

Hydrological forecasts through ensemble modeling in the Andes Cordillera



James McPhee, Pablo Mendoza, Diego Hernández, Francisco Jara, María Ignacia Orell

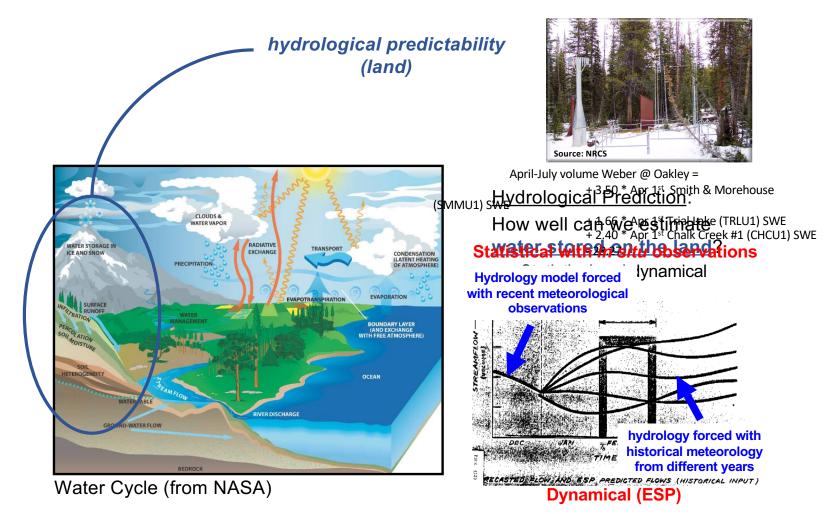
Universidad de Chile





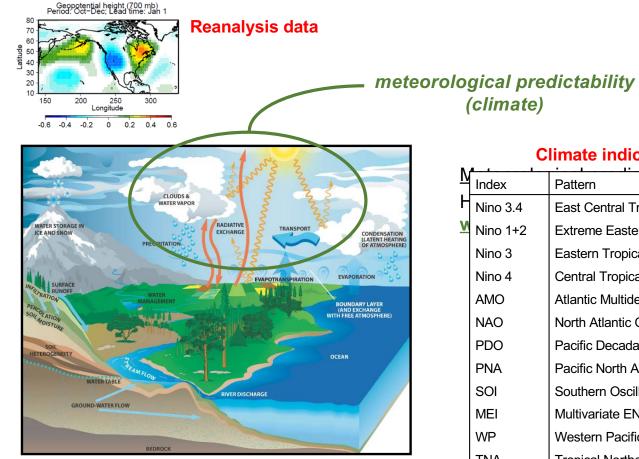
Motivation

Opportunities for prediction



Motivation

Opportunities for prediction



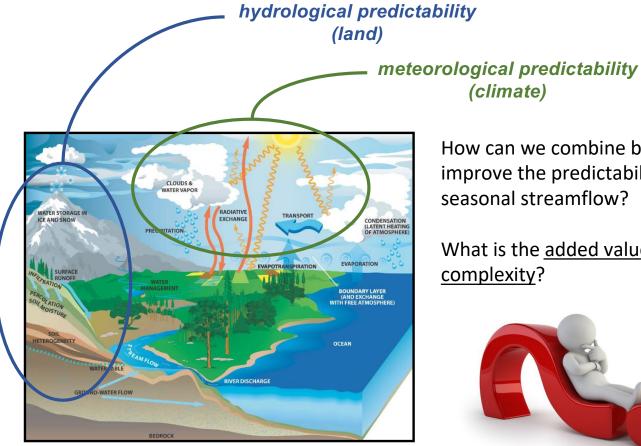
Water Cycle (from NASA)

Climate indices

Mart		
<u>IN</u>	Index	Pattern
F	Nino 3.4	East Central Tropical Pacific SST
M	Nino 1+2	Extreme Eastern Tropical Pacific SST
	Nino 3	Eastern Tropical Pacific SST
	Nino 4	Central Tropical Pacific SST
	AMO	Atlantic Multidecadal Oscillation
	NAO	North Atlantic Oscillation
	PDO	Pacific Decadal Oscillation
	PNA	Pacific North American Index
	SOI	Southern Oscillation Index
	MEI	Multivariate ENSO index
	WP	Western Pacific Index
	TNA	Tropical Northern Atlantic Index

Motivation

Opportunities for prediction



Water Cycle (from NASA)

How can we combine both to improve the predictability of seasonal streamflow?

