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operators and identities
Ex 3: VAR -

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Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2: Forecast

Ex 4.3: Coefficient

Questions?



# Forecasting tools in Stata

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Gustavo Sanchez

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### Outline

- Solving models for a collection of equations
- Subcommands
- Examples with time series
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# Solving models for a collection of equations

- Components
  - Stochastic equations fit using estimation commands
  - Identities
  - Coefficient vectors
- Solving the model
  - Obtain static or dynamic forecasts
  - Alternative forecast scenarios
- forecast command

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### Subcommands

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operators and identities
Ex 3: VAR - ARIMA

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### Subcommands

- Building the model
  - create
  - estimates
  - identity
  - coefvector
  - exogenous
- Solving the model
  - solve
  - adjust
- Utilities
  - describe
  - list
  - clear
  - drop
  - query

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# Examples with Time Series

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## Example with Time series

Variables and Notation (Quarterly macroeconomic data for Uruguay)

m1 : Currency and demand deposits

• pib : Gross domestic product (GDP)

• tcpn : Exchange rate.

• ipcp97 : Consumer price index (1997 = 100):

• mt : Imports

xt : Exports

• ipex : Exports price index.

Note: "I" will be used for natural logs and "d" for first difference

Source: International Monetary Fund

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Examples with Time Series

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# Example 1: Time series - OLS regressions

. regress dlm1 dlpib dlipcp97 if tin(1989q1,2009q4),noheader

. estimates store eq\_m1

. regress dlmt dltcpn dlpib if tin(1989q1,2009q4),noheader

dlmt	Coef.	Std. Err.	t	P> t	[95% Conf.	Interval]
dltcpn	1963056	.1439482	-1.36	0.176	4827717	.0901604
dlpib	.675093	.1495172	4.52	0.000	.3775444	.9726417
_cons	.0204891	.0123684	1.66	0.102	0041248	.0451029

. estimates store eq\_mt

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# Example 1: Time series - OLS regressions

. regress dlm1 dlpib dlipcp97 if tin(1989q1,2009q4),noheader

dlm1	Coef.	Std. Err.	t	P> t	[95% Conf.	Interval]
dlpib	1.081708	. 1506757	7.18	0.000	.7818536	1.381562
dlipcp97	3440374	.1829109	-1.88	0.064	7080417	.0199669
_cons	.0220782	.014986	1.47	0.145	0077448	.0519012

. estimates store eq\_m1

. regress dlmt dltcpn dlpib if tin(1989q1,2009q4),noheader

dlmt	Coef.	Std. Err.	t	P> t	[95% Conf.	Interval]
dltcpr	1963056	.1439482	-1.36	0.176	4827717	.0901604
dlpil	.675093	.1495172	4.52	0.000	.3775444	.9726417
_cons	.0204891	.0123684	1.66	0.102	0041248	.0451029

. estimates store eq\_mt

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# Example 1: Time series - OLS regressions

### Create the model

- . forecast create myfcst1
  Forecast model myfcst1 started.
- Add equations
  - . forecast estimates eq\_ml
    Added estimation results from regress
  - Forecast model myfcst1 now contains 1 endogenous variable.
  - . forecast estimates eq\_mt
    - Added estimation results from regress.
    - Forecast model myfcst1 now contains 2 endogenous variables.
- Solve the model
  - . forecast solve, begin(q(2010q1))

Computing dynamic forecasts for model myfcst1.

Forecast 2 variables spanning 6 periods.

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Ex 1: regress

Fy 4: Panel data xtreg xtabond Fy 4 2.

# Example 1: Time series - OLS regressions

### Create the model

. forecast create myfcst1 Forecast model myfcst1 started.

### Add equations

- . forecast estimates eq\_m1 Added estimation results from regress. Forecast model myfcst1 now contains 1 endogenous variable.
- . forecast estimates ed mt Added estimation results from regress.
  - Forecast model myfcst1 now contains 2 endogenous variables.

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## Example 1: Time series - OLS regressions

### Create the model

. forecast create myfcst1 Forecast model myfcst1 started.

### Add equations

forecast estimates eq\_m1
Added estimation results from regress.
Forecast model myfcst1 now contains 1 endogenous variable.

