Panel Analyses Report

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Prerequis

Ceci est une étude des données de panel avec Markdown.

The **bookdown** package can be installed from CRAN or Github:

La structure de ce rapport est que chaque fichier RMD porte un chapitre et un thème bien spécifique de notre analyse

Nous avions utilisé XeLaTeX pour compiler ce document en PDF.

Introduction

You can label chapter and section titles using {#label} after them, e.g., we can reference Chapter 2. If you do not manually label them, there will be automatic labels anyway, e.g., Chapter 5.

Figures and tables with captions will be placed in figure and table environments, respectively.

```
par(mar = c(4, 4, .1, .1))
plot(pressure, type = 'b', pch = 19)
```

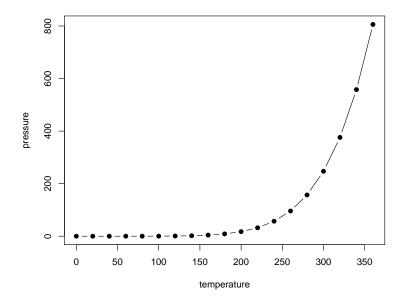


Figure 2.1: Here is a nice figure!

Sepal.Length	Sepal.Width	Petal.Length	Petal.Width	Species
5.1	3.5	1.4	0.2	setosa
4.9	3.0	1.4	0.2	setosa
4.7	3.2	1.3	0.2	setosa
4.6	3.1	1.5	0.2	setosa
5.0	3.6	1.4	0.2	setosa
5.4	3.9	1.7	0.4	setosa
4.6	3.4	1.4	0.3	setosa
5.0	3.4	1.5	0.2	setosa
4.4	2.9	1.4	0.2	setosa
4.9	3.1	1.5	0.1	setosa
5.4	3.7	1.5	0.2	setosa
4.8	3.4	1.6	0.2	setosa
4.8	3.0	1.4	0.1	setosa
4.3	3.0	1.1	0.1	setosa
5.8	4.0	1.2	0.2	setosa
5.7	4.4	1.5	0.4	setosa
5.4	3.9	1.3	0.4	setosa
5.1	3.5	1.4	0.3	setosa
5.7	3.8	1.7	0.3	setosa
5.1	3.8	1.5	0.3	setosa

Table 2.1: Here is a nice table!

Reference a figure by its code chunk label with the fig: prefix, e.g., see Figure 2.1. Similarly, you can reference tables generated from knitr::kable(), e.g., see Table 2.1.

```
knitr::kable(
  head(iris, 20), caption = 'Here is a nice table!',
  booktabs = TRUE
)
```

You can write citations, too. For example, we are using the **bookdown** package (Xie, 2021) in this sample book, which was built on top of R Markdown and **knitr** (Xie, 2015).

Literature

The One-way Error Component Regression Model

4.1 INTRODUCTION

A panel data regression differs from a regular time-series or cross-section regression in that it has a double subscript on its variables, i.e.

$$y_{it} = \alpha + X_{it}^{'}\beta + u_{it}$$

$$i = 1,...,N; t = 1,...,T$$

(2.1)

with \$ i \$ denoting households, individuals, firms, countries, etc. and t denoting time. The i subscript, therefore, denotes the cross-section dimension whereas t denotes the time-series dimension.

 α

is a scalar,

β

is

 $K \times 1$

and Xi t is the \$ it_{th} \$ observation on K explanatory variables. Most of the panel data applications utilize a one-way error component model for the disturbances, with

$$u_{it} = \mu_i + v_{it}$$

(2.2)

where i denotes the unobservable individual-specific effect and it denotes the remainder disturbance. For example, in an earnings equation in labor economics, yit will measure earnings of the head of the household, whereas

 X_{it}

may contain a set of variables like experience, education, union membership, sex, race, etc. Note that i is time-invariant and it accounts for any individual-specific effect that is not included in the regression. In this case we could think of it as the individual's unobserved ability. The remainder disturbance

 v_{it}

varies with individuals and time and can be thought of as the usual disturbance in the regression. Alternatively, for a production function utilizing data on firms across time,

 y_{it}

will measure output and

 X_{it}

will measure inputs. The unobservable firm-specific effects will be captured by the

