

A Quick Introduction to TMM

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Abstract

This document goes through how to use the Transport Matrix Model (TMM) using computational resources at the University of Minnesota's Minnesota Supercomputing Institution (MSI). All the source codes and documents (including this tutorial) that Tanioka made to TMM is available at my github website (https://github.com/tanio003/tmm/tree/TT_Release).

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1 Setting up

1.1 Flow Chart

Before you do anything, read "README.txt" by Samar Khatiwala at the following website:

<https://github.com/samarkhatiwala/tmm>. I will go over each of these steps specifically aimed at audiences using the computational cluster *Mesabi*.

1. Installing and configuring PETSc
2. Downloading all the scripts and transport matrices into your own local directory
3. Compiling the model (we use the BGC model MOPS2 for this example)
4. Running the model
5. Processing the model outputs
6. Displaying the model outputs

1.2 Steps

1.2.1 Step 0: Logging into MSI and Mesabi

Open the terminal (assuming that you have a MAC or Linux environment) on your computer and log in to MSI with your x500 account:

```
$ ssh -Yt youremail@umn.edu
```

Log in to Mesabi:

```
$ ssh -X mesabi
```

Make a new directory called TMM2 in your home directory and enter into this directory. Everything related to TMM will go into this directory.

```
$ mkdir TMM2
$ cd TMM2
```

1.2.2 Step 1: Installing and configuring PETSc

Download the latest version of PETSc and save it in your TMM2 directory and unzip this package. If opened properly, you should see the new directory petsc-3.13.5.

```
$ wget http://ftp.mcs.anl.gov/pub/petsc/release-snapshots/petsc-lite-3.13.5.tar.gz
$ tar -xvf petsc-lite-3.13.5.tar.gz
$ ls
petsc-3.13.5
```

Import the required modules: (1) impi, (2) impi/intel, and (3) cmake. Also make sure that you are using python 3, not python 2 (= default for MSI).

```
$ module purge
$ module load intel
$ module load impi/intel
$ module load cmake
$ module load python3
$ module list
Currently Loaded Modulefiles:
 1) intel/2018.release(default)   4) cmake/3.10.2(default)
 2) intel/2018/release           5) python3/3.7.1_anaconda
 3) impi/intel(default)
```

Set up \$PETSC_DIR to your petsc-3.13.5 directory. For your future uses, I would advise you to set \$PETSC_DIR in your .bashrc as well.

```
$ export PETSC_DIR=$HOME/TMM2/petsc-3.13.5
$ echo $PETSC_DIR
/.../TMM2/petsc-3.13.5
```

Configure PETSc. Although this part is quite tricky you can copy and use my config file “reconfigure-arch-linux-c-opt.py”. If the config file does not work properly, let me know and I can show you a way to compile without using this .py file.

```
$ cd petsc-3.13.5
$ cp ~/../tanio003/TMM2/petsc-3.13.5/config/reconfigure-arch-linux-c-opt.py config/
$ config/reconfigure-arch-linux-c-opt.py
```

Don’t worry about some warning signs. It takes few minutes to compile. If it’s compiled properly you should see the notice “Configure stage complete.” Then build PETSc library:

```
$ make all
```

Building process takes about 15-30 minutes. If you’re very lucky it will go through in a single shot. But in most cases, it fails during the middle of the process. Don’t worry if it fails the first time. Simply type “\$ make all” again and hopefully it will finish building from where it left off. If built properly, you should see the message “Now to check if the libraries are working do:...”. Then type,

```
$ make check
...
Completed test examples
```

If you get this far, you’ve managed to build the PETSc successfully and you’re ready to go to the next step. If it failed, read the error messages, debug, and try again. **Building PETSc is harder than it looks** so you need to be patient.

As more of a technical note, the procedure above uses the Intel compilers and Intel MPI library. By loading the cmake, the PETSc build system can learn more about the host machine. In addition to taking advantage of compiler optimizations and vectorization, the procedure above builds PETSc against the Intel Math Kernel Library (MKL)

for BLAS, LAPACK and ScaLAPACK which gives a performance gain over the reference implementations. For the FORTRAN compiler, we specifically need to use `mpifort`, and not `mpif90` (the default compiler), because TMM codes are written in both F77 and F90. Also, since we don't require C++ for TMM we put the flag in the config file, `--with-cxx=0`. The reason we need to use MPI compilers, not regular gcc compilers, is because we want to run PETSc in a parallel mode (i.e., by using the command `mpiexec` in the runscript). For more details about building PETSc please check out <https://www.mcs.anl.gov/petsc/documentation/installation.html>.

1.2.3 Step 2: Downloading all the scripts and transport matrices

1. First download Matlab scripts from http://kelvin.earth.ox.ac.uk/spk/Research/TMM/tmm_matlab_code.tar.gz and put into the first level of your TMM2 folder Path. You could also get my copy.

```
$ cp -r ~/../tanio003/TMM2/tmm_matlab_code $HOME/TMM2/
```

2. Download transport matrices and related data for the model of your choice: <http://kelvin.earth.ox.ac.uk/spk/Research/TMM/TransportMatrixConfigs/> and put into the first level of your TMM2 folder Path. You can download all 6 configurations but I warn you that MITgcm_ECCO_v4 and UVicKielIncrIsopycDiffTransient take a very long time. For the ones that I have you could also grab my copy (e.g., to copy MITgcm_ECCO):

```
$ cp -r ~/../tanio003/TMM2/MITgcm_ECCO $HOME/TMM2/
```

Alternatively, you can get download these TMM files from the web directly (e.g., to download MITgcm_ECCO):

```
$ wget kelvin.earth.ox.ac.uk/spk/Research/TMM/TransportMatrixConfigs/MITgcm_ECCO.tar
$ tar -xvf MITgcm_ECCO.tar
```

3. Download miscellaneous data called OceanCarbon from <http://kelvin.earth.ox.ac.uk/spk/Research/TMM/MiscData/>. You can get my copy by:

```
$ cp -r ~/../tanio003/TMM2/OceanCarbon $HOME/TMM2/
```

4. Download source codes for TMM and models:

```
$ git clone https://github.com/tanio003/tmm
```

This directory (`/TMM2/tmm`) contains the source codes from Khatiwala's master branch ("master") and my public release branch ("TT_Release"). For our exercise, we will be using some of my new codes so you need to switch from the master branch to my branch in the newly created tmm directory:

```
$ cd tmm
(master) $ ls
driver HOWTO.txt LICENSE.txt models README.txt
(master) $ git checkout TT_Release
(TT_Release) $ ls
driver HOWTO.txt LICENSE.txt models README.txt Tutorial_MSI
```

Notice that in the branch TT_Release, there is a new directory Tutorial_MSI, which was not present in the master branch.