. forecast estimates eq\_mt
Added estimation results from regress.

Forecast model myfcst1 now contains 2 endogenous variables.

### Solve the model

. forecast solve, begin(q(2010q1))

Computing dynamic forecasts for model myfcst1.

```
Starting period:
                      2010q1
Ending period:
                       2011a2
Forecast prefix: f_
2010q1:
2010q2:
            . . . . . . . . . . . . . .
2010q3:
            . . . . . . . . . . . . .
2010q4:
            . . . . . . . . . . . . .
2011q1:
            . . . . . . . . . . . . . .
2011q2:
            . . . . . . . . . . . . . .
Forecast 2 variables spanning 6 periods.
```

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Time Serie

Ex 1: regress Ex 2: TS operators and identities

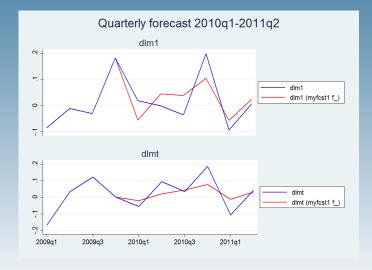
identities Ex 3: VAR -ARIMA

Examples with Panel Data

Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2: Forecast scenarios Ex 4.3: Coefficient

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# Example 1: Time series - OLS regressions



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Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2: Forecast scenarios Fx 4.3:

Questions

# Example 2: Working with time series operators

• Same two models but using first difference operator (D.)

lpib
D1. 1.081708 .1506757 7.18 0.000 .7818536 1.381567
lipcp97
D1. -.3440374 .1829109 -1.88 0.064 -.7080417 .019966

. estimates store eq2\_m1

. regress D.lmt D.ltcpn D.lpib if tin(1989q1,2009q4),noheader vsquish

D.lmt	Coef.	Std. Err.	t	P> t	[95% Conf.	Interval]
ltcpn D1. lpib	1963056	.1439482	-1.36	0.176	4827717	.0901604
D1. _cons	.675093 .0204891	.1495172 .0123684		0.000 0.102	.3775444 0041248	.9726417

. estimates store eq2\_mt

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Questions

# Example 2: Working with time series operators

### • Same two models but using first difference operator (D.)

. regress D.lm1 D.lpib D.lipcp97 if tin(1989q1,2009q4),noheader vsquish

D.lm1	Coef.	Std. Err.	t	P> t	[95% Conf.	Interval]
lpib D1. lipcp97	1.081708	.1506757	7.18	0.000	.7818536	1.381562
D1.	3440374	.1829109	-1.88	0.064	7080417	.0199669
_cons	.0220782	.014986	1.47	0.145	0077448	.0519012

. estimates store eq2\_m1

. regress D.lmt D.ltcpn D.lpib if tin(1989q1,2009q4),noheader vsquish

D.lmt	Coef.	Std. Err.	t	P> t	[95% Conf.	Interval]
ltcpn D1. lpib	1963056	.1439482	-1.36	0.176	4827717	.0901604
D1.	.675093	.1495172	4.52	0.000	.3775444	.9726417
_cons	.0204891	.0123684	1.66	0.102	0041248	.0451029

. estimates store eq2\_mt

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Examples wit Panel Data

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# Example 2: Working with time series operators

### Include name for dependent variable

- . forecast create myfcst2
  Forecast model myfcst2 started.
- . forecast estimates eq2\_m1,names(Dlm1)
  Added estimation results from regress.
  Forecast model myfcst2 now contains 1 endogenous variable.
- . forecast estimates eq2\_mt,names(Dlmt) advise (These estimation results are no longer needed; you can drop them.) Added estimation results from regress. Forecast model myfcst2 now contains 2 endogenous variables.
- Add identities for log-levels
  - forecast identity lm1=L.lm1+Dlm1
    Forecast model mvfcst2 now contains 3 endogenous variables.
  - . forecast identity lmt=L.lmt+Dlmt
    Forecast model myfcst2 now contains 4 endogenous variables.

