1	A Twenty-Year Dynamical Oceanic Climatology: 1994-2013.
2	Part 1: Active Scalar Fields: Temperature, Salinity, Dynamic
3	Topography, Mixed-Layer Depth, Bottom Pressure
4	$Draft \ Version \ 1.2^*$
5	The ECCO Consortium (M, Buckley <sup>8</sup> , JM. Campin <sup>3</sup> , A. Chaudhuri <sup>1</sup> , I. Fenty <sup>2</sup> ,
6	G. $Forget^3$ , I. Fukumori <sup>2</sup> ,
7	P. Heimbach <sup>3,4</sup> , C. Hill <sup>3</sup> , C.King <sup>3</sup> , X. Liang <sup>5</sup> , A. Nguyen <sup>4</sup>
8	C. Piecuch <sup>1</sup> , R. Ponte <sup>1</sup> , K. Quinn <sup>1</sup> ,
9	M. Sonnewald <sup>3</sup> , D. Spiegel <sup>3</sup> , N. Vinogradova <sup>7</sup> , O. Wang <sup>2</sup> , C. Wunsch <sup>3,6</sup> ) <sup>†</sup>
10	March 1, 2017

Abstract

The World Ocean Circulation Experiment (WOCE) was created to produce the first cli-12 matologically useful picture of the ocean circulation and its low-frequency variability. This 13 goal is addressed here from the state estimate of the Estimating the Circulation and Climate 14 of the Ocean (ECCO) consortium, which uses almost all of the data obtained during WOCE 15 and its aftermath along with the much improved general circulation modeling capabilities. 16 A dynamically and data-consistent, time-evolving, state estimate is available depicting the 17 ocean and its ice-cover over a 23-year time-span, globally, from the sea surface to the sea 18 floor. The resulting time-dependent 20-year long climatology includes temperature, salinity, 19 surface elevation, bottom pressure, sea-ice, and three components of velocity. Accompany-20 ing the state estimate are modified estimates of meteorological forcing-fields, ocean interior 21 mixing coefficients, and initial conditions. Much spatial structure persists through the two-22 decade averaging. Results here are primarily pictorial in nature, intended to give the wider 23 community a sense of what is now available and useful and where more detailed analysis 24 would be fruitful. An extended reference list is included. 25

11

<sup>\*</sup>For corrections, additions, comments and criticisms please email carl.wunsch@gmail.com.

<sup>&</sup>lt;sup>†</sup>1. AER, Inc., 2. Jet Propulsion Laboratory, 3. MIT, 4. U. Texas Austin, 5. U. South Florida, 6. Harvard

U., 7. Cambridge Climate Institute, 8. George Mason U.

# <sup>26</sup> 1 Introduction: The State Estimate

27 Purpose

One of the central goals of the World Ocean Circulation Experiment (WOCE) was to produce 28 the first truly global time-varying estimate of the circulation over approximately a decade, an 29 estimate that would be useful in defining the major climatologically important ocean elements. 30 The Estimating the Circulation and Climate of the Ocean (ECCO) project was formed near the 31 start of the WOCE field program so as to address this goal using both the conventional and 32 newly-deploying WOCE observation system, along with the rapidly advancing general circulation 33 modelling capability (Stammer et al., 2002). In this paper, and in subsequent Parts, this WOCE 34 goal is addressed by defining a time-dependent climatology over the 20-year (bidecadal) interval 35 1994-2013. Little or no dynamical or kinematical interpretation is provided—that is left to other 36 authors and times. 37

Various oceanic climatologies are in use by the oceanographic and climate dynamics com-38 munities. They serve as tests of models, as initial conditions, and as a basic descriptor of the 39 ocean. Definitions of climatologies vary widely both in terms of how they were formed and 40 the durations they represent. Here we describe a 20-year average modern climatology from a 41 dynamically consistent model that also has a consistent fit to the majority of global data be-42 tween 1992 and 2015 (Wunsch and Heimbach, 2013). The climatology is based upon the ECCO 43 version 4 state estimate (Forget et al., 2015). It derives from a least-squares fit of the MITgcm 44 (Marshall et all, 1997; Adcroft et al., 2004; Forget et al., 2015) to the numerous and diverse 45 global observations. A summary would be that all of the Argo, altimetry, the CTD hydrography 46 appearing in the WOCE Climatology and successors (Gouretski and Koltermann, 2004; Talley 47 et al., 2016), all extant, bias error-corrected XBTs, the considerable elephant seal profile data 48 (Roquet et al., 2013), GRACE mission mean and time-dependent geoids, satellite-measured sea 49 surface temperature and salinity, and the ECMWF<sup>1</sup> ERA-interim reanalysis of the meteorologi-50 cal variables (Dee et al., 2014), have been included, with the fits inferred to be adequate relative 51 to the estimated uncertainties of the data. (Atmospheric reanalyses should not be considered 52 "data", however.) 53

Previous climatologies, e.g. Levitus et al. (1982) and its later incarnations as the NOAA World Ocean Atlas, or Gouretski and Koltermann (2004) have usually been based only upon temperature and salinity averages and over much longer time intervals than employed here. Other climatologies (e.g., AchutaRao et al., 2007) have focussed on the upper 700 or 1000m and relied heavily on XBT measurements. As such, all these suffer from the very great inhomogeneities

<sup>&</sup>lt;sup>1</sup>European Centre for Medium Range Weather Forecasts

of data distribution prior to the WOCE period and a series of untestable statistical hypothe-59 ses (see e.g., Wunsch, 2016; Boyer et al., 2016). This present climatology differs from earlier 60 ones most obviously in its production of the three-dimensional, time-varying, three components 61 of velocity and of a self-consistent surface meteorology, as determined at the model time-step, 62  $\Delta t \approx 1$  h. Use of any fluid climatology confronts one basic problem: that the resulting time or 63 space-time average fields do not satisfy any simply derivable equations of motion—requiring a 64 variety of turbulence closure schemes—and the relationships among the different variables can 65 be complicated and poorly known. Here, time/space means of fluid quantities are based upon 66 the uniform average of fields exactly satisfying the model equations at each model time-step 67 (nominally 1 hour) and grid-point. Some authors have used ocean general circulation models fit 68 to data in methods analogous to those in meteorology and commonly known as "reanalyses." 69 These, unfortunately, are usually not property conserving (heat, salt, momentum, etc.) and 70 thus unsuitable for global-scale climate calculations (see e.g., Wunsch and Heimbach, 2013; and 71 Fig. 1 of Stammer et al., 2016). 72

A number of sketches of global scale analyses of earlier multi-decadal ECCO estimates has 73 been published starting with Stammer et al. (2002). An earlier 16-year global time-average was 74 described by Wunsch (2011), with a focus on the accuracy of Sverdrup balance, and Wunsch and 75 Heimbach (2014) discussed the heat content changes. Liang et al. (2016a,b) describe the vertical 76 redistribution of heat. In general, the present solution differs only subtly from those previously 77 used, with the chief differences being ascribed to the inclusion of more data over a longer 78 duration, inclusion of geothermal heating, improvements in the handling of sea ice, and where 79 appropriate separate uncertainties for time-average and time-anomaly measurements. Solutions 80 are generally robust, as the great volume of ocean in the model state vector is in near-geostrophic 81 balance with the density field at all times longer than a few days. 82

By choosing the period following 1994, a much more nearly uniform global data coverage is obtained than was possible earlier. Chief among the remaining data inhomogeneities are the intensification of the Argo float profile data availability after about 2005.

