# Reply to the Comments on gmd-2014-128 

Li Dong, Bin Wang and Li Liu

October 21, 2014

We would like first to thank both of the editor and the two reviewers for your good comments and suggestions. The manuscript has been modified accordingly, and the marked-up version is appended after the comment reply.

## 1 Reply to the comments of the first reviewer

1. The numerical results indicate that the proposed LASM scheme is first order accurate (Fig. 8). The authors stated on page 4847 line 14 that the dominated error is from trajectory calculation. However, the trajectory equation (3) is solved by a 4th order Runge-Kutta method which is sufficiently accurate for many cases. Therefore, it seems that the error from trajectory calculation should not dominate the total numerical error. The first order accuracy of LASM should be further discussed.

Response: Thanks for pointing out this issue. The original statement about the dominated error from trajectory calculation was wrong. In LASM, the equations are numerically integrated by using the fourth-order Runge-Kutta method, so the accuracy in time should be sufficiently accurate as you said, and we have conducted another two experiments with the following settings:

- Reduce $R_{\text {pole }}$ to $3^{\circ}$ (previously is $18^{\circ}$ );
- $R_{\text {pole }}$ is unchanged, use the analytical velocity.

The results are shown in the following figure. It is obvious that the convergence rate did not change significantly with different settings. By inspecting the scheme, we found that the firstorder convergence rate is caused by the fact that the spatial remapping method in LASM is firstorder. In contrast, HEL used a second-order numerical approximation to the spatial gradient of the tracer density on the Eulerian mesh, so its convergence rate is second-order. We have modified the corresponding words in the revised manuscript on page 18 line $24-27$ and page 19 line 1-3.
2. In Fig. 11, three diagnostics are reported in order to assess the capacity of LASM in preserving the pre-existing nonlinear correlation among tracers. It is observed that $l_{u}$ is non-zero. In fact, it is a very small number and far less than $l_{r}$. Further note that for many first order schemes such as the first order CSLAM and the first order upwind scheme, $l_{u}$ is zero. The authors could give an explanation why this is not the case for LASM.

Response: The correlation preservation diagnostics of LASM are evaluated on the lat-lon mesh, so they contain the remapping errors (the weighted remapping will disturb the correlation more or less). As pointed out in the manuscript on page 20 line 11-12, when evaluated on the parcels, $l_{u}$ is exactly zero as expected.
3. On page 4836 line 16, "In despite of" to "in spite of or despite".

Response: This is fixed on page 8 line 9 .


Figure 1: Convergence rates of three experiments.
4. On page 4842 line 13, "are same" to "are the same".

Response: This is fixed on page 13 line 24 .
5. On page 4844 line 21, "when search" to "when searching".

Response: This is fixed on page 16 line 11.
6. On page 4845 line 17 , "he" to "the".

Response: This is fixed on page 17 line 6.
7. On page 4847 line 4, "subjected" to "subject".

Response: This is fixed on page 18 line 14.

## 2 Reply to the comments of the second reviewer

1. It is not clear what physical principles were used to set the specific cut-off value of $\mathcal{D}_{i}$, and the actual reduced value of $\gamma_{m}$. " 5 " seems as a completely ad hoc choice.

Response: The current mixing setup in LASM is learned from the HEL scheme proposed by you, and the choice of the parameters is based on the test cases that we have conducted. The object is to make LASM perform well in both the deformation test case and the barotropic ones.
2. Nature is not discontinuous in terms of mixing. Parcels in the real world mix gradually and the mixing increases gradually with the deformation rate. This must be discussed. What is of even more concern is the factor by $\alpha$ which the major parcel axis will be shrunk after mixing has taken place. I cannot understand why $\alpha$ is not a function of the degree of mixing that has actually taken place. I also dont understand what has motivated the actual choice (e.g., $\alpha=0.05$ ). If there is no link between $\alpha$ and the mixing one can introduce anything from too excessive or too weak mixing, all depending on the parameter choices.

Response: : The mixing in LASM is not discontinuous. The value of $\alpha$ controls how the
mixing is gradual. One parcel may be mixed with its surrounding parcels continuously (in several time steps) if the deformation persists. The effect of changing $\alpha$ is depicted in Fig. 13, where the larger $\alpha$ causes more burrs at the edge of the slotted cylinders because too many amount of tracer mass is mixed at a time. But the setup of $\alpha$ remains open to question. As you mentioned, it could be a function of the mixing degree (or deformation rate). By doing this, the amount of mixing could be more consistent with the real one and more objective. Thank your for bringing such a good idea to us. We will work on this important topic in the future. We have added some discussion on page 14 line 6-8.
3. Aliasing is the misinterpretation of unresolved scales on the resolved scales. In spectral (Eulerian) models aliasing is avoided by having a larger number of degrees of freedom in grid point space (where non-linear advective terms are calculated) than in spectral space. In this way the spectrally unresolved scales are automatically eliminated at each time step. In pseudospectral models this is not the case, and therefore, in such models, one will need to introduce some diusion (spatial mixing) in order to prevent or reduce the problems with aliasing. In fully Lagrangian models there is no simple parallel to this situation but one may argue that a Lagrangian model without any inter-parcel mixing is equivalent to a pseudospectral Eulerian model. Hence, to avoid the gradual build up of aliasing in a Lagrangian model one must introduce spatial mixing. Considering the specific type of mixing in LASM it is not clear to me how one can be certain to avoid aliasing. In particular, I am here thinking about the situation where the degree of disorder $\mathcal{D}_{i}$ is low, i.e. the mixing threshold $\gamma_{m}$ is very large (up to 100). As far as I can see the mixing in LASM will not eliminate aliasing. So I should like the authors to discuss this issue some depth (at least to convince me). See also comments below.

Response: It is our belief that the aliasing in the Lagrangian methods is related to the fact that the real shape of the parcels is not simulated explicitly, so the remapping is isotropic which is not correct in the deformative flow. In addition, the chaotic flow deformation makes the simulation of the parcel shape even harder. So we firstly described the parcel shape by a linear deformation matrix (linear assumption) learned from the finite mass method. This can reduce the aliasing as much as possible when the disorder degree of the flow is low. The deformation test cases showed the effectiveness of such discretization. That is in the low degree of disorder cases, LASM can handle the deformation without the interparcel mixing. But when the flow deforms disorderly as in the barotropic test cases, the linear assumption degenerates quickly. Lots of needle form parcels appeared. That is when the interparcel mixing should be active to compensate for such degeneration of the linear assumption to the parcel shape. In spite of this, we currently could not be sure that the aliasing is eliminated at all. The interparcel mixing must be more physically based and be more adaptive (e.g., better parameter formula as pointed in the previous question), so that the minimum mixing is introduced to ensure the aliasing is suppressed and the numerical diffusion error is as low as possible. We have added more discussion in the revised manuscript on page 14 line 1 and page 15 line $7-14$.
4. Page 4830, line 18. It is suggested to change "model" to "modeling".

Response: We have changed "In atmospheric global circulation model (AGCM)" to "In an atmospheric global circulation model (AGCM)" on page 2 line 16-17.
5. Page 4830 , line 18 . What about cloud water and cloud ice?

Response: We have added them on page 2 line 17-18.
6. Page 4830, line 21. Grammar.

Response: We have changed "though many other aspects also affect" to "although many other aspects also affect the results" on page 2 line 20-21.
7. Page 4831, line 19. "is disbennifit" to "is a problem".

Response: This is fixed on page 3 line 19.
8. Page 4831, line 24 . "... so least resolution": Wrong grammar plus I cannot see that purely Lagrangian (without explicit interparcel mixing) schemes have any diffusion at all.

Response: We have changed "Contrarily, Lagrangian schemes have so least numerical diffusion that the interparcel mixing needs to be implemented explicitly," to "Contrarily, Lagrangian schemes have no numerical diffusion, and the interparcel mixing needs to be implemented explicitly" on page 3 line 22-23.
9. Page 4832 , line 15. "into needle form": in the real world they are not deformed into needles but rather into irregularly shaped thin filaments (i.e. they are often also strongly bended) Maybe you can find a better word than needles?