 μ_i

and we can think of these as the unobservable entrepreneurial or managerial skills of the firm's executives. Early applications of error components in economics include Kuh (1959) on investment, Mundlak (1961) and Hoch (1962) on production functions and Balestra and Nerlove (1966) on demand for natural gas. In vector form (2.1) can be written as

$$y = \alpha i_{NT} + X\beta + u = Z\delta + u$$

(2.3)

$$y = \alpha i_{NT} + X\beta + u = Z\delta + u$$

(2.3)

where \$ y \$ is \$ NT \times 1 \$, \$ X \$ is \$ NT \times K \$, \$ Z = [_{NT} , X] \$, \$ ^{'} = ({'}, ') \$ and $\iota_N T$ is a vector of ones of dimension NT. Also, (2.2) can be written as

$$u = Z_{\mu}\mu + v$$

(2.4)

$$y_{it} = \alpha + X_{it}^{'} + U_{it}$$

, i=1,...,N; t=1,...,T with i denoting households, individuals, firms, countries, etc. and t denoting time. The i subscript, therefore, denotes the cross-section dimension whereas t denotes the time-series dimension. $\$ is a scalar, $\$ is $K \times 1$ and X_{it} is the it^{th} observation on K explanatory variables. disturbances, with it

$$u_{it} = u_i + v_{it}$$

where i denotes the unobservable individual-specific effect and νit denotes the remainder disturbance. For example, in an earnings equation in labor economics. y_{it} will measure earnings of the head of the household, whereas Xi t may contain a set of variables like experience, education, union membership, sex, race, etc. Note that i is time-invariant and it accounts for any individual-specific effect that is not included in the regression. In this case we could think of it as the individual's unobserved ability. The remainder disturbance \$ {it} \$ varies with individuals and time and can be thought of as the usual disturbance in the regression. Alternatively, for a production function utilizing data on firms across time, \$ y {it} \$ will measure output and \$ X {it} \$ will measure inputs. The unobservable firm-specific effects will be captured by the \$ _i \$ and we can think of these as the unobservable entrepreneurial or managerial skills of the firm's executives. Early applications of error components in economics include Kuh (1959) on investment, Mundlak (1961) and Hoch (1962) on production functions and Balestra and Nerlove (1966) on demand for natural gas. In vector form (2.1) can be written as

$$y = \alpha i_{NT} + X\beta + u = Z\delta + u$$

where y is \$ NT × 1\$, X is $NT \times K$, \$ Z = [i_{NT} , X] \$, \$ ^{'}=(^ ', ^{'}) \$ and i_{NT} is a vector of ones of dimension NT . Also, (2.2) can be written as

$$u = Z_{\mu}\mu + v$$

(2.4)

where \$ u^{'} = (u_{11}, . . . , u_{1T}, u_{21}, . . . , u_{2T}, . . . , u_{1N1}, . . . , u_{1NT})\$ with the observations stacked such that the slower index is over individuals and the faster index is over time.\$ Z_ = IN T \$ where IN is an identity matrix of dimension N, T is a vector of ones of dimension T and \$ \$ denotes Kronecker product. \$ Z_ \$ is a selector matrix of ones and zeros, or simply the matrix of individual dummies that one may include in the regression to estimate the i if they are assumed to be fixed parameters. \$ ^{'} = (_1, . . . , _N)\$ and $\nu' = (\nu 11, ..., \nu_{1T}, ..., \nu_{N1}, ..., \nu_{NT})$. Note that \$Z_ Z^{'} = I_N J_T \$ where J_T is a matrix of ones of dimension T and \$

 ${\rm P}={\rm Z}$ (Z^{{\rm f}} Z){-1} Z^{{\rm f}} \$, the projection matrix on \$ Z_ \$, reduces to \$ IN J_T \$ where \$J_T=JT/T \$. P is a matrix which averages the observation across time for each individual, and Q = INT - P is a matrix which obtains the deviations from individual means. For example, regressing y on the matrix of dummy variables Z_{μ} gets the predicted values \$ P_y \$ which has a typical element

$$\bar{y}_i = \sum_{t=1}^T \frac{y_{it}}{T}$$

repeated T times for each individual. The residuals of this regression are given by Qy which has a typical element

$$(y_{it} - \bar{y}_i)$$

P and Q are (i) symmetric idempotent matrices, i.e.