(Optional) If you want to make start making your own changes to the source codes, I would suggest making a new branch in your local computer (e.g., `yournewrepo`), and leave master and TT_Release untouched.

```
(TT_Release) $ git checkout -b yournewrepo
(yournewrepo) $ git branch --show-current
yournewrepo
```

5. Set the environment variable TMMROOT to point to the top level of the TMM directory.

```
(TT_Release) $ export TMMROOT=$HOME/TMM2/tmm
(TT_Release) $ echo $TMMROOT
/home/.../TMM2/tmm
```

For your future convenience, I would advise you to set `$TMMROOT` in your `.bashrc` as well so you don't need to set the variable every time you log in to MSI.

6. To synchronize your tmm folder with the remote repository (e.g., syncing TT_Release with my updates), use the git pull command your terminal. I suggest you do this regularly to keep your files up to date.

```
$ cd $TMMROOT
$ git checkout TT_Release
$ git pull origin TT_Release
```

1.2.4 Step 3: Compiling the model

Here, let's try compiling the biogeochemical MOPS. If you want to learn about the basic architecture of MOPS, read the model description paper by Kriest and Oschlies (2015) at <https://gmd.copernicus.org/articles/8/2929/2015/>.

1. For each model there are model-specific source codes
(\$TMMROOT/models/current/mops2/src/); Matlab scripts
(\$TMMROOT/models/current/mops2/matlab/) to generate input data and read model output; and run
scripts and other runtime data such as namelists in
\$TMMROOT/models/current/mops2/runscripts/.

First, we create a new run directory. I make a new base directory called "Runs" and in that directory, I make subdirectories for specific experiments. I call it Runs/MOPS/Test_spinup and copy here all the files needed.

```
$ cd ~/TMM2
$ mkdir -p Runs/MOPS/TMM_spinup
$ cd Runs/MOPS/TMM_spinup
$ cp -p $TMMROOT/models/current/mops2.0/src/Makefile .
$ cp -p -R $TMMROOT/models/current/mops2.0/matlab/* .
$ cp -p $TMMROOT/models/current/mops2.0/runscripts/* .
```

2. Compile mops. Make sure that all the modules are loaded and \$PETSC_DIR is set correctly before you compile mops.

```
$ module load intel
$ module load impi/intel
$ module load cmake
$ make clean all
$ make mops
```

If compiled properly, you'd find a new executable "mops" created along with a bunch of objective .o files.

```
$ ls
BGC_INI.o                n7fluxes28.m
BGC_MODEL.o             n7physics.m
CAR_CHEM.o              n7tracers28.m
CAR_INI.o               n7tracersavg28.m
external_forcing_mops_biogeochem.o perry1996-runoff-noarctic_noname.txt
insolation.o            perry1996-runoff_noname.txt
load_output.m           petsc_matvec_utils.o
load_output_time_avg.m  petsc_signal_utils.o
load_pco2.m             process_output.m
Makefile                runscript
make_input_files_for_mops_model.m  runscript_msi
make_rivers.m           tmm_external_bc.o
misfit_mops_biogeochem.o tmm_forcing_utils.o
mops                   tmm_forward_step.o
mops_biogeochem_copy_data.o tmm_main.o
mops_biogeochem_diagnostics.o tmm_monitor.o
mops_biogeochem_ini.o   tmm_profile_utils.o
mops_biogeochem_misfit.o tmm_timer.o
mops_biogeochem_model.o tmm_write.o
mops_biogeochem_set_params.o
```

3. Edit the file make_input_files_for_mops_model.m. First thing to do is to make sure that variable base_path point to the right directory for the TMM configuration.

```
% make_input_files_for_mops_model.m

% Set toplevel path to GCMS configuration
% base_path='/data2/spk/TransportMatrixConfigs/MITgcm_2.8deg';
% base_path='/data2/spk/TransportMatrixConfigs/MITgcm_ECCO';
% base_path='/data2/spk/TransportMatrixConfigs/MITgcm_ECCO_v4';
base_path='~/TMM2/MITgcm_2.8deg';

addpath(genpath('~/TMM2/tmm_matlab_code'));% add tmm_matlab_code to the search path
oceanCarbonBasePath='~/TMM2/OceanCarbon'; % add OceanCarbon to the search path
atmosDataPath=fullfile(oceanCarbonBasePath,'AtmosphericCarbonData');
```

In the same matlab file, there are different switches (0 = no and 1 = yes). For this spin-up exercise, we **couple MOPS to a simple OCMIP-like carbon model** and **fix atmospheric pCO₂ at 280 ppm**. So set the switches as following:

```
% make_input_files_for_mops_model.m
...
periodicForcing=1
```

```

periodicMatrix=1

dt=43200; % time step to use (43200s for ECCO and MIT2.8; 28800s for any other TMMs)

rearrangeProfiles=1
bigMat=0
writeFiles=1
writeTMs=1
useCoarseGrainedMatrix=0
writePCFiles=0

READ_SWRAD=0           % Read short-wave radiation?
useCarbon=1            % Use simple inorganic carbon model?
useAtmModel=0          % Use prognostic 1-box atmosphere?
pCO2atm_ini=280.0      % Initial pco2?
useTimeVaryingPrescribedCO2=0 % Use prescribed pco2 pathway?
useVirtualFlux=1       % Use DIC and Alk to calculate E-P?
empScaleFactor=1.0     % Scaling factor for E-P (default = 1)
%-----
% Modified by Tatsuro Tanioka 200907 to allow for Atmospheric CO2 option
% For a prescribed pCO2 run, useTimeVaryingPrescribedCO2=1 and choose a scenario

% Available options: 'historical', 'RCP3PD', 'RCP45', 'RCP6' and 'RCP85'
co2Scenario='RCP85';
%-----

```

Then open MATLAB and run `make_input_files_for_mops_model.m`

```

$ module load matlab
$ matlab -nodesktop

               < M A T L A B (R) >
      Copyright 1984-2019 The MathWorks, Inc.
      R2019a Update 5 (9.6.0.1174912) 64-bit (glnxa64)
                July 31, 2019

To get started, type doc.
For product information, visit www.mathworks.com.

>> make_input_files_for_mops_model

```

This creates a bunch of periodic forcing files (`xxx_01`, `xxx_02`, ...), initial tracer concentrations (`po4ini.petsc`, `no3ini.petsc`, ...), and binary files (`.bin` and `.petsc`) related to model geometry and forcing.