What is the added value of complexity?



Water resources in Central Chile

- Andes Cordillera: largest natural water reservoir.
- Rivers flowing from the Andes are the main source for water supply.
- Water resources in this region are highly vulnerable to projected increases in temperature and decrease in precipitation.
- Drought conditions over the last 11 years.
- Key challenge: hydrometeorological monitoring network is quite sparse.

La Paloma reservoir, march 2015



Seasonal hydrological forecasts are required for appropriate water management





Informe Canal Melado

ESTIMADOS REGANTES Y ACCIONISTAS DE LA ASOCIACIÓN CANAL MELADO

Informe condición hídrica del mes de marzo al 10 de abril de 2021. Iniciada la temporada de riego el 01 de octubre 2020, a la fecha llevamos 192 días de riego, de los 222 días hasta el 10 de mayo, equivaente al 86.4 % de la temporada.

RIO MAULE Y LAGUNA DEL MAULE

El caudal del río Maule fue disminuyendo lentamente, inferior al pronóstico, pero permitió poder mantener la consigna programada para este mes, se complementó con el uso de los ahorros realizados en Colbún y Pehuenche y el agua que uso generación de la Laguna Invernada.



Consigna Promedio JVRM: 100.2 m3/s

Existió un error el día 17 de marzo en la estación de monitoreo Con un promedio de 100.2 m3/seg, el 50.0 %, de los derechos de riego. La consigna de riego del Maule se mantuvo todo el mes de marzo al 50 %.

Laguna del Maule se mantiene cerrada, esto gracias a los convenios efectuados y al buen manejo de las consignas e incluso un complemento de la Laguna Invernada.

Según lo pronosticado va no será necesario abrir la Laguna del Maule, logrando un ahorro para riego de 160 Hm3, esto es un excelente

ISOCIACION CANAL MELADO

10 de abril 2021



Canal Melado, le corresponde usar el 50% de sus derechos producto de la consigna del río Maule para el mes de marzo (consigna que corresponde al cauce natural + ahorros, total 12.6 m3/seg).

Esto sumado a la extracción de agua embalsada (2.5 m3/seg) se mantuvo todo el mes con una consigna de 15.1 m3/ seg. Esto gran parte se debe a la disminución de la necesidad de riego, al terminar las chacras y maíces, continuando con riego solo los frutales, praderas y segundos cultivos.

Canal Melado a la fecha ha mantenido un riego al 100% de la Tabla de distribución mensual.

Hoy se encuentra trabajando en los cierres contables y programando los provectos a eiecutar.

Con mayores restricciones producto de la pandemia que afecta a nuestro país, por el alto incremento de infectados cada día.

EMBALSE ANCOA

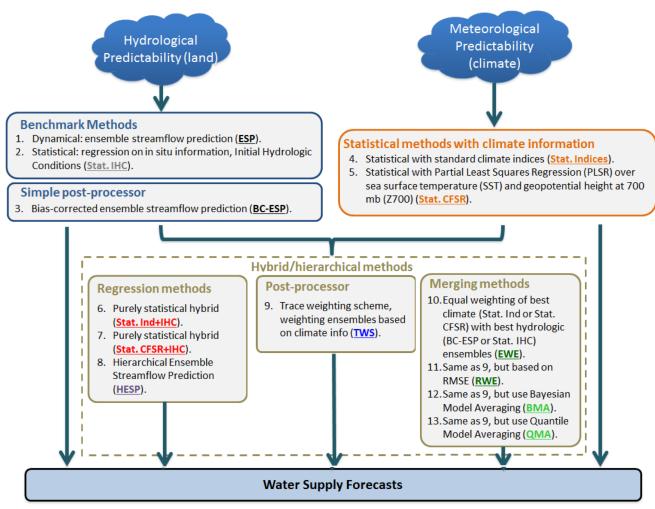


Se extrajeron durante el mes de enero 24.58 Hm3, para complementar los sistemas de riego, hoy con 17.5 Hm3 útiles. 13.08 Hm3 Achibueno extraio Ancoa extrajo 7.72 Hm3 Melado extraio 3.78 Hm3

