

Decadal climate variability and predictability: challenges and opportunities

Article

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25 **Decadal phenomena and their characteristics**

26 The slowdown in the rate of global surface warming in the early 2000s, and especially its regional characteristics, highlights the importance of "decadal climate 27 28 variability" (DCV) as modulator of long-term warming trends due to ever-increasing anthropogenic forcings (Medhaug et al. 2017). This event, which was termed in the 29 scientific and public domain as a "pause" or "hiatus" in global warming 30 31 (Lewandowsky et al. 2016), was argued by scientists to be associated with long-32 recognized (see for instance the 2nd IPCC report published in 1996 for an early assessment), multi-year phenomena and in particular the undulation of the tropical 33 34 Pacific ocean-atmosphere system (Kosaka and Xie 2013; Meehl et al. 2016). According to several studies, changes in Earth energy balance at the top of the 35 36 atmosphere partly related to volcanic aerosols from a series of moderate eruptions in 37 the early 2000s also contributed to the recent 'hiatus' (Huber and Knutti 2014; Santer 38 et al. 2017). Yet, because of uncertainties in observational estimates in both radiative 39 forcing and global temperature measures, it is impossible to stringently attribute the 40 early 2000s 'hiatus' to a specific origin (Hedemann et al. 2017); it should rather be interpreted as a combination of several factors (Medhaug et al. 2017). 41

Whether in cases of external forcing due to natural (solar & volcanic) or 42 anthropogenic factors, or during internal climate-system interactions, the oceans play 43 44 a central role in DCV due to their thermal and dynamical inertia. Decadal variations of both regional and global mean surface temperature can be associated with, and 45 46 often attributed to, changes in ocean heat uptake and heat redistribution (Yan et al. 47 2016). The study of the ocean's role in climate has traditionally involved the 48 diagnosis of sea surface temperature (SST) variability as the variable reflecting the 49 interaction with the atmosphere. While the major oceanic basins are usually

50 examined separately when identifying the main climate variability phenomena, what 51 stands out is the related nature of the global patterns and some similarities in their 52 temporal evolution. Specifically, large-scale, long-term SST variability in one ocean 53 basin is associated with variability in other basins. The global view of these patterns reveals a "network of teleconnections", linking neighboring ocean basins, the tropics 54 55 and extratropics, and the oceans and land regions (Fig 1). The two most prominent 56 patterns in this respect are associated with the Atlantic Multidecadal Oscillation 57 (AMO, Fig.1a, b) and the Pacific Decadal Oscillation (PDO, Fig.1c, d) or its nearly interchangeable companion referred to as Interdecadal Pacific Oscillation (IPO, Han 58 59 et al. 2014, Dong & Dai 2015)¹, although none of these are true 'oscillations'.

The apparent inter-basin connectivity seen in DCV SST footprints is likely 60 61 indicative of the global nature of the associated atmospheric mechanisms that either 62 force, or respond to, the oceanic variability. However, it is challenging to clearly elucidate the origins of DCV phenomena and especially the underlying oceanic 63 mechanisms because of the short observational records and sparse spatial sampling, 64 and because of consistency in terms of instrumental biases. This is even more a 65 limiting factor in the Southern Ocean where low-frequency variability seems to be 66 67 present (Fan et al. 2014) but cannot be robustly identified because of data issues. Nonetheless it is now well recognized that a superposition of multiple processes 68 underlies both the Atlantic and Pacific DCV (Yeager & Robson 2017; Newman et al. 69 2016, respectively). 70

- 71 In the Atlantic, coupled model integrations (e.g. Medhaug & Fluverik 2011,
- 72 Ruprich-Robert & Cassou 2015 and references therein), including decadal hindcasts
- 73 (Robson et al. 2012, Msadek et al. 2014) and forced-ocean model simulations

¹ In the rest of the paper, considering the difficulty to distinguish between PDO and IPO, we preferably use the latter term.

