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# **Peruvian North Coast Climate Variability and Regional Ocean–Atmosphere Forcing**

**Mark R. Jury 1,2,[\\*](https://orcid.org/0000-0002-6871-403X) and Luis E. Alfaro-Garcia [3](https://orcid.org/0000-0001-7361-2444)**



- <sup>2</sup> Geography Department, University of Zululand, KwaDlangezwa 3886, South Africa<br><sup>3</sup> Bhysics Department, University of Twiille, Twiille 13011, Beru lakkan@unitru odu r
- <sup>3</sup> Physics Department, University of Trujillo, Trujillo 13011, Peru; lalfaro@unitru.edu.pe

**\*** Correspondence: mark.jury@upr.edu

**Abstract:** This study analyses climate variability on the north coast of Peru to understand how the local weather is coupled with anomalous ocean conditions. Using high-resolution satellite reanalysis, statistical outcomes are generated via composite analysis and point-to-field regression. Daily time series data for 1979–2023 for Moche area (8S, 79W) river discharge, rainfall, wind, sea surface temperature (SST) and potential evaporation are evaluated for departures from the average. During dry weather in early summer, the southeast Pacific anticyclone expands, an equatorward longshore wind jet ~10 m/s accelerates off northern Peru, and the equatorial trough retreats to 10N. However, most late summers exhibit increased river discharge as local sea temperatures climb above 27  $\rm{°C}$ , accompanied by 0.5 m/s poleward currents and low salinity. The wet spell composite featured an atmospheric zonal overturning circulation comprised of lower easterly and upper westerly winds > 3 m/s that bring humid air from the Amazon. Convection is aided by diurnal heating and sea breezes that increase the likelihood of rainfall ~ 1 mm/h near sunset. Wet spells in March 2023 were analyzed for synoptic weather forcing and the advection of warm seawater from Ecuador. Although statistical correlations with Moche River discharge indicate a broad zone of equatorial Pacific ENSO forcing (Nino3 R~0.5), the long-range forecast skill is rather modest for February–March rainfall  $(R^2 < 0.2)$ .

**Keywords:** peruvian north coast; regional circulation; El Nino floods; predictability

### **1. Introduction**

Northern Peru's coastal climate (4–12S, Figure [1A](#page-1-0)) is naturally dry due to subsiding equatorward winds and pronounced coastal upwelling. The average rainfall is  $\sim$ 15 mm/month at the coast and reaches  $\sim$ 80 mm/month in the foothills  $\sim$ 100 km inland. The Andes Mountains block humidity outflows from the Amazon and accelerate the anticyclonic southeasterly winds  $[1-3]$  $[1-3]$ . Wind-driven upwelling  $[4,5]$  $[4,5]$  tends to relax in late summer (January–March), causing sea surface temperatures (SST) to warm and rivers to flow with an annual rhythm.

On the doorstep of northern Peru is the El Niño Southern Oscillation (ENSO), a leading source of global climate variability associated with tropical Pacific SST and trade winds [\[6\]](#page-24-4). ENSO's warm and cool phases have opposing SST patterns whose eastward extent depends on ocean–atmosphere coupling in austral summer [\[7](#page-24-5)[–9\]](#page-24-6). The tropical Atlantic and Indian Oceans show greater responses to eastern El Nino events [\[10\]](#page-24-7), as does the wind-driven upwelling along the north coast of Peru. During neutral or La Nina conditions, the winddriven upwelling persists, and the local weather remains sunny and dry. Past research has uncovered multi-decadal sequences of warm or cool ENSO phase [\[11\]](#page-24-8), temporal shifts in ENSO transitions involving early or late onset [\[12\]](#page-24-9), and north–south contrasts in Peru rainfall [\[13](#page-24-10)[,14\]](#page-24-11).



**Citation:** Jury, M.R.; Alfaro-Garcia, L.E. Peruvian North Coast Climate Variability and Regional Ocean–Atmosphere Forcing. *Coasts* **2024**, *4*, 508–534. [https://doi.org/](https://doi.org/10.3390/coasts4030026) [10.3390/coasts4030026](https://doi.org/10.3390/coasts4030026)

Received: 17 April 2024 Revised: 30 May 2024 Accepted: 1 July 2024 Published: 12 July 2024



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**Figure 1. (A)** Topography (shaded) and shelf edge (dashed) in the Moche area of Peru (**o**). Long-term average: (**B**) vertical air motion at 700 hPa, (**C**) rainfall on 8S slice: GPM (–o–), ERA5 ( $\Diamond$ ) and gauges on the western slope  $(\Delta)$ , (D) near-surface wind field (vector, largest 8 m/s) and ocean mixed layer depth (red contours, m), (E) wind speed on 8S slice. Long-term SST analysis: (F) average, (G) variance, (H) annual cycle in Moche area Peru (red mean, green upper/lower quintiles), based on daily data daily data 1979–2022. 1979–2022.