1.2.5 Step 4: Running the model

MSI systems use job queues to efficiently and fairly manage when computations are executed. The queuing system at MSI is called PBS (Portable Batch System) and to submit a job to a PBS queue users create PBS job scripts. PBS script contains information on the resources requested for calculation, as well as the commands for executing the calculation.

Below is the custom PBS script for submitting a new job to run MOPS2 using Mesabi. It's called `runscript_msi` and should be in the current directory already. Here is the first 11 lines:

```

1  #!/bin/bash -l
2  #PBS -l walltime=06:00:00,nodes=1:ppn=24,pmem=2580mb
3  #PBS -m abe
4  #PBS -j oe
5  #PBS -M tatsurobkkuk@gmail.com
6
7  cd $PBS_O_WORKDIR
8
9  module load intel
10 module load impi/intel
11 module load cmake

```

The first line defines which type of shell the script will be read. Here we will use the `bash`. The second line contains the PBS resource request. The current job will require about 6 hours, 1 node each with 24 processor cores (ppn), and 2580 megabytes of memory per core (pmem).

The two lines containing `#PBS -m abe`, and `#PBS -M tatsurobkkuk@gmail.com`. are both commands having to do with sending message emails to the user. The first of these lines instructs the PBS system to send a message email when the job aborts, begins, or ends. The second command specifies the email address to be used. Using the message emails is recommended because the reason for a job failure can often be determined using information in the emails. The seventh line sets the directory at which commands are executed and the lines 8-11 loads the necessary software modules.

The following lines (14~) contain the commands to execute and start a specific program. Different flags need to be change accordingly depending on the nature of experiments. For more information on different options available, read "HOWTO.txt" by S. Khatiwala located in `$TMMROOT`.

```

# 360 days per year with a time step of 2 steps per day:
14 mpiexec -np 24 -hostfile $PBS_NODEFILE ./mops \ # number of cores , models
15 -numtracers 9 \ # number of tracers (i.e. state variables)
16 -i po4ini.petsc , dopini.petsc , oxyini.petsc , phyini.petsc , zooini.petsc , detini.petsc ,
no3ini.petsc , dicini.petsc , alkini.petsc \ # files for initialization of BGC state variables
17 -me Ae \ # the name of the explicit transport matrix
18 -mi Ai \ # the name of the implicit transport matrix
19 -t0 0.0 -iter0 0 \ # starting time[years] starting time[timesteps]: for initial run
20 -deltat_clock 0.0013888888888889 \ # ocean timestep length[years]: 2 timesteps/day
21 -max_steps 2160000 \ # total number of timesteps to be evaluated (here 3000 yrs)
22 -write_time_steps 72000 \ # output frequency(in timesteps , here every 100 yrs)
23 -o po4out.petsc , dopout.petsc , oxyout.petsc , phyout.petsc , zooout.petsc , detout.petsc ,
no3out.petsc , dicout.petsc , alkout.petsc \ # files for output of 9 BGC state variables
24 -external_forcing \ # calculate BGC explicitly
25 -use_profiles \
26 -nzeuph 2 \ # number of layers in euphotic zone (2 for MIT2.8, 6 for ECCO)
27 -biogeochem_deltat 43200.0 -days_per_year 360.0 \ # ocean timestep[seconds]
28 -burial_sum_steps 720 \ # sum burial over a period of 720 timesteps = 1 yr
29 -pco2atm 280.0 \ # use fixed pCO2 of 280 ppm
30 -use_virtual_flux \ # use the global surface mean DIC and Alk to calculate E-P
31 -periodic_matrix \ # use of periodic transport matrix
32 -matrix_cycle_period 1.0 -matrix_num_per_period 12 \ # the unit of time is year and
# circulation has a periodicity of 1 year; monthly mean transport matrix (12 TMs/year)
33 -periodic_biogeochem_forcing \ # periodic biogeochemical forcing
34 -periodic_biogeochem_cycle_period 1.0 -periodic_biogeochem_num_per_period 12 \
35 -num_biogeochem_steps_per_ocean_step 8 \ # the number of BGC timestep per ocean step
36 -separate_biogeochem_time_stepping \ # timestep BGC model separately from ocean step
37 -time_avg -avg_start_time_step 2159281 -avg_time_steps 60 \
# initial timestep for avg concentrations (for final year); avg over 60 timestep = 1 month
38 -avg_files po4avg.petsc , dopavg.petsc , oxyavg.petsc , phyavg.petsc , zooavg.petsc ,
detavg.petsc , no3avg.petsc , dicavg.petsc , alkavg.petsc \ # avg file names
39 -calc_diagnostics -diag_start_time_step 2159281 -diag_time_steps 60 \
# initial timestep for diagnostic fluxes (for final year); avg over 60 timesteps = 1 month
40 -diag_files fbgc1.petsc , fbgc2.petsc , fbgc3.petsc , fbgc4.petsc , fbgc5.petsc , fbgc6.petsc ,
fbgc7.petsc \ # diagnostic flux files names
41 > log # outputting to logfile

```

Currently BGC model writes the following 7 diagnostics into the different files:

1. fbgc1.petsc: primary production in each box [mmol P/m3/oceantimestep]
2. fbgc2.petsc: zooplankton grazing in each box [mmol P/m3/oceantimestep]
3. fbgc3.petsc: detritus sedimentation through upper boundary of each box [mmol P/m2/oceantimestep]
4. fbgc4.petsc: remineralization of detritus and DOP in each box [mmol P/m3/oceantimestep]
5. fbgc5.petsc: river runoff [mmol P/m3/oceantimestep]
6. fbgc6.petsc: nitrogen fixation [mmol N/m3/oceantimestep]
7. fbgc7.petsc: denitrification [mmol P/m3/oceantimestep]

To submit the job to the queue, type on the command line:

```

$ chmod u+x runscript_msi
$ qsub runscript_msi

```

To check your job status at MSI, type:

```

$ showq -u yourusername

```

1.2.6 Step 5: Processing the model outputs

When the run is completed, you should receive an email from MSI (if you set it so in the runscript). You should also check you log file and the bottom of the log file should say “Wall clock time xxx seconds”. As the output files are binary and cannot be opened on its own, we have to convert from the binary format into either netcdf (.nc) or Matlab (.mat) files using Matlab scripts.