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# Example 2: Working with time series operators

### Include name for dependent variable

- . forecast create myfcst2
  Forecast model myfcst2 started.
- . forecast estimates eq2\_m1,names(Dlm1)
  Added estimation results from regress.
  Forecast model myfcst2 now contains 1 endogenous variable.
- . forecast estimates eq2\_mt,names(Dlmt) advise
  (These estimation results are no longer needed; you can drop them.)
  Added estimation results from regress.
- Forecast model myfcst2 now contains 2 endogenous variables.

### Add identities for log-levels

- . forecast identity lm1=L.lm1+Dlm1
  Forecast model myfcst2 now contains 3 endogenous variables.
- . forecast identity lmt=L.lmt+Dlmt
  Forecast model myfcst2 now contains 4 endogenous variables.

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## Example 2: Working with time series operators

Add identities for the levels of the dependent variable

Forecast 6 variables spanning 6 periods.

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Ex 4.3: Coefficien

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### Example 2: Working with time series operators

- Add identities for the levels of the dependent variable
  - . forecast identity m1 = exp(lm1)
    Forecast model myfcst2 now contains 5 endogenous variables.
  - . forecast identity mt = exp(lmt)
    Forecast model myfcst2 now contains 6 endogenous variables.

  - . forecast solve, begin(q(2010q1)) prefix(f2\_) Computing dynamic forecasts for model myfcst2.

Starting period: 2010q1 Ending period: 2011q2 Forecast prefix: f2\_

2010q4: ..... 2011q1: ....

2011q2: .....

Forecast 6 variables spanning 6 periods.

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Ex 1: regress Ex 2: TS operators and

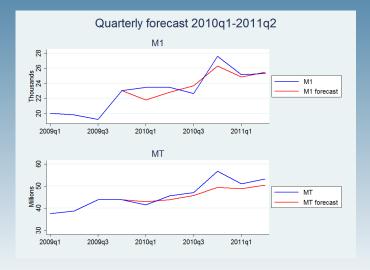
identities Ex 3: VAR -ARIMA

Examples with Panel Data

Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2: Forecast scenarios Ex 4.3:

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# Example 2: Working with time series operators



# Example 3.1: Systems of equations (VAR) and ARIMA

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Ex 1: regress

Fy 3: VAR -ARIMA

Ex 4: Panel data

xtreg xtabond

	dlpib						
	L1.	4349428	.1037079	-4.19		6382065	231679
	dlxt						
	L1.	1074271	.0657059	-1.63	0.102	2362082	.021354
	dlipex	.4569253	.3233219	1.41	0.158	176774	1.090625
dlxt							
	dlpib						
	L1.	.9716131	.1243015	7.82	0.000	.7279866	1.21524
	dlxt						
	T.1 .	- 2507243	.0787533	-3 18	0.001	4050779	- 0963707

dlipex

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Ex 1: regress

Fy 3: VAR -ARIMA

Ex 4: Panel data xtreg xtabond Fy 4 2.

# Example 3.1: Systems of equations (VAR) and ARIMA

. var dlpib dlxt if tin(1989q1,2009q4),lags(1) exog(dlipex) vsquish noconstant Vector autoregression Sample: 1989g3 - 2009g4 No. of obs 82 Log likelihood = 202.7663 AIC = -4.799178FPE .0000282 HOIC -4.728476 = -4.623077

Det(Sigma_ml)	= .0000244			SBIC	
Equation	Parms	RMSE	R-sq	chi2	P>chi2
dlpib	3	.065405	0.1882	19.01206	0.0003
dlxt	3	.078392	0.5244	90.42973	0.0000

.0787533

.3875249

		Coef.	Std. Err.	z	P> z	[95% Conf.	Interval]
dlpib							
	dlpib						
	L1.	4349428	.1037079	-4.19	0.000	6382065	231679
	dlxt						
	L1.	1074271	.0657059	-1.63	0.102	2362082	.021354
	dlipex	.4569253	.3233219	1.41	0.158	176774	1.090625
dlxt							
	dlpib						
	L1.	.9716131	.1243015	7.82	0.000	.7279866	1.21524
	dlxt						

-.2507243

T.1.

dlipex

-3.18

1.19

0.001

0.233

-.0963707

1.221756

-.4050779

-.2973142

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Examples wit Time Series

Ex 1: regress Ex 2: TS operators and identities Ex 3: VAR -ARIMA

Examples wit Panel Data

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Questions?