The arid north coast climate is punctuated by wet spells at quasi-decadal intervals which challenge resource management. Archeological evidence over five millennia has revealed an irrigation network to draw seasonal runoff from the western Andes for crop farming and socio-economic development [\[15\]](#page-24-12). Although floods occasionally led to destruction, hydraulic technology gradually improved so that late summer stream-flows could be converted to beneficial water supply. By the 15th century, indigenous communities

were well established, but the equilibrium was upset by soil erosion/salinization and multi-decadal dry spells.

The east Pacific experiences a zonal tilting of the tropical thermocline accompanied by propagating ocean–atmosphere waves [\[16,](#page-25-0)[17\]](#page-25-1). During eastern El Nino events such as in 1983 and 1998, Peru's north coast receives an inflow of equatorial air [\[18](#page-25-2)[,19\]](#page-25-3). Wind-driven upwelling ceases and SSTs increase above 26  $°C$ , leading to atmospheric convection [\[20,](#page-25-4)[21\]](#page-25-5) at near-monthly intervals via eastward-moving Madden Julian Oscillations (MJO) [\[22\]](#page-25-6). A secondary process that affects the timing of local rainfall is the diurnal cycle [\[23\]](#page-25-7). Seabreeze convergence of humid air over the west-facing Andes as the coastal plains warm during mid-day. The subsiding southeasterly airflow turns shoreward and rises up-slope, so runoff tends to peak in the evening.

Local climatic features may be analyzed via modern numerical weather models underpinned by the global coupled data assimilation of satellite and in situ measurements. However, predictability is uncertain and impacts are problematic: flash-floods move quickly down the steep ravines, damaging hydraulic, agricultural and urban infrastructure, with knock-on effects for sediment transport, food and water shortages, and disease. In recent decades, flood events have become more frequent on the north coast of Peru. Whereas ancient society gained benefit from the runoff in the form of vegetation blooming events and replenished water supplies, modern society has lost some of that resilience—despite sophisticated warning systems that can distinguish the onset and extent of El Nino. Hence, our scientific questions include the following: (i) How does the coastal climate switch from stratiform to convective? (ii) Does the influence of coastal upwelling and ENSO shift N-S along the coast? (iii) Is the temporal character annually wet or infrequently wet? (iv) Are regional drivers of coastal warm events consistent with recent studies? (v) How can El Nino risks be better managed to sustain food and water resources?

#### **2. Data and Methods**

Along Peru's north coast, 4–12S, 82–75W (Figure [1A](#page-1-0)), are the Chicama and Moche river-mouths and the city of Trujillo (8S, 79W), a center of pre-Columbian culture whose meso-climate was studied via hourly to monthly gridded satellite reanalysis products in the period 1979–2023. Our main focus is on river discharge, near-shore SST and winds, and potential evaporation (heat flux causing soil moisture depletion, [\[24](#page-25-8)[,25\]](#page-25-9). Dataset acronyms, characteristics, and documentation are listed in Table [1.](#page-3-0) The reader should note that Peru's national weather and ocean services make routine surface observations for assimilation in global models. These include a network of weather stations, hydrological streamflow, tide gauges, and in situ ocean variables from buoys and ships; however, upper air observations are scarce and necessitate satellite remote sensing.

The discharge of the Chicama and Moche Rivers in the study area was derived by an EC hydrological model assimilation of daily in situ catchment rainfall and stream-flow measurements. To describe the weather and climate, ERA5 and CFS2 fields were analyzed for air pressure, wind velocity, vertical motion, temperature, specific humidity, potential evaporation, and convective available potential energy (CAPE). Rainfall (GPM) and sea surface height were derived from multi-satellite + gauge merged products, and coupled ensemble model forecasts were obtained. Moist convection was quantified by satellite net outgoing longwave radiation (OLR), and land temperature and vegetation conditions were analyzed via de-clouded satellite IR and VIS data (NDVI). Ocean reanalyses were employed to describe near-surface currents, vertical motion, temperature, and salinity along the north coast of Peru. Station records were derived from Trujillo airport hourly observations (8S, 79W) and daily tide gauge measurements at 4S, 8S, and 12S.



<span id="page-3-0"></span>**Table 1.** Dataset details, characteristics, and references; coverage 1979–2023 unless indicated (yr+).

Time series of daily river discharge, SST, and meridional (V) wind were constructed for the Moche area (8S, 79W  $\pm$  0.25<sup>°</sup>) on the north coast of Peru (cf. Figure [A1\)](#page-22-0). The 44-year record of daily data ( $N = 44 \times 365 = 16,070$ ) was analyzed for long-term average, mean annual cycle, and extreme dry and wet cases: 14 October 2011 and 10 March 2023, respectively. The daily time series were lag-correlated across the entire record, 1979–2022, and per month ( $N = 1340$ ) to establish the seasonality of wind-driven upwelling and hydrological response. Intra-seasonal pulsing was evaluated by 20–60-day band-filtering and wavelet spectral analysis.

Reducing these time series to monthly resolution, dry and wet groups were identified (Table [2\)](#page-4-0) according to highest potential evaporation (dry early summer) and highest river discharge (wet late summer) for the subsequent composite analysis of regional anomalies of SST, wind, humidity (30S–15N, 150–30W), and subsurface ocean conditions over the Peru shelf (90–78W, 0–300 m). Anomalies were calculated by subtracting long-term mean

October–November (dry) and February–March (wet) values. In addition, dry and wet composites of the atmospheric circulation were analyzed.