(Option 1, recommended): To convert to .nc files you are going to use the following 5 scripts:

1. n7tracers28.m: This file converts each tracer snapshot .petsc file (e.g., po4put.petsc) into a single .nc file. The MATLAB syntax is:

```

>> n7tracers28('filename1.nc')

```

Make sure to set the basepath correctly and useCarbon=1 (when carbon model is used) and make sure that there is no .nc file with the same name already in the directory.

2. `n7tracersavg28.m`: This file converts each tracer time-averaged .petsc file (e.g., `po4avg.petsc`) into a single .nc file. The MATLAB syntax is:

```
>> n7tracersavg28('filename2.nc')
```

Make sure to set the basepath correctly and useCarbon=1 (when carbon model is used) and make sure that there is no .nc file with the same name already in the directory.

3. `n7fluxes28.m`: This file converts each diagnostic flux .petsc file (e.g., `fbgc1.petsc`) into a single .nc file. The MATLAB syntax is:

```
>> n7fluxes28('filename3.nc')
```

Make sure to set the basepath correctly and make sure that there is no .nc file with the same name already in the directory.

4. `n7physics.m`: This file makes single .c files with monthly mean temperature and salinity. The MATLAB syntax is:

```
>> n7physics('filename4.nc')
```

Make sure to set the basepath correctly and make sure that there is no .nc file with the same name already in the directory.

5. `load_pco2.m`: This file makes a global mean atmospheric pCO₂ file ("`pco2.nc`") and surface CO₂ air-sea flux file ("`co2airseafux.nc`"). CO₂ is in ppm and CO₂ air-sea flux is in [mmol C/m²/timestep] (positive flux means CO₂ is going into the sea from air). The MATLAB syntax is

```
>> load_pco2
```

Make sure to set the basepath and the CO₂ run options correctly.

6. `process_output.m` (optional): To run all 5 scripts at once, edit and use this file. The MATLAB syntax is

```
>> process_output
```

(Option 2): To convert to .mat files you are going to run 2 scripts:

1. `load_output.m`: This file converts each tracer snapshot .petsc file (e.g., `po4put.petsc`) to .mat file. Make sure to edit the `base_path` and add `tmm_matlab_code` to search path in lines 2 and 3.
2. `load_output_time_avg.m`: This file converts each tracer average concentration .petsc file (e.g., `po4avg.petsc`) to .mat file. Make sure to edit the `base_path` and search path correctly.
3. Unfortunately I don't have scripts for creating .mat diagnostic flux files, physics files, and CO₂ files. But this should not be too hard to do and all you have to do is to modify other .m files.

1.2.7 Step 6: Displaying the model outputs

(Option 1): To view .nc files, I recommend the software *Ferret* developed by NOAA. It is already installed in MSI, and to launch Ferret, type on the command line:

```
$ ls *.nc
filename1.nc filename2.nc filename3.nc filename4.nc co2airseafux.nc pco2.nc
$ module load ferret
$ ferret
  NOAA/PMEL TMAP
  FERRET v6.82
  Linux 2.6.32-279.1.1.el6.x86_64 64-bit - 08/03/12
  14-Sep-20 14:49

yes? load filename1.nc
yes? sho d
  currently SET data sets:
  1> ./filename1.nc (default)
name      title
P04        1:128    1:64    1:15    1:31
DOP        1:128    1:64    1:15    1:31
OXYGEN     1:128    1:64    1:15    1:31
PHYTO      1:128    1:64    1:15    1:31
```

ZOO	1:128	1:64	1:15	1:31
DET	1:128	1:64	1:15	1:31
NO3	1:128	1:64	1:15	1:31
DIC	1:128	1:64	1:15	1:31
ALK	1:128	1:64	1:15	1:31

I won't go into too much detail here but to learn more about Ferret, visit NOAA's website and take a tutorial at <https://ferret.pmel.noaa.gov/Ferret/documentation/ferret-tutorials>. You can make all kinds of graphs and figures with Ferret.

(Option 2): If you want to visualize .mat files, I recommend the MATLAB package `m_map`. Again, I would not go into much detail here but if you want to learn about it, download the package and take the tutorial from the developer's website: <https://www.eoas.ubc.ca/~rich/map.html>. Compared to Ferret, you have more freedom for customizing graphs but the downside is that you are going to have to write much longer codes.

2 Case Studies

2.1 Study 1: Postindustrial CO₂ uptake with MOPS+MIT2.8

In the first case study, we will simulate postindustrial CO₂ uptake using MOPS and MITgcm2.8 under IPCC's RCP8.5 scenario from 1765 to 2265. We are going to do the continuous run from the spinup run (Section 1) so make sure that you have completed that run before you proceed.

1. Update source codes in your `tmm` directly by doing `git pull` from the remote repository.

```
$ cd $TMMROOT
$ git checkout TT_Release
$ git pull origin TT_Release
```

2. Make a new run directory. Let's call it `Test_co2historyRCP85` and copy all the files needed into this directory.

```
$ cd ~/TMM2
$ mkdir -p Runs/MOPS/TMM_co2historyRCP85
$ cd Runs/MOPS/TMM_co2historyRCP85
$ cp -p $TMMROOT/models/current/mops2.0/src/Makefile .
$ cp -p -R $TMMROOT/models/current/mops2.0/matlab/* .
$ cp -p $TMMROOT/models/current/mops2.0/runscripts/* .
```

3. Compile mops as we have done in the spinup run. Don't forget to load modules and make sure that environmental variables `$TMMROOT` and `$PETSC_DIR` are set up properly.

```
$ make clean all
$ make mops
```

4. Copy the file `pickup.petsc` from the spinup run directory into the current working directory. This `petsc` files contains the tracer concentrations from the final year of the run and is required for the continuous run.

```
$ cp ../Test_spinup/pickup.petsc .
```

Also, copy the file `pickup_runoff.bin` from the spinup run directory. This binary file contains the global sedimentation from the final year of the previous run.

```
$ cp ../Test_spinup/pickup_runoff.bin .
```

