needed in the preprocessing step. The preprocessing step output most coefficients of the reactive-transport equation. The numerical model (e.g., Polair3D) integrates in time this equation, and a driver manages the numerical model (e.g., to perform data assimilation). For post-processing (statistics, visualization, ...), Python scripts and the Python library AtmoPy are used.

Each part may be modified in Polyphemus with changes in preprocessing and in the model itself.

Preprocessing of data is split into several programs on purpose. It increases the flexibility of the system. Several programs can be written and executed in order to propose alternative parameterizations for a given field. For instance, vertical diffusion may be computed with Louis parameterization (in preprocessing/meteo/MM5-meteo or preprocessing/meteo/Kz) or with Troen&Mahrt parameterization (in preprocessing/meteo/Kz\_TM). Furthermore, several input data are supported: primarily USGS and GLCF for land use cover, and ECMWF and MM5 for meteorological fields. Finally the programs have options that may be easily changed (minimum vertical diffusion, ground flux calculations, ...). Almost all parameterized fields are preprocessed; they are outside the transport model to preserve flexibility and save computation costs in ensemble simulations.

Polyphemus is platform built to include several models. These models can be included in ensemble forecasts. They can be plugged into drivers such as a Monte Carlo driver to further describe uncertainties.

In this training session, it will be shown how to create new ensemble members based on preprocessing choices (Section 1) and model changes (Section 2). Monte Carlo simulation will be performed in Section 3. Finally the ensemble forecasting through linear combination of models will be explained (Section 4).

#### 1 Preprocessing

In this section, two parameterizations are replaced in the reference simulation:

• the vertical diffusion parameterization;

• the deposition parameterization.

#### 1.1 Test Case

All configurations files used to generate the test case are in polyphemus-sessions/ensemble/config/. You may find configuration files from luc-glcf.cfg (luc-glcf is the very first step) to polair3d.cfg (for the simulation).

The commands of the preprocessing steps are provided in file commands.txt. The raw input data are not provided (boundary conditions, meterological files, ...), but one should be able to download them (possibly for an other period), following the user's guide instructions. You may use the MM5 file distributed with the Polyphemus test case (see http://www.enpc.fr/cerea/polyphemus, section "Eulerian Test Case").

Run the reference simulation with Polair3D, using polair3d.cfg.

#### 1.2 Vertical Diffusion

The vertical diffusion coefficients have been generated with Louis parameterization by MM5-meteo. We now want to use Troen&Mahrt parameterization. Generate vertical diffusion coefficients with Troen&Mahrt parameterization. Run the Eulerian model with it. Compare the results in IPython. The file polyphemus-sessions/ensemble/config/disp.cfg has been provided for convenience.

#### **1.3** Deposition Velocities

Deposition velocities have been generated with Zhang parameterization, with program dep. Use this program to generate deposition velocities using Wesely parameterization. Do not forget to change the path of the output files. You may save the new deposition velocities in polyphemus-sessions/ensemble/data/dep/wesely/. Perform a simulation using Wesely deposition velocities and Louis parameterization for vertical diffusion. Generate results with Troen&Mahrt parameterization too.

Since all preprocessing steps are well split, it is possible to make many changes from the reference configuration and to combine these changes.

### 2 Model Changes

Eulerian models include modules for transport (advection and diffusion) and chem-These modules may be changed: it is therefore possible to change the chemistrv. ical mechanism or to change the numerical algorithms. We illustrate this with RADM. Open polyphemus-sessions/Polyphemus-1.1/driver/polair3d-radm.cpp. This program is the same as polair3d.cpp except that it relies on RADM. Compare polair3d-radm.cpp and polair3d.cpp. Compile it (make -f makefile-radm polair3d-radm) and launch the simulation. The  $\operatorname{main}$ configuration file is polyphemus-sessions/ensemble/config/polair3d-radm.cfg.

If you are interested in the implementation, you may have a look in polyphemus-sessions/Polyphemus-1.1/include/modules/chemistry/ChemistryRADM.cxx (module) and in polyphemus-sessions/Polyphemus-1.1/include/models/Polair3DChemistry.cxx (model).

### 3 Monte Carlo Simulations

At model level, it is possible to take into account uncertainties in the input data with Monte Carlo simulations. A driver called MonteCarloDriver is used by polyphemus-sessions/Polyphemus-1.1/driver/polair3d-mc. Its main configupolyphemus-sessions/ensemble/config-mc/polair3d-mc.cfg ration files are and polyphemus-sessions/ensemble/config-mc/perturbation.cfg. Open and read these files. Compile polair3d-mc.

File polair3d-mc.cfg includes a section [MonteCarlo] where the number of members in the ensemble is set. Section [save] differs from usual output saver sections. It uses a saver unit of type ensemble\_prediction which allows to save concentrations of all ensemble members.

File **perturbation.cfg** is described in the user's guide, in the section about the perturbation manager (drivers chapter).

Launch a Monte Carlo experiment. Perform other simulations with different numbers of members in the ensemble, and with different perturbations. It is advocated to save the results (copy directory results/) in order to compare them in IPython.

Display the results: time evolution of all members at some point in the domain, and map of the standard deviation of the ensemble. You should read and launch polyphemus-sessions/ensemble/config-mc/load\_ensemble.py. The standard deviation of the ensemble may be computed with the AtmoPy function stat.spatial\_distribution. Help about this function may be found in AtmoPy documentation (http://www.enpc.fr/cerea/ polyphemus/doc/atmopy/index.html, module atmopy.stat.miscellaneous) or in IPython with command help stat.spatial\_distribution.

### 4 Models Combination

Models combinations (superensembles, machine learning agregation) may be performed with AtmoPy. Help about these features may be found in AtmoPy documentation (http://www.enpc.fr/cerea/polyphemus/doc/atmopy/index.html, module atmopy.ensemble). There is no further description in this session because no ensemble forecast at hand can be distributed (rights limitations at meteorological level – ECMWF data).