74 (Danabasoglu et al. 2016), demonstrate that the AMO is linked to the variability of the 75 Atlantic Meridional Overturning Circulation (AMOC). Through its associated fluctuations of salt and heat transport and through deep convection-related 76 77 mechanisms in the North Atlantic subarctic seas, the AMOC is considered as a driver of the upper ocean heat content variability and related SST anomalies that project 78 79 upon the AMO (Buckley and Marshall, 2016). Fingerprints of AMOC variation were found in the subpolar gyre in the form of SST, salinity and, hence, density anomalies 80 81 (Hakkinen et al. 2011), particularly in deep-water formation regions. Related changes 82 in the state of the ocean are found in the tropical Atlantic, expressed as anti-83 correlated variations of surface and subsurface ocean temperatures (Zhang et al. 2013), a relationship which is supported by paleoclimate proxy evidence (Parker et 84 85 al. 2015), although the connection between AMOC variations and tropical Atlantic 86 SSTs remains ambiguous and the mechanism producing tropical Atlantic SST 87 decadal variability remains elusive.

88 In addition to such ocean dynamical processes, decadal North Atlantic SST 89 evolution since the early 20th century has also been attributed to external radiative forcing by either anthropogenic (Booth et al. 2012, but see Zhang et al. 2013 for 90 further discussion) or natural aerosols. Results combining paleoclimate 91 92 reconstructions, simulations and observations, have pointed to decadal climatic 93 impacts of volcanic eruptions and to their possible role in the modulation or phaselocking of the AMOC/AMO pattern (Ottera et al. 2010, Swingedouw et al. 2015). 94 95 In the Pacific domain, evidence suggests that the PDO should be viewed as the superposition of several phenomena, each governed by different physical 96 97 processes, each of which is manifested in SST variability in a different part of the 98 basin, rather than being a coherent, single, physical mode. Possible physical drivers

include the integration of extratropical atmospheric weather noise by the extratropical
ocean basins, teleconnections through Rossby wave propagation from the decadal
tropical footprint of ENSO, re-emergence of persistent subsurface heat content
anomalies, and variations in wind stress driven gyre circulation (Newman et al.
2016). The subtle distinctions between the PDO and IPO may be linked with the
multiplicity of governing processes.

105 According to several studies, the IPO underlies part of the slowdown in the 106 rate of global warming during the early 2000s (see Xie & Kosaka 2017 for a review) 107 and could also be considered as the primary driver of past-observed warming 108 slowdowns and accelerations over the historical period (Fyfe et al. 2016, Kosaka & 109 Xie 2016). Model control simulations (with constant external forcing) exhibit IPO-like 110 variability, thus pointing at an internal, i.e. unforced origin of this phenomenon. 111 However, similarly to AMO, it was suggested that aerosol forcing played a role in 112 determining the temporal phase of the IPO in the late 1990's (Smith et al., 2016, but 113 see Kuntz and Schlag 2017 for further discussion). In any case, determining the 114 cause for the particular IPO event that led to the slowdown in warming in the early 2000s, still faces lingering uncertainties (Hedemann et al. 2017). 115

116 The climate literature is rich with studies that have linked the AMO and IPO to 117 past observed worldwide climate variations over land. For example the AMO has 118 been related to the multi-decadal fluctuation in Atlantic tropical cyclone activity (Wang 119 et al. 2012), and the variations of rainfall in the Sahel, which led to the devastating 120 droughts and famines of the 1970s & 1980s. Similarly, the multi-year pulses of 121 droughts in the US and Mexico (e.g., the "dust bowl" in the 1930s and the most 122 recent protracted dry period in California over 2007-2016) have been associated with 123 the combined effect of the AMO and IPO (Schubert et al. 2004, Chylek et al. 2014),

124 while the so-called Millennium drought and warming in Australia has been attributed 125 to a combination of DCV phenomena in the Indo-Pacific and Southern Ocean regions (van Dijk et al. 2013). Controlled experiments in which global climate models are 126 127 forced to follow AMO and IPO temporal evolution, confirm that many of the past 128 observed changes in the climate could be partly attributable to these oceanic 129 anomalies (Zhang & Delworth 2006; Kosaka & Xie 2013, Ruprich-Robert et al. 2017). This motivates the ongoing development of "initialized decadal prediction", in which 130 131 coupled models are initialized with the observed state of the ocean while anthropogenic and natural forcings are prescribed. Models are integrated for multiple 132 133 years to try to predict the combined impact of radiative forcing and natural climate variability since the 1960s (Kirtman et al. 2013, among others). 134