Any temporally averaged state will be considerably smoother than states which are sampled 86 more or less as "snapshots." Thus classical hydrographic sections (e.g., Fuglister, 1960 or the 87 various WOCE Atlases) show many small-scale features which vanish on averaging. Suppressed 88 features include internal waves, tides, and geostrophically balanced eddy motions. Meandering 89 currents, such as the off-shore Gulf Stream, are broader and smoother than in any near-synoptic 90 estimate. In addition, fluid regions that are only marginally or poorly resolved numerically 91 (particularly boundary currents), will be smoother than even a true 20-year average would be. 92 No model with a nominal horizontal grid-spacing of  $1^{\circ}$  of longitude can resolve small-scale 93

circulation features, which include the important boundary currents. Nonetheless, the near-94 geostrophy of the bulk of the ocean supports the conjecture that to the extent that a successful 95 fit to the interior temperature, salinity, and altimetric fields and surface boundary conditions, has 96 been obtained, the boundary currents will be forced by the interior flows to carry the appropriate 97 amount of mass (volume), temperature, etc. so as to satisfy the basic overall conservation laws. 98 This conjecture, upon which we rely, can be regarded as a formal statement of that used by 99 Stommel and Arons (1960) in their discussion of deep boundary currents—whose existence and 100 structure was fixed by the mass and property requirements of the interior flow—even though 101 they were not dynamically resolved. 102

As with any estimation problem, a crucial element in the determination of the best values 103 lies with the use of realistic error estimates for all of the data that are being fit. For a full 104 discussion of the error estimate used here, reference must be made to the literature. Temperature 105 measurements are described by Forget and Wunsch (2007) and Abraham et al. (2013). Altimetry 106 accuracies are discussed by Fu and Haines (2013) and Forget and Ponte (2015). For the gravity 107 data from the GRACE mission, see Quinn and Ponte (2008). Satellite surface salinities are 108 addressed by Vinogradova et al. (2014). Meteorological variable accuracies are described e.g., 109 by Chaudhuri et al. (2013). 110

This paper is not an in-depth analysis of any features of the global ocean circulation. It 111 is instead mainly visually descriptive—a suggestive pictorial subsample—intended primarily to 112 serve as an invitation to the wider community to exploit it by demonstrating various products. 113 With the widespread recognition that a steady-state ocean never exists, attention turns instead 114 to the temporal changes over the estimation period.<sup>2</sup> Here for descriptive purposes, some pictures 115 of changes year-by-year for 20 years, by 20-year averages by month, and by season are displayed. 116 All results can readily be calculated month-by-month at the expense of using a larger volume of 117 numbers. 118

Most results are intended mainly to be indicative of possibilities rather than being the most precise or accurate possible. Thus for example, the heat capacity,  $c_p$  and the mean density,  $\bar{\rho}$ are treated as constant in calculations of heat uptake even though both are (weak) functions of position.

## 123 The State Estimate

The ECCO state estimate is obtained from the *freely-running* MITgcm after the adjustment of the control parameters required to fit the data. In the least-squares methodology with Lagrange multipliers (see Wunsch and Heimbach, 2013), the entire interval 1992-2015 has been

<sup>&</sup>lt;sup>2</sup>Forget (2010) presented an 18-month estimate from an earlier ECCO state estimate, and which is closer to being a "snapshot" rather than a climatology.

fit to the data. Parameters adjusted include the three-dimensional, top-to-bottom, initial con-127 ditions, internal mixing coefficients, and the surface meteorology. At any given time in the 128 estimation interval, the solution represents data both preceding and following that date so that 129 the equations are always satisfied while coming as close to the data as possible within uncertainty 130 estimates. The 20-year period 1994-2013 has been chosen for averaging as sufficiently distant 131 from the poorly constrained earlier years before the high accuracy altimetry begins in late 1992 132 and the time of the then non-existent data following 2016. The period corresponds to that of 133 complete coverage by satellite altimetry, the WOCE CTD survey, and the interval after about 134 2005 when the Argo array became fully-deployed. All data, plus the ECMWF estimate, have 135 been assigned uncertainties that include both instrumental and natural noise. After adjustment 136 of the parameters, the free-running forward model satisfies all basic conservation requirements 137 and is structurally no different from any other unconstrained model estimate. 138

No state estimate is definitive or "correct"; they are "best-estimates" for the present time: data are continuously added, both from more recent years and previously omitted earlier values; estimated data errors are sometimes revised; models are improved; and in all situations, minimizing iterations are ongoing. Values shown here are obtained from ECCO version 4 as of mid-November 2016.

Undoubtedly the state estimate has residual systematic errors at some level, particularly 144 in data-poor regions and times. To some extent, these will be removed when considering only 145 temporal changes in the state over the 20-years and these latter are given some emphasis. 146 Uncertainty estimates remain an amorphous problem: much of the variability in the model 147 represents deterministically evolving elements. Stochastic elements are introduced by weather, 148 some longer-period meteorological variability, and by elements of the initial-conditions best 149 regarded as random. Because the true probability distributions are not known, discussion of 150 estimate uncertainties is postponed to Part 4. 151

A full description of the many features of a 20-year average global ocean circulation requires a book-length publication, if not a library. The strategy here is to sketch the gross hydrographic and circulation features and to do a limited comparison to a few of the special regions (boundary currents, mixed-layer, etc.) to provide some of the flavor of the differences between an average and both the more common limited-time analyses usually available (classical synoptic hydrographic sections) as well as the far more inhomogeneous published climatologies.

With time-mean fields being spatially and temporally smoother than in nominally synoptic measurements, second order quantities such as the time averages e.g.,  $\langle \mathbf{v} \rangle \langle T \rangle \neq \langle \mathbf{v}T \rangle$ , where  $\langle \cdot \rangle$ denotes a epace-time average, and the difference may be very large. Much of physical oceanography has been based upon the unstated assumption that quasi-synoptic measurements represented



Figure 1: (a) Level thicknesses; (b) level depths in the ECCO version 4 of the MITgcm.

{interfaces\_la

the mean motion. Thus e.g., the calculation of Sverdrup balance, or of "abyssal recipes", are 162 implicitly steady-state results, despite the common use of individual hydrographic sections. Here 163 true 20-year average estimates are now possible. This description and discussion thus largely 164 focusses on the properties of single variables, T, u, etc., their 20-year means and estimates of 165 the deviation from those means. As Part 1, this paper is confined to the hydrographic products, 166 T, S and their implications for surface elevation, mixed layer depth, deformation radii, etc. The 167 velocity field and its property transports are discussed in Part 2. Most emphasis is placed on the 168 global fields. A number of higher resolution, regional versions, of the state estimate exist (e.g., 169 Gebbie et al., 2006; Mazloff et al., 2010), and a high northern latitude version is forthcoming 170 (An Nguyen, personal communication, 2016), but these are not further discussed here. 171 All of the ECCO system output described here is available in Matlab form at: http://mit.ecco-172 group.org/opendap/diana/h8 i48/contents.html<sup>3</sup> as 20-year means, 20-separate annual means, 173 20-year average individual months, and 20-year average seasonal means (DJF, MAM, JJA, SON) 174 on a grid in 50 vertical levels, of thickness plotted in Fig. 1. Many studies are best done in 175 isopycnal-like coordinate systems; but the present description is confined to calculations in geo-176 metrical (latitude-longitude-depth) coordinates, with the interpolations to isopycnals postponed 177 (but see Speer and Forget, 2013 for a mode water discussion). 178

# <sup>179</sup> 2 Temperature Field

## 180 Data Misfits

Figs. 3-4 show the misfit to the mean temperature over 20 years at two different levels.<sup>4</sup>

<sup>&</sup>lt;sup>3</sup>Or contact Carl Wunsch directly (cwunsch@mit.edu) for data or advice.