<span id="page-4-0"></span>**Table 2.** Based on time series in the Moche area, Trujillo, Peru, in chronological order: (a) dry months according to highest potential evaporation and (b) wet months according to highest river discharge. Rainfall (mm/day) or discharge (m<sup>3</sup>/s) and SST (°C) also given. These groups are used to form composites: Figures 5, 6, 8 and 9.





**Table 2.** *Cont.*

The river discharge time-series was point-to-field regressed onto fields of runoff and net OLR to quantify spatial decorrelation and define a zone of 'sympathetic' climate responses and impacts within the area 0–17S, 90–70W. Independently, a Principal Component analysis of evapotranspiration (ERA5 latent heat flux) and satellite vegetation NDVI was conducted to determine areas with similar mean annual cycle and response to eastern Pacific ENSO. These support the use of the Moche area time series as an indicator of climate variability on the north coast of Peru.

The January–March river discharge was analyzed for inter-annual ocean–atmosphere teleconnections by point-to-field correlation with Hadley SST [\[34\]](#page-25-18), satellite OLR, and 850 hPa zonal wind. The 1979–2022 records have ~44 degrees of freedom due to annual cycling, so 95% confidence is reached with  $|R| > 0.30$ . Lag correlations were calculated between the Moche area discharge/pot. evap. and the Pacific ENSO variables: SST in prescribed areas Nino1–2, Nino3, and Nino4, the multi-variate ENSO index MEI2, and Pacific Decadal Oscillation PDO.

Among the methods, the point-to-field correlation maps use all 44 seasons to establish standardized, linearly opposed spatial patterns that tend to be dominated by the larger  $\pm$  ENSO events. In contrast, the composite technique separates dry early summer and wet late summer, uses ~15% of the total months, and assigns equal weights therein. These statistical approaches will generate different outcomes.

Mean diurnal cycles in the Moche area were analyzed using hourly time series of GPM rainfall and zonal (U) wind during late summer wet spells in December 2014–April 2015 and December 2022–April 2023. Departures from the all-hour mean were analyzed for MERRA2 11:00–14:00 surface temperatures, with 14:00–17:00 wind velocity and 17:00–20:00 GPM rainfall over the 0–17S, 90–70W area. This helps to establish the link between afternoon sea breezes and evening flash floods.

The wet spell in March 2023 was analyzed for airflow patterns, SST, and ocean currents, and the daily time series of GPM rainfall and sea surface height. This outcome shows an influx of equatorial air over high SST that may be compared with an earlier El Niño wet spell in March 2017.

To evaluate long-lead forecasts, the EC ensemble model for Jan, Feb, Mar rainfall hindcasts and 3-month forecasts for 1980–2017 were compared. Although the EC model corresponds with GPM-gauge observations at the coast, it has a wet bias over the Andes. A further statistical limitation is the small degrees of freedom owing to the infrequent nature of floods. Short-term forecasts were evaluated via the CFS2 ensemble model for daily rainfall hindcasts and 1-month forecasts for 2014–2022. The linear regression fit is the primary measure of skill, which for daily data was restricted to rainfall > 0.1 mm.

The workflow progresses from mean climate and cross-coast gradients to environmental conditions in dry early summer and wet late summer. Tropical late summer rainfall over Andes catchments is beneficial except when amplified to flood proportions by El Nino conditions, as the statistics demonstrate. Lag-correlations enable inferences on how central Pacific warm events spread eastward with coupled ocean–atmosphere Kelvin waves.

### **3. Results**

### **3.1. North Coast Climate and Seasonality**

The geography (Figure [1A](#page-1-0)) of the Moche area shows a straight NNW coastline backed by steep mountains that separate atmospheric sinking and rising motions (Figure [1B](#page-1-0)), resulting in a sharp eastward increase in orographic rainfall on 8S (Figure 1C). The shelf is broad and overlain by shallow equatorw[ar](#page-1-0)d winds (Figure 1D) aligned to the coastal plains. The prevailing SSE winds at Trujillo airport ([Figu](#page-22-1)re A2) are rarely outside that sector. Marine winds of  $\sim$ 6 m/s decrease rapidly at the coast (Figure 1E), leaving a shallow mixed Marine winds of ~6 m/s decrease rapidly at the coast (F[ig](#page-1-0)ure 1E), leaving a shallow mixed layer and imparting cyclonic vorticity  $(-10^{-4} \text{ s}^{-1})$  that enhances near-shore upwelling. Long-term mean SST (Figure 1F) exhibits upwelling effects <20 $\degree$ C in a plume that extends Long-term mean SST (Figure 1F) exhibits upwell[ing](#page-1-0) effects  $\langle 20 \degree C$  in a plume that extends along the coast  $\sim$ 200 km wide of the Moche area, narrowing equatorward/widening poleward. The mean annual cycle of SST (Figure [1G](#page-1-0)) reaches a minimum/maximum in September–October/February–March, a few months behind the atmospheric heat budget. Upper/lower quintiles of SST depend on La Nina/El Nino influence and range from 18 °C to 26 °C in late summer. A circular area of tropical SST > 25 °C~6S, 90W often reaches the shelf edge, causing high SST variance there (Figure 1H).

