# IST:Likelihood Status of the likelihood code

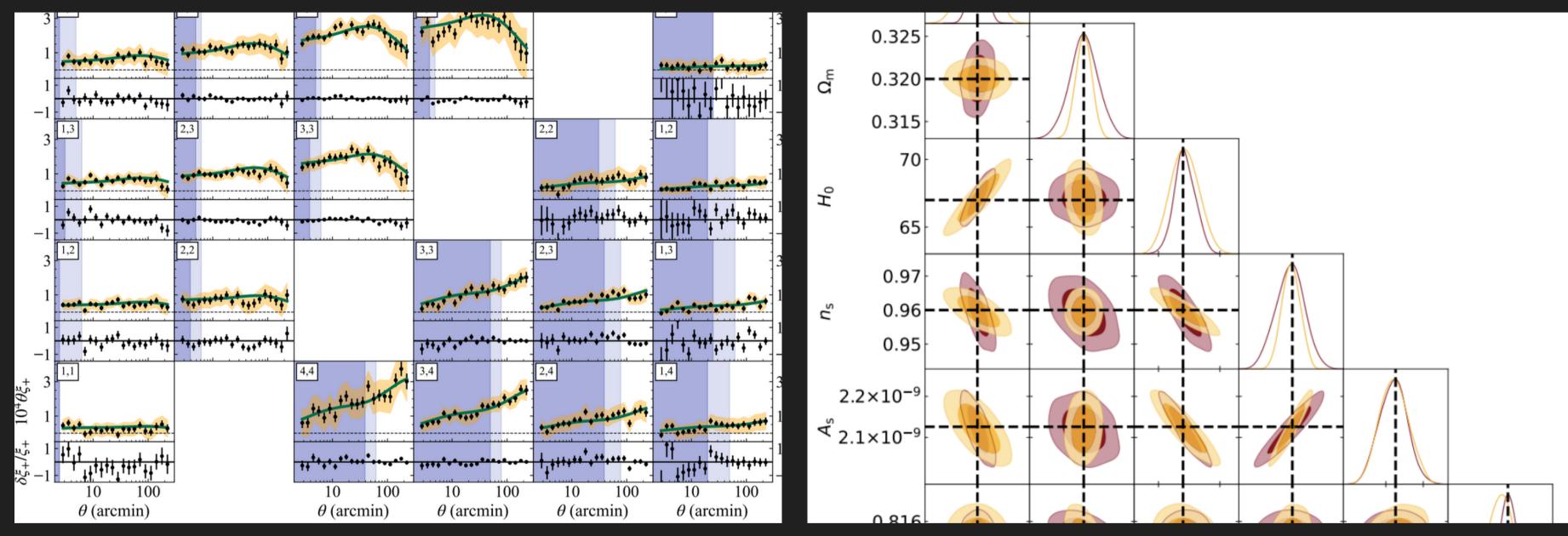
Vincenzo F. Cardone







# From Euclid Data to Constraints why do we need a likelihood code



## Photometric + Spectroscopic Data

- 3x2pt (pseudo Cl and/or 2pCFs and/or COSEBIs)
- GCsp (Legendre multipoles and/or 2pCF)
- beware of systematics

### Constraints on Cosmological Parameters

 dark energy equation of state (FoM > 400) • dark matter properties and initial conditions • General Relativitity vs Modified Gravity

### **Boltzmann Module**

Background quantities

Matter power spectrum

**Theory Module** 

Theoretical predicions for

WL + GCp + XC + GCs

### Data Module

WL + GCp + XC + GCs data

**Covariance matrices** 

Likelihood Module

Theory vs data

┿

Posterior and priors

# What is inside a likelihood code

### Sampling and Analysis

Sampler

Parameters constraints

Model comparison

# IST:Likelihood - Inter SWG Taskforce for Likelihood



A.G. SANCHEZ on behalf of GC - SWG (up to 04/2021) S. JOUDAKI on behalf of GC – SWG (from to 04/2021) V. PETTORINO on behalf of Theory - SWG V.F. CARDONE on behalf of WL - SWG

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# Team Fusion



Reviewer

#### Isaac Tutusaus



#### Reviewer

#### Ziad Skar



**NL Expert** 

Guido D'Amico



### Computational Scientist Consultant

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WL Expert	GC Expert	Th Expert
Virginia Ajani	Domenico Sapone	Stéphane Ilic