135

136 **Challenges and outstanding questions**

137 In the context of adaptation to (and mitigation of) the impact of climate change, 138 it is important for a broad range of stakeholders and decision makers to know how 139 the response to anthropogenic forcing and the impact of natural DCV phenomena will mix together to shape the near term evolution of climate, especially at regional 140 141 scales. A major objective of CLIVAR's study of DCV and its predictability, the 142 research focus on Decadal Climate Variability and Predictability (DCVP²), is to 143 advance the dynamical understanding of the associated phenomena and improving 144 their representation in models. This is an essential component of the World Climate 145 Research Programme (WCRP) plan to facilitate a robust and reliable provision of decadal information to society under its Grand Challenge on Near Term Climate 146

² http://www.clivar.org/research-foci/dcvp

Prediction³. Decadal forecasts were part of the 5th phase of the Coupled Model
Intercomparison Project (CMIP5, Taylor et al. 2012) and the Decadal Climate
Prediction Project (DCPP⁴) ensures the coordination and design of the modeling
experiments in the ongoing 6th edition (Boer et al. 2016).

151 In the Atlantic, initialized near-term prediction systems demonstrate substantial 152 skill in hindcasting decadal AMO-like SST anomalies (Oldenborgh et al., 2012; Kim et 153 al., 2012, Marotzke et al. 2016, among others) but noticeably, the added-value of the 154 initialization in temperature and precipitation over adjacent land is lost very rapidly (beyond a couple of years), especially over Europe and the American continents 155 156 (Doblas-Reyes et al., 2013; Meehl et al., 2014). More robust skill seems to be found when statistical methods to overcome sampling issues are applied (e.g. Robson et al. 157 158 2013) or when investigations are focused on case studies (such as the 1960s or 159 1990s AMO phase transitions). This is perplexing in light of the findings that coupled 160 models with restored SST to observed anomalies over the Atlantic are able to display 161 part of the ocean's influence on land climate. Part of the loss of predictability over 162 land may be related to systematic errors in the simulation of the spatial structure and temporal properties of the AMO in free-coupled models and/or the weak associated 163 164 teleconnections that communicate ocean signals to the continents (Eade et al.2014, 165 Qasmi et al. 2017). Skill in a given prediction system might be also dependent on the 166 model representation of processes or chain of events leading to AMO phenomena. In particular, the AMOC-AMO relationship varies considerably from model to model and 167 168 leads to a wide range of amplitudes, spatial properties and preferred timescales of 169 the simulated AMO and associated teleconnections (Ruiz-Barradas et al. 2013, 170 Zhang and Wang 2013, Ba et al., 2014; Peings et al., 2016). Moreover, recent

³ https://www.wcrp-climate.org/grand-challenges/gc-near-term-climate-prediction

⁴ https://www.wcrp-climate.org/dcpp-overview

171 studies also showed that a pattern akin to the AMO SST expression could be 172 identified in a model in which the atmosphere is coupled to a motionless, slab-ocean model, calling into question the active role of the ocean dynamics in the phenomenon 173 174 that could be consequently attributed to random atmospheric forcing (Clement et al. 2015, Cane et al. 2017 but also Zhang et al. 2016 and O'Reilly et al. 2016 for further 175 176 discussion of this controversy). In that context, it is notable that the frequency-177 dependence of the relationship between the AMV and the North Atlantic Oscillation 178 (NAO), which displayed substantial variability on multidecadal time scale during the 20th century, seems to be a key aspect for DCV mechanisms (Delworth et al. 2017). 179 180 Altogether, the role of atmosphere and ocean thermodynamics and dynamics in the 181 surface expression of the AMO and its remote impacts over land remains an active 182 area of research. Resolving the reasons for the very large diversity in model 183 simulations of the AMO is an outstanding challenge, especially the nature and 184 respective weight of the physical mechanisms that contribute to the development of 185 DCV in the Atlantic.