Response: This "needle" word is first mentioned in Klingler et al. (2007) as: "The ability of the mass packets to deform arbitrarily with the flow and to change their size, shape, and orientation is the reason for the high accuracy of the finite mass method, but can also lead to serious problems when particles become sharp needles or degenerate in another way." And we also observe such abnormal shape of the parcel when the parcel shape is not constrained. So we think it might be better to keep this word.
10. Page 4833 , line 16. "... aliasing error as much as possible...". I cannot see that this is related to aliasing. Only mixing can be used to reduce aliasing in this type of model. Maybe you can explain this in more detail to bring the thoughts of the reader in the right direction.

Response: As mentioned in comment 3, we think the shape of the parcels is not simulated explicitly causes the wrong isotropic remapping (e.g. the spotty pattern in the tracer density on the mesh), so the tracer mass may be remapped onto the wrong grids, which may generate the aliasing error. By simulating the shape explicitly, such aliasing can be reduced largely when the flow deformation is not much in disorder, for example in the deformation test case that has large deformation rate but the flow is in order. Otherwise, we need the interparcel mixing to compensate for the degenerated linear assumption to the parcel shape as in HEL.
11. Page 4834 , line 4. "... of deformation matrix, the ..." to "... of the deformation matrix, and the ...".

Response: This is fixed on page 5 line 27.
12. Page 4834, equation (4). You write that this equation is an ordinary differential equation. But the divergence operator includes partial derivatives?

Response: This is fixed on page 6 line 10.
13. Page 4836 , line 5. "not" to "no".

Response: This is fixed on page 7 line 19.
14. Page 4836, line 17. "despite" to "spite"

Response: This is fixed on page 8 line 9 .
15. Page 4838 , line 1. "for other" to "for the other"

Response: This is fixed on page 9 line 11.
16. Page 4838, line 25. "defomration" to "deformation".

Response: This is fixed on page 10 line 14.
17. Page 4839, line 2-3. "aliasing error without using ... schemes.". I can see that this is the essence of the paper. I am however, not sure I understand how one can avoid introducing a certain amount of mixing to avoid the aliasing. Also, as far as I can see, the mixing will be more or less independent of the particular parcel shape formulation one uses. The mixing only depends on the deformation rate (or equivalently on the Lyapunov exponent) of the flow/problem. You should discuss this statement in more detail to clarify what the magic is. From a theoretical point of view, I simply don't understand how a special shape formulation of individual parcels can reduce aliasing.

Response: This is related to the above comment 3 and 10. LASM simulates the shape of the parcels explicitly by using the linear deformation matrix. This turns the isotropic remapping as in other Lagrangian schemes to the anisotropic remapping which should be more realistic. When the flow deformation is in order, the aliasing error in LASM is low without using the interparcel mixing, because the linear assumption to the parcel shape is sufficient and the tracer mass can be remapped onto the right grids. But when the flow deformation is very disorderly, the linear shape assumption will degenerate and the mixing must be used as in other Lagrangian schemes to suppress the strong aliasing error. So the shape formulation of individual parcels can help to reduce the aliasing, but a good interparcel mixing algorithm is necessary to eliminate the aliasing.
18. Page 4839 , line 24 . "In future," to "In the future,"

Response: This is fixed on page 11 line 12.
19. Page 4841, line 27. A $\gamma_{m}$ value of 100 seems to be exceptionally high (then parcels are indeed needles). I can see that $\gamma_{m}$ is reduced when the degree of disorder is large, but still it seems that a $\gamma_{m}$ value of, e.g., 5 is very large. With such large numbers it is obvious that you will minimize the mixing dramatically and therefore, in the validation tests, obtain results, which are similar to an almost unmixed Lagrangian model. However, I am not convinced that the values used for $\gamma_{m}, \mathcal{D}_{i}$, and $\alpha$ are consistent with the mixing limit that must be introduced to avoid aliasing. The $\gamma_{m}, \mathcal{D}_{i}$, and $\alpha$ values seem to be chosen on an ad hoc basis.

Response: The $100 \gamma_{m}$ is currently chosen to not interrupt the evolution of the parcel shape when the flow deformation is in order as in the deformation test cases. In those cases, it is normal that the parcels are deformed into long ellipses. But in the more real barotropic flows, the parcels can never evolve into long ellipses, because the interparcel mixing is active to control the parcel shape when the disorder degree is high. The $\gamma_{m}^{*}$ value of 5 is a testing result. When it is larger, unacceptable results are observed, and when smaller, the excessive diffusion is observed. Nevertheless, it is open to questions that the optimal values of these parameters may be in the different forms. We have added some discussion on page 13 line 24-28.
20. Page 4841, line 14. Another related issue: I would guess that $\alpha$ should depend on the length of the time step, or rather by the actual amount of mixing that has been imposed for the particle in question.

Response: Thanks for providing another good idea! We mentioned it on page 14 line 6.
21. Page 4844 , line 1. "in future" to "in the future".

Response: This is fixed on page 15 line 17.
22. Page 4844, line 3. "are summaries" to "can be summarized as".

Response: This is fixed on page 15 line 20.
23. Page 4845 , line 13 . "be in the real" to "be in a real".

Response: This is fixed on page 17 line 2.
24. Page 4845 , line 16 . Why not use (semi) analytical trajectories to check the importance of errors in trajectory calculations?

Response: At first, we thought it would be better to reveal the performance of LASM as in a real application, where the flow velocity is discretized on the mesh. We have conducted a convergence rate experiment with analytical velocity, and the result is similar with the one using discrete velocity, see the previous figure.
25. Page 4847, text around Fig. 10. Please provide mixing parameters $\gamma_{m}, \beta_{1}, \beta_{2}$.

Response: We have added the reference to Table 1 where those parameters are listed on page 18 line 17 .
26. Page 4850 , line 12 . What is meant by "apparent" in this context?

Response: The "apparent" means there is almost no interparcel mixing in the deformation test cases, when the values of the parameters are chosen as in Table 1. Only several times mixing occurred near the Poles due to the convergence of the grids in lat-lon mesh.
27. Page 4851 , text around Fig. 15 At a first glance the LASM transport scheme seems to perform quite well. It is of course not surprising that the noise level is reduced when the number of parcels is increased. However, as hinted above, my general fear is that the amount of inter-parcel mixing in LASM is generally to low to avoid the build up of noise over time due to some kind of aliasing. I think it is very important to perform some longer simulations with the model (e.g. 10 days) to see what happens with noise in the long run in a realistic geophysical flow. The same comment applies to the simulations shown in Fig. 17.

Response: The current form of the interparcel mixing of LASM could not be the final form. We will continue to improve it based on the physical and computational consideration. We have extended the time duration of the second barotropic test case to 10 days, and the distribution of the geopotential depth and step tracer are depicted in the following figure. And the animation of the step tracer is uploaded as a supplement file. We also added the step tracer on 10 day into Fig. 17.
28. Page 4852 , line 8 "chaostic" to "chaotic".

Response: This is fixed on page 23 line 10.


Figure 2: The results of a barotropic test case after 10 days.

Manuscript prepared for Geosci. Model Dev. Discuss. with version 2014/07/29 7.12 Copernicus papers of the $A T_{E} X$ class copernicus.cls. Date: 21 October 2014

## A Lagrangian Advection scheme with Shape Matrix (LASM) for solving advection problems

L. Dong ${ }^{1}$, B. Wang ${ }^{1,2}$, and L. Liu ${ }^{2}$

${ }^{1}$ LASG, Institute of Atmospheric Physics, Chinese Academy of Sciences, Beijing, China
${ }^{2}$ Ministry of Education Key Laboratory for Earth System Modelling, Center for Earth System Science (CESS), Tsinghua University, Beijing, China

Correspondence to: L. Dong (dongli@lasg.iap.ac.cn)


#### Abstract

A new Lagrangian advection scheme with shape matrix (LASM) is proposed to take advantage of the extreme low numerical diffusion of the Lagrangian methods. The tracer is discretized into finite parcels, which move along the downstream trajectories. Different from approximation of the parcel shape, where the mixing is only triggered when it is necessary and resembles the physical mixing. The total tracer mass on the parcels is conserved exactly. The new scheme is validated by using several test cases. other Lagrangian schemes, the parcel shape is simulated explicitly by a linear transformation matrix. By doing so, the aliasing error in the Lagrangian schemes is largely reduced without introducing substantial interparcel mixing in the pure advection stage, because the flow information will be respected when remapping tracer density onto the fixed model grids. An adaptive interparcel mixing algorithm is constructed to ensure the validity of the linear


## 1 Introduction

Advection is one of the key problems in the geophysical modelling-modeling researches. Many tracers (or constituents) need to be advected by the flow simulated-flowsimulated by the atmospheric or oceanic dynamical core and physical parameterization. In an atmospheric global circulation model (AGCM), the most important tracer is tracers are the water vapour fone of the phases of waterand other phases of the water (e.g. cloud water and cloud ice), which participates participate in many parameterization processes (e.g. convection, microphysics, radiation). The quality of the computed water vapour distribution is substance distributions are vital to the successful simulation, though-although many other aspects also affect the results.