Turning our att[en](#page-7-0)tion to the Moche area hydrology, Figure 2A shows the daily river discharge over the 44 yr record, with an annual rhythm aligned to SST. Intra-seasonal oscillations tend to occur at monthly interval, according to wavelet spectral analysis (Figure 2B). Wind-driven upwelling suppresses river discharge, as seen in lag correlation and monthly plots (Figure [2C](#page-7-0)–H). Equatorward winds tend to cool SST a day later, but correlations are weak (R~−0.15) except in March–April (−0.4), indicating secondary effects from net heat flux and current advection. Relationships with discharge are informative: a reduction in equatorward winds contributes to a rapid increase in river flow (R~−0.25) that is particu-<br>the west-facing Andes from 0 to 17S, and into the equatorial along the equatorial of the equatorial equation of larly strong in February–April (−0.45). SST naturally exhibits a more gradual influence on discharge ( $R$ ∼0.30) from −3 to +2 days. Correlations per month show a double maxima  $(R > 0.4)$  in November–December and March–April when local weather couples with anomalous ocean conditions.



**Figure 2.** *Cont.*

<span id="page-7-0"></span>

**Figure 2.** (**A**,**B**) Moche area daily fluvial discharge and its spectral power after 20–60-day band-filtering, shaded blue to red for 90 to 99% confidence. Lag correlation between continuous daily time series in the Moche area, Trujillo, Peru: (C) SST vs. V wind, (D) discharge vs. V wind, (E) discharge vs. SST. Correlation between the same time series but segregated by month: (F) SST vs. V wind (1 day earlier), (G) discharge vs. V wind (0 lag), (H) Moche discharge vs. SST (0 lag) and duplicated to reflect austral summer. In (**C–H**) red line is mean, green lines are 95% confidence intervals. **Figure 2.** (**A**,**B**) Moche area daily fluvial discharge and its spectral power after 20–60-day band-

The inter-annual filtered time series of Moche area discharge and SST (Figure [3A](#page-8-0),B) are linked through the ENSO phase. The local SST leads discharge by 2–4 months ( $R > 0.6$ ) and both exhibit 2–8 yr cycles that are strong before 2000 and weak thereafter. To check for coherence between Moche area discharge and the north coast climate, point-to-field correlations were calculated with respect to runoff and net OLR (Figure [3C](#page-8-0),D). Sympathetic values spread along the west-facing Andes from 0 to 17S, and into the equatorial east Pacific. Runoff derives from rainfall on the western slopes of the Andes mountains (not snowmelt). The spatial correlation map suggests that the Moche area discharge can be used to indicate ENSO-modulated climate forcing across the region.

<span id="page-8-0"></span>

Figure 3. (A,B) Time series of inter-annual filtered Moche river discharge and coastal SST. Correlation of Moche area river discharge (8S, 79W) with January–March 1979–2022 fields of (C) surface runoff and  $(D)$  net OLR; blue shading is wet and outlines the coherent zone. Inset in  $(C)$  is the mean annual cycle of daily Moche area fluvial discharge and upper/lower quintiles.

#### *3.2. Regional Teleconnections*

Point-to-field correlations between the January–March discharge time series and SST, 850 U wind and surface air pressure fields are illustrated in Figure 4A–C. Moche rivers flow when the tropical Pacific SST exhibits an eastern El Nino warming (5–10S, 140–80W) coupled with westerly winds (0–5S, 150–90W) and a weakened SE Pacific anticyclone  $(10-15S, 110-80W)$ . A secondary feature is easterly winds from the southern Amazon that push up against the Andes and 'leak' onto the Peruvian north coast at 6S. Table  $3$ confirms that Nino1–3 and MEI2 have significant influence on the January–March Moche area discharge. The influence of eastern and coastal ENSO forcing seems blurred; they act in concert, according to the broad extent of high correlations in Figure [4B](#page-9-0). Table [3](#page-10-0) also suggests that Nino4 and PDO had minimal influence on Moche area discharge in<br>1070, 2022 1979–2022.

<span id="page-9-0"></span>

**Figure 4.** Correlation with January–March fields of (A) SST, (B) 850 U wind, (C) SL. pressure, 2022. Arrows in (**B**) refer to wind direction. 1979–2022. Arrows in (**B**) refer to wind direction.