186 In the Pacific, even if such conclusions are still topics of contention and discussion, initialized coupled models have shown some success in simulating the 187 188 recent IPO cool phase in the late 1990s (Ding et al. 2013, Meehl et al. 2014); yet, 189 overall performance and results remain inferior to the Atlantic case (Doblas-Reves et 190 al., 2013). Here too, more research is needed to elucidate the role of the relevant 191 processes and mechanisms that govern the IPO. Fluctuations in tropical Pacific trade 192 winds have been suggested to be a key factor (England et al. 2014) but models fail in 193 reproducing the observed strengthening over the last 30 years (Kociuba and Power 194 2015). In non-initialized simulations, the basin-wide spatial characteristics of the IPO 195 are reasonably well represented (Henley et al. 2017), but the overall ratio of decadal-

196 to-total variance for SST and oceanic fields is underestimated in most of the models 197 and errors are pronounced in the extratropics (Farneti, 2016; Nidheesh et al. 2017). Discrepancies could be explained by the (in)ability of the coupled models to 198 199 effectively simulate all processes generating the IPO (Newman et al. 2016) and/or by 200 their respective ability to represent the different processes that govern the 201 phenomenon (e.g., the models ability to simulate oceanic re-emergence, Kuroshiro 202 dynamics, stochastic midlatitude atmospheric forcing associated with the variability of 203 the Aleutian Low, etc.).

For both Atlantic and Pacific DCV, part of the inter-model divergence can be 204 205 explained by model biases of both mean state and intrinsic variability. For instance, the formation of Labrador Sea Water, that is critical for AMOC variations leading to 206 207 DCV, is either controlled by salinity or temperature variations as a function of 208 systematic errors in the model's mean state (Menary et al. 2015); this is expected to 209 influence the spatio-temporal characteristics of the simulated AMO. For the IPO, the 210 failure in reproducing the pan-Pacific imprint of the decadal mode in some models is 211 related to their intrinsic deficiencies in simulating interannual teleconnections linked to ENSO (Nidheesh et al. 2017). 212

213 Yet, evaluating the authenticity of model simulated DCV is challenging due to 214 sparse and short observational records. Based on long control experiments, Qasmi 215 et al. (2017) provides evidence for non-stationarity, in a statistical sense, of the 216 intrinsic spatio-temporal properties of the AMO (variance, persistence, etc.) and 217 associated teleconnections in all CMIP5 models. The identification of the processes 218 that have led to observed DCV since the end of the 19th century is further 219 complicated by the presence of external forcing, both natural and anthropogenic. 220 Uncertainties and controversies remain concerning the role of anthropogenic

221 aerosols for both the AMO and IPO transitions. This remains an outstanding issue 222 because of the interplay between the response of SST patterns to aerosols and 223 GHGs (Xie et al. 2013) and because external forcing can interfere with internal DCV 224 phenomena (Ottera et al. 2010, Tandon and Kushner 2015). In addition, there is no 225 unique and perfect way to remove the impact of external forcing in the observations 226 and the chosen method may have significant implications for the outcome and hence 227 the interpretations of DCV expression during the historical period (Tandon and 228 Kushner 2015, Lyu and Yu, 2017).

Finally, the presence of drifts and initial shocks in decadal hindcasts is a 229 230 hindrance for prediction and understanding of recent DCV events. Several drift-231 adjustment procedures, which are mandatory prior to evaluation, exist but are not yet 232 satisfactory in an operational context (Hawkins et al. 2014). Difficulties are mostly 233 related to the temporal non-stationarity of the model drifts due to errors in initial 234 conditions (Fučkar et al. 2014, Sanchez-Gomez et al. 2015, Pohlmann et al. 2016, 235 among others) and interactions with the model representation and responses to 236 external forcings (Kharin et al. 2012).

237 Addressing all these challenges and distinguishing the processes contributing 238 to DCV is all the more important since both the latest observations and initialized 239 decadal forecasts are suggesting that the AMO is undergoing a transition from a 240 warm to a cold phase (Hermanson et al. 2014, Robson et al. 2016) and that the IPO 241 is trending toward its warm phase (Thoma et al. 2015, Meehl et al. 2016). Over the 242 Arctic, Yeager et al. (2015) also reported a prediction for a near-term decadal 243 transition, signaling that the decline rate of sea-ice due to GHG forcing is expected to 244 slow down due to a weakened AMOC in the 2010s associated with the transition of 245 the AMO to its cool phase. These predictions will be put to test in the next few years

(e.g. Smith et al. 2013) and there is urgency to assess their reliability based on aprocess-based evaluation.