## Example 3.1: Systems of equations (VAR) and ARIMA

. arima dlipex if tin(1989q1,2009q4),arima(4,0,0) nolog vsquish

ARIMA regression

Sample: 1989q1 - 2009q4

Log likelihood = 295.3648

Number of obs = 84 Wald chi2(4) = 829.23 Prob > chi2 = 0.0000

_						
		OPG				
dlipex	Coef.	Std. Err.	Z	P> z	[95% Conf.	Interval]
dlipex						
_cons	.0041001	.0048688	0.84	0.400	0054427	.0136428
ARMA						
ar						
L1.	1.969244	.1136402	17.33	0.000	1.746513	2.191975
L2.	-1.922958	.1900391	-10.12	0.000	-2.295428	-1.550489
L3.	1.053276	.1576608	6.68	0.000	.7442666	1.362286
L4.	2896628	.0892802	-3.24	0.001	4646488	1146769
/sigma	.0070179	.0004398	15.96	0.000	.0061559	.0078799

Note: The test of the variance against zero is one sided, and the two-sided confidence interval is truncated at zero.

. estimates store eq\_ar1

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Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2: Forecast scenarios

Ex 4.3: Coefficient

Questions

# Example 3.1: Systems of equations (VAR) and ARIMA

### Create and solve the model

- . forecast create myfcst3
  Forecast model myfcst3 started.
- . forecast estimates eq\_var
  Added estimation results from var.
  Forecast model myfcst3 now contains 2 endogenous variables.
- . forecast estimates eq\_ar1

Added estimation results from arima.

Forecast model myfcst3 now contains 3 endogenous variables.

.

. forecast solve, begin(tq(2010q1)) prefix(f3\_)

Computing dynamic forecasts for model myfcst3.

Starting period: 2010q1 Ending period: 2011q2 Forecast prefix: f3\_ 2010q1: .....

2011q1: .....

2011q2: .....

Forecast 3 variables spanning 6 periods.

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Ex 1: regress Ex 2: TS

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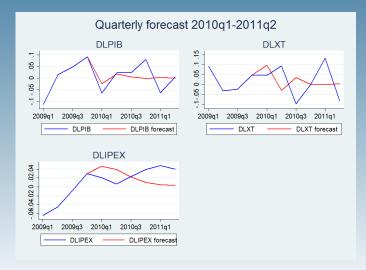
Ex 3: VAF ARIMA

Examples wit Panel Data

Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2: Forecast scenarios Ex 4.3:

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# Example 3.1: Systems of equations (VAR) and ARIMA



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Ex 3: VAR -ARIMA

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Questions?

# Example 3.2: Simulations

Solve model (dlpib, dlxt, dlipex) including simulations

• Compute limits for confidence intervals

```
foreach x of varlist dlpib dlxt dlipex {
2.          quietly gen fs_`x´_ul = fs_`x´ + invnormal(0.975)*sd_`x´
3.          quietly gen fs_`x´_ll = fs_`x´ + invnormal(0.025)*sd_`x´
4. }
```

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Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2: Forecast scenarios

Questions?

## Example 3.2: Simulations

Solve model (dlpib, dlxt, dlipex) including simulations

• Compute limits for confidence intervals

```
foreach x of varlist dlpib dlxt dlipex {
2.          quietly gen fs_`x´_ul = fs_`x´ + invnormal(0.975)*sd_`x´
3.          quietly gen fs_`x´_ll = fs_`x´ + invnormal(0.025)*sd_`x´
4. }
```

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Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2: Forecast scenarios

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### Example 3.2: Simulations

Solve model (dlpib, dlxt, dlipex) including simulations

Compute limits for confidence intervals

```
foreach x of varlist dlpib dlxt dlipex {
2.         quietly gen fs_`x´_ul = fs_`x´ + invnormal(0.975)*sd_`x´
3.         quietly gen fs_`x´_ll = fs_`x´ + invnormal(0.025)*sd_`x´
4. }
```