 $P^{'}=P$ and $P^{2}=P$. This means that rank(P)=tr(P)=N and rank(Q)=tr(Q)=N(T-1). This uses the result that the rank of an idempotent matrix is equal to its trace (see Graybill, 1961,theorem 1.63). Also, (ii) P and Q are orthogonal, i.e. PQ=0 and (iii) they sum to the identity matrix $P+Q=I_{NT}$. In fact, any two of these properties imply the third (see Graybill, 1961, theorem 1.68).

4.2 THE FIXED EFFECTS MODEL

In this case, the i are assumed to be fixed parameters to be estimated and the remainder disturbances stochastic with v_{it} independent and identically distributed $IID(0,\sigma_v^2)$. The X_{it} are assumed independent of the v_{it} for all i and t. The fixed effects model is an appropriate specification if we are focusing on a specific set of N firms, say, IBM, GE,Westinghouse, etc. and our inference is restricted to the behavior of these sets of firms. Alternatively, it could be a set of N OECD countries, or N American states. Inference in this case is conditional on the particular N firms, countries or states that are observed. One can substitute the disturbances given by (2.4) into (2.3) to get

$$y=i_{IT} + X + Z_ +v = Z + Z_ +v$$
\$ (2.5)

and then perform ordinary least squares (OLS) on (2.5) to get estimates of \$, and \upmu \$

Note that Z is $NT \times (K+1)$ and Z, the matrix of individual dummies, is $NT \times N$ $NT \times N$. If N is large, (2.5) will include too many individual dummies, and the matrix to be inverted by OLS is large and of dimension (N+K). In fact, since and are the parameters of interest, one can obtain the LSDV (least squares dummy variables) estimator from (2.5), by premultiplying the model by Q and performing OLS on the resulting transformed model:

$$Qy=QX + Qv$$
 (2.6)

This uses the fact that $QZ_{\mu}=Qi_{NT}=0$, since $PZ_{\mu}=Z_{\mu}$ the Q matrix wipes out the individual effects. This is a regression of $\tilde{y}=QY$ with element $(y_{it}-\bar{y}_{i.})$ on $\check{X}=QX$ with typical element

16CHAPTER 4. THE ONE-WAY ERROR COMPONENT REGRESSION MODEL

Methods

We describe our methods in this chapter.

Les données de panel, ou données longitudinales possèdent les deux dimensions précédentes (individuelle et temporelle). En effet, il est souvent intéressant d'identifier l'effet associé à chaque individu (un effet qui ne varie pas dans le temps, mais qui varie d'un individu à un autre). Cet effet peut être fixe ou aléatoire.

Par conséquent, le modèle en données de panel s'écrit comme un modèle à double indice qui prend la forme suivante :

$$Y_{it} = \alpha_i \sum_{k} \beta_{ki} x_{ki} + \epsilon_{it}$$

avec

$$i:1 \to N$$

et

$$t: 1 \to T$$

La double dimension qu'offrent les données de panel est un atout majeur. En effet, si les données en séries temporelles permettent d'étudier l'évolution des relations dans le temps, elles ne permettent pas de contrôler l'hétérogénéité entre les individus. A l'inverse, les données en coupes transversales permettent d'analyser l'hétérogénéité entre les individus mais elles ne peuvent pas tenir compte des comportements dynamiques, puisque la dimension temporelle est exclue du champ d'analyse.

Ainsi, en utilisant des données de panel, on pourra exploiter les deux sources de variation de l'information statistique : - Temporelle où variabilité intra-individuelle (within) - et individuelle ou variabilité inter-individuelle (Between).

Analyses

Nous faisons *application* des méthodes présentées dans le chapitre précédant pour l'analyse des données de pannel

Avant de passefr à la modélisation, nous ferons une description de nos variables d'interet d'une manière statique : nos prédicteurs et la variables réponses

6.1 Netoyage de la base des données

Apperçue globale des données

Voici la structure de la base des données

Voici les modalités de la variabme Goods qui signifie Marchandises

La variables Goods a 740 modalités

Faison la cactérisation des niveaux des marchandises dont l'encodage fait défaut class(taxe_df\$Goods)

```
## [1] "character"
```