248

249 Framework for progress and recommendations

All the above-listed obstacles and challenges test our ability to *attribute* past variations to the combined role of internal variability and external forcing, as well as *predict* the near-term future climate evolution on a global and regional scale. Research is needed to deepen our understanding of the physical mechanisms contributing to DCV phenomena and to make progress, we propose to address DCV issues in terms of teleconnections based on the intrinsic nature of the observed SST variability (Fig.1). More specifically:

tropical-extratropical teleconnections. Studies are needed to better understand 257 1. 258 the oceanic basin scale properties of the DCV patterns and, in particular, the 259 respective origins and roles of their tropical versus extratropical components. Over the Atlantic, a focus is recommended on the processes that facilitate the 260 link between decadal subpolar gyre and tropical Atlantic SST variations -- the 261 262 latter being the primary bridge to global climate variability (Chikamoto et al. 2016, Ruprich-Robert et al. 2017). The interaction and possible feedbacks 263 between the AMOC and AMO variations and the NAO and other atmospheric 264 circulation anomalies (such as blocking events), is a key question in this 265 266 respect as these are also very important for driving basin-wide Atlantic Ocean 267 variability (Barrier et al. 2014). In addition, uncertainties remain regarding the 268 influence of the external forcing on the North Atlantic modes of variability. The 269 attribution of the late 20th century observed trend of the NAO to external 270 forcing (Gillett et al. 2003) has been disputed in some recent studies (e.g.

Kelly et al. 2012, Cattiaux and Cassou 2013, Deser et al. 2016) and a better
evaluation and understanding of the weight of external forcing in the recent
decadal changes of the North Atlantic climate is still a research priority. Over
the Pacific, it is essential to resolve and understand the exchange of heat
between the extra-tropical and tropical Pacific in governing the IPO as well as
the role of midlatitude atmospheric stochastic forcings (Drijfhout et al. 2014;
Newman et al. 2016).

278 2. inter-basin teleconnections. Motivated by the temporal guasi-synchronization of the main modes of DCV (Fig.1), research is needed to better characterize 279 280 and understand the interconnectivity of the different oceanic basins as well as 281 with the polar regions, and to evaluate the robustness and stationarity of these 282 relationships. The role of the AMV in the phase shift of the IPV in the late 283 1990s (Kucharski et al. 2016) and more broadly in the modulation of ENSO 284 variance (Dong et al. 2006), the role of the IPO/AMO in the cooling of the 285 Southern Ocean and increased sea-ice cover over the last 30 years, the 286 atmospheric bridge between tropical oceanic basins through Walker cell 287 recent reinforcement, among others, are key questions to elevate our 288 understanding of decadal variability and predictability, especially if robust 289 lagged relationships between modes are identified.

3. ocean-land teleconnections. Motivated by the strong relationship at regional
 scales between observed oceanic DCV modes and land anomalies, emphasis
 should be placed on improved understanding of the ocean-land connection at
 low-frequency, especially as CMIP5 models tend to underestimate the overall
 relationship (Qasmi et al. 2017 for the AMO) and decadal hindcast skill is
 critically reduced over the continents. The spatial imprint of the observed early

2000s 'hiatus' (strong cooling over North America and Eurasia during 2000s 'hiatus' (strong cooling over North America and Eurasia during 2010) wintertime as an important contributor to the slower rise in annual global 2020) temperature) as well as recent modeling studies highlight the importance of 2020) investigating these issues on a seasonal basis and in terms of changes in the 2020) entire probability density function of key parameters such as surface air 2021) temperature and precipitation (surmising that the ocean-land connection could 2022) take place through changes in the probability of extremes).

303 4. vertical teleconnections. Motivated by (i) the importance of surface-subsurface 304 relationship in the ocean as key factor for DCV genesis, (ii) the huge 305 discrepancies between oceanic reanalysis products on the three dimensional 306 thermohaline properties of the water masses (Karspeck et al. 2015), (iii) the 307 recent evidence for the important role of the troposphere-stratosphere 308 coupling in the atmosphere in response to natural decadal forcing (Dunstone 309 et al. 2016), process-oriented approaches and emerging high resolution model 310 configurations (stratosphere-resolving atmosphere and refined vertical levels 311 in the ocean component to better simulate vertical processes), should be 312 promoted to tackle this issue. Resolving and understanding the exchange of 313 heat between the upper and deep ocean in governing the AMO and the IPO is 314 essential for progress.