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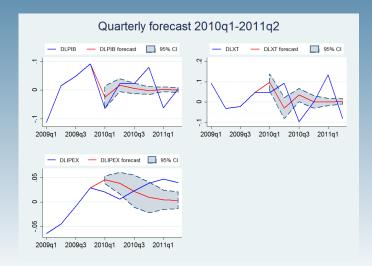
Examples wit

Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2: Forecast scenarios Ex 4.3:

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# Example 3.2: Simulations

### Confidence intervals based on simulations



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# Examples with Panel Data

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# Examples with Panel Data

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## Examples with Panel data

Model for aggregate consumption

$$\textit{consumo}_{\textit{it}} = \alpha + \textit{pib}_{\textit{it}} * \beta_1 + \textit{pib}_{\textit{it}-1} * \beta_2 + \textit{irate}_{\textit{it}} * \beta_3 + \mu_{\textit{i}} + \nu_{\textit{it}}$$

### Data

World Bank public online data on:

consumo: Final consumption expenditure (Y2000=100) pib: Gross domestic product (Y2000=100) irate deposit interest rate

- Period: 2000-2010 for 112-116 countries :
- Source:http://databank.worldbank.org/data/Home.aspx

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Questions?

## Examples with Panel data

Model for aggregate consumption

$$consumo_{it} = \alpha + pib_{it} * \beta_1 + pib_{it-1} * \beta_2 + irate_{it} * \beta_3 + \mu_i + \nu_{it}$$

### Data

World Bank public online data on:

consumo: Final consumption expenditure (Y2000=100) pib: Gross domestic product (Y2000=100) irate deposit interest rate

- Period: 2000-2010 for 112-116 countries :
- Source:http://databank.worldbank.org/data/Home.aspx

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### Panel Data

Ex 4: Panel data Ex 4.1: xtreg xtabond Ex 4.2:

Forecast scenarios Ex 4.3: Coefficient

Questions

# Example 4.1: xtreg xtabond

### Fixed effects model for consumption

. xtreg lconsumo L(0/1).lpib lirate if year<2007,fe vsquish

corr(u\_i, Xb) = 0.7688

F(3,535) = 610.19Prob > F = 0.0000

lpib  L1. lirate _cons	.7191382 .1410591 0138219 3.137966	.0751612 .0815228 .0052345 .5386802	9.57 1.73 -2.64 5.83	0.000 0.084 0.009 0.000	.571491 0190849 0241045 2.079778	.8667855 .301203 0035393 4.196153
sigma_u sigma_e rho	.2614921 .05014561 .96452975	(fraction	of varia	nce due t	:o u_i)	

F test that all u\_i=0:

F(115, 535) = 55.0

Prob > F = 0.0000

. estimates store eq\_con

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Ex 1: regress

Fx 3: VAR -

Fx 4: Panel data Ex 4.1: xtreg xtabond Fy 4 2.

## Example 4.1: xtreg xtabond

### Fixed effects model for consumption

. xtreg lconsumo L(0/1).lpib lirate if year<2007, fe vsquish

Fixed-effects (within) regression Number of obs 654 Group variable: country Number of groups 116

R-sq: within = 0.7738Obs per group: min = between = 0.9935avg = 5.6 overall = 0.9924max =

F(3.535)

Prob > F  $corr(u_i, Xb) = 0.7688$ 0.0000

-	lconsumo	Coef.	Std. Err.	t	P> t	[95% Conf.	. Interval]
	lpib						
		.7191382	.0751612	9.57	0.000	.571491	.8667855
	L1.	.1410591	.0815228	1.73	0.084	0190849	.301203
	lirate	0138219	.0052345	-2.64	0.009	0241045	0035393
	_cons	3.137966	.5386802	5.83	0.000	2.079778	4.196153
_	sigma_u	.2614921					
	sigma_e	.05014561					
	rho	.96452975	6 (fraction of variance due to u_i)				

F test that all u i=0:

F(115, 535) =55.01 Prob > F = 0.0000

6

610.19

. estimates store eq\_con

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Ex 1: regress

Fy 3: VAR -

Fy 4: Panel data Fx 4.1: xtreg xtabond Fy 4 2.