 $<sup>^{4}</sup>$ The projections used here are the so-called loximuthal, with the Atlantic placed close to the center. The rationale is that this form both avoids the visual dominance of the tropical Pacific–which tends to get excess attention—and shows the Arctic as a reasonable fraction of the total. Color scales mostly follow the advice of Thyng et al. (2016) as both most suitable for colorblind individuals and with the least visual distortion of the



Figure 2: Latitude (blue curve) and longitude spacing in kilometers as a function of latitude (from Forget et al., 2015). Higher latitude spacing exists near the equator. At high latitudes the more complex grid leads to a distribution of spacings (see Figs. 1,2 of Forget et al., 2015). Most of the high latitude southern region is land.

Values are calculated from point values where available and then gridded. Although some systematic misfits do appear, particularly in the region of the unresolved western boundary currents and near-surface in the tropical oceans, the bulk of the system is within a fraction of a degree of the observed averages. Although not shown here, misfits can be readily computed for each year, each season, and each month if desired. In an ideal world, the misfit values should be Gaussian, here roughly consistent with the displayed histograms.

The implications of regional misfits to observations is a problem generic to the use of *any* general circulation model: if a model fails to adequately mimic the observations in a particular place at a particular time, does that render useless the solution in other regions and times? The existence of the adjoint (dual) solution as part of the state estimate permits, in the present situation, an answer in terms of global sensitivities computed from the dual (e.g., Heimbach et al., 2011). That discussion is postponed to Part 3 of this climatology.

### 194 Estimated Solutions

A representative set of horizontal charts and vertical sections is displayed here. For temper-195 ature, the charts and sections are oceanographically qualitatively consistent with conventional 196 descriptions of the large-scale, averaged oceanic circulation. Thus for example, the 20 year av-197 erage temperatures at 5 and 105m in Figs. 5, 6 show all of the conventional near-surface gyres, 198 the strong Southern Ocean thermal fronts, the upwelling regions off Africa, California and South 199 America, as well as numerous other expected features. The differences between these two maps 200 are a rough measure of the mixed layer temperature gradient (discussed below). Some mapped 201 values are shown with a histogram of their distribution; where not shown they are typically 202 Gaussian—or at least unimodal. Most property anomalies are strongly unimodal; time average 203

fields.

{forget\_etal\_f



Figure 3: Misfit to the 20-year average temperature (°C) at 105m including Argo, XBT, CTD, and elephant seal profile data. Inset shows a histogram of values. A small number of outliers here and in other charts have been suppressed.

{misfit\_temper



Figure 4: Same as Fig. 3 except at 553 m.

{misfit\_temper



Figure 5: Twenty-year mean potential temperature at 5m depth (°C). Inset shows the histogram of values.

### {temperature\_2

properties usually are not. An example of the deep temperatures is shown in Fig. 7 near 2100m
depth.

At 2100m (Fig. 7) the Atlantic Ocean warmth relative to the rest of the world is obvious, as is the large-scale thermal gradients extending away from the Southern Ocean.

A few traditional potential temperature sections are shown in Figs. 8-11. As compared to standard atlas sections (e.g., the WOCE Atlas Series) they display, as expected, similar largescale features, but tend to be considerably smoother. Nonetheless, a number of small scale features survive the 20-year averaging, particularly in the Southern Ocean (Fig. 10).

### 212 Global Mean temperatures:

The 20-year mean temperatures of the global ocean, including the full Arctic, are shown in Table 1. Volume-weighted global average temperature is 3.32°C as compared to Worthington's (1981) estimate of 3.51°C, but who had no Arctic and very few Southern Ocean values (see his Fig. 2.1 and Fig. 10 here). Table 1 lists volume-weighted mean temperatures, while the ad hoc standard errors are the raw standard deviation of the unweighted temperatures and salinities from the spatial variations of the 20-year means. They give a rough idea of the range of temperatures (and salinities) that enter. On the other hand, the standard errors of the



Figure 6: Twenty-year average potential temperature at 105m (°C). Note change in scale from Fig. 5. {temperature\_2



Figure 7: Twenty-year average temperature at 2084m (°C). Color saturates at 3.9 °C with the maximum approaching 13.5°C in the Mediterranean and Gulf of Mexico.

{temperature\_2



Figure 8: Twenty-year mean section (°C) of potential temperature down 28.8°W in the Atlantic ocean. {temp\_20yearme



Figure 9: Twenty-year mean potential temperature in all three oceans along 14°N.



Figure 10: The twenty-year average temperature along 60°S through the Drake Passage.

{temp\_20yearme



Figure 11: Equatorial 20-year mean potential temperature section.

{temp\_20yearme

Depth Range (m)	Mass (Zetta $(10^{21})$ kg	Mean Temperature, °C	Mean Salinity, o/oo
0-100	0.04	15.4(9.3)	34.74(0.10)
0-700	0.32	9.1(7.4)	34.74(0.10)
0-2000	0.90	5.2(6.4)	34.70(0.07)
0-3600	1.5	3.8(6.0)	34.72(0.06)
3600 to bottom	0.31	0.9(0.34)	34.73(0.003)
0 to bottom	1.7	3.32(6.7)	34.72(0.06)

Table 1: Mean temperatures and salinities over 20 years as integrated to various depths. Parenthetical values are the standard deviation of the annual mean temperatures and salinities going into the calculation. They are not any sort of standard error. Standard deviations of volume weighted temperatures are far smaller (e.g.,  $2x10^{-5}$  degree C). A constant density of 1029 kg/m<sup>3</sup> was used in computing the total masses for each depth range, and which are also displayed.

{table\_vols}

<sup>220</sup> fractional volume weighted temperatures are far smaller: e.g. for the global mean temperature,

that standard error is  $4 \times 10^{-7}$ °C, but which is in large part a measure of the volumetric variability 221 assigned to each temperature under the pretence of statistical independence of each value. Let 222  $V_{ijk}$  indicate the volume occupied by any grid box, at horizontal location indices i, j, and with 223 depth index k. Fig. 12 shows the distribution of fractional values  $T_{ijk}V_{ijk}/\sum_{ijk}V_{ijk}$  in the 20-224 year mean temperatures. There the vertical index k ranges over the top 100m, and over the full 225 water column. The bimodal, non-normal distribution renders an ordinary variance estimate of 226 the mean not particularly meaningful. Useful uncertainties would come from computing means 227 from resampling strategies dictated by actual observational distributions (e.g., Wunsch, 2016; 228 Boyer et al., 2016), but which is not carried out here. Such estimates depend sensitively on 229 statistical assumptions about the space-time distribution for "infilling" purposes. 230

# 231 2.1 Annual Changes

Figs. 13-16 show individual year-long average anomalies relative to the 20-year average at two representative depths. Apart from major regional features (e.g., the Gulf of Alaska and the Indo-Pacific tropics), these results emphasize the very intricate patterns appearing, and the consequent highly challenging space/time sampling program for forming large-spatial scale means.