Usage de tm et Stringr

N°	Country/destination	Year	Goods	Weight	Taxe
1	AFRIQUE DU SUD	2011	GRUES SUR PNEUMATIQUE	13500	0
2	AFRIQUE DU SUD	2011	CAMION FAMIL	12000	0
3	AFRIQUE DU SUD	2011	CAMION SOMUL	24000	0
4	AFRIQUE DU SUD	2013	Café vert arabica k4	183	0
5	AFRIQUE DU SUD	2013	Café vert arabica k4	19520	264771
6	AFRIQUE DU SUD	2013	Café vert arabica k4	19520	272817
7	AFRIQUE DU SUD	2013	Café vert arabica k4	19520	283220
8	AFRIQUE DU SUD	2013	Café vert arabica k4	19520	264142
9	AFRIQUE DU SUD	2013	CAMION	24000	0
10	AFRIQUE DU SUD	2017	Instruments et appareils du n°90.15	654	0

Table 6.1: Echantillon de la base des données

Warning: Unknown levels in `f`: equipements protection

- ## [1] "Autres Marchandises"
- ## [2] "Bois"
- ## [3] "Machines et appareils domestique"
- ## [4] "Médicaments et plantes médécinales"
- ## [5] "Poissaons, viande et oeufs"
- ## [6] "Matériels de construction"
- ## [7] "Materiel Informatique et Electroniques"
- ## [8] "Véhicules, camions, Motos et acc"
- ## [9] "Vetements, tissus et acc et chaussure"
- ## [10] "boissons, bières et limonades"
- ## [11] "Machine us Ingsutriel"
- ## [12] "Article Menange et Campement"
- ## [13] "sacs, sachetsn emballages"
- ## [14] "Papiers et fournitures de bureaux"
- ## [15] "Produits alimentaires, prep et huiles"
- ## [16] "caféarabica"
- ## [17] "Minérais et dérivés"
- ## [18] "engins et tracteurs"
- ## [19] "Cigarette et papier cigarettes et tabac"
- ## [20] "constructionprefabriquees"
- ## [21] "cadreset conteneurs"
- ## [22] "Pièces de Réchange appareils"
- ## [23] "Générateurs, baterie et piles"
- ## [24] "etuis en plastique ou textile"
- ## [25] "Pétrole et dérivées et huile de graissage"
- ## [26] "boissons, bières, liqueurs et limonades"
- ## [27] "produits beaute"
- ## [28] "peauxdes betes"

X	_
0	_
3Café vert arabica, en feve K3	_
Abats comestibles, congeles, de chevaux, anes, mulets, ovins ou caprins	_
ABATS COMESTIBLES; CONGELES; DE CHEVAUX; ANES; MULETS; OVINS	_
Accessoires de radio diffusion	_
Accessoires de vehicules	
Accumulateurs electriques	
Acide acetique	
ages de 5 ans ou moins	
ages de plus de 5 ans	
Agés de plus de 5 ans ou moins	
Alcaloides du quinquina et leurs derives;	
ALCOOL ETYLIQUE NON DENATURE	
ambulance d'une cylindree excedant 2500 cm3	
Antennes	
Antennes et reflecteurs d'antennes	
antennes et refleteurs	
Appareils d'eclairage electriques	
Appareils d'eclairage non electriques	
Appareils d'eclairages electriques	
Appareils du n°84.14	
Appareils electrothermiques pour la	
appareils pour la reception, la conversion et la transmission	
Art et materiel d'athletisme	
Articles confectionnes en textiles	
Articles d'economie domestique,en	
Articles de bureau	
ARTICLES DE BUREAU	
Articles de bureau ou de la papeterie	
Articles de friperie	
ARTICLES DE FRIPERIE	
Articles et materiel d'athletisme	
Ashok Layland	
ASPIRATEUR ET ACCESSOIRES	
Autes bois sciés	
AUTRE MACHINE ET APPAREIL A IMPRIMER	
AUTRE MINERAIS DE TITANE (Coltant)	
AUTRE PARTIE DE PLANTE	
AUTRE PEAUX	
AUTRE PREP ALIMENTAIRE	
Autre vehicules automobiles a usages speciaux	

Autres

Autres bois scies

Autres abats comestibles frais ou refrigérés de chevaux, anes, mulets, ovins, caprins