Water allocation relative to existing water rights

Reservoir operations for hydropower and irrigation





Mendoza et al. 2017 (HESS)

Sources of predictability

We build on previous experience testing ensemble forecasting systems in Andean watersheds

@AGUPUBLICATIONS

Water Resources Research

RESEARCH ARTICLE

10.1002/2014WR015426

Key Points:

 Multimodel ensemble forecasting systems involve several methodological choices

A robust framework for

decision-making is provided

• The utility of this approach is

demonstrated for seasonal streamflow forecasts

Correspondence to:

P. A. Mendoza, pmendoza@ucar.edu

Citation:

Mendoza, P. A., B. Rajagopalan, M. P. Clark, G. Cortés, and J. McPhee (2014), A robust multimodel framework for ensemble seasonal hydroclimatic forecasts, *Water Resour. Res., 50*, doi:10.1002/2014WR015426.

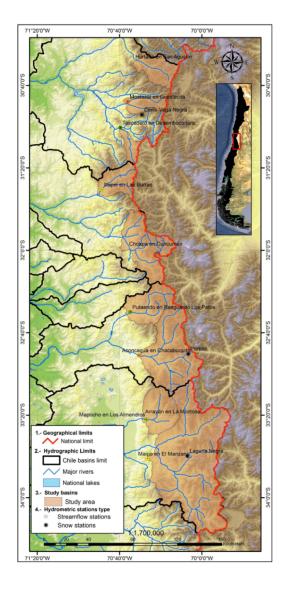
Received 10 FEB 2014 Accepted 3 JUL 2014 Accepted article online 8 JUL 2014

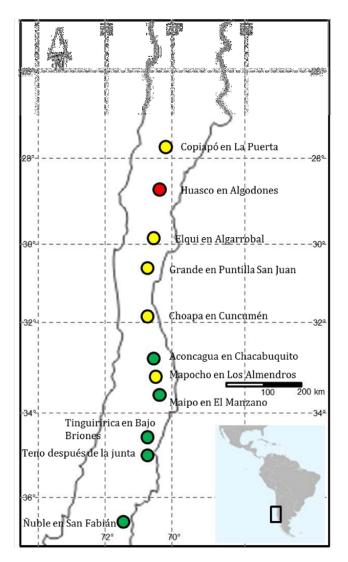
A robust multimodel framework for ensemble seasonal hydroclimatic forecasts

Pablo A. Mendoza^{1,2,3}, Balaji Rajagopalan^{1,2}, Martyn P. Clark³, Gonzalo Cortés⁴, and James McPhee^{5,6}

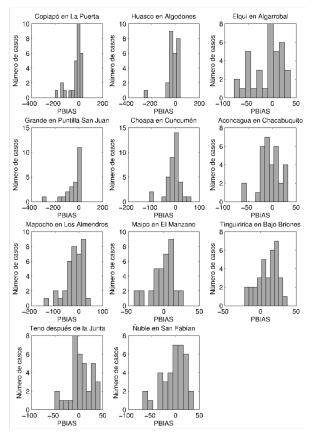
¹Department of Civil, Environmental, and Architectural Engineering, University of Colorado at Boulder, Boulder, Colorado, USA, ²Cooperative Institute for Research in Environmental Sciences (CIRES), University of Colorado at Boulder, Boulder, Colorado, USA, ³Research Applications Laboratory, National Center for Atmospheric Research (NCAR), Boulder, Colorado, USA, ⁴Department of Civil and Environmental Engineering, University of California, Los Angeles, Los Angeles, California, USA, ⁵Department of Civil Engineering, Faculty of Physical and Mathematical Sciences, Universidad de Chile, Santiago, Chile, ⁶Advanced Mining Technology Center (AMTC), Faculty of Physical and Mathematical Sciences, Universidad de Chile, Santiago, Chile

Abstract We provide a framework for careful analysis of the different methodological choices we make when constructing multimodel ensemble seasonal forecasts of hydroclimatic variables. Specifically, we focus on three common modeling decisions: (i) number of models, (ii) multimodel combination approach, and (iii) lead time for prediction. The analysis scheme includes a multimodel ensemble forecasting algorithm based on nonparametric regression, a set of alternatives for the options previously pointed, and a selection of probabilistic verification methods for ensemble forecast evaluation. The usefulness of this framework is tested through an example application aimed to generate spring/summer streamflow forecasts at multiple locations in Central Chile. Results demonstrate the high impact that subjectivity in decision-making may have on the quality of ensemble seasonal hydroclimatic forecasts. In particular, we note that the probabilistic verification criteria may lead to different choices regarding the number of models or the multimodel combination method. We also illustrate how this objective analysis scheme may lead to results that are extremely relevant for the case study presented here, such as skillful seasonal streamflow predictions for very dry conditions.