5. Edit the input generation file (`make_input_files_for_mops_model.m`). The key here is to set `useTimeVaryingPrescribedCO2=1` and choosing the appropriate `co2Scenario`, in this case RCP85.

```
% make_input_files_for_mops_model.m

% Set toplevel path to GCMs configuration
% base_path = '/data2/spk/TransportMatrixConfigs/MITgcm_2.8deg';
% base_path = '/data2/spk/TransportMatrixConfigs/MITgcm_ECCO';
% base_path = '/data2/spk/TransportMatrixConfigs/MITgcm_ECCO_v4';
base_path = '~/TMM2/MITgcm_2.8deg';

addpath(genpath('~/TMM2/tmm_matlab_code')); % add tmm_matlab_code to the search path
oceanCarbonBasePath = '~/TMM2/OceanCarbon'; % add OceanCarbon to the search path
atmosDataPath = fullfile(oceanCarbonBasePath, 'AtmosphericCarbonData');
...
```



```

READ_SWRAD=0 % Read short-wave radiation?
useCarbon=1 % Use simple inorganic carbon model?
useAtmModel=0 % Use prognostic 1-box atmosphere?
pCO2atm_ini=280.0 % Initial pco2? (will be ignored as useAtmModel=0)
useTimeVaryingPrescribedCO2=1 % Use prescribed pco2 pathway?
useVirtualFlux=1 % Use DIC and Alk to calculate E-P?
empScaleFactor=1.0 % Scaling factor for E-P (default = 1)
%-----
% Modified by Tatsuro Tanioka 200907 to allow for Atmospheric CO2 option
% For a prescribed pCO2 run, useTimeVaryingPrescribedCO2=1 and choose a scenario

% Available options: 'historical', 'RCP3PD', 'RCP45', 'RCP6' and 'RCP85'
co2Scenario='RCP85';
%-----

```

6. Open Matlab and make input files:

```

$ matlab -nodesktop
...
>> make_input_files_for_mops_model

```

7. Edit runscript_msi. Important changes are commented with blue. You can manually edit the script or copy my script from ~/./tanio003/TMM2/Runs/MOPS/Test_co2historyRCP85.

```

1 #!/bin/bash -l
2 #PBS -l walltime=01:00:00,nodes=1:ppn=24,pmem=2580mb
3 #PBS -m abe
4 #PBS -j oe
5 #PBS -M tatsurobkkuk@gmail.com
6
7 cd $PBS_O_WORKDIRP
8
9 module load intel
10 module load impi/intel
11 module load cmake
12
13 # 360 days per year with a time step of 2 steps per day:
14 mpiexec -np 24 -hostfile $PBS_NODEFILE ./mops \
15   -numtracers 9 \
16   -pickup pickup.petsc \ # read initial values from file
17   -me Ae \
18   -mi Ai \
19   -t0 1765.0 -iter0 0 \ # start from year 1765
20   -deltat_clock 0.0013888888888889 \
21   -max_steps 360000 \ # run for 720*500 timesteps = 500 years
22   -write_time_steps 7200 \ # output every 720*10 timestep = 10 years
23   -o po4out.petsc , dopout.petsc , oxyout.petsc , phyout.petsc , zooout.petsc ,
24   detout.petsc , no3out.petsc , dicout.petsc , alkout.petsc \
25   -external_forcing \
26   -use_profiles \
27   -nzeuph 2 \
28   -biogeochem_deltat 43200.0 -days_per_year 360.0 \
29   -burial_sum_steps 720 \
30   -runoff_ini_file pickup_runoff.bin \ # read global sedimentation of previous run
31   -periodic_matrix \
32   -pco2atm_history TpCO2.bin , pCO2atm.bin \ # read prescribed pCO2 and time
33   -use_virtual_flux \
34   -matrix_cycle_period 1.0 -matrix_num_per_period 12 \
35   -periodic_biogeochem_forcing \
36   -periodic_biogeochem_cycle_period 1.0 -periodic_biogeochem_num_per_period 12 \
37   -num_biogeochem_steps_per_ocean_step 8 \
38   -separate_biogeochem_time_stepping \
39   -time_avg -avg_start_time_step 169199 -avg_time_steps 720 \
40   # output annual avg. from year 2000 (235 years after 1765)
41   -avg_files po4avg.petsc , dopavg.petsc , oxyavg.petsc , phyavg.petsc , zooavg.petsc ,
42   detavg.petsc , no3avg.petsc , dicavg.petsc , alkavg.petsc \
43   -calc_diagnostics -diag_start_time_step 169199 -diag_time_steps 720 \
44   # output annual mean fluxes from 2000 (235 years after 1765)
45   -diag_files fbgc1.petsc , fbgc2.petsc , fbgc3.petsc , fbgc4.petsc , fbgc5.petsc ,
46   fbgc6.petsc , fbgc7.petsc \
47   > log

```

8. Submit the job to MSI queue.

```

$ qsub runscript_msi

```

9. Processing and outputting results. Use 5 Matlab scripts

(n7tracers28.m, n7tracersavg28.m, n7fluxes28.m, n7physics.m, load_pco2.m) to create .nc files. Here, I will show you how to plot CO₂ timeseries and global annual mean air-sea flux of CO₂ using Ferret. The script is also at ~/./tanio003/TMM2/Runs/MOPS/Test_co2historyRCP85/analyzeoutput.jnl.

```

$ ferret
NOAA/PMEL TMAP
PyFerret v7.5 (optimized)
Linux 4.15.0-1071-azure - 03/31/20
16-Sep-20 14:49
yes? use pco2.nc
yes? use co2airseafux.nc
yes? set w 1;plot/d=1/hlimits=1800:2120/vlimits=200:1200/title="pCO2_RCP8.5" pco2
yes? ppl XLAB Year
yes? ppl YLAB pCO2 (ppm)
yes? ppl PLOT
yes? set w 2 ; sha/d=2/x=-180:180/lev=(-Inf)(-4,4,0.8)(Inf)/palette=cmocean_balance/
title="Annual_CO2_flux_(mol_C_m-2_yr-1)" co2airseafux[l=10]*2*360/1000*(-1);go fland
yes? set w 3 ; sha/d=2/x=-180:180/lev=(-Inf)(-4,4,0.8)(Inf)/palette=cmocean_balance/
title="Annual_CO2_flux_(mol_C_m-2_yr-1)" co2airseafux[l=100]*2*360/1000*(-1);go fland
yes? set w 4; plot/d=2/hlimits=2000:2100/vlimits=-7:0/
title="Ocean-atmosphere_CO2_flux_(PgC_yr-1)" co2airseafux[x=@din,y=@din]*2*360/1000*12/1e15*(-1)

```

(Note: Here, I'm actually using the new version of the Ferret called PyFerret and some of the commands may not be compatible with the older version that is pre-installed at MSI. To install PyFerret in your MSI directory, see Appendix and follow instructions. Also, visit <https://github.com/NOAA-PMEL/PyFerret/> for more information. *I highly recommend PyFerret.*)

Figure 1 (*Ferret:w 1*) shows the change in CO₂ under RCP8.5 scenario. There is a rapid increase in CO₂ concentration from the late 1990s.