Figure 12: (Left panel). Histogram of volume weighted temperature values of  $T_{ijk}V_{ijk}/\sum_{ijk}V_{ijk}$  for the global 20-year temperature mean in the top 100m of the model. (Right panel) Same as the left panel except for the entire water column. ijk are the three grid box indices,  $V_{ijk}$  is the volume assigned to temperature  $T_{ijk}$ . Note the bimodal nature of the distributions and the long-tail for the top 100m values. See also, Fig. 5.

{temp\_20yrmean

Period & Fraction of	$1 \mathrm{W/m^2}$	1  mm/y
Water Column	Heating/Cooling Rate	GMSL Change
1 Year, Full Depth	0.002°C	$0.0015^{\circ}\mathrm{C}$
20 Years, Full Depth	$0.04^{\circ}\mathrm{C}$	$0.03^{\circ}\mathrm{C}$
1 Year, Upper 700 m	0.01°C	0.008°C
20 Years, Upper 700 m	$0.2^{\circ}\mathrm{C}$	$0.16^{\circ}\mathrm{C}$
1 Year, Below 700 m	$0.0025^{\circ}\mathrm{C}$	0.002°C
20 Years, Below 700 m	$0.05^{\circ}\mathrm{C}$	$0.04^{\circ}\mathrm{C}$

Table 2: Approximate oceanic temperature changes implied by a 1 W/m<sup>2</sup> heating (or cooling)-rate over different times and depths, as well as the temperature change equivalent of a 1 mm/y global mean sea level (GMSL) change. For rough calculation purposes, the heat capacity  $c_p = 4000 J/kg/^{\circ}C$ , h = 3800m,  $\rho = 1029 kg/m^3$ , Expansion coefficients  $\alpha$  are in the range  $5 - 30x10^{-5}/C$  (Thorpe, 2005) and smaller near the freezing point. Modified from Wunsch and Heimbach (2014).

{table2}



Figure 13: Anomaly of temperature in 1994 relative to the 20 year mean at 105m.

{temp\_anom\_199



Figure 14: Twenty-year mean anomaly of temperature at 105m in 2013, twenty-years after that in Fig. 13.

 $\{\texttt{temp}\_\texttt{anom}\_\texttt{201}$ 



Figure 15: Change in temperature between 2013 and 1994 at 105m, the difference of Figs. 14 and 13. {temp\_anom\_201



Figure 16: Temperature anomaly at 2100m in 1994 relative to the 20-year mean.



{temp\_anom\_200

## 237 2.2 Heat Uptake

A large literature has grown up surrounding the notion of a "hiatus" in global warming during 238 the nominal period 1998-2013. No consensus has emerged over the reality or significance of this 239 phenomenon in the presence of very noisy, under-sampled sets of data as well as the exchanges 240 (re-arrangements) of heat energy within the ocean itself. To the extent that the phenomenon is 241 a real one, it has been argued that the ocean uptake of heat must have increased during that 242 period, subject to the assumption of little or no change of net solar radiation during that interval. 243 Conversion of out-of-equilibrium heating rates, which are minute compared to the background 244 values, is not very intuitive. Thus Table 2 converts a net ocean uptake change of  $1 W/m^2$  into 245 an approximate temperature change, depending upon the depth over which the change is to be 246 attributed. So for example, if the changed heat content all resides in the upper 700m, the mean 247 temperature would change by  $0.2^{\circ}$ C in 20 years. Similarly, the Table also shows the temperature 248 change over different layers that would lead to a 1mm/y change in global mean sea level. In 249 terms of the ordinary, measured, oceanic temperature, the changes are dauntingly small. 250

The inferred 20-year change in heat content is depicted in Fig. 17, displaying the computed 251 yearly-average global mean temperature anomaly for each year. Deeper values are accompanied 252 by a least-squares fitting straight-line. The "abyssal" region, 3600m to the bottom shows a 253 slight cooling. Heat content changes, involving the massive volumes in the deeper integrals, are 254 tabulated in Table 3. A map of the vertically integrated heat content can be seen in Wunsch 255 (2016) and see Liang et al. (2016a,b) for further discussion. Negative values in the abyss are 256 most easily interpreted as owing to cooling there during the adjustment from the estimated 257 initial conditions. Discussion of the linear fits and their statistical significance, if any, is left to 258 the references except to say that no obvious evidence of a "hiatus" or other time-limited shift, 259 appears. 260

The global mean ocean temperature shows an increase over 20 years to 2000m of 0.02°C 261 (difference of first and last years and not a fitted trend). That change translates (Table 2) 262 into a heating rate of  $0.3 \text{W/m}^2$ . The change to 700 m is  $0.08^{\circ}\text{C}$  translating into  $0.13 \text{W/m}^2$  not 263 inconsistent with numerous published estimates, including that of Wunsch and Heimbach (2014) 264 from a previous state estimate. Although the upper 100m displays, as expected, a much larger 265 noisiness, including e.g., the 1997-98 El Niño event, the deeper integrals display no such effect. 266 The calculation of differences tends to remove systematic errors in the ECCO system, but a 267 further quantification is not available. The total warming over 20 years includes the cooling 268 below 3600m remarked by Wunsch and Heimbach (2014) which persists even with the inclusion 269



Figure 17: Volume weighted temperature change °C by year. Upper panel is the average to 100m and 700m, and lower panel the averages to 2000m, 3600m, the total top to bottom, and the abyssal layer below 3600m. Dashed lines are a best linear fit using a jackknifed estimate of the uncertainty in the values (not shown).

{heat\_content\_

Depth Range (m)	Mean Heat Content	Temp. Change 20 Yrs	Warming 20
	(YJ: 10 <sup>24</sup> J)	°C	Year Difference $W/m^2$
0-100	2.6	0.03	0.02
0-700	11.6	0.03	0.13
0-2000	18.9	0.02	0.26
0-3600	22.2	0.02	0.32
3600-bottom	1.1	-0.09	-0.004
0-bottom	23.3	0.01	0.23

Table 3: Time-mean heat content in the ocean by depth range in Joules. The net change, converted to  $W/m^2$ , calculated from the difference between 2013 and 1994 is shown. Most of the oceanic mass lies below 700m. Mean temperatures are shown in Table 1.



Figure 18: Vertical temperature difference over averaged over the top 100m from 2014-1993. A La Niña pattern is visible, but embedded within a complex structure of global change.

{temp\_lastminu

of  $0.1 W/m^2$  average geothermal heating<sup>5</sup>.

Changes in heat content, as reflected in temperature, have a complex spatial pattern varying 271 with depth. Figs. 18-20 show the column averaged temperature differences for three represen-272 tative depths, including the top-to-bottom. These are presumably the result of interior redistri-273 butions, and air-sea fluxes over the 20 years. As always, the irregular sampling distribution for 274 in situ measurements used alone is challenging if accurate global means are required. Standard 275 deviations of the annual means, which become part of the discussion of sampling strategies, are 276 shown in Figs. 21-22 again depicting the strong regionality. Instantaneous standard deviations 277 are necessarily far larger. Huge standing reservoirs of thermal energy in the ocean, and the very 278 small dis-equilibrium of the climate system, renders accurate determination of the very slight 279 reservoir changes to be a difficult problem. 280

## 281 2.3 Annual Cycle

The largest ongoing climatological signal is the seasonal oscillation. Vinogradov et al. (2008) have described the seasonal cycle of sea level in an earlier ECCO state estimate. Fig. 23-26

 $<sup>^{5}</sup>$ More precisely 0.095 W/m<sup>2</sup>.