In Chile, official forecasting program since 1970's, based on regression models and in-situ hydrometeorological observations



Room for improvement:

- Probabilistic forecasts
- Skill statistics
- Reliability under changing climate

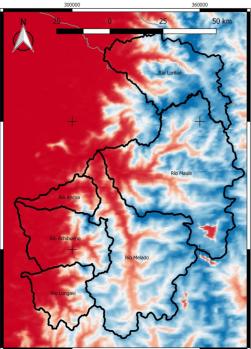
A case study: the Maule River Basin (aprox. 36°S)



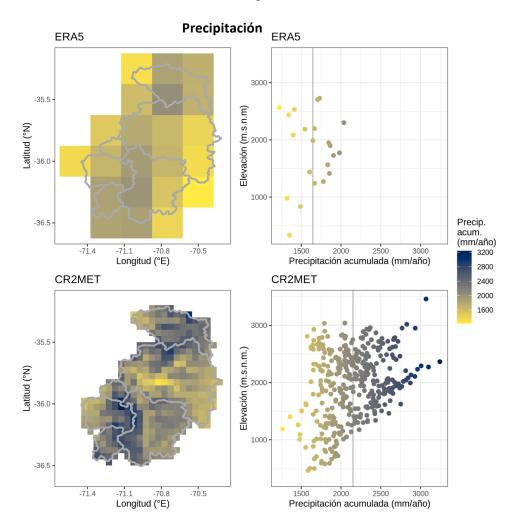
6 subbasins

٠

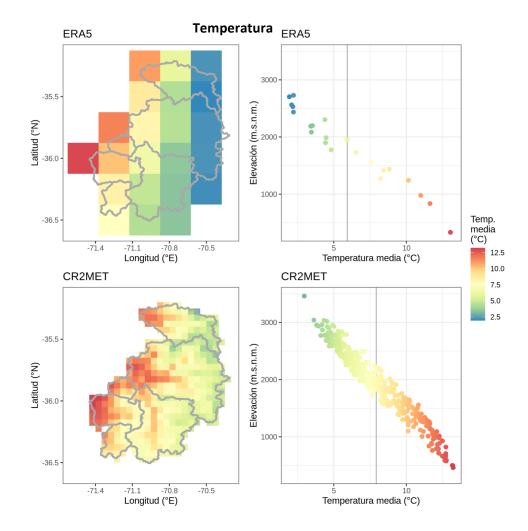
- Mixed flow regimes (snow and rain dominated)
- 1 Snow station