Figure 2 compares annual mean CO₂ flux in 2010 (*Ferret:w 2*) and 2100 (*Ferret:w 3*). Notice that in 2010, large parts of the equatorial regions are net source of CO₂ but in 2100, larger parts are becoming sink. Also, greater part of the Southern Ocean is also expected to absorb more CO₂ in 2100 compared to 2010.

Figure 3 is a CO₂ flux in 2010 from a study by Woolf et al. (2019) who used Surface CO₂ atlas and wind data. If you compare with the left panel of Figure 2, you can see that our MOPS model does a quite good job in reproducing the large scale pattern.

Figure 4 (*Ferret:w 4*) is a globally integrated sea-air CO₂ flux projections under RCP8.5 scenario. The negative value means net uptake of CO₂ by ocean. For a comparison, we show the similar projection using the CESM and CMIP5 (Figure 5a-b.) from Lovenduski et al. (2016). Again, notice that MOPS's result is largely consistent in terms of the magnitude.

./Figures_tutorial/pco2RCP85.pdf

Figure 1: CO₂ concentration pathway under RCP8.5 scenario (Meinshausen et al., 2011).

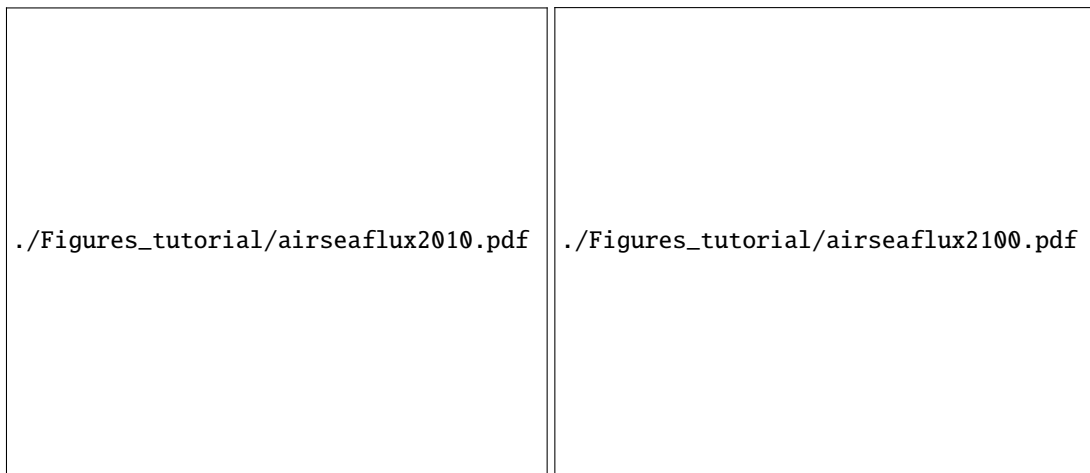


Figure 2: Modeled map of annual CO₂ flux for 2010 (Left) and for 2100 (Right). Upward fluxes are defined as positive.

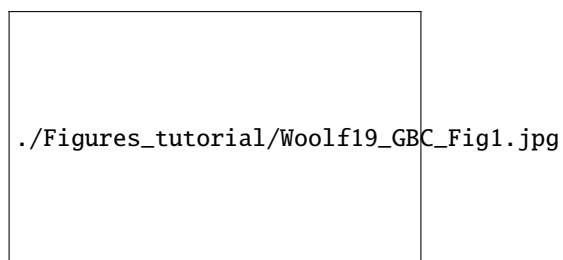


Figure 3: Map of annual CO₂ flux in 2010 from CO₂ and wind data (Woolf et al., 2019). Compare this with Figure 2.

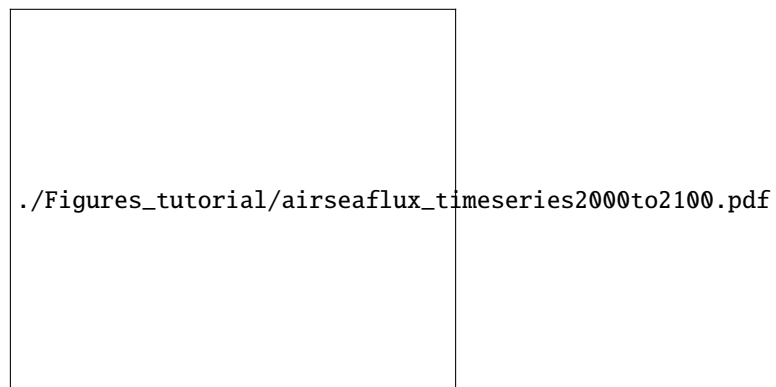


Figure 4: Modeled annual-mean globally integrated sea-air CO₂ flux projections under RCP8.5 scenario.

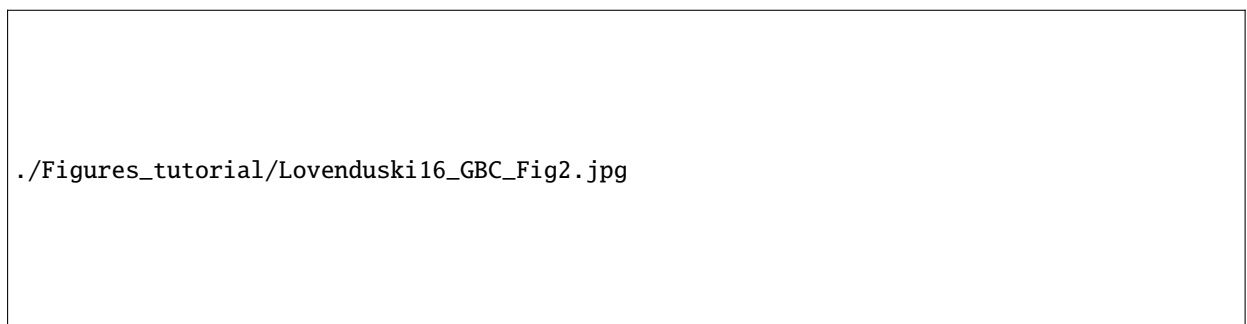


Figure 5: Modeled annual-mean globally integrated sea-air CO₂ flux projections (Lovenduski et al., 2016) with CESM (a) and CMIP5 models (b). Compare this with Figure 4.

