

# **Ciencia reproducible**

**¿Qué es? ¿Cómo y por qué?**

## **Reproducible (reproducibility):**

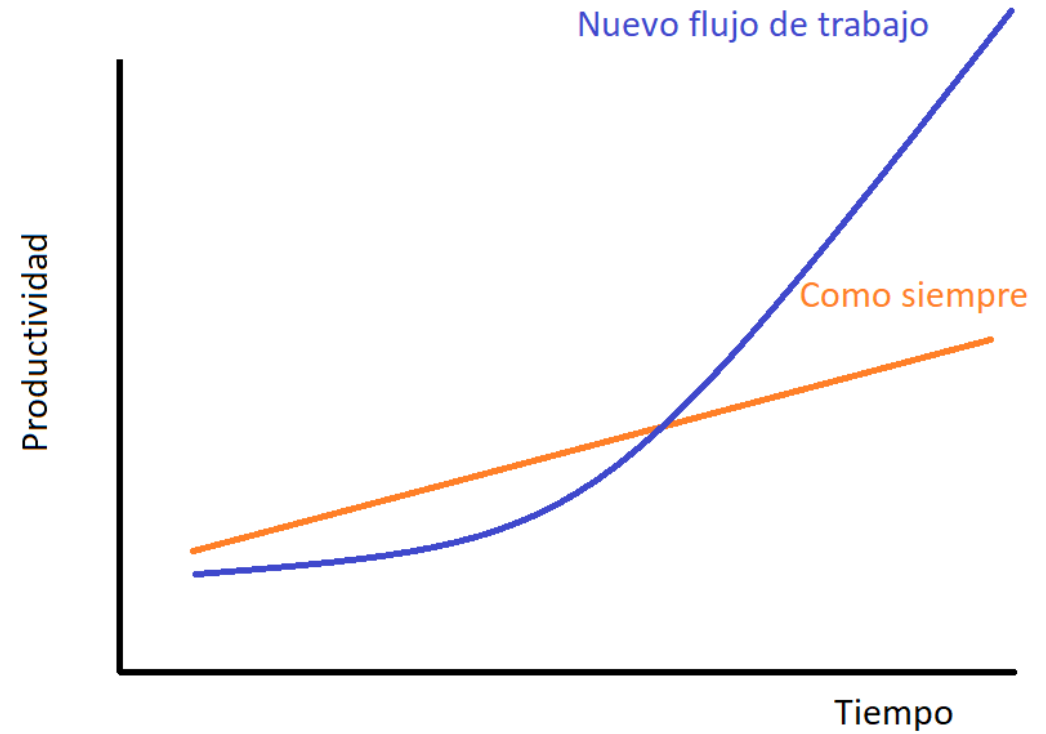
"Un estudio es reproducible si el texto del artículo viene acompañado de código... ..que permite recrear exactamente a partir de los datos originales todos los resultados y figuras incluidos en el artículo."

## **vs Repetible (replicability):**

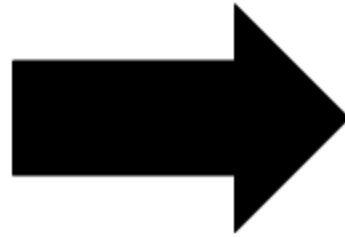
"...replicar el mismo estudio (con nuevos datos) a partir de la información proporcionada en el artículo."

Rodríguez-Sánchez, F., Pérez-Luque, A.J. Bartomeus, I., Varela, S. 2016. Ciencia reproducible: qué, por qué, cómo. Ecosistemas 25(2): 83-92. Doi.: 10.7818/ECOS.2016.25-2.11