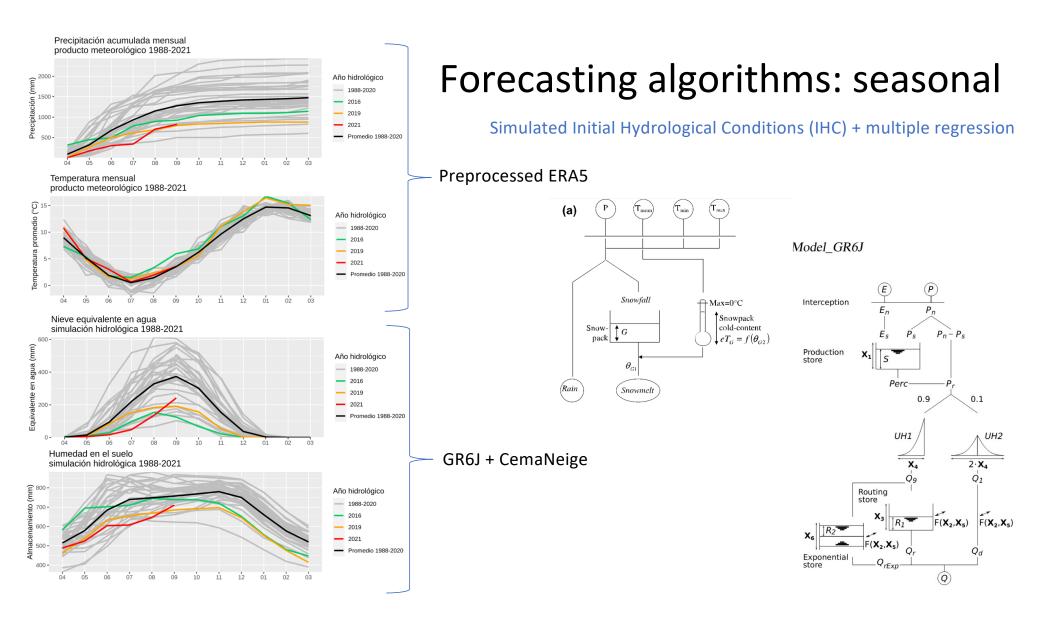


0000



A case study: the Maule River Basin climate data





Forecasting algorithms: weekly

Simulated Initial Hydrological Conditions (IHC) + NWP-driven simulation

Near-present preprocessed historical ensemble forcings

Global reanalysis ERA5 (Herbach et al., 2020)

Preprocessing and ensemble generation at the catchment scale, using a modified analog approach (Schefzik; 2015, 2016)

Local gridded product CR2MET (0.05 x 0.05°) as the reference

Streamflow records

Streamflow records collected from the national database

Naturalized series provided by the local water users

Preprocessed forecasted ensemble forcings

Global forecasts GEFS (Hamill et al., 2013)

Preprocessing using EMOS, at the catchment scale

Mean-ensemble historical forcings as the reference

Hydrological modeling

GR6J lumped model (Pushpalatha et al., 2011) with the CemaNeige module (Valéry et al., 2014).

The 1998-2011 and 2012-2018 periods are used for calibration and validation, respectively. Alternatively, the 2005-2018 and 1998-2004 periods are also tested for calibration and validation.

Pre-selection of ensemble members

Out of 22 historical members, 8 are selected by streamflow-based criterion

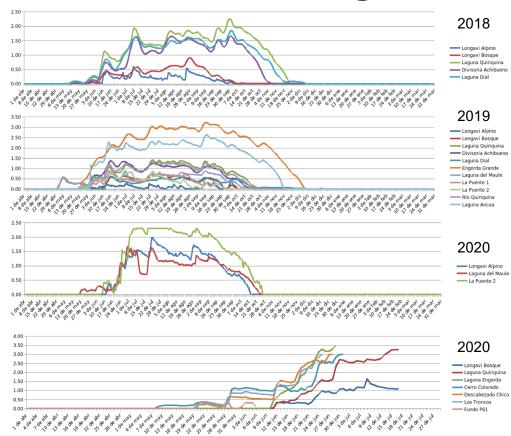
Before forecast emission, each 22 simulated traces are compared to the observed streamflow by mean absolute error along 1 to 2 weeks-ago

Forecasted streamflow

Daily streamflows forecasted for 1 to 7 days lead times

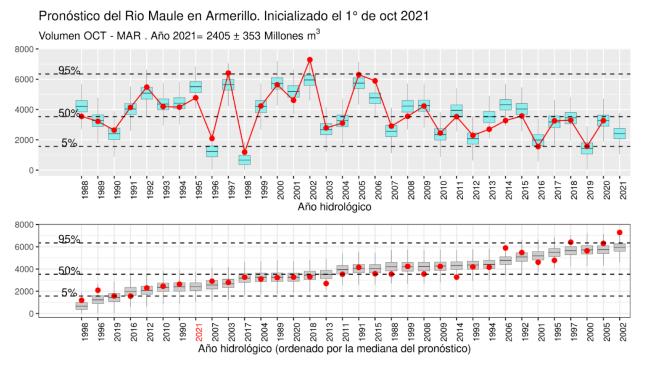
Weekly streamflows forecasted as the volume of 1 to 7 daily streamflows