2.2 Study 2: Using MOBI+UVic to simulate isotope dynamics

For this study, we will explore ocean biogeochemical dynamics using the second version of MOBI (Model of Ocean Biogeochemistry and Isotopes). MOBI includes:

- NO_3 , PO_4 , and DFe as interactive nutrients.
- 3 Phytoplankton classes (diazotrophs, coccolithophores, and other phytoplankton).
- Zooplankton.
- Detritus (dead POM).
- CaCO_3 is a prognostic variable and its production is calculated as a fraction of the detritus produced by coccolithophores and zooplankton and it is sinking into the deep ocean where it dissolves.
- Nitrogen (^{15}N) and carbon (^{13}C) isotopes are included in all compartments.
- Radiocarbon (^{14}C) is included only in the DIC compartment.
- Dissolved O_2 controls the water column denitrification. Benthic denitrification is calculated considering subgridscale bathymetry.
- DOM is calculated separately for C, N, and P (DOC, DON, DOP).
- The most complex configuration has a total of 30 prognostic tracers.

To learn different configurations of MOBI, refer to the primer by A. Schmittner (https://github.com/tanio003/tmm/blob/TT_Release/Tutorial_MSI/MOBI2.0_Schmittner.pdf).

In our exercise, we will try conducting a spin-up run for 3000 yrs using 30 prognostic tracers. Instructions will mostly follow that of S. Khatiwala.

1. Download the compatible versions of UVic ESCM 2.9 in the first level of your TMM directory

```
$ cd ~/TMM2
$ git clone https://github.com/your_github_username/UVic2.9
```

2. Download the TMM called UVicOSUpicdefault. Although you can download the original TMM from the Samar's repository, I found out when I did the preliminary test that the original TMM does not have the flow field for river discharge. Therefore, I had to import the "foreign" river discharge field from another TMM called UVicKielIncrIsopycDiff (*Maybe we could contact Samar to ask for the full configuration for UVicOSUpicdefault with river discharge?*). To copy my TMM,

```
$ cp -r ~/../tanio003/TMM2/UVicOSUpicdefault_with_discharge $HOME/TMM2/
```

Currently, MOBI can only be coupled to this TMM configuration (UVicOSUpicdefault_with_discharge) because other TMMs like MITgcm models do not have bathymetry profile and hydrothermal Fe input masks.

3. Make a Run directory for TMM-MOBI. For this run, I call it Runs/MOBI/Test_spinup. Copy mobi2.0/src/Makefile and mobi2.0/src/MOBI_TMM_OPTIONS.h to this directory.

```
$ cd ~/TMM2
$ mkdir -p Runs/MOBI/TMM_spinup
$ cd Runs/MOBI/TMM_spinup
$ cp -p $TMMROOT/models/current/mobi2.0/src/Makefile .
$ cp -p $TMMROOT/models/current/mobi2.0/src/MOBI_TMM_OPTIONS.h .
```

Also, following the instructions at the top of Makefile, set the environmenta variable \$UVICESCMROOT to point to the top level of the UVic ESCM 2.9. Add this to your .bashrc for cd your future convenience.

```
$ export UVICESCMROOT=$HOME/TMM2/UVic2.9
echo $UVICESCMROOT
/home/.../TMM2/UVic2.9
```

4. Copy the contents (including the subdirectories) of mobi2.0/matlab and mobi2.0/runscripts to the test directory.

```
$ cp -p -R $TMMROOT/models/current/mobi2.0/matlab/* .
$ cp -p $TMMROOT/models/current/mobi2.0/runscripts/* .
$ ls
control.in                Makefile
get_mobi_diagnostic.m     make_input_files_for_mobi_model.m
InitialConditionProfiles  make_input_files_for_mobi_model_write_ic.m
load_diagnostics.m        MOBI_TMM_OPTIONS.h
load_output.m             MOBI_tracer_names.txt
load_output_sed.m         runscript
load_output_time_avg.m    runscript_msi
```

5. Edit `control.in`. See the appendix for what each of these options mean.

3 Appendix

3.1 Downloading PyFerret on MSI

1. Install miniconda on your home directory. This is a free cross-platform for Python distribution from Continuum Analytics.

```
$ cd ~
$ module purge
$ wget https://repo.anaconda.com/miniconda/Miniconda3-latest-Linux-x86_64.sh
$ bash Miniconda3-latest-Linux-x86_64.sh
```

Follow the prompts on the installer screens. If you are unsure about any setting, accept the defaults. To make the changes take effect, close and then re-open your terminal window. Once installed you should find new directory called `miniconda3` on your home directory.

2. Execute the following command to install `pyferret` as well as `ferret_datasets` (the default Ferret datasets) into conda.

```
$ conda create -n PyFERRET -c conda-forge pyferret ferret_datasets --yes
```

`PyFERRET` is the environment name where `pyferret` is installed. You can change that to any name you like.

3. To start using PyFerret, execute the following commands (replace `PyFERRET` with whatever environment name you used):

```
(base) $ conda activate PyFerret
(PyFERRET) $ pyferret
NOAA/PMEL TMAP
PyFerret v7.6 (optimized)
Linux 4.15.0-1089-azure - 06/25/20
18-Sep-20 15:07
yes?
```

4. (Optional) You may wish to add directories to `FER_DATA` and `FER_GO`:

```
(PyFERRET) $ export FER_DATA="$FER_DATA_/my/path/to/big/data/dir"
(PyFERRET) $ export FER_GO="$FER_GO_/my/path/to/custom/ferret/scripts"
```

5. Once you are done working with PyFerret you can leave this environment, if you wish, with the command:

```
(PyFERRET) $ conda deactivate
(base) $
```

3.2 General reference for MOPS and MOBI

There are several key references for MOBI:

- Khatiwala, S., Schmittner, A., and Muglia, J. (2019). Air-sea disequilibrium enhances ocean carbon storage during glacial periods. *Science advances*, 5(6):eaaw4981
- Muglia, J., Somes, C. J., Nickelsen, L., and Schmittner, A. (2017). Combined effects of atmospheric and seafloor iron fluxes to the glacial ocean. *Paleoceanography*, 32(11):1204–1218
- Somes, C. J., Schmittner, A., Muglia, J., and Oschlies, A. (2017). A three-dimensional model of the marine nitrogen cycle during the last glacial maximum constrained by sedimentary isotopes. *Frontiers in Marine Science*, 4:108

- Kvale, K. F., Meissner, K., Keller, D., Eby, M., and Schmittner, A. (2015). Explicit planktic calcifiers in the university of victoria earth system climate model, version 2.9. *Atmosphere-Ocean*, 53(3):332–350
- Yamamoto, A., Abe-Ouchi, A., Shigemitsu, M., Oka, A., Takahashi, K., Ohgaito, R., and Yamanaka, Y. (2015). Global deep ocean oxygenation by enhanced ventilation in the southern ocean under long-term global warming. *Global Biogeochemical Cycles*, 29(10):1801–1815