Figure 19: Vertical average temperature change, top-to-bottom, 2013 minus 1994 in °C.

# {temp\_differen



Figure 20: Abyssal temperature change, 3600m to the bottom, over 20 years. The warming of the Antarctic Bottom Water (Purkey and Johnson, 2010) is apparent, with a cooling over much of the rest of the ocean (see Wunsch and Heimbach, 2014).

{temp\_lastminu



Figure 21: Standard deviation of temperature (°C) averaged over top 105m based on yearly variations. {temp\_stdev\_to



Figure 22: Vertical average temperature, (°C) top-to-bottom, standard deviation based on annual fluctuations. Relatively intense values in the northwestern Atlantic Ocean need to be rationalized (some discussion is provided by Hakkinen et al., 2013).

{temp\_stdev\_to



Figure 23: Seasonal (December, January, February, DJF) mean 5m temperature anomalies. The main feature is the interhemispheric anti-symmetry with the conventional larger amplitudes in the northern region.

{temp\_djf\_5m.t

displays the four seasonal temperature anomaly means at the 5m level in the present estimate.
The largest signals are in the shallow regions on the eastern coasts of Asia and North America

where the continental meteorology first encounters the ocean.

Non-equatorial vertical propagation of seasonal forcing tends to be suppressed rapidly with 287 increasing depth (Gill and Niiler, 1973). Some understanding of the overall depth/spatial struc-288 ture of the seasonal cycle can be obtained from the singular value decomposition of the seasonal 289 average temperature. With four seasons, only four pairs of singular vectors fully describe the 290 patterns, and because the time average of the anomalies vanishes, only three pairs are required. 291 The singular values are 2706, 1083, 436. Figs. 27-29 show the most energetic component  $\mathbf{u}_1$ 292 for three depths. But from Fig. 30, on the spatial average, the annual cycle in temperature 293 penetrates only to about 100m, and beneath that depth (in the spatial average) it is negligible. 294

# <sup>295</sup> **3** Salinity Field

## 296 Data Misfits

Twenty-year average salinity misfits are displayed in Figs. 31, 32. Largest values and outliers are at continental margins where model resolution is inadequate, and where issues concerning land runoff data accuracies persist.



Figure 24: Twenty-year average temperature anomaly March, April, May at 5m.

{temp\_mam\_5m.t



Figure 25: Twenty-year average temperature anomaly at 5 m, June, July, August.

{temp\_jja\_5m.t



Figure 26: Twenty-year seasonal mean temperature anomaly at 5m September, October, November. {temp\_son\_5m.t



Figure 27: The first EOF (singular vector) of temperature at 5m. multiplied by  $10^4$ . Values are dimensionless with units being ascribed to the singular values.



Figure 28: Same as Fig. 27 except at 105m.

{temp\_v1svd\_10



Figure 29: Same as Fig. 27 except at 722m. A monsoonal response is visible, particularly in the eastern and western tropical Indian Ocean. Otherwise, the annual cycle at this depth is effectively negligible.

{temp\_v1svd\_72



Figure 30: (Left panel) The first three singular vectors of the annual cycle in temperature as a function of depth at one point on the Atlantic equator  $(0^{\circ}E, 0^{\circ}N)$ . (Right panel). Logarithm of the areal mean as a function of depth of the 3 singular vectors of temperature. The annual cycle in temperature is effectively confined to the top 100m of the ocean.

{temp\_svd\_viwi



Figure 31: Misfit of the state estimate to the salinity data averaged over 20 years at 5m—effectively the surface. (g/kg).

{misfit\_salt\_5



Figure 32: Same as Fig. 31 except at 722m.

#### {misfit\_salt\_7

#### 300 Salinity Charts

A number of representative maps and sections are shown in Figs. 33-39. These are again broadly consistent with historically available estimates.

The global mean salinity (volume weighted) is 34.72, fortuitously identical to Worthington's (1981) estimate from a very sparse data set. Apparent changes in upper ocean salinity over 50 years have been discussed e.g., by Durack et al. (2012) and Vinogradova and Ponte, (2016). The histogram of the distribution of salinity is in Fig. 40, showing the comparatively narrow range existing over the oceanic bulk.

## **308 3.1** Regional Examples

As an example of what can be done regionally with salinity, Fig. 41 displays the twenty-year seasonal average anomalies at 5m depth of salinity in the Bay of Bengal (see e.g., the special issue *Oceanography*, 29(2), 201) for a comparison).

Among other regional applications is that of Pillar et al. (2016) in the North Atlantic, and which includes a sensitivity analysis using the dual solution (see also, Part 3 of this series), Wunsch (2010) for the Indonesian Throughflow, Buckley et al. (2014, 2015) and Evans et al. (2017) for North Atlantic changes.



Figure 33: 20-year average salinity, g/kg, at 5m depth.

{salt\_20yrmean



Figure 34: Twenty-year mean salinity (g/kg) at 105m depth. A marked difference with the near surface (5m) values is apparent.



Figure 35: Twenty-year average salinity at 2100m. Excess values in the North Atlantic and the extreme of the Mediterranean Sea (values truncated here) are visible. The relatively saline Atlantic and fresh Pacific Oceans are apparent.





Figure 36: Twenty-year average salinity (g/kg) along a section at 30°N in the North Atlantic Ocean. {salt\_zonalsec



Figure 37: Meridional section of 20-year average salinity (g/kg) along  $180^{\circ}W$  in the Pacific Ocean. Note the presence of ice at the surface at the northern latitudinal extreme.





Figure 38: Twenty-year average salinity, g/kg, in a zonal section along the equator in all oceans. Note extra contours below 500m.

{salt\_20yrmean



Figure 39: Twenty-year mean salinity in a zonal section through the Drake Passage with a complex zonal structure as seen also in temperature (Fig. 10) and producing a similarly complex zonally varying T - S relationship in the Southern Ocean.





Figure 40: Histogram of salinity values averaged over the top 100m (left panel) and to the bottom (right panel). The latter is truncated so that some very small numbers of outliers are not shown. (histo s

{histo\_salt\_20



Figure 41: Twenty-year seasonal averages of salinity anomalies at 5m in the Bay of Bengal. September-November.

{bayofbengal\_s



Figure 42: Salinity anomaly by year and depth interval. The upper ocean becomes fresher with a small salinity increase below 3600m corresponding to the slight net warming there and again most likely owing to the adjustment to initial conditions.

{salt\_anom\_byy

#### 316 **3.2** Fresh Water uptake

Fig. 42 shows the small changes through time occur in the salinity fields, including a weak freshening below 100m but above the abyss. The equivalent freshwater injections are shown in Table 4 as meters of water each year. The net change over 20 years to 2000m corresponds to about 3 mm/y freshwater addition or about 0.04 Sv. (For comparison, net annual precipitation over the ocean is about 12 Sv.) Spatial variations in  $\partial \rho / \partial S$  were not included. If justified, more accurate calculations are obviously possible.

## 323 **3.3 Surface Salinity Change**

The difference between the annual mean near-surface (5 M) salinity anomalies in 2013 minus those in 1994 is shown in Fig. 43 and can be compared with the 20-year near-surface mean surface salinity in Fig. 33. Durack et al. (2012) have suggested that the surface salinity patterns over 50 years have become more intense in the last decades. In contrast with their result, the pattern correlation between the time average salinity and the 20-year difference is 0.26. Even if statistically significant (not clear) the mean salinity pattern accounts for less than 10% of of the spatial variation in the change; cf. Vinogradova and Ponte (2016).