The numerical schemes can be divided into three categories: (1) Eulerian schemes; (2) semi-Lagrangian schemes; (3) Lagrangian schemes. The Eulerian schemes (Yu, 1994; Lin and Rood, 1996; Putman and Lin, 2007) are constructed on the fixed meshes and compute the flux of mass through the Eulerian cell edges. The semi-Lagrangian schemes (Staniforth
and Côté, 1991; Lauritzen et al., 2010) are also bound to the fixed meshes, but they track the mass in a cell and restart from grids each time step. Lauritzen et al. (2011) gave a thorough review on the atmospheric transport schemes emphasized on the semi-Lagrangian view on finite-volume discretisations. In comparison, the Lagrangian schemes use mobile parcels as the discretization units and track them all the time. The most significant advantage of of the Lagrangian schemes over the first two is that the numerical diffusion is highly suppressed because the simulated tracer parcels adapt to the flow and do not restart from the fixed grids. This advantage is praised in Stenke et al. (2008) which used a Lagrangian scheme to advect water vapor and cloud water, and gained positive results compared with the semiLagrangian scheme in ECHAM4.

Besides the application in the AGCMs, the Lagrangian schemes are also suitable for the use in the atmospheric chemistry transport models (CTM), see Brunner (2013) for an overview. With the increasing of the chemical tracer number (approaching hundreds), the multi-tracer efficiency becomes an important issue. Some Eulerian or semi-Lagrangian schemes need to advect each tracer species independently, so this low efficiency may become a significant computational bottleneck. Whereas in Lagrangian schemes, the trajectory information and some weights are shared by all the species, so this efficiency is very high. In addition, the trajectory information of individual parcel provided in default is useful for addressing sources and transport pathways. For the nonlinear chemical reaction, the un-
${ }_{20}$ physical numerical diffusion is disbennifit, which is hardly controlled a problem, which needs more efforts to control in the Eulerian and semi-Lagrangian schemes when the resolution is coarse, and will disturb the reaction. On the other hand, when the resolution is refined, the time step size must be reduced substantially due to the CFL constraint for some Eulerian schemes. Contrarily, the Lagrangian schemes have so least numerical diffusionthat no numerical diffusion, and the interparcel mixing needs to be implemented explicitly, but this mixing can be designed in a physical way, which is good for simulating chemical reaction realistically.

Several Lagrangian schemes have also been proposed in the last decade: (1) ATTILA (Atmospheric tracer transport in a Lagrangian model, Reithmeier and Sausen, 2002); (2)

CLaMS (Chemical Lagrangian model of the stratosphere, McKenna et al., 2002); (3) TTS$\mathrm{C} / \mathrm{I}$ (Trajectory-tracking scheme, "C" and "l" mean the tracking object is centroid and interface respectively, Dong and Wang, 2012, 2013); (4) HEL (Hybrid Eulerian-Lagrangian, Kaas et al., 2013). The discretisation unit in the Lagrangian schemes is the tracer parcel, which carries tracer information and is advected by the flow passively all the way without restarting from the fixed model grids each time step as in the semi-Lagrangian schemes. To be applied in aan AGCM, the carried tracer information must be remapped onto the the model grids, and some other information like tendencies from the physical parameterization needs to be remapped back onto the parcels. In some Lagrangian schemes unrealistic "spotty" tracer distribution will occur when the flow deforms greatly as noted in TTS-C (see Fig. 13 in Dong and Wang, 2012) and HEL (see Sect. 1.3 in Kaas et al., 2013). McKenna et al. (2002) also noted small (unmixed) structures will arise (see Fig. 8 there). This is caused by the fact that the parcel spatial extent or shape is not simulated explicitly, so the remapping is isotropic, e.g. the inverse distance weighting interpolation in TTS-C. When the parcel is
deformed severely(e.g. elongated into needle form), the tracer mass will not be distributed to the right grids or not resolved well, and the so-called spectral blocking or aliasing will occur (Kaas et al., 2013). The main motivation of this work is to address the problem of tracer mass remapping between the irregularly distributed parcels and the fixed model grids (e.g. regular latitude-longitude grids).

ATTILA, CLaMS and HEL all introduced some kinds of physical mixing among parcels to solve the above unrealistic tracer distribution problem with different methodologies. In order to keep the mass of air associated with a parcel as a compact volume around the parcel centroid, ATTILA redefines the parcel boundaries by bringing the mass mixing ratio $c$ of a species in a parcel closer to an average background mixing ratio, or called "interaction by exchange with mean" (Henne et al., 2013). CLaMS uses a Lyapunov exponent to measure for the deformation in the flow, and inserts or merges parcels based on this exponent. HEL incorporates the deformation rate of the flow and mixes tracers in a directionally biased way. In 2-D cases two passive auxiliary Lagrangian parcels are associated with the main parcel to identify the asymptotic dilatation axis caused by the shear. Only model grids close to
the axis are assigned the tracer mass carried by the main parcel, and this mixing is mainly along the asymptotic dilatation axis.

TTS-I tried another path by computing the parcel interfaces explicitly, which are polygons in 2-D cases, so the shape of each parcel is simulated. The polygons are advected and deformed by the flow, and new vertices are inserted to capture the curvature changes of the real interfaces. This solved the remapping problem to a great extent, and no mixing concept was added at this pure advection stage, though physical mixing must be still needed in the real application. The drawback of this approach is that the complex geometric calculation, especially on the sphere, hindered its application. Furthermore, in 3-D cases the parcel polyhedron is almost impossible to deal with.

In this work a new design of TTS is proposed with the consideration of pros and cons in TTS-C and TTS-I, and other schemes. To extend the new scheme to 3-D easily, the centroid discretisation is used as in TTS-C and other schemes. The shape of a parcel is still computed explicitly as in TTS-I to avoid the aliasing error as much as possible, but it is represented by a linear transformation matrix as in Yserentant (1999); Gauger et al. (2000) with some key modifications, so the costly geometric calculations in TTS-I are bypassed. This transformation transforms the physical space into a remapping space after translation, rotation and size change of the parcel. In this manner the flow deformation can play an important role in the remapping process. Several computation difficulties on the sphere have been addressed. Henne et al. (2013) stated that this type of parcel shape treatments allow for a more realistic description of the interparticle mixing and also enable the realization of a fully Lagrangian dynamical core, but these insteresting and important topics are not covered in this work. A flow adaptive interparcel mixing algorithm is also constructed in the new scheme to ensure the approximation of the parcel shape valid in the nonlinearly deformational flow. In other words, when the flow deformation is comparatively linear, the mixing can be turned off. The new scheme is renamed to LASM for Lagrangian Advection scheme with Shape Matrix to better represent its features.

The paper is organized as following: Sect. 2 presents the new LASM in details, i.e., the updating of the deformation matrix, and the interpacel mixing. Section 3 gives the results
from several test cases to show the performance of LASM. The conclusion and discussion is drawn in Sect. 4. The code availability is shown in Sect. 5.