# Necesitamos cambiar el flujo de trabajo



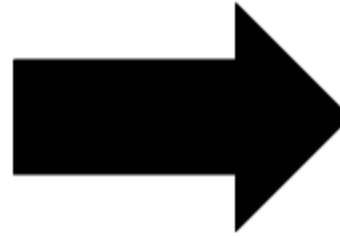
# ALMACENAMIENTO



	B	C	I	J	K	L	M
2			Real GDP growth				
3			Debt/GDP				
4	Country	Coverage	30 or less	30 to 60	60 to 90	90 or above	30 or less
26			3.7	3.0	3.5	1.7	5.5
27	Minimum		1.6	0.3	1.3	-1.8	0.8
28	Maximum		5.4	4.9	10.2	3.6	13.3
29							
30	US	1946-2009	n.a.	3.4	3.3	-2.0	n.a.
31	UK	1946-2009	n.a.	2.4	2.5	2.4	n.a.
32	Sweden	1946-2009	3.6	2.9	2.7	n.a.	6.3
33	Spain	1946-2009	1.5	3.4	4.2	n.a.	9.9
34	Portugal	1952-2009	4.8	2.5	0.3	n.a.	7.9
35	New Zealand	1948-2009	2.5	2.9	3.9	-7.9	2.6
36	Netherlands	1956-2009	4.1	2.7	1.1	n.a.	6.4
37	Norway	1947-2009	3.4	5.1	n.a.	n.a.	5.4
38	Japan	1946-2009	7.0	4.0	1.0	0.7	7.0
39	Italy	1951-2009	5.4	2.1	1.8	1.0	5.6
40	Ireland	1948-2009	4.4	4.5	4.0	2.4	2.9
41	Greece	1970-2009	4.0	0.3	2.7	2.9	13.3
42	Germany	1946-2009	3.9	0.9	n.a.	n.a.	3.2
43	France	1949-2009	4.9	2.7	3.0	n.a.	5.2
44	Finland	1946-2009	3.8	2.4	5.5	n.a.	7.0
45	Denmark	1950-2009	3.5	1.7	2.4	n.a.	5.6
46	Canada	1951-2009	1.9	3.6	4.1	n.a.	2.2
47	Belgium	1947-2009	n.a.	4.2	3.1	2.6	n.a.
48	Austria	1948-2009	5.2	3.3	-3.8	n.a.	5.7
49	Australia	1951-2009	3.2	4.9	4.0	n.a.	5.9
50							
51			4.1	2.8	2.8	=AVERAGE(L30:L44)	

Abundance	Biomass	Family	Genus	Species	SampleDescr	Plot	Latitude	Longitude	Depth	Elevati	Day	Month	Year	StudyID
4.07	NA	Aegithalidae	Aegithalos	caudatus	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
1.84	NA	Certhiidae	Certhia	brachydactylus	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.52	NA	Corvidae	Garrulus	glandarius	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.39	NA	Emberizidae	Emberiza	cia	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.26	NA	Fringillidae	Chloris	chloris	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
1.57	NA	Fringillidae	Fringilla	coelebs	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.26	NA	Fringillidae	Pyrrhula	pyrrhula	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
8.66	NA	Muscicapidae	Erithacus	rubecula	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
8.14	NA	Paridae	Cyanistes	caeruleus	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
2.62	NA	Paridae	Lophophanes	cristatus	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.92	NA	Paridae	Parus	major	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.66	NA	Paridae	Periparus	ater	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.66	NA	Phylloscopidae	Phylloscopus	collybita	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.13	NA	Picidae	Dendrocopos	major	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.26	NA	Prunellidae	Prunella	modularis	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
3.28	NA	Regulidae	Regulus	ignicapilla	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.13	NA	Sittidae	Sitta	europaea	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
3.28	NA	Sylviidae	Sylvia	atricapilla	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.92	NA	Sylviidae	Sylvia	melanocephala	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.13	NA	Sylviidae	Sylvia	undata	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
0.26	NA	Troglodytidae	Troglodytes	troglodytes	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
1.97	NA	Turdidae	Turdus	merula	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA
4.27	NA	Aegithalidae	Aegithalos	caudatus	Cazorla_bird	NA	37.94	-2.87	NA	NA	NA	NA	1978	NA

# ANÁLISIS



IBM SPSS Statistics Data Editor

File Edit View Data Transform Analyze Direct Marketing Graphs Utilities Add-ons Window Help