Autres abats comestibles, congeles, de chevaux, anes, mulets, ovins ou caprins

Autres accumulateurs electriques

Autres appareils elevateurs, a action continue pour marchandises

AUTRES

Autres accessoires de tuyauterie en fonte

Autres armes

Autres art de bureau ou de papeterie en papier

##		n	%	val%
##	Autres Marchandises	160		4.8
##	Bois	140	4.2	4.2
##	Machines et appareils domestique	30	0.9	0.9
	Médicaments et plantes médécinales	34	1.0	1.0
	Poissaons, viande et oeufs	12	0.4	0.4
##	Matériels de construction	27	0.8	0.8
##	Materiel Informatique et Electroniques	32	1.0	1.0
##	Véhicules, camions, Motos et acc	113	3.4	3.4
##	Vetements, tissus et acc et chaussure	100	3.0	3.0
##	boissons, bières et limonades	15	0.5	0.5
##	Machine us Ingsutriel	54	1.6	1.6
##	Article Menange et Campement	37	1.1	1.1
##	sacs, sachetsn emballages	6	0.2	0.2
##	Papiers et fournitures de bureaux	24	0.7	0.7
##	Produits alimentaires, prep et huiles	68	2.1	2.1
##	caféarabica	1303	39.4	39.5
##	Minérais et dérivés	1053	31.8	31.9
##	engins et tracteurs	18	0.5	0.5
##	Cigarette et papier cigarettes et tabac	14	0.4	0.4
##	constructionprefabriquees	7		0.2
##	cadreset conteneurs	1		0.0
	Pièces de Réchange appareils	6		0.2
##	Générateurs, baterie et piles	15		0.5
	etuis en plastique ou textile	1		0.0
	Pétrole et dérivées et huile de graissage	4		
##	boissons, bières, liqueurs et limonades	2	0.1	
	produits beaute	10		0.3
	peauxdes betes	14		0.4
##	NA	10	0.3	NA

netoyyage de la variable country_desti qui est un facteur dans le quel nous retrouvons les niveaux rédondants (sur l'identifiant des pays)

```
## [1] "AFRIQUE DU SUD"
## [2] "ALGERIE"
## [3] "ALLEMAGNE"
## [4] "AMERIQUE LATINE"
## [5] "ANGLETERRE"
   [6] "ANGOLA"
##
##
   [7] "ARABIE"
##
   [8] "ASIE"
##
   [9] "AUSTRALIE"
## [10] "BELGIQUE"
## [11] "BURUNDI"
## [12] "CANADA"
## [13] "CHINE"
```

```
## [14] "CHYPRE"
## [15] "CONGO BRAZA"
## [16] "CZECH REP"
## [17] "DOMBASI SIMBA"
## [18] "EMIRATES ARABES UNIES"
## [19] "ESPAGNE"
## [20] "FRANCE"
## [21] "GABON"
## [22] "GRANDE BRATAGNE"
## [23] "GRECE"
## [24] "HONG KONG"
## [25] "ILE MAURICE"
## [26] "INDE"
## [27] "ITALIE"
## [28] "J WOLFF"
## [29] "JAPON"
## [30] "KENYA"
## [31] "KP - Corée, République Populaire démocra"
## [32] "LIBAN"
## [33] "LUXEMBOURG"
## [34] "MADRID"
## [35] "MALAISIE"
## [36] "MAROC"
## [37] "NERLAND"
## [38] "NERTHERLAND"
## [39] "NIGERIA"
## [40] "NOUVELLE ZELANDE"
## [41] "OUGANDA"
## [42] "PANAMA"
## [43] "PAYS BAS"
## [44] "PHILLIPINE"
## [45] "POLOGNE"
## [46] "PORTUGAL"
## [47] "R-U"
## [48] "RDC"
## [49] "RDC/BELGIQUE"
## [50] "RDC/BUNIA"
## [51] "RDC/CHINE"
## [52] "RDC/ETATS UNIS"
## [53] "RDC/FRANCE"
## [54] "RDC/MALAISIE"
## [55] "RDC/OUGANDA"
## [56] "RDC/R-U"
## [57] "RDC/RWANDA"
## [58] "RDC/SINGAPOUR"
```