## 2 LASM details

The advection equation in the Eulerian framework can be written as
${ }_{5} \frac{\partial \rho_{m}}{\partial t}+\nabla \cdot\left(\rho_{m} \mathbf{V}\right)=0, m=0, \ldots, M$,
where $\mathbf{V}$ is the velocity of the flow, and $\rho_{m}$ is the tracer density for the tracer species $m$. The mixing ratio of tracer $(m>0)$ relative to the background tracer or dry air $(m=0)$ is
$\phi_{m}=\frac{\rho_{m}}{\rho_{0}}$,
and will be used in the following tests. In the Lagrangian framework, this partial differential equation turns into an ordinary a differential equation system as

$$
\begin{align*}
\frac{\mathrm{d} \boldsymbol{x}}{\mathrm{~d} t} & =\mathbf{V}  \tag{3}\\
\frac{\mathrm{d} \rho_{m}}{\mathrm{~d} t} & =-\rho_{m} \nabla \cdot \mathbf{V}, m=0, \ldots, M \tag{4}
\end{align*}
$$

where $\boldsymbol{x}$ is the coordinate of a parcel centroid. So the continuous tracer field is discretized into tracer parcels with finite number accordingly. The parcel carries the tracer densities and masses for each species, and is transported by the given flow. Equation (3) is the trajectory equation for the parcel centroid. Its computation on the sphere is elaborated in Dong and Wang (2012), which integrates Eq. (3) by using the 4th-order Runge-Kutta Runge-Kutta method numerically and projects the centroids onto the polar stereographic plane when they are near polesthe Poles. Equation (4) describes the evolution of tracer density, which is affected by the flow divergence. The divergence on the model grids is evaluated by the
second-order central finite difference in this study. The interpolation of velocity and divergence onto the parcel centroids is bilinear.

Each parcel is constructed in the following two steps. Firstly the shape of the parcel is expressed by a linear transformation (see Fig. 1a) as
${ }_{5} \boldsymbol{x}=\boldsymbol{x}_{0 i}+\mathbf{H}_{i} \boldsymbol{y}$,
where $x_{0 i}$ is the centroid coordinate of parcel $i, \boldsymbol{x}$ is some spatial coordinate, $\boldsymbol{y}$ is the body coordinate in the remapping space with $x_{0 i}$ as the origin, and $\mathbf{H}_{i}$ is the transformation matrix or deformation matrix. In 2-D cases the shape of the parcel is ellipse, and in 3-D it is ellipsoid. The parcels can overlap each other. The inverse transformation is
$\boldsymbol{y}=\mathbf{H}_{i}^{-1}\left(\boldsymbol{x}-\boldsymbol{x}_{0 i}\right)$.
The matrix $\mathbf{H}_{i}$ is the key of this transformation, which controls the shape and size of the parcel. This idea is proposed by Harry Yserentant through a series of papers (Yserentant, 1997a, b, 1999, 2003; Gauger et al., 2000) in the context of fully Lagrangian dynamics. Compared with the polygons in TTS-I which can not overlap each other, the linear transformation is more feasible in the-a real application. Secondly the mass distribution within the remapping space of a parcel is prescribed by a shape function or kernel function
$\psi(\boldsymbol{y})=\prod_{k=1}^{d} \widetilde{\psi}\left(y_{k}\right)$,
which is a composite of a B-spline function (see Fig. 1b) as in Gauger et al. (2000)
$\widetilde{\psi}\left(y_{k}\right)=\frac{4}{3}\left\{\begin{array}{ll}2\left(1+y_{k}\right)^{3}, & -1 \leq y_{k} \leq-1 / 2 \\ 1-6 y_{k}^{2}\left(1+y_{k}\right), & -1 / 2 \leq y_{k} \leq 0 \\ 1-6 y_{k}^{2}\left(1-y_{k}\right), & 0 \leq y_{k} \leq 1 / 2 \\ 2\left(1-y_{k}\right)^{3}, & 1 / 2 \leq y_{k} \leq 1\end{array}\right.$,
where $d$ is the spatial dimension number, $y_{k}$ is $k$ th component of the body coordinate $\boldsymbol{y}$. This form of shape function is adopted in this work, since there is not no driving need to replace it.

### 2.1 Update of deformation matrix

The core of the new LASM is the deformation matrix $\mathbf{H}_{i}$ of parcel $i$, which is updated every time step according to the advection flow as in the following equation (Yserentant, 2003)
$\frac{\mathrm{d} \mathbf{H}_{i}}{\mathrm{~d} t}=\nabla \mathbf{V} \mathbf{H}$,
where $\nabla \mathbf{V}$ is the velocity gradient tension (a $d \times d$ matrix). But on the sphere, the solution of Eq. (9) meets some difficulties when parcels traverse the poles Poles in the spherical coordinate system. In some spherical meshes like cubed-sphere mesh, the coordinate system is on the local (curvilinear) coordinate, so the difficulties may be bypassed. In despite-spite of this, LASM needs to support the lat-lon mesh, so other solutions are sought. To avoid the pole-Pole problems, the transformation is conducted on the local stereographic projection plane with the parcel centroid as the origin. The spatial coordinate is labeled as $\widetilde{\boldsymbol{x}}$ on that plane, and Eqs. (5) and (6) become
$\widetilde{\boldsymbol{x}}=\mathbf{H}_{i} \boldsymbol{y}$,
$\boldsymbol{y}=\mathbf{H}_{i}^{-1} \widetilde{\boldsymbol{x}}$.
The coordinate transformation between spherical coordiante and local stereographic projected coordinate is routine and omitted here.

In 2-D cases, four auxiliary skeleton points are associated with each parcel. Their body coordinates are set as $(-1,0),(0,-1),(1,0)$ and $(0,1)$ respectively. Initially the parcels are in circle shape (see the left figure in Fig. 2) and the distance between centroid and skeleton point is chosen as 1.5 times as the maximum local model grid interval so that all the grids are covered by some parcels. It is noteworthy that a larger distance will cause a smoother initial tracer density distribution when remapping between tracers and grids as in Sect. 2.2.

The skeleton points will be advected along with the parcel centroid, and the relative locations of them will be changed if the flow is deformational (see Fig. 2). So we can say that the skeleton points sense the flow deformation, and they determine $\mathbf{H}_{i}$. From Eq. (10), the
elements of $\mathbf{H}_{i}$ can be calculated as
$h_{11}=\frac{1}{2}\left(h_{11}^{(1)}+h_{11}^{(3)}\right)$,
$h_{12}=\frac{1}{2}\left(h_{12}^{(2)}+h_{12}^{(4)}\right)$,
$h_{21}=\frac{1}{2}\left(h_{21}^{(1)}+h_{21}^{(3)}\right)$,

$$
h_{22}=\frac{1}{2}\left(h_{22}^{(2)}+h_{22}^{(4)}\right),
$$

5 where the superscripts $(*)$ are the labels for the skeleton points, and
$h_{11}^{(1)}=-\frac{\widetilde{x}_{1}^{(1)}}{y_{1}^{(1)}}$,
$h_{21}^{(1)}=-\frac{\widetilde{x}_{2}^{(1)}}{y_{1}^{(1)}}$,
$h_{11}^{(3)}=\frac{\widetilde{x}_{1}^{(3)}}{y_{1}^{(3)}}$,
$h_{21}^{(3)}=\frac{\widetilde{x}_{2}^{(3)}}{y_{1}^{(3)}}$,
$h_{12}^{(2)}=-\frac{\widetilde{x}_{1}^{(2)}}{y_{2}^{(2)}}$,
$h_{22}^{(2)}=-\frac{\widetilde{x}_{2}^{(2)}}{y_{2}^{(2)}}$,
$h_{12}^{(4)}=\frac{\widetilde{x}_{1}^{(4)}}{y_{2}^{(4)}}$,
$h_{22}^{(4)}=\frac{\widetilde{x}_{2}^{(4)}}{y_{2}^{(4)}}$.

The determinant of $\mathbf{H}_{i}$ is
$\operatorname{det} \mathrm{H}_{i}=\frac{1}{4} \operatorname{detH}_{i}^{(1,2)}+\frac{1}{4} \operatorname{detH}_{i}^{(1,4)}+\frac{1}{4} \operatorname{det} \mathbf{H}_{i}^{(3,2)}+\frac{1}{4} \operatorname{det} \mathrm{H}_{i}^{(3,4)}$,
where $\mathbf{H}_{i}^{(1,2)}$ is a matrix with elements $h_{11}^{(1)}, h_{12}^{(2)}, h_{21}^{(1)}, h_{22}^{(2)}$, and similar for the other three matrices. It is obvious that $\mathbf{H}_{i}$ is composed of four matrices $\mathbf{H}_{i}^{(1,2)}, \mathbf{H}_{i}^{(1,4)}, \mathbf{H}_{i}^{(3,2)}$ and $\mathbf{H}_{i}^{(3,4)}$.