Reports  
Descriptive Statistics  
Tables  
Cognitive Means  
General Linear Model  
Generalized Linear Models  
Mixed Models  
Complate  
Regression  
Loglinear  
Neural Networks  
Classify  
Dimension Reduction  
Single  
Nonparametric Tests  
Forecasting  
Survival  
Multiple Response  
Missing Value Analysis  
Multiple Imputation  
Complex Samples  
Quality Control  
ROC Curve

Visible: 10 of 10 Variables

	customer_id	income	rentals	home type	address:cat	service_type	service_usage
1	1979-OPALG	\$45 - \$100	2	Single family	More than 15	Television	No service
2	1979-OPALG	\$45 - \$100	2	Single family	More than 15	Telephone (la	Other provider
3	1979-OPALG	\$45 - \$100	2	Single family	More than 15	Internet	Other provider
4	1912-UCOEYV	\$45 - \$100	2	Single family	More than 15	Television	Service with c...
5	1912-UCOEYV	\$45 - \$100	2	Single family	More than 15	Telephone (la	Service with c...
6	1912-UCOEYV	\$45 - \$100	2	Single family	More than 15	Internet	Service with c...
7	1923-SEERQ	\$45 - \$100	2	Single family	More than 15	Television	No service
8	1923-SEERQ	\$45 - \$100	2	Single family	More than 15	Telephone (la	Other provider
9	1923-SEERQ	\$45 - \$100	2	Single family	More than 15	Internet	Other provider
10	1945-TYFWO	\$45 - \$100	2	Multiple family	More than 15	Television	No service
11	1945-TYFWO	\$45 - \$100	2	Multiple family	More than 15	Telephone (la	Other provider
12	1945-TYFWO	\$45 - \$100	2	Multiple family	More than 15	Internet	No service
13	1915-CLQWR	Under \$45	3	Mobile Home	More than 15	Television	Service with c...
14	1915-CLQWR	Under \$45	3	Mobile Home	More than 15	Telephone (la	Service with c...
15	1915-CLQWR	Under \$45	3	Mobile Home	More than 15	Internet	Service with c...
16	1952-VEGB	\$45 - \$100	2	Single family	More than 15	Television	Service with c...
17	1952-VEGB	\$45 - \$100	2	Single family	More than 15	Telephone (la	Service with c...
18	1952-VEGB	\$45 - \$100	2	Single family	More than 15	Internet	Service with c...
19	1925-KYDNY	\$45 - \$100	1	Single family	6 to 15	Television	No service
20	1925-KYDNY	\$45 - \$100	1	Single family	6 to 15	Telephone (la	Service with c...
21	1925-KYDNY	\$45 - \$100	1	Single family	6 to 15	Internet	Other provider
22	1944-WHCY	Under \$45	4	Single family	Less than 6	Television	Other provider
23	1944-WHCY	Under \$45	4	Single family	Less than 6	Telephone (la	Service with c...
24	1944-WHCY	Under \$45	4	Single family	Less than 6	Internet	Other provider
25	1947-AWFL	Under \$45	2	Single family	More than 15	Television	Service with c...
26	1947-AWFL	Under \$45	2	Single family	More than 15	Telephone (la	Service with c...
27	1947-AWFL	Under \$45	2	Single family	More than 15	Internet	Service with c...
28	1955-CANES	\$45 - \$100	1	Condominium	More than 15	Television	Service with c...