Depth Range	20 y mean Sal	Salinity Change 20 y	Freshwater Input
m	m g/kg	$10^{-3}{ m g/kg}$	mm/y
0-100	34.74 (7.2)	-6.6	1.2
0-700	34.74(17.2)	-2.6	3.2
0-2000	34.70 (17.1)	-1.1	3.8
0-3600	34.72(17.0)	0	-0.1
0-bottom	34.72 (16.7)	0	-0.4
Abyss (3600m-bottom)	34.73 (11.2)	+0.1	-0.1

Table 4: Time-mean salinity in the ocean by depth range, the calculated change over 20 years, and approximate conversion to equivalent freshwater input or extraction.

{meansalt}



Figure 43: Change in 5m salinity between 1993 and 2014.

{salt\_5m\_2013\_



Figure 44: T-S histogram of the raw (not volume weighted) temperatures and salinities in the 20-year mean. The logarithm of the relative volume is plotted. (Cf., Fig. 3 of Wunsch and Heimbach, 2014).

# 331 3.4 TS-Distribution

In the 20-year average, the largest volume of water in T-S space (Fig. 44) has a temperature of 0.5°C and a salinity of 34.70 g/kg. Worthington (1981) had estimated the most abundant water in the ocean was in the intervals 1.1-1.2°C, 34.68-34.69 g/kg. Separate histograms for volume weighted temperature and salinity have already been shown above.

# <sup>336</sup> 4 Surface Elevation and Bottom Pressure

## 337 Misfits

Surface elevation,  $\eta(\theta, \lambda, t)$  relative to an estimated geoid is largely, but not completely, de-338 termined by the altimetric data: the state estimate is simultaneously being fit to meteorological 339 forcing, the thermal, salinity and ice fields, and any other data (e.g., gravity and altimeter height 340 changes) that are present. A full determination of cause would depend upon the adjoint sensi-341 tivity of  $\eta$  to each of these data sets. The adjoint solution is discussed in Part 3. But because 342 the altimetric records are the only ones nearly uniform and global over the entire 20 years, the 343 20-year average misfit to the time-varying altimetric measurement of  $\eta$  is shown in Fig. 45. 344 Apart from some isolated outliers that have been suppressed, the misfits are generally within 345 10cms overall, highest at high latitudes, and showing some residual structures in the tropics. 346 Misfits associated with the moving Kuroshio also appear. 347

### 348 Dynamic Topography

The 20-year mean surface elevation relative to the EGM2008 geoid (the dynamic topography; see Pavlis et al., 2012) is shown in Fig. 46. Quantitative differences exist between this estimate



Figure 45: Average misfit (m) over 20 years of the state estimated values of  $\eta$  and that measured by the suite of altimeters. Based upon the average of the monthly misfits.

{slamisfit\_20y

and the initial estimate from Rio and Hernandez (2004). Maximenko et al. (2009) published similar but different estimates based on various data sets, including surface drifter data corrected for ageostrophic effects; these latter data are not included in ECCO v4 because of concerns over the appropriate error estimates (e.g., Elipot et al., 2016).

Seasonal mean anomalies of  $\eta$  are in Fig. 47-50 and have the expected dominant hemispheric shifts. Some of the large-scale gyres, and particularly the western boundary current regions, as well as the ice-covered regions near Antarctica, show considerable seasonality. Ice-covered regions are difficult to measure whether in situ or by satellite, and high-latitude seasonal biases probably exist in all data sets. The present estimate does include some 200,000 elephant seal profiles (Roquet et al., 2013), many from under the floating ice regions.

The seasonal cycle in  $\eta$  is depicted in Figs. 47-50. Interhemispheric interchange is the major expected feature, but complex structures in the tropics remain even with 20 years of averaging. Anomalies of  $\eta$  relative to the 20-year average in 1994 and 20 years later are shown in Figs. 51, 52. One can infer a general rise in value over the 20-years, but it is highly structured. Using only tide gauges to determine the global average of figures such as Fig. 51 —to a useful accuracy—is an exercise in finding a small residual in the presence of much larger spatial and temporal fluctuations.



Figure 46: Twenty-year mean dynamic topography . Very low values in the ice-covered areas account separately for the ice thickness. Off-setting the entire surface by a constant would have no observable dynamical consequences. Compare to Maximenko et al. (2009), Knudsen et al. (2011). Inset shows the histogram of values about the mean.

{eta\_20yearmea



Figure 47: Twenty-year average elevation anomaly in December, January, February. {eta\_djf.tif}



Figure 48: Same as 47 except March, April, May.

{eta\_mam.tif}



Figure 49:  $\eta$  anomaly, JJA.

{eta\_jja.tif}



Figure 50:  $\eta$  anomaly September, October, November.

{eta\_son.tif}



Figure 51: Anomaly (meters) of sea surface elevation  $\eta$  in 1994. Anomalies are relative to the mean in Fig. 46



Figure 52: Anomaly of  $\eta$  in 2013. Compare to Fig. 51.

### 368 Bottom Pressure

Oceanic bottom pressure,  $p_b$ , is of intense interest in the analysis of the GRACE satellite data, in studies of the rotation of the Earth, as well as in the diagnoses of sea level change (see Ponte et al., 2007; Piecuch et al., 2015). Fig. 53 displays the mean seasonal cycle, while Fig. 54 indicates the change from 1994-2013 and can be compared to the estimated linear trend in Fig. 55. The bottom pressure variance represents the residual about the linear trend of the yearly fluctuations. In all cases a spatial mean was removed before plotting, so that total mass change is not reflected in these plots.

# **5 ENSO** and Equatorial Structures

The El Niño-Southern Oscillation (ENSO) component is, apart from the annual cycle, by far the strongest of all short-term (sub-decadal) climatic changes. Entire books have been devoted to its physics (e.g., Philander, 1990; Sarachik and Cane, 2010). As examples of its character, Figs. 57- 59 display the elevation and thermal anomaly at 95m and 2000m respectively during 1997-2000.

{eta\_anom\_2013



Figure 53: Twenty-year mean seasonal oscillation of bottom pressure anomaly,  $p_b$ .

{pbot\_quinn\_cl



Figure 54: Bottom pressure anomaly in 2013 minus that in 1994. Spatial means removed.

{pbot\_quinn\_cl



Figure 55: Linear trend (mm/y) in the bottom pressure anomaly. Compare to Fig. 54.

{pbot\_quinn\_cl



Figure 56: Standard deviation (cm) over 20 years (from annual values) of the residual bottom pressure anomaly (a linear trend estimate was removed).

{pbot\_quinn\_cl



Figure 57: Annual average  $\eta$  (meters) for the years surrounding the 1997-1998 El Niño event. Note the Indian Ocean structure in 1998.

{eta\_enso\_4yea



Figure 58: Annual averages at 95m of temperature in the years surrounding the 1997-1998 El Niño event.



Figure 59: Same as Fig. 58 except at 2000m.

{theta\_ensoyea

# <sup>382</sup> 6 Mixed-Layer Depth

The mixed-layer depth Fig. 60 is based upon the density algorithm of Kara et al. (2003) to which comparison may be made. Fig. 61 shows the strong average seasonal response in that depth. Fig. 62 shows the 20-year mean difference in temperature between 5m and 15m and is an indication of the time-average mixed layer vertical gradient.