The matrix $\mathbf{H}_{i}$ can be decomposed by using SVD (singular value decomposition) technique which provides useful information about the transformation for the subsequent computation,
$\mathbf{H}_{i}=\mathbf{U}_{i} \mathbf{S}_{i} \mathbf{V}_{i}$,
where $\mathbf{S}_{i}$ is a positive diagonal $d \times d$ scaling matrix with the diagonal elements in descending order, $\mathbf{U}_{i}$ and $\mathbf{V}_{i}$ are for rotation. The production of the diagonal elements of $\mathbf{S}_{i}$ is the determinant of $\mathbf{H}_{i}$, which is also a representation of the parcel volume $V_{i}$. On the other
hand, after solving the density of the tracer from Eq. (4), we can also calculate the tracer volume by
$V_{i}=\frac{m_{i}}{\rho_{i}}$,

### 2.2 Remapping between tracers and grids

Since other dynamical and physical processes of the model takes place on the Eulerian grids, the carried tracer densities by the parcels need to be remapped onto the grids.

After the trajectory calculation and deformation matrix updating, the parcels will be connected with the grids that have non-zero shape function value. This involves the neighbor searching algorithm. The searching procedure is as following

- The grids covered by the circle (or sphere in 3-D) with the parcel semi-major axis length as radius are searched;
- The grid coordinates are transformed into the parcel's body coordinate system by Eq. (11);
$\rho_{m_{I}}=\frac{1}{\sum_{j \in S_{I}} \psi_{j}(I)} \sum_{i \in S_{I}} \psi_{i}(I) \rho_{m_{i}}$,
where the subscripts $i$ and $I$ are for parcel and grid respectively, $S_{I}$ is the set of parcels that are connected with this grid. Since this is a linear remapping, the density on the grid will be in the range of the minimum and maximum density on the parcels. The remapping in the reverse direction is similar to Eq. (16) as
$\rho_{m i}=\frac{1}{\sum_{J \in S_{i}} \psi_{i}(J)} \sum_{I \in S_{i}} \psi_{i}(I) \rho_{m I}$,
where $S_{i}$ is the set of grids that are connected with parcel $i$.

The density (not the mass) is chosen as the remapping quantity, because the remapping weight is based on "distance" not overlapping area between parcels and grid cells as in TTS-I. So when the areas of the model grid cells are highly nonuniform (e.g. lat-lon mesh), large density error on the grids will occur if the mass is remapped, especially near the poles 5 Poles on the lat-lon mesh. Whereas the grid density will be constrainted directly through Eq. (16) when the density is remapped, but the drawback is that the total tracer mass on the grids can not be guaranteed as a constant without sources and sinks. This dilemma is also encountered by TTS-C and HEL. A mass correction must be done, if the total mass on the grids must be conserved. Diamantakis and Flemming (2014) described several mass fixer algorithms for the semi-Lagrangian schemes, which can be used in LASM. In this study, the simplest fixer is used as in TTS-C and HEL. This may make people uncomfortable, but as stated in Kaas et al. (2013), it is different from the traditional global methods in Eulerian and semi-Lagrangian schemes, because the correct values are preserved in the Lagrangian parcels, in other words, the total mass on the parcel is exactly conserved, therefore the total mass on the grids is well constrained. The profound impact on the model simulation should be analyzed in the real application. On the other hand, when more uniform mesh is used (e.g. cubed-sphere, icosahedral mesh), we can remap the mass and the total mass on the grids is conserved automatically.

There may be occasions that some grids are not connected with any parcel, which are called void grids as in ATTILA. When this happens, the void grids will be filled by the density value interpolated from its neighbor grids by using the inverse-distance weight. In the real application, due to the continuity condition, the void grids are conjectured to be very rare.

Finally because the remapping weight $\psi_{i}(I)$ is the same for all the tracer species, the multi-tracer efficiency will be as good as HEL, which meets the needs of chemistry transport models with hundreds of tracer species.

### 2.3 Interparcel mixing

It is ideal that all the parcels will move around and keep good shape, but in the deformational flows, the large shear will elongate some parcels along the asymptotic dilation axis, and the
strong vortex will stir the parcels heavily. At some critical time points, on one hand the determinant of $\mathbf{H}_{i}$ may turn to be negative if the parcel size is not limited, which is unphysical and means negative volume, on the other hand the linear deformation approximation of the parcel shape may be violated. These are caused by the finite parcel resolution. To avoid problems, Klingler et al. (2007) proposed a restart procedure in the finite mass method, which replaces the old, deformed parcels (particles in their case) by more regularly distributed parcels (i.e. redistribution). But the global parcel redistribution will eventually cause unacceptable numerical diffusion, and some good features of the Lagrangian method will be lost (e.g. good preservation of tracer correlation). Contrarily a different path is taken in LASM, where a parcel $i$ is mixed with its surrounding parcels (the connected parcels of the cell where parcel $i$ is contained) when the ratio $\gamma_{i}$ of the major axis of the parcel shape to the minor one (i.e. $s_{1 i} / s_{2 i}$ in 2-D) exceeds some threshold $\gamma_{m}$ (normally 100 in this study).

The threshold $\gamma_{m}$ is adjusted by the flow. We define a disorder degree $\mathcal{D}_{i}$ of parcel $i$ by the angles between the major axes of it and its surrounding parcels. Firstly the angles are calculated on the local stereographic plane of parcel $i$. Secondly the ratio between the maximum and mean angles ${ }^{1}$ is defined as $\mathcal{D}_{i}$. When $\mathcal{D}_{i}$ is small, the parcels are well organized so that they are free to sense the deformation of the flow, such as the case in Fig. 4a. When $\mathcal{D}_{i}$ exceeds some threshold $\mathcal{D}^{*}$ (e.g. 1.05), the parcels are disordered and the flow is more nonlinearly deformational, such as in Fig. 4b, so the interparcel mixing needs to be more easily triggered to improve the linear deformation approximation by reducing $\gamma_{m}$ to a strict value $\gamma_{m}^{*}$ (e.g. 5) for the involved parcels. It is noteworthy that the mixing in LASM is adapted to the flow deformation, not the tracer density gradient as in the Eulerian or semi-Lagrangian schemes, so the correlation between tracers will not be largely disturbed because the mixing degrees of all the tracers are same. the same. It should also be noted that the values and formulas of the above parameters are by no means the optimal ones. The current values are gained under the objective to make LASM perform well in both ideal and barotropic test cases. For example, when $\chi_{m}^{*}$ is larger, unacceptable results (more aliasing) will be observed, and when it is smaller, the excessive diffusion will appear. Better
${ }^{1}$ To reduce arccos calculation, the cosine of the angles are used.
formula of $\mathcal{D}_{i}$ could be designed to ensure the mixing is sufficient so that the aliasing is eliminated at all.

When parcel $i$ needs to be mixed, its major axis will be shrunk by a factor $\alpha=0.05$ to reduce $\gamma_{i}$, so the mixing is a gradual process. Firstly $s_{1 i}$ is reduced to $(1-\alpha) s_{1 i}$. Secondly the new $\mathbf{H}_{i}$ are reconstructed by using Eq. (13). The skeleton points are also reset according to the new $\mathbf{H}_{i}$. The constant value of $\alpha$ may be changed to a function of $\mathcal{D}_{i}$ and time step size suggested by the reviewer Eigil Kaas, which will make LASM more adaptive. This will be addressed in the future works.