Adding snowpack observations through a low-cost sensing network





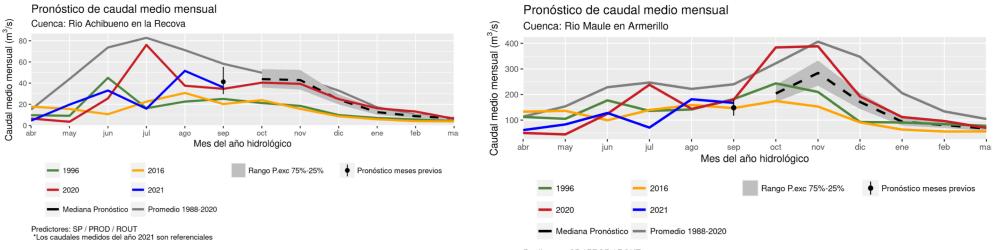
Globally available meteorological products and hydrological simulation do provide some predictive power at the seasonal level.



Caudales medidos

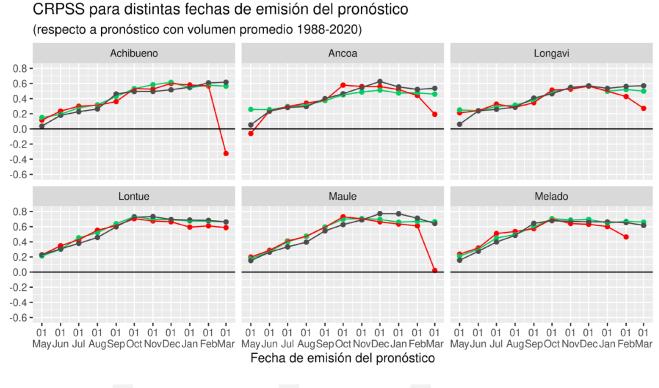
CRPSS (c/r promedio)	= 0.187
Regresión	= lineal
Predictores	= SP / PROD / ROUT

Globally available meteorological products and hydrological simulation do provide predictive power at the seasonal level.

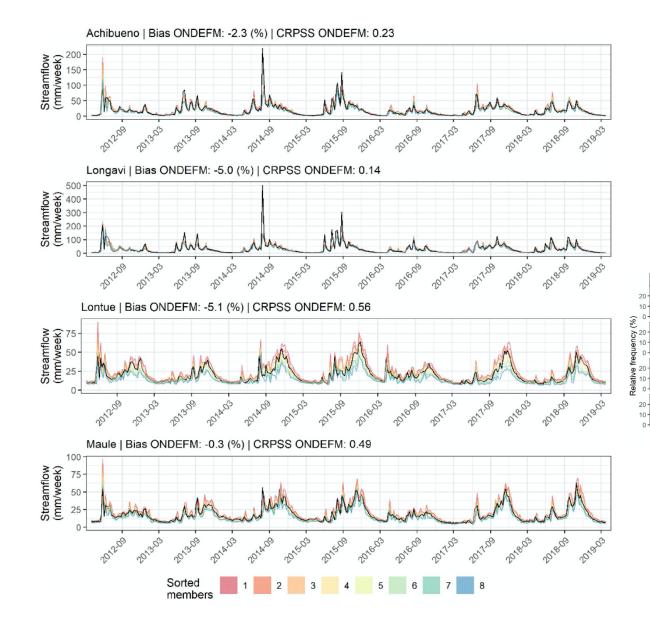


Predictores: SP / PROD / ROUT *Los caudales medidos del año 2021 son referenciales

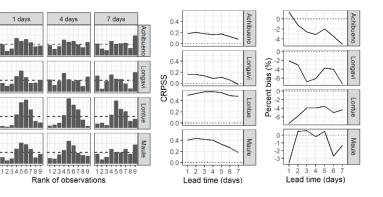
Is it possible to issue earlier forecasts (midwinter) with increased skill?



Predictores - pr_acum / tem_mean_3mons - SWE / PROD / ROUT - SWE_avg3m / PROD_avg3m / ROUT_avg3m



Ensemble weekly forecasts capture streamflow observations. Screening (preprocessing) reduces problem size and increases forecast skill.





Ongoing work

- "Assimilate" snow depth observations through screening of ensemble forecast members -> density simulation
- Testing climate forecast products for ESP
- Testing different hydrological model options







Ongoing work

- "Assimilate" snow depth observations through screening of ensemble forecast members -> density simulation
- Testing climate forecast products for ESP
- Testing different hydrological model options

THANKS!