Across all the four teleconnections, it is essential to assess the respective roles of internal variability and external forcing in DCV at *regional* scale, i.e., characterize and understand the observed and simulated spatial responses to external forcing agents and to how these forcing agents affect circulation change in the ocean and the atmosphere and related teleconnections, in presence of internal variability.

320 Within this *"drivers of teleconnectivity"* framework, recommendations are to:

321 (1) use a hierarchy of models and dedicated modeling protocols to study DCV 322 mechanisms and improve their simulations. Both coupled historical simulations and 323 initialized hindcast experiments, together with targeted model sensitivity experiments 324 (e.g. pacemaker or partial coupling configurations, etc.), are crucial for mechanistic 325 and process understanding of DCV that is necessary to ultimately advance decadal 326 climate prediction skill and capacities, especially at regional scale. Empirical 327 approaches to make decadal predictions and utilize observed teleconnections 328 between ocean and land should be also encouraged (Lean & Rind 2009; Suckling et 329 al. 2017).

330 (2) reduce model biases and drifts. Presence of systematic errors in models 331 has been shown to hamper the representation of DCV patterns and variability. In 332 forecast mode, drift and shock when models are initialized from observed conditions, 333 correspond to a sequence of physical processes by which models adjust towards 334 their own biased equilibria. The determination of the physical origin of model drift and 335 systematic errors should be promoted since such a framework provides clues for the 336 mechanisms underlying DCV in models (Toniazzo & Woolnough 2014; Sanchez-Gomez et al. 2015) and is therefore a promising pathway toward improved simulation 337 338 and related prediction capability/skill of DCV.

(3) *improve the knowledge and observational capacity necessary to track the energy flows through the climate system.* This is critical for a better understanding of
the relationships/interactions between external climate forcing and internal DCV in
affecting past and near-term future changes. Accurate measurement and physical
interpretation of three-dimensional ocean heat content (heat uptake and heat
redistribution) are crucial to make progress in DCV (Trenberth et al, 2016). This
should be combined with the precise estimation and analysis of the planetary energy

budget at the top of the atmosphere and at the surface (Allan et al. 2014, Smith et al.2015), from global to regional scale.

348 (4) combine the analysis of instrumental observations and models together 349 with the information emerging from high-resolution paleoclimate proxy data. Evidence 350 of coherent spatial and temporal patterns of DCV emerge from tree ring atlases, coral 351 and mollusc records and other paleoclimatic archives (e.g Linsley et al., 2015, 352 Tierney et al., 2015, Emile-Geay et al., 2017, Reynolds et al., 2017). These can shed 353 light on underlying physical processes and provide validation to patterns emerging 354 from the short observational record. Instrumental data rescue efforts should also be 355 expanded to recover the wealth of un-digitized records, filling gaps and increasing 356 overlap with the paleoclimatic archives (e.g. the ACRE and OldWeather.org 357 initiatives, Allan et al., 2011).

358 (5) revisit the traditional definition of DCV phenomena. Care is required when 359 representing and interpreting the climate system with single univariate and basin-360 wide indices, as is too often done in the case of the AMO and IPO indices (see 361 examples in Yeager and Robson 2017's review). It is recommended that the community adopts (i) the use of multivariate metrics ('fingerprints') to identify and 362 363 discriminate between processes involved, especially when comparing model 364 simulations to observations and (ii) the notation of decadal variability acronyms (e.g. 365 AMV and IPV) to think in terms of broad spectrum variability instead of temporal oscillations with preferred time-scales. 366

The "drivers of teleconnectivity" theme provides a way to approach the goal of advancing the study of DCV and predictability from different research directions. It goes beyond a preoccupation with changes in the global mean temperature "popularized" by the early 2000s 'hiatus', a shorthand term for a very complex