Some part (controlled by $\alpha$ ) of the tracer mass (omitting the species index $m$ ) carried by parcel $i$ will be distributed to its surrounding parcels. The mixing weight for a surrounding parcel $j$ is calculated on the local stereographic plane of parcel $i$ as
$w_{j}=\frac{1}{\sum_{k \in S_{i}} w_{k}} \exp \left(-\beta_{1} d_{j}^{(1)^{2}}-\beta_{2} d_{j}^{(2)^{2}}\right)$,
where $d_{j}^{(1)}$ is the distance parallel to the major axis of parcel $i$, and $d_{j}^{(2)}$ is vertical to the major axis, parameters $\beta_{1}$ and $\beta_{2}$ are two scale factors, and $S_{i}$ is the set of the surrounding parcels. Weight (Eq. 18) is similar with Eq. (29) in Kaas et al. (2013), so only parcels close to parcel $i$ will be involved, see the color of the surrounding parcels in Fig. 4c (The redder the color is, the larger the weight is). Moreover we can control the lateral mixing by adjusting $\beta_{2}$. The larger $\beta_{2}$ is, the less the lateral mixing is. In addition, the lateral mixing can also be controlled by $\mathcal{D}_{i}$, so when $\mathcal{D}_{i}$ is high, $\beta_{2}$ is changed to $\beta_{2}^{*}$ (e.g. 10) to allow more lateral mixing. Then the new tracer mass of parcel $j$ is
$m_{j}^{*}=m_{j}+w_{j} \alpha m_{i}$.
The volume of parcel $j$ will be increased accordingly ( $\mathbf{H}_{j}$ is updated) as
${ }^{25} \quad V_{j}^{*}=V_{j}+w_{j} \alpha V_{i}$,
so the tracer density will be
$\rho_{j}^{*}=\frac{m_{j}^{*}}{V_{j}^{*}}=\frac{1}{\frac{1}{V_{i}}+\frac{w_{j} \alpha}{V_{j}}}\left(\frac{1}{V_{i}} \rho_{j}+\frac{w_{j} \alpha}{V_{j}} \rho_{i}\right)$,
which is clearly a weighted average and reveals the mixing nature of this operation. No new in this process.

Compared to the mixing in other Lagrangian schemes, LASM can avoid the mixing as much as possible when the flow deformation is quite linear because the linear deformation approximation is sufficient for capturing the parcel shape changes -and then helping the aliasing occurs. Additionally, extra mixing can be added by casting the corresponding formula based on the physical thoughts.

### 2.4 Implementation

LASM is implemented in C++ language and incorporates the object-orient programming model. The Fortran interfaces for application in the existing models will be added in the to remap the tracer mass onto the right grids. This is the reason why $\chi_{m}$ can be set as large as 100 so that the evolution of the parcel shape will not be interrupted when the flow deformation is in order. Only when this approximation will be violated, the interparcel mixing is triggered. The current formula of disorder degree $\mathcal{D}$ is very preliminary, more elaberate and less costly one can be designed in future. to compensate for such degeneration when future. The workflow is shown in Fig. 5 and the overall programming units are depicted in Fig. 6, which are divided into two libraries (LASM and GEOMTK) with different functionalities. The key implementation details are summaries: can be summarized as

- Parcel and tracer codes: The Parcel class contains the centroid coordinate, H, U, $\mathbf{S}, \mathbf{V}$ and the index to the mesh cell. It is the core of LASM. The Tracer class derives from Parcel and adds the members related to tracer species, such as the density and mass. The skeleton points (TracerSkeleton) are also contained in Tracer.

Tracer objects are managed by TracerManager which contains a list of them. The tracer quantities remapped onto the mesh and the connectivity between parcels and grids are organized in MeshAdaptor.

- Mesh and field codes: The mesh is specified by the model (AGCM or OGCM) and is not the core of LASM, so the mesh details are separated from LASM. Different mesh could be used by implementing the corresponding mesh, index and regrid classes. The field class are bound with the mesh class to provide a convenient container. Currently, only lat-lon mesh is implemented, but other meshes will be supported in the future.
- Neighbor search codes: The efficient neighbor search codes should depend on the mesh type, but currently a general search algorithm is adopted to reduce the development burden. This algorithm comes from the MLPACK library ${ }^{2}$ and is based on the tree data structure. The fixed grids are organized into a tree structure at the initialization stage. When search searching the connected grids of a parcel, this tree is walked through and the Euclidean space distance is used as the judger. In future, if the efficiency needs to be improved further, the exclusive search algorithms for each mesh could be implemented.
- Interparcel mixing codes: The interparcel mixing is conducted after the remapping from parcels to grids, because this can avoid modification of connectivity between parcels and grids due to the shape change of parcels.
- Test case codes: Several test cases for testing LASM are coded in the same interface AdvectionTestCase. Currently there are three concrete test case classes:

1. SolidRotationTestCase
2. DeformationTestCase
3. BarotropicTestCase
${ }^{2}$ See MLPACK website http://www.mlpack.org.

The current implemention is not fully optimized, only serial run is tested. The parallel version by using OpenMP and MPI techniques will be provided in other works.

## 3 Test case results

In the following subsections, three test cases are performed to validate LASM. It should be noted that the trajectory calculation in LASM is the same as it will be in the a real application, whereas some other schemes used semi-analytical trajectory (i.e. use the true velocity at half time step), so the error caused by the time discretization will be a little larger in LASM relatively. In order to reduce the unnecessary computation in the lat-lon mesh, he the initial distribution of parcels is chosen as a reduced lat-lon mesh with only 4 parcels along the zonal circle closest to polesthe Poles, and the latitutde of the transition from the normal region to the reduced region is $45^{\circ} \mathrm{S} / \mathrm{N}$. The normal key parameters for the test cases are listed in Table 1. Because $\gamma_{m}$ is large, no mixing occurs in the interesting regions in the ideal test cases ${ }^{3}$. The impact of interparcel mixing with different parameter configurations is tested in Sect. 3.2.4. A test case with a barotropic model as the driver is also included to demonstrate the performance of LASM in the more complex flow.

### 3.1 Solid body rotation

The traditional solid body rotation on the sphere test case is used to illustrate the basic performance of LASM, since no apparent shape changes will occur. The sphere radius $R$ is chosen as 1 , and the cosine bell radius $R_{c}$ is $R / 3$. The time step size of all runs are 1800 s .

Figure 7 shows the traditional normalized errors $\left(l_{1}, l_{2}, l_{\infty}\right)$ of three runs with rotation paramter $\alpha$ as $\pi / 2, \pi / 4$ and 0 respectively. The crossing pole-Pole $(\alpha=\pi / 2)$ run has relatively larger errors, whereas another run with rotation along the equator ( $\alpha=0$ ) has significant error reduction. This reveals that the crossing pole-Pole trajectory calculation affects the overall accuracy. On the other hand, HEL constructed on the cubed sphere mesh
${ }^{3}$ Occasional mixing only occurs near poles-Poles in the deformation test cases.
performs with high accuracy, so the main inaccuracy sources are from lat-lon mesh (e.g. trajectory calculation on the polar stereographic projection plane). In the future, more elaborate crossing poles Poles trajectory calculation may be designed, or compute on other meshes without pole Pole problems.

### 3.2 Deformation flow

The deformation flow test cases proposed in Nair and Lauritzen (2010); Lauritzen et al. (2012) are utilized here with the emphasis on convergence rate, filamentation preservation, correlation preservation diagnostics. These tests are also used in a scheme intercomparison study (Lauritzen et al., 2014).

The analytical flows selected are the same as the previous studies (Kaas et al., 2013), including one non-divergent flow and one divergent flow. The trajectories implied by the two flows are quite challenging, since the initial compact parcels will be stretched and bent into long filaments. The deformation reaches maximum at half simulation duration and is reversed after that. Three initial conditions consisting of Gaussian hills, cosine hills and slotted cylinders defined in Lauritzen et al. (2012) are used for different purposes.

In all the following test runs, the sphere radius $R$ is 1 , and the normalized flow period $T$ is 5 . The Courant number ( CN ) is fixed for different spatial resolutions as about 1 with time step size $5 / 600$ for $1.5^{\circ}$ spatial resolution. The selection of time step size is only subjected subject to the accuracy, not the stability, compared with other Eulerian schemes. The simulated spatial distribution of tracer mixing ratios in the two flows with different initial conditions are shown in Fig. 10 with the parameters listed in Table 1, which shows that LASM can preserve the discontinuity in tracers and perform well in the deformational flows. The results with the slotted cylinders initial condition of other schemes can be referred in Figs. 7-10 in Lauritzen et al. (2014).