Data View Variable View

Generalized Linear

IBM SPSS Statistics Processor is ready

```
# Guanica_birds

# Load data
raw_data <- read.delim("raw_data/Guanica_birds_raw.csv", sep = ";", dec = ".")
str(raw_data)

# Correct column names
names(raw_data)[2:23] <- c(1991:2012)

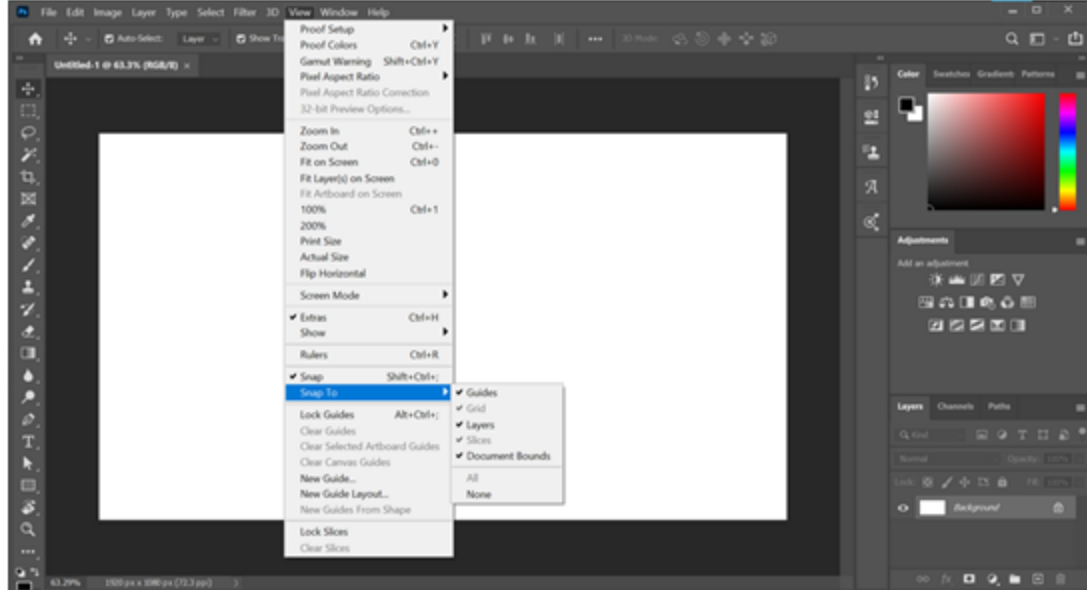
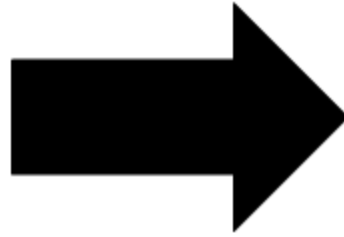
# Transpose
raw_data <- data.table::transpose(raw_data, keep.names = "Year")
names(raw_data)[-1] <- raw_data[, -1]

# Remove useless first row
raw_data <- raw_data[-1, ]

# Pivot longer
data <- raw_data %>% pivot_longer(cols = c(2:21),
                                names_to = "Binomial",
                                values_to = "Abundance")

# Abundance and Year as integers
data$Year <- as.integer(data$Year)
data$Abundance <- as.integer(data$Abundance)
```

# FIGURAS



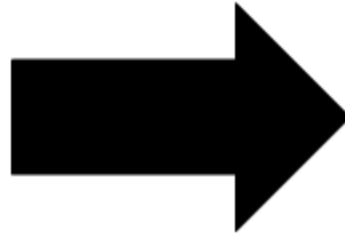
```

31
32 # Plot eta vs phi
33 pdf("results/eta_phi3.pdf", width = 4, height = 4)
34
35 # Plot detrended eta vs detrended phi
36 par(mar = c(5, 6, 1, 1), pty = "s")
37 plot(data$eta_t3_obs ~ data$phi_t3_obs,
38      xlim = c(0, 1),
39      ylim = c(-1, 1),
40      xlab = "",
41      ylab = "",
42      las = 1,
43      pch = 21,
44      cex = log(data$nspp),
45      col = "black",
46      bg = "#2966ce"
47 )
48
49 # Create 4 sub-squares
50 abline(a = 0, b = 0, lwd = 2)
51 abline(v = 0.5, lty = "dashed", lwd = 2)
52
53 # Separate assemblages by sub-squares of the plot
54 data_a <- data[data$eta_t3_obs > 0 & data$phi_t3_obs < 0.5, ]
55 data_b <- data[data$eta_t3_obs > 0 & data$phi_t3_obs > 0.5, ]
56 data_c <- data[data$eta_t3_obs < 0 & data$phi_t3_obs < 0.5, ]
57 data_d <- data[data$eta_t3_obs < 0 & data$phi_t3_obs > 0.5, ]
58

```



# REDACCIÓN



# L<sup>A</sup>T<sub>E</sub>X