## Example 4.1: xtreg xtabond

### Dynamic model for GDP

. xtabond lpib trend if year<2007, lags(1) vsquish

17

Arellano-Bond dynamic panel-data estimation Group variable: country

Time variable: vear

Number of instruments =

Number of obs 538 Number of groups 115

Obs per group:

min =

avg = 4.678261 max =

Wald chi2(2) Prob > chi2

7682.64

0.0000

One-step results

lpib	Coef.	Std. Err.	z	P> z	[95% Conf.	Interval]
lpib L1.	.8500304	.038387	22.14	0.000	.7747932	.9252675
trend	.0125958	.0017827	7.07	0.000	.0091019	.0160897
_cons	3.549008	.9035604	3.93	0.000	1.778062	5.319954

Instruments for differenced equation

GMM-type: L(2/.).lpib Standard: D.trend

Instruments for level equation

Standard: \_cons

. estimates store eq\_lpib

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## Example 4.1: xtreg xtabond

### Dynamic model for interest rate

. xtabond lirate if year<2007,lags(2) vsquish

Arellano-Bond dynamic panel-data estimation Number of obs = 423 Group variable: country Number of groups = 112

Time variable: year

Obs per group: min = 1 avg = 3.776786

Number of instruments = 15 Wald chi2(2) = 211.5

One-step results

Wald chi2(2) = 211.52 Prob > chi2 = 0.0000

lirate	Coef.	Std. Err.	z	P> z	[95% Conf.	Interval]
lirate						
L1.	.8837478	.0643112	13.74	0.000	.7577002	1.009795
L2.	4333317	.044075	-9.83	0.000	519717	3469463
_cons	.8355917	.099475	8.40	0.000	.6406244	1.030559

Instruments for differenced equation GMM-type: L(2/.).lirate

Instruments for level equation Standard: cons

. estimates store eq\_lirate

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### Example 4.1: xtreg xtabond

### Create and solve the model

- . quietly forecast create  ${\tt xtfcst}$
- . quietly forecast estimates eq\_con
- . forecast estimates eq\_lpib

forecast will use the default type of prediction for xtabond. Verify this is appropriate; see xtabond postestimation. Use the predict() option with forecast estimates to override the default.

Added estimation results from xtabond.
Forecast model xtfcst now contains 2 endogenous variables.

forecast estimates eq\_lirate

forecast will use the default type of prediction for xtabond. Verify this is appropriate; see xtabond postestimation. Use the predict() option with forecast estimates to override the default.

Added estimation results from xtabond

Forecast model xtfcst now contains 3 endogenous variables.

. capture noisily forecast solve must have strongly balanced panel data

### Oops! Unbalanced panels... Use tsfill

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#### Create and solve the model

- . quietly forecast create  ${\tt xtfcst}$
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# Example 4.1: xtreg xtabond

#### Create and solve the model

- . quietly forecast create  ${\tt xtfcst}$
- . quietly forecast estimates eq\_con
- . forecast estimates eq\_lpib

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### Example 4.1: xtreg xtabond

#### Create and solve the model

- . quietly forecast create  ${\tt xtfcst}$
- . quietly forecast estimates eq\_con
- . forecast estimates eq\_lpib  $\,$

forecast will use the default type of prediction for xtabond. Verify this is appropriate; see xtabond postestimation. Use the predict() option with forecast estimates to override the default.

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Added estimation results from xtabond.

Forecast model xtfcst now contains 3 endogenous variables.