3.3 Paramters for MOBI (listed at control.in)

- **npzd**: Parameters related to biogeochemical NPZD model. Descriptions are from https://github.com/OSU-CEOAS-Schmittner/UVicMOBI_fct_npzd_o2_n_fe_ca_caco3_c13_n15/blob/master/updates/npzd_src.F

Num	Parameters	Description	Unit	Def.
1	<i>k1n</i>	Half saturation constant for N uptake	[<i>mmol/m</i> ³]	0.7
2	<i>capr</i>	carbonate to carbon production ratio	[<i>molar</i>]	0.055
3	<i>abio_P</i>	<i>a</i> ; Maximum growth rate parameter	[1/ <i>day</i>]	0.6
4	<i>alpha</i>	Initial slope P-I curve	[(<i>W/m</i> ²) ⁻¹ / <i>day</i>]	0.16
5	<i>nup</i>	Specific mortality rate (Phytoplankton)	[1/ <i>day</i>]	0.03
6	<i>nupt0</i>	Fast-recycling mortality rate (Phytoplankton)	[1/ <i>day</i>]	0.001
7	<i>redctn</i>	C/N Redfield ratio	[<i>molar</i>]	7
8	<i>geZ</i>	Zooplankton growth efficiency	[-]	0.54
9	<i>redotn</i>	O2/N Redfield ratio	[<i>molar</i>]	11.0
10	<i>kfemin</i>	Minimum half saturation constant for Fe limitation	[<i>mmolFe/m</i> ³]	0.04e-3
11	<i>kfemax</i>	Maximum half saturation constant for Fe limitation	[<i>mmolFe/m</i> ³]	0.4e-3
12	<i>kfemin_C</i>	Minimum half saturation constant for Fe limitation (Cocco)	[<i>mmolFe/m</i> ³]	0.04e-3
13	<i>kfemax_C</i>	Maximum half saturation constant for Fe limitation (Cocco)	[<i>mmolFe/m</i> ³]	0.4e-3
14	<i>kfe_D</i>	Half saturation constant for Diaz Fe limitation	[<i>mmolFe/m</i> ³]	0.1e-3
15	<i>zprefC</i>	Zooplankton preference for C	[-]	0.21
16	<i>zprefP</i>	Zooplankton preference for P	[-]	0.24
17	<i>disso0</i>	initial dissolution rate parameter	[-]	0.013
18	<i>gbio</i>	Maximum grazing rate	[1/ <i>day</i>]	0.37
19	<i>wd0</i>	Sinking speed of detritus at surface	[<i>m/day</i>]	15
20	<i>nuz</i>	Quadratic mortality (zpk)	[(<i>mmol/m</i> ³) ⁻² <i>day</i> ⁻¹]	0.06
21	<i>jdiar</i>	factor reducing the growth rate of diazotrophs	[-]	0.2
22	<i>nud0</i>	detritus remineralization rate	[1/ <i>day</i>]	0.07
23	<i>sgbdfac</i>	sub-grid benthic denitrification rate factor	[-]	2.0
24	<i>diazntp</i>	diazotroph N:P ratio	[<i>molar</i>]	40.0
25	<i>nup_D</i>	Specific mortality rate (Diazotrophs)	[1/ <i>day</i>]	0.0001
26	<i>abio_C</i>	<i>a</i> ; Maximum growth rate parameter (Cocco)	[1/ <i>day</i>]	0.3
27	<i>k1n_C</i>	Half sat const for N uptake (Cocco)	[<i>mmol/m</i> ³]	0.35
28	<i>alpha_C</i>	Initial slope P-I curve (Cocco)	[(<i>W/m</i> ²) ⁻¹ / <i>day</i>]	0.1
29	<i>nuct0</i>	Fast-recycling mortality rate (Cocco)	[1/ <i>day</i>]	0.013
30	<i>nupt0_D</i>	Fast-recycling mortality rate (Diazotrophs)	[1/ <i>day</i>]	0.001
31	<i>dfr</i>	phyt mortality refractory/semi-labile DOM fraction	[-]	0.1
32	<i>dfrt</i>	phyt fast-recy refractoty/semi-labile DOM fraction	[-]	0.08
33	<i>dtnpzd</i>	time step of biology	[s]	14400.0
34	<i>hdop</i>	DOP growth rate handicap	[-]	0.4
35	<i>nudop0</i>	DOP remineralization rate	[1/ <i>day</i>]	2.0e-5
35	<i>nudon0</i>	DON remineralization rate	[1/ <i>day</i>]	1.0e-5
36	<i>eps_assim</i>	Scaling factor for assimilation	[-]	6.0
37	<i>eps_excr</i>	Scaling factor for excretion	[-]	4.0
38	<i>eps_recy</i>	Scaling factor for recycling	[-]	1.3
39	<i>eps_wcdeni</i>	Scaling factor for water column denitrification	[-]	25.0
40	<i>eps_bdeni0</i>	Scaling factor for benthic denitrification	[-]	4.0
41	<i>eps_nfix</i>	Scaling factor for benthic N fixation	[-]	1.0
42	<i>mwz</i>	Depth where sinking below remains constant	[<i>cm</i>]	100000
43	<i>mw</i>	Sinking speed increase with depth	[<i>s</i> ⁻¹]	0.055

To find out what these paramters actually do in the model, you may need to refer to several description papers :

- Original NPZD model (Oschlies and Garçon, 1999; Giraud et al., 2000; Schmittner et al., 2005, 2008).
- Zooplankton grazing formulation (Keller et al., 2012)
- Nitrogen isotope model (Somes et al., 2010a,b, 2013)
- Carbon isotope (¹³C) model (Schmittner et al., 2013)
- Prognostic CaCO₃, Coccolithophores, and balast (Kvale et al., 2015)
- Iron Model (Nickelsen et al., 2015)

– Benthic denitrification and sedimentary iron release (Somes and Oschlies, 2015; Muglia et al., 2017)

- **ctrl:**
- **tsteps:**
- **riglid:**
- **mixing:**
- **diagn:**
- **io:**
- **ictime:**
- **blmix:**
- **hlmix:**
- **isopyc:**
- **ppmix:**
- **smagnl:**
- **embm:**
- **carbon:**
- **paleo:**
- **ice:**
- **veg:**
- **mtlm:**
- **sed:**

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