# <sup>387</sup> 7 Buoyancy Frequency, Rossby Radii, and Equivalent Depths

An important dynamical consequence of a climatology is encompassed in the buoyancy frequency,  $N(\phi, \lambda, z, t)$ , the derived baroclinic Rossby radii of deformation  $R_{Di}$ , and the related equivalent depths,  $h'_j$ , j = 1, 2, ..., where,

$$R_{Di} = \frac{\sqrt{gh'_i}}{f}.$$
 (1) {deformationra

Display of N at 722m can be seen in Fig. 63 and in Wunsch (2013). Here  $R_{D1,2}$  are computed from eigenvalues,  $\gamma_i$ , of the Sturm-Liouville problem for the flat-bottom ocean of locally constant physical depth  $h(\phi, \lambda)$ ,

$$\frac{d^2 G_i(z)}{dz^2} + \gamma_i^2 N^2(\phi, \lambda, z) G_i(z) = 0$$

$$\tag{2}$$

with w(-h) = w(0) = 0, implying  $G_i(-h) = G_i(0) = 0$ . (In the interests of efficiency, the full free surface boundary condition was replaced by a rigid lid; see Wunsch, 2013 for full discussion.)



Figure 60: Twenty-year average mixed-layer depth as defined by Kara et al. (2003). Most of the ocean has values near 100m, with extreme values above 700m in the high latitude North Atlantic Ocean.

{mixed\_layer\_2



Figure 61: Anomaly of mixed-layer depth as a 20-year seasonal average. Negative values denote a shoaling relative to the mean in Fig. 60.



Figure 62: Difference in the temperatures at 5m and 15m as a 20 year mean. The figure is an indication of the near-surface mixed layer thermal gradient (compare Figs. 5, 6).



Figure 63: Estimated buoyancy frequency (N) in radians/sec at 722m as computed from the TEOS simplified formula for density and their algorithm. Estimates at other depths can be seen in Wunsch (2013).

{temp\_20yrmean



Figure 64: First and second Rossby radii,  $R_{D1,2}$  computed from the solution of the rigid lid Sturm-Liouville problem. Contouring near the equatorial singularity is incomplete.

Visually the chart is very similar to the earlier one of Chelton et al. (1998), but with detailed 396 differences presumed to arise from their use of a very different climatology. Values of  $G_i(0)$  are 397 important in the interpretation of altimetric data as representing isopycnal disturbances, but 398 the free surface boundary condition is required (which leads to a vertical velocity reversal near 399 to the free surface). The ratio  $R_{D2}/R_{D1}$  varies between about 0.31 and 0.79 (not shown) with 400 the smallest values at high latitudes and near the equator. A second mode weights the upper 401 ocean differently than does the first mode and this sensitivity accounts for much of the spatial 402 variation in the ratio. For numerical models trying to obtain realism for second and higher mode 403 vertical structures (three or more levels or layers), resolving this second and higher deformation 404 radius can be a serious problem. 405

The equivalent depth,  $h'_1$  is shown in Fig. 65 and differs in detailed structure from the phase speed values  $\sqrt{gh'_1}$  of Chelton et al. (1998) or Rainville and Pinkel (2006). {rd1\_rd2.tif}



Figure 65: First equivalent depth,  $h'_1$ , in meters. The high frequency internal wave gravity phase speed, plotted by other authors (e.g., Chelton et al, 1998; Rainville and Pinkel, 2006) from a different climatology is  $\sqrt{gh'_1}$ . No equatorial singularity occurs.

{h1.tif}

# 408 8 Comments

An important qualitative result of the state estimate is the spatial complexity of most variables even after 20 years of averaging (see for example, Figs. 7, 10, 39, 41). The central message must be that global space-time sampling of almost any quantity must be nearly complete—should any accurate average be required. In many variables, such as upper ocean temperature and salinity and mixed layer depth, the strong seasonal cycle must be resolved to determine the interannual changes with useful accuracies.

Further Parts in this series will depict the velocity field and its changes, the meteorological variables and their changes, the heat and salt transports, ice cover, a few regional comparisons, and discussion of the adjoint/dual solution and of the uncertainties.

## 418 Acknowledgments

Supported by NASA for the ECCO Consortium at MIT, AER, JPL. We thank all of the people, scientists, engineers, ships' crews, program managers, who finally made possible the gathering of global ocean data, as well as all those who have worked on the ECCO system and models.

### References

Abraham JP, Baringer M, Bindoff NL, Boyer T, Cheng LJ, et al. 2013. A review of global ocean temperature observations" implications for ocean heat content estimates and climate change. Rev. Geophys. 51: 450-83

427 AchutaRao KM, Ishii M, Santer BD, Gleckler PJ, Taylor KE, et al. 2007. Simulated and ob-

- 428 served variability in ocean temperature and heat content. Proceedings of the National Academy
- <sup>429</sup> of Sciences of the United States of America 104: 10768-73
- 430 Adcroft A, Hill C, Campin JM, Marshall J, Heimbach P. 2004. Overview of the formulation and
- $_{\rm 431}$   $\,$  numerics of the MIT GCM  $\,$
- <sup>432</sup> Boyer T, Domingues CM, Good SA, Johnson GC, Lyman JM, et al. 2016. Sensitivity of Global
- <sup>433</sup> Upper-Ocean Heat Content Estimates to Mapping Methods, XBT Bias Corrections, and Base-
- <sup>434</sup> line Climatologies. Journal of Climate 29: 4817-42
- 435 Chaudhuri AH, Ponte RM, Forget G. 2016. Impact of uncertainties in atmospheric boundary
- 436 conditions on ocean model solutions. Ocean Modelling 100: 96-108
- 437 Chaudhuri AH, Ponte RM, Forget G, Heimbach P. 2013. A Comparison of Atmospheric Re-
- 438 analysis Surface Products over the Ocean and Implications for Uncertainties in Air-Sea Boundary
- 439 Forcing. Journal of Climate 26: 153-70
- Chelton DB, Schlax MG. 1996. Global observations of oceanic Rossby waves. Science 272: 23438
- Colin de Verdière A, Ollitrault M. 2016. A Direct Determination of the World Ocean Barotropic
  Circulation. Journal of Physical Oceanography 46: 255-73
- 444 Dee DP, Balmaseda M, Balsamo G, Engelen R, Simmons AJ, Thépaut JN. 2014. Toward a
- Consistent Reanalysis of the Climate System. Bulletin of the American Meteorological Society
  95: 1235-48
- 447 Durack PJ, Wijffels SE, Matear RJ. 2012. Ocean Salinities Reveal Strong Global Water Cycle
- 448 Intensification During 1950 to 2000. Science 336: 455-58
- <sup>449</sup> Elipot S, Lumpkin R, Perez RC, Lilly JM, Early JJ, Sykulski AM. 2016. A global surface drifter
- 450 data set at hourly resolution. Journal of Geophysical Research: Oceans
- <sup>451</sup> Forget G. 2010. Mapping ocean observations in a dynamical framework: A 2004-06 ocean atlas.
- 452 Journal of Physical Oceanography 40: 1201-21
- <sup>453</sup> Forget G, Campin J-M, Heimbach P, Hill C, Ponte R, Wunsch C. 2015. ECCO version 4: an
- <sup>454</sup> integrated framework for non-linear inverse modeling and global ocean state estimation. Geosci.
- 455 Model Dev. 8: 3071?104
- <sup>456</sup> Forget G, Ponte RM. 2015. The partition of regional sea level variability. Progress in Oceanog-