371 phenomenon, and directly promotes regional analyses in line with societal needs for 372 local climate information. It fosters an approach to address the intrinsic transdisciplinary issues that challenge progress in DCV and predictability and encourage 373 374 strengthened links across international community programs such as the CLIVAR DCVP and CONCEPT-Heat⁵ research foci, PAGES2K⁶, WCRP GEWEX⁷, DCPP, 375 VolMIP⁸ and the WCRP Near-Term Prediction Grand Challenge. Because of the 376 377 difficulties to observe and model the Earth's climate at timescales of a decade or 378 longer, this area of research is wholly dependent on emerging connections between 379 those who perform, collect and analyze instrumental observations of the present, 380 those who develop and analyze proxies of past climate, and with scientists who develop models and perform dedicated modeling experiments. This "drivers of 381 382 teleconnectivity" framework has been discussed and adopted at the end of the DCVP 383 Research-Focus workshop organized by CLIVAR and the International Centre for 384 Theoretical Physics in Trieste (Italy) in November 2015⁹. 385 More specifically, the continued PAGES2K effort towards collecting, analyzing 386 and interpreting high-resolution climate records, including the development of spatiotemporal reconstructions of climate (temperature and precipitation) variability both in 387 388 the tropics and at midlatitudes, especially for the last two millennia, should help better 389 understand tropical-extratropical and inter-basin teleconnections at decadal

390 timescales. Progress on the interpretation of ocean-land connectivity would gain from

⁵ http://www.clivar.org/research-foci/heat-budget

⁶ http://pastglobalchanges.org/ini/wg/2k-network/

⁷ http://www.gewex.org/

⁸ http://volmip.org/index.html

⁹ The Workshop was organized towards meeting the objectives of the CLIVAR Research Focus on DCVP to advance the understanding of the mechanisms and predictability of decadal climate variability. The organizers integrated the plans to establish a new WCRP Grand Challenge on "Near Term Climate Prediction" and the development of coordinated modeling strategies to address decadal variability and prediction under CMIP6 led by DCPP. The Workshop was attended by around 150 participants and was streamed live to a global audience.

studying the relationship between land (e.g. tree rings) and ocean proxies (corals,shells etc.).

On the modeling side, coordinated experiments based on "pacemaker" or 393 394 partial coupling modeling strategies have been designed to directly address 395 teleconnectivity (DCPP Component C; Boer et al., 2016) and thus perfectly fit within 396 the proposed framework. The emergence of high-resolution models now compatible 397 with DCV studies, together with increasing computing resources, is a promising 398 opportunity for improved model fidelity and better simulation of the four above-listed 399 teleconnections. Recent work has highlighted (i) the role of meso-scale oceanic 400 fronts in driving the atmosphere and (ii) the role of the stratosphere and storm-tracks 401 as transmitters of SST variability towards the continents (Kidston et al. 2015, Ma et 402 al. 2016). To make progress, increasing computing resources should be also 403 prioritized to promote the production of large ensembles to correctly characterize 404 internal variability; this is essential to accurately attribute observed DCV events, their 405 nature and physical origins and interaction with external forcing.

406

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848 **Figure captions**

Figure 1: Spatial and temporal characteristics of sea surface temperature anomaly 849 850 (SSTA) variability in selected ocean basins. (Left column) Global SSTA regression 851 maps (degrees C) based on the (a) leading principal component of North Pacific 852 SSTA, (b) North Atlantic SSTA. All indices were standardized prior to computing the 853 regression maps. Index regions are outlined by black boxes. (Right column) 854 Standardized 3-month running mean time series of the (a) leading principal 855 component of North Pacific SSTA, (b) North Atlantic SSTA. Global mean SSTA was 856 removed prior to computing the time series and regression maps. Figure adapted 857 from Deser and Phillips (2017), CLIVAR exchanges.

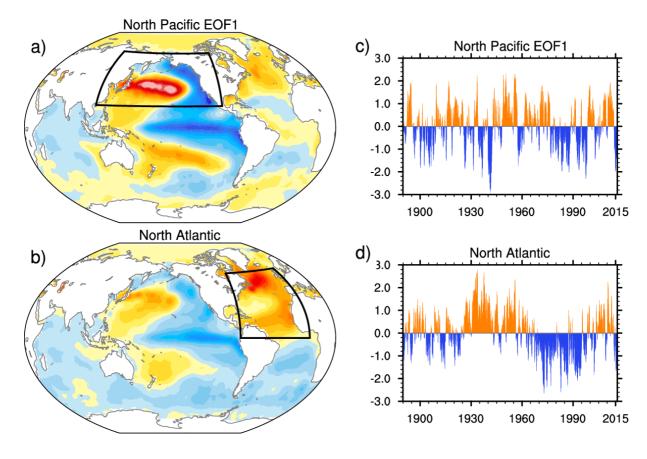


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