Lead/Lag	$Nino1 + 2$	Nino3	MEI <sub>2</sub>	<b>PDO</b>	Nino4
$-6$	0.11	$-0.05$	$-0.17$	$-0.05$	$-0.07$
$-5$	0.19	0.01	$-0.05$	0.01	$-0.07$
$-4$	0.27	0.13	0.16	$-0.03$	$-0.06$
$-3$	0.38	0.27	0.34	0.03	$-0.05$
$-2$	0.51	0.42	0.40	0.09	$-0.03$
$-1$	0.63	0.48	0.38	0.16	$-0.02$
$\mathbf{0}$	0.66	0.45	0.35	0.20	0.01
$+1$	0.63	0.41	0.34	0.20	0.03
$+2$	0.58	0.37	0.31	0.22	0.05
$+3$	0.57	0.38	0.30	0.24	0.07
$+4$	0.58	0.41	0.32	0.23	0.12
$+5$	0.59	0.44	0.36	0.27	0.16
$+6$	0.59	0.45	0.39	0.28	0.18

<span id="page-10-0"></span>**Table 3.** Correlation of January–March Moche river discharge with ENSO variables. Lead/lag months before/after;  $N = 44$ , 95% confidence at  $r > 0.30$ . Values are listed in descending order, with significant peaks underlined.

### *3.3. Dry Climate and Weather*

The dry early summer composite satellite daytime land temperature and vegetation maps (Figure [5A](#page-11-0),B) reveal that the coastal plains are warm ~40  $\degree$ C and sparsely covered<br>(creen fraction < 0.2), due to einking motions imported by divergent antioxelonic vinds and (green fraction < 0.2), due to sinking motions imparted by divergent anticyclonic winds and  $\frac{1}{2}$  cool SST in early summer. The principal component analysis of evapo-transpiration and vegetation (representing the Peruvian north coast) have mean annual cycles that follow SST: maxima in February–April/minima in September–November (Figure [5C](#page-11-0)). The terrestrial<br>hydrology 'turns off' as wind-driven upwelling intensifies hydrology 'turns off' as wind-driven upwelling intensifies.



**Figure 5.** *Cont.*

<span id="page-11-0"></span>

**Figure 5.** Composite dry conditions based on months in Table [2a](#page-4-0) and high-resolution satellite data: (**A**) IR daytime land temperature and (**B**) VIS color fraction, with an arrow on the Moche area; map scales differ. (**C**) Mean annual cycles of evapo-transpiration (mm/day) and vegetation color (fraction) in the north coastal plains, duplicated to reflect austral summer.

Dry composite climate anomalies (Figure [6A](#page-12-0)–C) based on months listed in Table [2a](#page-4-0) feature equatorial trade winds diverging away from an east Pacific cold tongue (SST anomaly  $\epsilon$  -1 °C). There is an axis of dry air extending from subtropical South America to the equatorial east Pacific (moisture anomalies −8 mm). A Rossby wave pattern focuses extra-tropical troughs and poleward airflow on 30S, 90W. These features tend to weaken eastward, moving ocean Kelvin waves in the equatorial Pacific, consistent with La Niña conditions.

<span id="page-12-0"></span>

**Figure 6.** Dry composite anomalies: (**A**) 925–850 hPa winds, (**B**) SST, and (**C**) precipitable water, based on ERA5 reanalysis and months listed in Table [2a](#page-4-0).

A spell of dry weather on 14 October 2011 is analyzed in Figure [7A](#page-13-0),B. Wind-driven upwelling cooled SST over the shelf to 14 ◦C. A low-level equatorward wind jet of 10 m/s accelerated along the coast, while daytime temperatures on the coastal plain exceeded

<span id="page-13-0"></span>

35 ◦C. The Hadley circulation was displaced northward, thereby damping equatorial ocean Kelvin waves. River discharge in early summer tends to stay below 10 m<sup>3</sup>/s.

L'Incigne section **Figure 7.** (**A**) Marine winds (vector) and SST (shaded) and max land temp > 35 ◦C (contour), (**B**) W– E height section 6.5–9S of the equatorward wind jet, during a dry spell and upwelling event on

# *3.4. Shelf Composites: Dry vs. Wet*

In this section, we employ GODAS ocean data over the shelf of northern Peru (averaged 6.5–9S) to contrast dry and wet composite anomalies, based on the months listed in Table [2a](#page-4-0),b. The opposing patterns exhibit asymmetry in Figure [8A](#page-14-0)–H. The dry composite

<span id="page-14-0"></span>has offshore Ekman transport, near-shore upwelling, and northward currents, whereas the wet composite shows onshore transport, downwelling, and stronger southward currents. Near-shore upper ocean sea temperature anomalies are -1 °C in the dry composite, but  $+4$   $\degree$ C in the wet composite. Salinity reflects near-shore negative anomalies in wet climate due to rainfall and runoff. It is noted that quarterly ship sections at various latitudes over the shelf [\[40\]](#page-25-24) underpin the model-interpolated results.



**Figure 8.** (**Left**) Dry month composite ocean anomalies over the shelf 6.5–9S: (**A**) zonal circulation, (**B**) V current vectors, (**C**) sea temperature, and (**D**) salinity based on GODAS reanalysis and months listed in Table [2a](#page-4-0). (**Right**) Same composite ocean anomalies, but wet months based on Table [2b](#page-4-0).