### 3.2.1 Convergence rate and minimal resolution

The numerical convergence rate of LASM is evaluated with the Gaussian hills initial condition in the non-divergent flow. Figure 8 shows the results for error norms $l_{2}$ and $l_{\infty}$, where the rate is calculated by the linear regression from the four error samples. Currently, the convergence rate of LASM is about 1 first-order with $\mathrm{CN}=1$. The main error source comes from trajectory calculation, because the error is not reduced when only changing the spatial resolution (not shown) . analytical velocity field is also used, but the convergence rate is still first-order (not shown), because the spatial remapping between tracers and grids is only first-order. In constrast, HEL uses a second-order numerical approximation to the gradient of the tracer density on the Eulerian mesh (see Eq. (15) in Kaas et al. (2013)). In the future, $\rho_{m i}$ and $\rho_{m L}$ on the right hand side of Eq. (16) and (17) can be modifed as in HEL to improve the convergence rate of LASM.

The minimal resolution $\Delta \lambda_{m}$ is an absolute error measure that supplements the convergence rate. The initial condition is changed to the cosine hills, which is quasi but not infinitely smooth, to challenge the schemes. $\Delta \lambda_{m}$ is the evaluated resolution at which the $l_{2}$ error is 0.033 , therefore larger value is better. For unfiltered CSLAM (Lauritzen et al., 2010) $\Delta \lambda_{m}$ is $1.5^{\circ}$ with $\mathrm{CN}=5.5$ and about $1^{\circ}$ with $\mathrm{CN}=1$ (Lauritzen et al., 2012), where $\Delta \lambda_{m}$ is about $1.40^{\circ}$ for LASM with $\mathrm{CN}=1$.

### 3.2.2 Filamentation preservation

${ }^{20}$ This diagnostics $\left(l_{f}\right)$ is used to indicate how well the advection scheme resolves the thin filaments that develop at $t=T / 2$, which is defined as
$l_{f}=\left\{\begin{array}{ll}100 \frac{A(\tau, t)}{A(\tau, t=0)}, & \text { if } A(\tau, t=0) \neq 0 \\ 0, & \text { else }\end{array}\right.$,
where $A(\tau, t)$ is the total area whose tracer mixing ratio value exceeds $\tau$ at time $t .19$ values across the range $[0.1,1]$ of $\tau$ are selected for the cosine hill initial condition. In non-divergent flow, the the area spanned by mixing ratio values larger than some threshold value should
be preserved. Therefore $l_{f}$ of a good scheme should be close to $100 \%$. When evaluate $l_{f}$ on the parcels, the values would be almost $100 \%$ as stated in Kaas et al. (2013), which is also true for LASM. But because we consern concern the results on the model grids, $l_{f}$ is evaluated on the model grids even though LASM is fully Lagrangian.

Figure 9 shows the result of two resolutions $\left(1.5^{\circ}\right.$ and $\left.0.75^{\circ}\right)$, which inidicates that LASM can preserve the filament or large gradient very well. All the values of $l_{f}$ are around $100 \%$ with a little oscillation in $1.5^{\circ}$ resolution, and further better when the resolution is doubled. The results of other schemes can be found in Fig. 5 of Lauritzen et al. (2014), where most schemes exhibit diffusive trait, i.e. $l_{f}$ is larger than $100 \%$ at smaller $\tau$ and vice versa.

### 3.2.3 Correlation preservation

The correlation preservation diagnostics proposed in Lauritzen and Thuburn (2012); Lauritzen et al. (2012) evaluate the potential performance of schemes in the chemistry transport models, where the pre-existing correlations among tracer species are chemically significant and influence the chemical reaction rates and equilibria. In this test two tracers with initial nonlinear functional relation are advected in the non-divergence flow, where $\chi$ corresponds to the cosine hills initial condition and $\xi$ corresponds to the nonlinearly related hills (see Eqs. 21 and 22 in Lauritzen and Thuburn, 2012, for setup).

The scatter plots of the two tracers on the mesh at $t=T / 2$ are depicted in Fig. 11, including three mixing diagnostics: real mixing $l_{r}$, unmixing $l_{u}$ and overshooting $l_{o}$. The order of magnitude of unmixing is $10^{-8}$. When evaluated on the parcels, the unmixing and overshooting are both zero as HEL. The real mixing is also small ( $10^{-4}$ ) so the scatter points are almost along the prescribed functional curve. The results of other schemes can be found in Figs. 11-14 of Lauritzen et al. (2014). Therefore LASM is among the schemes which can preserve the tracer correlation well.

### 3.2.4 Impact of interparcel mixing

The above deformation test cases have not included apparent interparcel mixing, because the mixing only occurs near the Poles occasionally where the tracer density is constant, so the impact of the mixing are demonstrated in this section by adjusting the key parameters.

### 3.3 Barotropic model test

To test the new LASM in a more realistic flow, this section shows the results from a barotropic dynamical model on the sphere. This dynamical model is solved by using a finite difference method with an implicit Euler midpoint time integrator that can conserve the total energy and total mass on the regular lat-lon mesh. The details about the numerical techniques in the model can be referred to Wang and Ji (1994). The barotropic equations
are

$$
\begin{align*}
\frac{\partial U}{\partial t} & =-\frac{1}{2 a \cos \varphi}\left[\left(\frac{\partial u U}{\partial \lambda}+u \frac{\partial U}{\partial \lambda}\right)+\left(\frac{\partial v^{*} U}{\partial \varphi}+v^{*} \frac{\partial U}{\partial \lambda}\right)\right]+f^{*} V-\frac{H}{a \cos \varphi} \frac{\partial \phi+\phi_{s}}{\partial \lambda},  \tag{23}\\
\frac{\partial V}{\partial t} & =-\frac{1}{2 a \cos \varphi}\left[\left(\frac{\partial u V}{\partial \lambda}+u \frac{\partial V}{\partial \lambda}\right)+\left(\frac{\partial v^{*} V}{\partial \varphi}+v^{*} \frac{\partial V}{\partial \lambda}\right)\right]-f^{*} U-\frac{H}{a} \frac{\partial \phi+\phi_{s}}{\partial \varphi},  \tag{24}\\
\frac{\partial \phi}{\partial t} & =-\frac{1}{a \cos \varphi}\left(\frac{\partial H U}{\partial \lambda}+\frac{\partial H V \cos \varphi}{\lambda}\right) \tag{25}
\end{align*}
$$

where $H=\sqrt{\phi}, U=u H, V=v H, v^{*}=v \cos \varphi$ and $f^{*}=2 \Omega \sin \varphi+\frac{u}{a} \tan \varphi . u, v$ and $\phi$ are the zonal wind speed, merdional wind speed and geopotential depth respectively, $\phi_{s}$ is the surface geopotential. The gravity acceleration $g=9.8 \mathrm{~m} \mathrm{~s}^{-2}$, the Earth radius $a$ is $6.371 \times 10^{6} \mathrm{~m}$ and the rotation velocity $\Omega$ of the Earth is $7.292 \times 10^{-5} \mathrm{~s}^{-1}$. The model spatial resolution is $1.5^{\circ} \times 1.5^{\circ}$, and the time step size is 20 s to ensure stability.

The objective of this experiment is to test the effectiveness of the adaptive interparcel mixing. Three tracers are advected:

- an initial uniform background tracer used to calculate mixing ratio of the step tracer;
- the geopotential depth as in the barotropic model;
- a step tracer (Fig. 14b).

Since the current LASM is not fully dynamical, the standard shallow water tests are not used, instead two subcases with different initial conditions and topography are conducted:

- subcase 1: isolated cosine topography (Fig. 14a), constant initial geopotential depth, and wind field derived from geostrophic relation;
- subcase 2: flat topography, initial wind field and geopotential depth (Fig. 14c) from ERA reanalysis.

Although the initial flow in subcase 1 is simple, a strong vortex will be generated above the topography. The interparcel mixing must be effective to control the parcel shape near the
vortex to avoid intensive filamentation which will degenerate the degree of approximation. The results of subcase 1 are shown in Fig. 15. Two resolutions of parcels are used (21984 and 87948). From the geopotential depth results, it can be concluded that the mixing is working, despite of some noise around the vortex in LASM compared with the barotropic in Fig. 16. When $\mathcal{D}^{*}$ is reasonable enough, the sensitivity on it is not very large, but when it is infinity, i.e. the adaptivity is turned off, the tracer density is in disorder and many spotty structures come out due to the degeneration of linear deformation approximation when parcels turn to be very long. The parcel distribution after 24 h is depicted in Fig. 15f. The parcels are stirred heavily by the vortex, and the mixing occurs frequently there to ensure the good approximation.