. capture noisily forecast solve must have strongly balanced panel data

#### Oops! Unbalanced panels... Use tsfill

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# Example 4.1: xtreg xtabond

#### Create and solve the model

. tsfill,full

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```
Starting period: 200°
Ending period: 200°
Number of panels: 117
Forecast prefix: f_
Solving panel 1
Solving panel 2
Solving panel 3
Solving panel 4
Solving panel 5
Solving panel 6
```

missing values encountered

Missing values were encountered while attempting to solve the model at time 2009 in panel 18. Variable lpib evaluates to missing.

Oops! missing data... Drop panels with missing data

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# Example 4.1: xtreg xtabond

#### Create and solve the model

. tsfill,full

. capture noisily forecast solve, begin(2007) end(2009)

Computing dynamic forecasts for model xtfcst.

Starting period: 2007 Ending period: 2009 Number of panels: 117 Forecast prefix: f\_

Solving panel 1

Solving panel 2 Solving panel 3

Solving panel 3

Solving panel 5

Solving panel 6

Solving panel 7 Solving panel 8

Solving panel 9

missing values encountered

Missing values were encountered while attempting to solve the model at time 2009 in panel 18. Variable lpib evaluates to missing.

# Oops! missing data... Drop panels with missing data

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# Example 4.1: xtreg xtabond

# Keep panels with full (required) data for forecast period

- . /\* Balanced panels for forecasting period
  > egen nomiss=rownonmiss(lconsumo lpib lirate)
- $\hspace{0.5cm}>\hspace{0.5cm}$  by country: generate mycount=nomiss==3 if year>=2005
- > keep if mycount==1
- > xtset country year
- > keep country year consumo pib irate lconsumo lpib lirate trend
- > by country:keep if \_N==6
- > xtset country year
- > \*/
- . forecast solve, begin(2007) end(2010) log(off)

Computing dynamic forecasts for model xtfcst.

Starting period: 2007
Ending period: 2010
Number of panels: 78
Forecast prefix: f\_

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Questions?

### Example 4.1: xtreg xtabond

# Keep panels with full (required) data for forecast period

- . /\* Balanced panels for forecasting period
  > egen nomiss=rownonmiss(lconsumo lpib lirate)
- > by country: generate mycount=nomiss==3 if year>=2005
  - > keep if mycount==1
- > xtset country year
- > keep country year consumo pib irate lconsumo lpib lirate trend
- > by country:keep if \_N==6
- > xtset country year
- > \*/
- . forecast solve, begin(2007) end(2010) log(off) Computing dynamic forecasts for model xtfcst.

Starting period: 2007 Ending period: 2010 Number of panels: 78

Number of panels: 78 Forecast prefix: f\_

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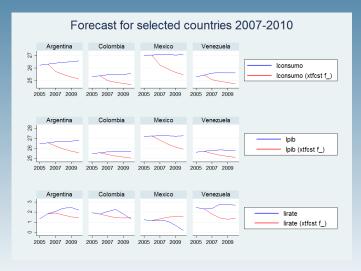
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# Example 4.1: xtreg xtabond



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# Example 4.2: Panel Data - Forecast scenarios

Scenarios for GDP (PIB) and interest rate

```
Ending period:
Forecast prefix: fa_
```

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# Example 4.2: Panel Data - Forecast scenarios

#### Scenarios for GDP (PIB) and interest rate

```
. forecast adjust lpib = ln(pib*1.2) if tin(2007,2008) ///

> & (country==146 | country==241)

Endogenous variable lpib now has 1 adjustment.
. forecast adjust lpib = ln(pib*.8) if tin(2007,2008) ///

> & (country==9 | country==44)

Endogenous variable lpib now has 2 adjustments.
```

```
forecast solve, begin(2007) end(2010) log(off) prefix(fa_)
```

```
Starting period: 2007
Ending period: 2010
Number of panels: 78
Forecast prefix: fa_
```

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### Example 4.2: Panel Data - Forecast scenarios

#### Scenarios for GDP (PIB) and interest rate

```
. forecast adjust lpib = ln(pib*1.2) if tin(2007,2008) ///
> & (country==146 | country==241)
Endogenous variable lpib now has 1 adjustment.
. forecast adjust lpib = ln(pib*.8) if tin(2007.2008) ///
```

. forecast adjust lpib = ln(pib\*.8) if tin(2007,2008) ///
> & (country==9 | country==44)

Endogenous variable lpib now has 2 adjustments.