In this section, we focus on wet composites using months listed in Table [2b](#page-4-0). Figure [9A](#page-15-0),C present regional maps, while Figure [9D](#page-15-0)–F illustrate local features. Low-level westerly wind anomalies flow across the equatorial east Pacific (10N–10S, 150–80W) toward Ecuador, where they divide. Low-level wind anomalies over the Amazon turn northward into the Caribbean. SST anomalies are +4 ◦C above normal off Peru and in the equatorial east Pacific (Nino1–3). Surface wind anomalies are northwesterly and confluent near 4S, 82W, where rainfall anomalies are >+10 mm/day. The wet conditions extend from Ecuador along the Peruvian north coastal plains. The wet composite height sections reveal an anomalous zonal overturning circulation: it is upper eastward/lower westward, sinking to east/rising to west of the Andes (Figure [9E](#page-15-0)). This represents a mini-Walker cell driving El Nino-induced late summer wet spells. Warm SST and rising motions generate a core of anomalous humidity over the shelf (Figure [9F](#page-15-0)).

<span id="page-15-0"></span>

**Figure 9.** Wet composite anomalies: (**A**) 925–850 hPa wind, (**B**) local 1000 hPa wind, (**C**) satellite SST, (**D**) local rainfall. Wet composite anomaly W–E height section averaged over 6.5–9S of (**E**) zonal circulation wind vectors to 12 km and (**F**) specific humidity to 5 km with topographic profile, based on ERA5 reanalysis and months listed in Table [2b](#page-4-0). A 'mini-Walker Cell' is located over the Andes during wet spells.

Diurnal cycles in local rainfall and surface zonal winds are studied using hourly satellite reanalysis data during December–April wet spells for 2014–2015 and 2022–2023. Both time series, when averaged by hour, exhibit afternoon peaks (Figure [10A](#page-16-0)–D). Values are near zero all night and in the morning, and then as winds shift to westerly  $\sim$ 2 m/s by 12:00 h, rainfall increases >0.3 mm/h by 15:00 h. Outliers are uniform and symmetric for wind but tend to peak~0.8 mm/h for afternoon rain. Maps of mean surface temperature, wind, and rainfall departures for successive 3 h periods (Figure [10E](#page-16-0)–G) demonstrate how the heating of the coastal plains triggers onshore sea-breezes and afternoon rainfall over the west-facing Andes. An inspection of wind departures indicates that coastal sea-breezes draw warm, humid air from the northern shelf. Thermal gradients (+10C/100 km) converge airflow onto the Andes, thereby stimulating atmospheric convection and flash floods in the evening.

<span id="page-16-0"></span>

**Figure 10.** Mean diurnal cycle box-whisker plots of Moche area ERA5 zonal wind and GPM hourly rainfall in wet seasons: (**A**,**B**) December–April 2015, (**C**,**D**) December–April 2023. Maps of diurnal departure from overall mean: (**E**) surface temperature 11:00–14:00 h, (**F**) surface wind 14:00–17:00 h (largest vector 3 m/s), and (**G**) rainfall 17:00–20:00 h (local time), based on hourly December–April 2023 data, N = 150.

### 3.7. Late Summer Wet Spell, 2023 (largest vector 3 m/s), and (**G**) rainfall 17:00–20:00 h (local time), based on hourly December–April

In this section, an El Nino-induced wet spell in northern Peru is studied via Hovmöller analysis of SST and CAPE on 8S (Figure [11A](#page-18-0)). Early summer (November 2022) Fract drainysis of 551 and C/H E on 55 (Figure 1111). Early summer (Provember 2022)<br>Saw wind-driven upwelling, cool SST < 19 °C, and dry weather. SSTs started warming in January 2023 as winds relaxed, and then continued >28 °C in February–March 2023 pulsing CAPE > 1500 J/kg. Sea height time series (Figure 11B) from gauge measurements exhibited a gradual rise punctuated by three surges, moving poleward along the coast exhibited a gradual rise punctuated by three surges, moving poleward along the coast<br>at ~2.3 m/s. This phase speed was consistent with domes of warm seawater carried by ocean Kelvin waves [41] accompanied by northwest winds, onshore Ekman transport, and downwelling. Time series of daily SST and rainfall (Figure 11C) exhibited three upward steps in early February, March, and April. Heavy rainfall on 10–12 March was driven by an inflow from the equatorial Pacific. Figure [12A](#page-18-1),B show maps of currents and winds<br>that in directe a hydd yn of aaythaastysaad awwerk 0.5 m /a ayer the shalf in dyaad hy o that indicate a build-up of southeastward currents 0.5 m/s over the shelf induced by a and marchine at stand applied by discussionary cell (cancelly by one the stress marchines) at the stress marchines of the stress marchines of the stress marchines and down-

Comparing the March 2023 wet spell with March 2017 [21,40], we find that coastal SST warmed rapidly after January and reached 29 °C by March (Figure 13A). Heavy rains on 14 March 2017 were supported by moist inflow from the east (Figure [13B](#page-19-0)) and cyclonic<br>influences and winds that the currents and winds that the currents and winds that the currents and winds that vortices over eastern Peru and Ecuador. The coastal El Nino caused humid Amazon air for the Sover eastern Ferd and Ecuador. The coastar Erivino caused humid-rimazon and to spill across the Andes. Both events show a gradual increase in poleward airflow that is pulsed by ocean–atmosphere coupling.