In subcase 2, a 200 hPa geopotential depth and wind field from ERA reanalysis are chosen as the initial conditions. After 24 h , the geopotential depth simulated by the barotropic model and LASM are compared in Fig. 17a-c. The discrepency (i.e. wind-mass inconsistency) between the results of the barotropic model and LASM can not be avoided, but model. The noise level is reduced when the number of parcels is increased. Based on this observation, the adaptive refinement of parcels may be incorporated in future to further improve the performance of LASM. From the step tracer results, it is obvious that LASM does a good job to simulate discontinuous tracer field, where the thin and rolled filament is preserved very well. The effects of the interparcel mixing adaptivity can be further illustrated indicates the good performance on the discontinuous tracer of LASM, where the discontinuous tracer is deformed heavily, although no reference solution is given. The parcels after 24 h (Fig. 17e) are fairly chaostic. chaotic. The time duration of this subcase is also extended to 10 days, and the step tracer is already deformed beyond recogition as shown in Fig. $15 f$ (the animation can be found in the supplement files or viewed in http://dongli.github.io/dongli/assets/pictures/lasm.barotropic.240x120.step.cells.gif).

The sensitivity about $\gamma_{m}$ is also tested by reducing it to 10 , and the results (not shown) of the two subcases are almost the same as the above, because the interparcel mixing
is active to limit the parcel size in the nonlinearly deformational flow, so no long parcels survive.

## 4 Conclusions

A new Lagrangian advection scheme LASM is proposed in this work, which takes into ac5 count of the pros and cons of TTS-C/I and other Lagrangian schemes. The core of LASM is the linear transformation matrix that is used to describe the parcel shape. The remapping weight is then anisotropic so that the flow deformation is respected. The test results show that LASM can reduce the aliasing error occured in other that will occur in the Lagrangian schemes without introducing substantial mixing when the flow deformation is quite linear. The interparcel mixing is only triggered in the regions with very strong nonlinear deformation where the linear deformation approximation will be violated, and the parcels will be shrunk to improve the approximation. The effects of such mixing is verified and acceptable as compared with HEL. Parameter $\gamma_{m}, \alpha, \beta_{1}$ and $\beta_{2}$ can be used to control the degree of mixing. Furthermore the disorder degree $\mathcal{D}$ of the parcels is used to adjust $\gamma_{m}$ and $\beta_{2}$. This adjustment is evaluated to be effective in the barotropic tests. The formulation of $\mathcal{D}$-the parameters may be further polished to better control the mixing and judge the nonlinear deformation. Currently, the convergence rate of LASM is first-order, and this can be improved by adding the second-order terms when remapping tracer mass.

LASM is ready to be extended into three-dimension with consideration of the vertical motion and boundaries. Other spherical meshes except for lat-lon mesh will be supported in the near future, and the crossing poles Poles performance will be better when the mesh does not have the pole-Pole problems. The grid searching procedure may be further polished to improve the remapping accuracy. The remaining challenges are coming from the parallel computing. In the Eulerian models (AGCM/OGCM/CTM), the spatial domain is decomposed into several parts, and each part is assigned to one CPU/node. For some Eulerian or semiLagrangian schemes, only boundary cells need to be communicated among the CPUs. But because Lagrangian parcels move around, the parcels in CPU1 initially may travel to the
other CPU, this may cause some troubles when parallelize parallelizing the codes. Efficient LASM for application in the real models will be implemented in other workworks.

## 5 Code availability

The codes of LASM is version managed by using GIT and hosted in GitHub. 5 The repository URL is https://github.com/dongli/LASM. There are also two repositories GEOMTK (https://github.com/dongli/geomtk) and BARAOTROPIC-MODEL (https://github.com/dongli/barotropic-model) used by LASM as submodules.

Acknowledgements. This work is supportted by the National Natural Science Foundation of China (Grant No. 41305094).

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Table 1. Key parameters of LASM.

| parameter | symbol | value |
| :--- | :---: | ---: |
| filament_limit | $\gamma_{m}$ | 100 |
| strict_filament_limit | $\gamma_{m}^{*}$ | 5 |
| shrink_factor | $\alpha$ | 0.05 |
| radial_mixing | $\beta_{1}$ | 1 |
| lateral_mixing | $\beta_{2}$ | 1000 |
| strict_lateral_mixing | $\beta_{2}^{*}$ | 10 |
| disorder_degree_limit | $\mathcal{D}^{*}$ | 1.05 |



Figure 1. (a) Linear transformation between physical space and remapping space. In this 2-D case, the black ellipse in physical space is transformed into a red circle in remapping space so that two points marked by 1 and 2 have the same distance to $x_{0}$ in remapping space, but their Euclidean distances to $x_{0}$ are different. (b) The deformed shape function is bell like.


Figure 2. Four skeleton points (black points) associated with a parcel. Their spatial coordinates will change with the flow, but the body coordinates in remapping space are fixed. The red point is the major axis vertex of the parcel.


Figure 3. The neighbor grids of the parcel schema. The black cross is the parcel centroid, and the black circle represents the parcel shape that is determined by the deformation matrix. The red filled circles are the neighbor grids connected with the parcel.

## (a) Low disorder degree


(b) High disorder degree

(c) Interparcel mixing


Figure 4. (a) The low disorder degree case, where the black ellipses are the surrounding parcels of the red one. (b) The high disorder degree case. (c) The blue parcel is mixed with its surrounding parcels whose colors indicate the mixing weights (The reder, the larger). The blue parcel is shrunk to the green one after mixing.


Figure 5. The workflow of LASM.


Figure 6. The overall programming units of LASM and their relationship. Four external libraries (Boost, Armadillo, NetCDF and MLPACK) are used.


Figure 7. The normalized errors in solid rotation test case. Three runs with different rotation parameter $\alpha$ have different error levels. The run rotates along equator has the lowest errors.


Figure 8. Test of convergence for the deformation test case with Gaussian initial condition using error norms $l_{2}$ (left) and $l_{\infty}$ (right). The Courant number is fixed. The upper reference line is for second-order, and the lower one is for third-order.


Figure 9. Diagnositics for filament preservation, $l_{f}$, for the model grid resolution $1.5^{\circ}$ and $0.75^{\circ}$.


Figure 10. Results from deformation flow test cases. (a) is the initial slotted cylinders for the nondivergent flow test, and (b) is the initial cosine hills for the divergent flow test. (c) and (d) are the simulated distributions at time $t=T / 2$ with maximum deformation. (e) and (f) are the final distributions at time $t=T$. The model grid resolution is $1.5^{\circ} \times 1.5^{\circ}$, and time step size is $T / 600$.


Figure 11. Diagnostics for correlation preservation for the model grid resolution $1.5^{\circ}$ and $0.75^{\circ}$.




Figure 12. The effects of interparcel mixing with the slotted cylinders initial condition. There are three parameter configurations as shown on the top of the each row. By increasing $\beta_{2}$, the lateral mixing is decreased. The results for $\gamma_{m}=100$ are in Figs. 10 and 11.


Figure 13. The effects of interparcel mixing with the slotted cylinders initial condition. There are three parameter configurations as shown on the top of the each row. The tested parameter is $\alpha$ that controls the amount of tracer mass distributed to the surrounding parcels.


Figure 14. (a) The surface geopotential in subcase 1. (b) The initial step tracer mixing ratio. (c) The initial geopotential depth in subcase 2 (wind field is omitted).
(a) Geopotential depth from LASM with 21984 parcels after 24 hr

$\begin{array}{lllllll}61000 & 64750 & 68500 & 72250 & 76000 & 79750 & 83500\end{array}$
(c) Geopotential depth from LASM with 87948 parcels after 24 hr


| 61000 | 64750 | 68500 | 72250 | 76000 | 79750 | 83500 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

(e) Geopotential depth from barotropic model after 24 hr

(b) Step tracer from LASM with 21984 parcels after 24hr

(d) Step tracer from LASM with 87948 parcels after 24 hr

(f) Parcel (21984) distribution after 24hr


Figure 15. The simulation results after 24 h in subcase 1.


Figure 16. The effectiveness of the interparcel mixing adaptivity. Different disorder degree threshold $\mathcal{D}^{*}$ are tested. (a) is the same as Fig. 15b.


Figure 17. The simulation results after 24 h in subcase 2.