```
. forecast adjust lirate = ln(irate-3) if tin(2007,2010) //,
> & (country==9 | country==44 | country==241)
```

Endogenous variable lirate now has 1 adjustment.

. forecast adjust lirate = ln(irate-1) if tin(2007,2010) ///

% country==146

Endogenous variable lirate now has 2 adjustments.

. forecast solve, begin(2007) end(2010) log(off) prefix(fa\_) Computing dynamic forecasts for model xtfcst.

Starting period: 2007 Ending period: 2010 Number of panels: 78 Forecast prefix: fa\_

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Examples wit Panel Data

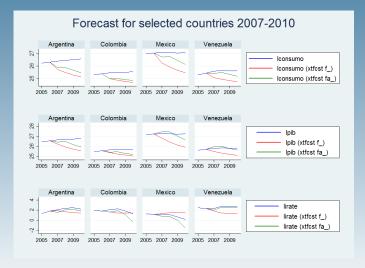
Ex 4: Panel data Ex 4.1: xtreg xtabond

Ex 4.2: Forecast scenarios

Ex 4.3: Coefficien

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# Example 4.2: Panel Data - Forecast scenarios



```
Forecasting
tools in Stata
```

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### Example 4.3: Panel Data - Coefficient Vector

#### Coefficient vector for lincome

```
. matrix lincome = (.96, -.06, 2.6)
. matrix coleq lincome = lincome:L.lincome
                                                    111
                           lincome:L2.lincome
                           lincome: cons
>
. matrix list lincome
lincome[1,3]
     lincome:
               lincome:
                          lincome:
                     1.2.
           L.
     lincome
               lincome
                            cons
         .96
                   -.06
                              2.6
r1
```

. forecast coefvector lincome

Forecast model xtfcst now contains 4 endogenous variables.

. forecast solve, begin(2007) end(2010) prefix(fcv\_) log(off)
Computing dynamic forecasts for model xtfcst.

```
Starting period: 2007
Ending period: 2010
Number of panels: 74
Forecast prefix: fcv_
```

```
Forecasting tools in Stata
```

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Ex 4.3: Coefficient Vector

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### Example 4.3: Panel Data - Coefficient Vector

#### Coefficient vector for lincome

```
. matrix lincome = (.96, -.06, 2.6)
. matrix coleq lincome = lincome:L.lincome
                                                    111
                           lincome:L2.lincome
                           lincome: cons
>
. matrix list lincome
lincome[1,3]
     lincome:
               lincome:
                          lincome:
                     1.2.
           L.
     lincome
               lincome
                            cons
         .96
                  -.06
                              2.6
r1
```

. forecast coefvector lincome
Forecast model xtfcst now contains 4 endogenous variables.

```
. forecast solve, begin(2007) end(2010) prefix(fcv_) log(off) Computing dynamic forecasts for model xtfcst.
```

```
Starting period: 2007
Ending period: 2010
Number of panels: 74
Forecast prefix: fcv_
Forecast 4 variables spanning 4 periods for 74 panels.
```

```
Forecasting
tools in Stata
```

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### Example 4.3: Panel Data - Coefficient Vector

#### Coefficient vector for lincome

```
. matrix lincome = (.96, -.06, 2.6)
. matrix coleq lincome = lincome:L.lincome
                                                    111
>
                           lincome:L2.lincome
                           lincome: cons
>
. matrix list lincome
lincome[1,3]
     lincome:
               lincome:
                          lincome:
                     1.2.
           L.
     lincome
               lincome
                            cons
         .96
                   -.06
                              2.6
r1
```

- . forecast coefvector lincome
  Forecast model xtfcst now contains 4 endogenous variables.
- . forecast solve, begin(2007) end(2010) prefix(fcv\_) log(off) Computing dynamic forecasts for model xtfcst.

```
Starting period: 2007
Ending period: 2010
Number of panels: 74
Forecast prefix: fcv_
```

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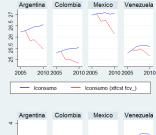
Ex 4.3: Coefficient Vector

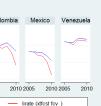
Questions?

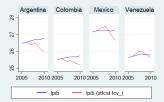
# Example 4.3: Panel Data - Coefficient Vector

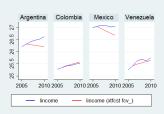
Coefficient vector for lincome

#### Forecast for selected countries 2007-2010









2010 2005

lirate

0

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2005

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