[59] "RDC/SUISSE"

```
## [60] "REP TCHEQUE"
## [61] "ROYAUME UNI"
## [62] "RWANDA"
## [63] "SENEGAL"
## [64] "SINGAPOUR"
## [65] "SKN"
## [66] "SOMALIE"
## [67] "SOUDAN"
## [68] "SUCAFINA"
## [69] "SUD SOUDAN"
## [70] "SUEDE"
## [71] "SUISSE"
## [72] "SUITZERLAND"
## [73] "Swaziland"
## [74] "SWEDEN"
## [75] "SWITZERLAND"
## [76] "TANZANIE"
## [77] "TCHAD"
## [78] "THAILANDE"
## [79] "TWIN TRADING"
## [80] "TZ"
## [81] "UAE"
## [82] "UNION EUROPEENNE"
## [83] "USA"
## [84] "WALTER MATTER"
## [85] "ZAMBIE"
```

## ## ## ##	[4] [7] [10] [13] [16] [19] [22] [25] [28]	"AFRIQUE DU SUD" "AMERIQUE LATINE" "ARABIE" "BELGIQUE" "CHINE" "REP TCHEQUE" "ESPAGNE" "GRECE" "INDE" "KENYA" "LUXEMBOURG"	"ALGERIE" "GRANDE BRATAGNE" "ASIE" "BURUNDI" "CHYPRE" "NA" "FRANCE" "HONG KONG" "ITALIE" "KP - Corée" "MALAISIE"	"ALLEMAGNE" "ANGOLA" "AUSTRALIE" "CANADA" "CONGO BRAZA" "EMIRATES ARABES UNIES" "GABON" "ILE MAURICE" "JAPON" "LIBAN" "MAROC"
## ## ## ##	[37] [40] [43] [46] [49] [52]	"NERLAND" "NOUVELLE ZELANDE" "PHILLIPINE" "ROYAUME UNI" "RWANDA" "SENEGAL" "SUD SOUDAN" "TANZANIE"	"PAYS BAS" "OUGANDA" "POLOGNE" "RDC" "SINGAPOUR" "SOMALIE" "SUEDE" "TCHAD"	"NIGERIA" "PANAMA" "PORTUGAL" "USA" "SUISSE" "SOUDAN" "Swaziland" "THAILANDE"
##	[00]	TANZANIE	IOHAD	THATLANDE

var1	var2	coef_corr
Weight	Year	-0.1727414
Taxe	Year	-0.1965648
Year	Weight	-0.1727414
Taxe	Weight	0.6699457
Year	Taxe	-0.1965648
Weight	Taxe	0.6699457

Table 6.3: Table de corrélation entre les variables quantitatives

[58] "UNION EUROPEENNE" "ZAMBIE"

Dans la base des données il y a des entreprises que l'on a enregistré à la place des pays. ces genre des cas ont été traité par remplacement avec le NA pour Not Available et ces dernier on été élargués de la base des données, car nous avions jugé qu' aucune méthode d'imputation n'est applicable pour ce genre de situation. Nous avions fait la même chose pour les variables tels que Les marchandises.

6.1.1 Nouvelle base de données pour les analyses

Regroupement des variables pour la synthèse pour rendre la base des données simple à exploiter, éliminer les NA dans les observations telsque les pays et les valeurs pour les marchandises et les taxes.

```
DBase <- taxe_df %>%
    select(Year,Country_dest,Goods,Weight,Taxe) %>%
    group_by(Year,Country_dest,Goods) %>%
    summarise(Weight=sum(Weight),Taxe=sum(Taxe),.groups = "drop") %>% drop_na()

correlate(DBase) %>% kable(caption = "Table de corrélation entre les variables quantitatives")

#plot_correlate(DBase)

df <- pdata.frame(DBase,index = c("Year","Country_dest"))

## Warning in pdata.frame(DBase, index = c("Year", "Country_dest")): duplicate couples (id-time)

## to find out which, use, e.g., table(index(your_pdataframe), useNA = "ifany")

DF <- df %>% pivot_wider(names_from = Goods,values_from = c(Taxe,Weight))

DB <- pdata.frame(DBase,index=c("Year","Goods"))

## Warning in pdata.frame(DBase, index = c("Year", "Goods")): duplicate couples (id-time) in results to find out which, use, e.g., table(index(your_pdataframe), useNA = "ifany")</pre>
```

6.2 Analyse descriptive des Varariales

Conversion des données en modèle des panels des données

Final Words

We have finished a nice book.

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