**Figure 11.** *Cont.*

<span id="page-18-0"></span>

**Figure 11.** El Niño flood: (**A**) Hovmöller plot on 8S of daily SST (color shaded) and CAPE (gray **Figure 11.** El Niño flood: (**A**) Hovmöller plot on 8S of daily SST (color shaded) and CAPE (gray shaded > 1000 J/kg) across the shelf, November 2022–March 2023. (**B**) Daily measurements of sea level at 3 places along the north coast of Peru, November 2022–March 2023, with dashed lines highlighting poleward signals. (**C**) Time series of SST (blue line) and rainfall (dashed grey line) at in January–April 2023. Trujillo in January–April 2023.

<span id="page-18-1"></span>

labeled. (**B**) Map of 850 hPa wind during the wet spell, 10 March 2023. The marine low persisted for **Figure 12.** El Niño flood: (**A**) HYCOM3 surface currents: 11 (**left**) and 15 March 2023 with Moche SST many days. Currents (blue) and winds (black) are represented as vectors according to arrow size.

<span id="page-19-0"></span>

**Figure 13.** (**A**) Time series of daily SST and rainfall at Trujillo, January–April 2017; (**B**) maps of 700 hPa wind during the El Niño flood: 14 March 2017 (00Z **left**, 18Z **right**), indicating rapid formation of a marine low west of Ecuador. Blue lines indicate the atmospheric inflow.

### *3.8. Long-Lead Forecasts of Monthly and Daily Rainfall*

Here, we evaluate coupled ensemble model forecasts from the ECMWF and CFS2 models for the Moche area. Oct and Nov forecasts for late summer (Figure [14A](#page-20-0),B) show best fit with the Jan rainfall ( $R^2$  0.42–0.48), thereafter declining to 0.16–0.28 for February–March rainfall. November forecasts are only ~5% better than October, and seasonal forecasts barely exceed 'chance'. We question why February–March forecasts are poor at one-season lead, given the well-documented ocean–atmosphere coupling. A larger target could improve hit-rates but would mix mountain and marine regimes. The low forecast skill may relate to weak La Nina signals and to different atmospheric Walker circulations in central (standing) vs. eastern (transient) ENSO [\[42\]](#page-26-0).

In contrast to forecasts that weaken over late summer, the statistical fit of the satellite to gauge rainfall improves from January to March (Figure [14C](#page-20-0)). Monthly GPM satellite rainfall exhibits a low bias in dry spells but matches during wet spells, with little dispersion



<span id="page-20-0"></span>in March ( $\mathbb{R}^2$  0.70). Daily rainfall forecasts by CFS2 at the 1-month lead (Figure [14D](#page-20-0)) show moderate skill  $(R^2 0.41)$ , with dispersion below 5 mm/day. At higher rain rates, the daily moderate skill  $(R^2 0.41)$ , with dispersion below 5 mm/day. At higher rain rates, the daily moderate skill (R<sup>2</sup> 0.11), with dispersion below 5 mm, day. At higher rain rates, the daily forecasts are better, albeit with a dry bias over the period 2014–2023.

Figure 14. Moche area rainfall evaluation: (A,B) ECMWF October and November forecast compared with the January, February, March hindcast, (**C**) IR-satellite compared with gauge rainfall for January, ary, February, March 1982–2020, (**D**) CFS2 daily rainfall one-month forecast compared with hindcast February, March 1982–2020, (**D**) CFS2 daily rainfall one-month forecast compared with hindcast 2014–2022 (log-scale, zero values omitted), all with linear regression fit. 2014–2022 (log-scale, zero values omitted), all with linear regression fit.

## **4. Concluding Discussion 4. Concluding Discussion**

Climate variability on the north coast of Peru has been studied using high-resolution Climate variability on the north coast of Peru has been studied using high-resolution except for a couple of wet months in late summer. Long-term averages reflect sharp zonal except for a couple of wet months in late summer. Long-term averages reflect sharp zonar<br>gradients in SSE wind and rainfall across the coast. Statistical composite analysis and pointsatellite and model reanalysis. Wind-driven upwelling and atmospheric subsidence prevail, to-field regression provide useful insights, based on monthly river discharge and potential evaporation time series for 1979–2023 in the Moche area (8S, 79W). Dry early-summer

composites had divergent airflow over the east Pacific cold tongue. As the southeast Pacific anticyclone expands, an equatorward longshore wind jet of  $\sim$ 10 m/s accelerates off northern Peru, and the equatorial trough shifts to 10N. In contrast, high river discharge corresponded with warm SST anomalies  $+4\degree C$  accompanied by 0.5 m/s poleward currents, low salinity, and a shallow downwelling circulation. In the atmosphere, a mini-Walker cell was discovered (cf. Figure [9E](#page-15-0)). The wet composite featured upper-level westerly/low-level easterly wind anomalies that lift humid air over coastal SST ~27 °C.

In addition to multi-year climate variability, intra-seasonal oscillations were studied using daily data. Many days before flood events, sea levels rise off Ecuador and domes of warm water spread poleward along the north coast of Peru. These ocean Kelvin waves are characterized by a 6000 km length, 2.3 m/s phase speed, and ~30-day cycle that corresponds with the pulsing of rivers during austral summers under the influence of warm-phase ENSO [\[43\]](#page-26-1). In contrast, cold-phase conditions suppress the coupling and propagation of zonal waves into the equatorial east Pacific.