- 457 raphy 137: 173-95
- <sup>458</sup> Fu LL, Haines BJ. 2013. The challenges in long-term altimetry calibration for addressing the
- <sup>459</sup> problem of global sea level change. Adv. Space Res. 51: 1284-300
- <sup>460</sup> Fuglister FC. 1960. Atlantic Ocean Atlas of Temperature and Salinity Profiles and Data from
- the International Geophysical Year of 1957-1958. 209 pp pp.
- Gill AE, Niiler PP. 1973. The theory of the seasonal variability in the ocean. Deep-Sea Res. 20:
  141-77
- 464 Gouretski VV,. Koltermann, K. P. 2004. WOCE Global Hydrographic Climatology.
- <sup>465</sup> Häkkinen S, Rhines PB, Worthen DL. 2013. Northern North Atlantic sea surface height and
- <sup>466</sup> ocean heat content variability. Journal of Geophysical Research: Oceans 118: 3670-78
- <sup>467</sup> Kara AB, Rochford PA, Hurlburt HE. 2003. Mixed layer depth variability over the global ocean.
- <sup>468</sup> J. Geophys. Res. 108: 3079
- <sup>469</sup> Knudsen P, Bingham R, Andersen, O., Rio, M. H. 2011. A global mean dynamic topography
- and ocean circulation estimation using a preliminary GOCE gravity model. Journal of Geodesy
  85: 861-79
- 472 Koltermann KP, Gouretski VV, Jancke K, eds. 2011. Hydrographic Atlas of the World Ocean
- 473 Circulation Experiment (WOCE). Volume 3: Atlantic Ocean International WOCE Project Of-
- 474 fice, Southampton, UK, ISBN 090417557X.
- 475 Levitus S. 1982. Climatological Atlas of the World Ocean. 173 pp plus microfiche pp.
- Liang X, Piecuch CG, Ponte RM, Forget G, Wunsch C, Heimbach P. 2016. Change of the Global
- 477 Ocean Vertical Heat Transport over 1993-2010. Submitted for publication
- 478 Liang X, Wunsch C, Heimbach P, Forget G. 2016. Vertical redistribution of oceanic heat con-
- 479 tent. J. Clim. 28: 3821-33
- 480 Marshall J, A. Adcroft, C. Hill, L. Perelman, Heisey C. 1997. A finite-volume, incompressible
- Navier Stokes model for studies of the ocean on parallel computers. J. Geophys. Res., 102:
   5753-66
- 483 Maximenko N, Niiler P, Rio MH, Melnichenko O, Centurioni L, et al. 2009. Mean Dynamic
- 484 Topography of the Ocean Derived from Satellite and Drifting Buoy Data Using Three Different
- <sup>485</sup> Techniques. Journal of Atmospheric and Oceanic Technology 26: 1910-19
- 486 Pavlis NK, Holmes SA, Kenyon SC, Factor JK. 2012. The development and evaluation of the
- 487 Earth Gravitational Model 2008 (EGM2008). J. Geophys. Res.-Solid Earth 117
- 488 Pillar HR, Heimbach P, Johnson HL, Marshall DP. 2016. Dynamical Attribution of Recent
- 489 Variability in Atlantic Overturning. Journal of Climate 29: 3339-52
- <sup>490</sup> Ponte RM, C. Wunsch, Stammer D. 2007. Spatial mapping of time-variable errors in TOPEX/POSEIDON
- <sup>491</sup> and Jason-1 seasurface height mesurements. J. Atm. Oc. Tech., 24: 1078-85

- <sup>492</sup> Purkey SG, Johnson GC. 2010. Warming of Global Abyssal and Deep Southern Ocean Waters
- <sup>493</sup> between the 1990s and 2000s: Contributions to Global Heat and Sea Level Rise Budgets. Jour-
- <sup>494</sup> nal of Climate 23: 6336-51
- <sup>495</sup> Quinn KJ, Ponte RM. 2008. Estimating weights for the use of time-dependent gravity recovery
- <sup>496</sup> and climate experiment data in constraining ocean models. Journal of Geophysical Research-
- 497 Oceans 113
- <sup>498</sup> Rio MH, Hernandez F. 2004. A mean dynamic topography computed over the world ocean from
- altimetry, in situ measurements, and a geoid model. Journal of Geophysical Research-Oceans
   109
- <sup>501</sup> Roquet F, Wunsch C, Forget G, Heimbach P, Guinet C, et al. 2013. Estimates of the Southern
- Ocean general circulation improved by animal-borne instruments. Geophysical Research Letters
   40: 6176-80
- 504 Stammer D, Balmaseda M, Heimbach P, K?hl A, Weaver A. 2016. Ocean Data Assimilation in
- <sup>505</sup> Support of Climate Applications: Status and Perspectives. Annu. Rev. Mar. Sci. 8: 491-518
- 506 Stammer D, Wunsch C, Giering R, Eckert C, Heimbach P, et al. 2002. Global ocean circulation
- <sup>507</sup> during 1992-1997, estimated from ocean observations and a general circulation model. Journal
- <sup>508</sup> of Geophysical Research-Oceans 107: -
- 509 Stommel H, Arons AB. 1960. On the abyssal circulation of the world ocean-I. Stationary plan-510 etary flow patterns on a sphere. Deep-Sea Res., 6: 140-54
- Talley LD, Feely RA, Sloyan BM, Wanninkhof R, Baringer MO, et al. 2016. Changes in Ocean
- <sup>512</sup> Heat, Carbon Content, and Ventilation: A Review of the First Decade of GO-SHIP Global Re-

<sup>513</sup> peat Hydrography In Annual Review of Marine Science, Vol 8, ed. CA Carlson, SJ Giovannoni,

- 514 pp. 185-215
- <sup>515</sup> Vinogradov SV, Ponte RM, Heimbach P, Wunsch C. 2008. The mean seasonal cycle in sea level
- estimated from a data-constrained general circulation model. Journal of Geophysical Research-
- 517 Oceans 113
- <sup>518</sup> Vinogradova NT, Ponte RM. 2016. In search for fingerprints of t he recent intensification of the <sup>519</sup> ocean water cycle. J. Clim. (submitted)
- <sup>520</sup> Vinogradova NT, Ponte RM, Fukumori I, Wang O. 2014. Estimating satellite salinity errors for
- <sup>521</sup> assimilation of Aquarius and SMOS data into climate models. Journal of Geophysical Research-
- 522 Oceans 119: 4732-44
- <sup>523</sup> Wunsch C. 2016. Global Ocean Integrals and Means, with Trend Implications In Annual Review
- <sup>524</sup> of Marine Science, Vol 8, ed. CA Carlson, SJ Giovannoni, pp. 1-+
- <sup>525</sup> Wunsch C, Heimbach P. 2013. Dynamically and kinematically consistent global ocean circula-
- tion state estimates with land and sea ice In Ocean Circulation and Climate, 2nd Edition, ed.

- 527 JC G. Siedler, W. J. Gould, S. M. Griffies, Eds., pp. 553-79: Elsevier
- <sup>528</sup> Wunsch C, Heimbach P. 2014. Bidecadal thermal changes in the abyssal ocean and the obser-
- vational challenge. J. Phys. Oc. 44: 2013-30