Atmospheric convection was found to be concentrated by the diurnal cycle. Hourly data showed the 10  $\degree$ C heating of Peru's north coastal plains at midday, followed by an onshore airflow of  $3 \text{ m/s}$  that lifts over the west-facing Andes, generating mean diurnal rainfall ~1 mm/h near sunset. Wet spells in March 2023 were analyzed for synoptic weather forcing. A quasi-stationary low pressure cell formed off the north coast over SST > 28 ◦C. Southeastward surface currents and airflow increased CAPE > 1500 J/kg, leading to heavy rainfall on the evening of 10 March 2023. East Pacific El Ninos, such as in March 2017, drive coastal SST up to 29  $\degree$ C and cause humid air from the Amazon to spill over the Andes mountains, leading to flash floods. Although point-to-field and temporal correlations with Moche River discharge indicate a broad zone of equatorial Pacific forcing (Nino1–2 R = 0.66, Nino3 = 0.48), the ENSO impacts challenge long-range forecasts, the accuracy of which declines in late summer ( $R^2$  = 0.16).

The ENSO modulation of Peru's north coast climate can be managed to ensure resource availability. If ancient communities found resilience via hydrological engineering, then modern technologically advanced civilizations can too. Although recent reports suggest that climate change may deliver negative consequences [\[44\]](#page-26-2), a brief analysis of CMIP6-coupled ensemble model projections revealed weak trends on the north coast of Peru (Figure [A3\)](#page-23-0), perhaps due to the buffering effect of coastal upwelling. However, the  $5.8~\mathrm{W/m^2}$  scenario anticipates increased wet spells after 2050. Beyond climate, the bigger question is whether municipal services can be extended to support a growing population and protect arid ecosystems from degradation.

**Author Contributions:** M.R.J. conceived the work, analyzed most of the data and wrote the first draft; L.E.A.-G. added local insights and helped rewrite the introduction and conclusions. All authors have read and agreed to the published version of the manuscript.

**Funding:** This research received no external funding.

**Institutional Review Board Statement:** Not applicable.

**Informed Consent Statement:** Not applicable.

**Data Availability Statement:** Websites used for data extraction and analysis include APDRC Univ Hawaii, Iowa Enviro-monitoring, IRI Climate Library (cf. Figure [A4\)](#page-24-13), KNMI Climate Explorer, NASA– Giovanni, and NOAA Ready–ARL. Outcome-based support from the South African Dept of Higher Education via the Univ Zululand is acknowledged. A spreadsheet is available on request.

**Conflicts of Interest:** The authors declare no conflict of interest.

<span id="page-22-0"></span>

### **Appendix A**

**Figure A1.** Moche coastal area satellite vegetation color fraction, same as Figure [5A](#page-11-0) but zoomed to show irrigated river valleys; smoothed topographic contours > 1000 m overlain; dashed box is the area for extraction of time series.

<span id="page-22-1"></span>

**Figure A2.** Trujillo airport wind rose, illustrating the prevalence of airflow from SSE. Fi**gure A2.** Trujillo airport wind rose, illustrating the prevalence of airflow from SSE.<br>
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<span id="page-23-0"></span>

5.8 W/m<sup>2</sup> scenario; arrow points to Trujillo. Projection of Moche area precipitation under 2.5 (blue) and  $5.8 \text{ W/m}^2$  (red) scenarios, based on CNRM- and MRI-coupled ensemble models: box-whisker of annual cycle (**middle**) and smoothed time series (**lower**) with 2nd-order trend and R<sup>2</sup> fit. **Figure A3.** (**upper**) HAD-coupled ensemble model soil moisture trend 1970–2070 (mm/yr) with

SOURCES .NOAA .NCEP .EMC .CMB .GODAS .monthly .BelowSeaLevel .POT

<span id="page-24-13"></span>X (90W) (78W) RANGEEDGES

Y (9S) (6.5S) RANGEEDGES

[Y]average

Z (1) (300) RANGEEDGES

a:

 T (Jan 1983) (Feb 1983) (Mar 1983) (Apr 1983) (Feb 1987) (Mar 1992) (Apr 1992) (Feb 1993) (Jan 1998) (Feb 1998) (Mar 1998) (Mar 2002) (Mar 2008) (Feb 2016) (Mar 2016) (Mar 2017) (Feb 2019) (Mar 2023) (Apr 2023) VALUES

[T]average

:a:

T (Feb 1990) (Mar 2022) RANGEEDGES

T (Feb-Mar) seasonalAverage

[T]average

:a

sub

DATA 1 STEP

correlationcolorscale

**Figure A4.** IRI climate website subroutine to calculate the cross-shelf sea temperature anomalies for **Figure A4.** IRI climate website subroutine to calculate the cross-shelf sea temperature anomalies for composite wet months on the north coast of Peru, resulting in Figure 8C (right). composite wet months on the north coast of Peru, resulting in Figure [8C](#page-14-0) (right).

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