# Team Fission



Reviewer

#### Linda Blot



Reviewer

#### Santiago Casas



**NL Expert** 

Guido D'Amico



### Computational Scientist Consultant

# **CLOE:** Cosmology Likelihood of Observables in Euclid CONCEPT RECIPE

- structure the code in modular blocks
- individuate what is needed for each
- interact with people providing input
- close connection with nonlinear part
- interface with other SWGs codes
  - DATASET

- which observables must be considered
- how to go from theory to observables
- how to account for systematics
- what are the input quantities
- what are the output quantities

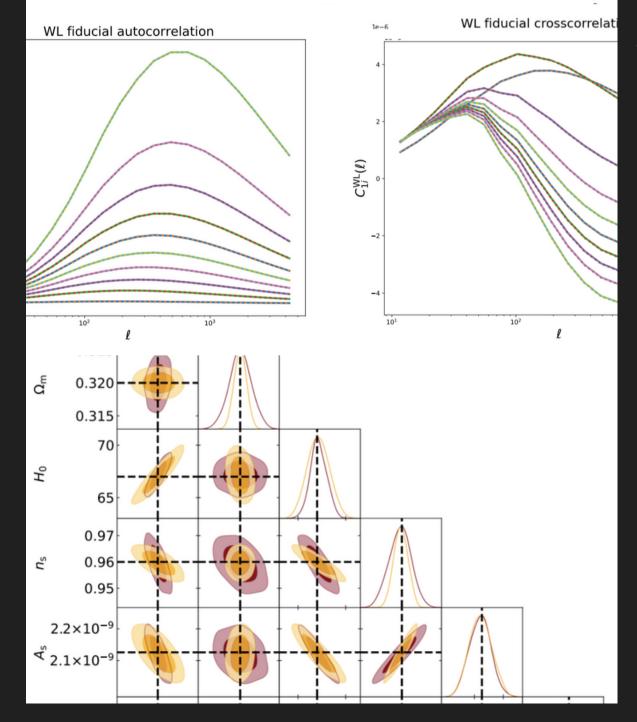
- 3x2pt
  - 2pCF and COSEBIs
  - Pseudo Cl and band powers
- GCsp
  - Legendre multipoles

- covariance matrix as external input
- (see C. Giocoli talk)
- different likelihood expressions
  - Gaussian vs non Gaussian
  - depending on the covariance

# LIKELIHOOD

# CLOE v1.0 delivered to EC on May 2021

$$\begin{split} C_{ij}^{\gamma}(\ell) &= \int_{0}^{2\pi} \frac{H(z)f_{K}^{2}[r(z)]}{H(z)f_{K}^{2}[r(z)]} P_{mm}(k_{\ell}, z)dz \\ C_{ij}^{\gamma I}(\ell) &= \int_{0}^{2\pi} \frac{W_{i}^{\gamma}(\ell, z)W_{j}^{IA}(\ell, z) + W_{j}^{\gamma}(\ell, z)W_{i}^{IA}(\ell, z)}{H(z)f_{K}^{2}[r(z)]} P_{II}(k_{\ell}, z)dz \\ C_{ij}^{II}(\ell) &= \int_{0}^{2\pi} \frac{W_{i}^{IA}(\ell, z)W_{j}^{IA}(\ell, z)}{H(z)f_{K}^{2}[r(z)]} P_{II}(k_{\ell}, z)dz \\ C_{ij}^{\gamma,RSB}(\ell) &= \frac{(\ell+2)!}{(\ell-2)!} \frac{\ell(\ell+1)}{(\ell+1/2)^{6}} \\ &\times \int \frac{d^{2}\ell'}{(2\pi)^{2}} \cos(2\phi_{\ell'} - 2\phi_{\ell}) \\ &\times & \Big\{ [2(1+\alpha_{i}^{eff}(z)]B_{iij}^{\kappa\kappa\kappa}(\ell,\ell',-\ell-\ell')] \Big\} \end{split}$$



## RECIPE

- linear matter power spectrum
- eNLA model for IA
- Gaussian only covariance
- Gaussian likelihood

### VALIDATION

- comparison against benchmark for
  - 3x2pt auto and cross spectra
  - Legendre multipoles
- speed test and profiling

## MCMC TEST

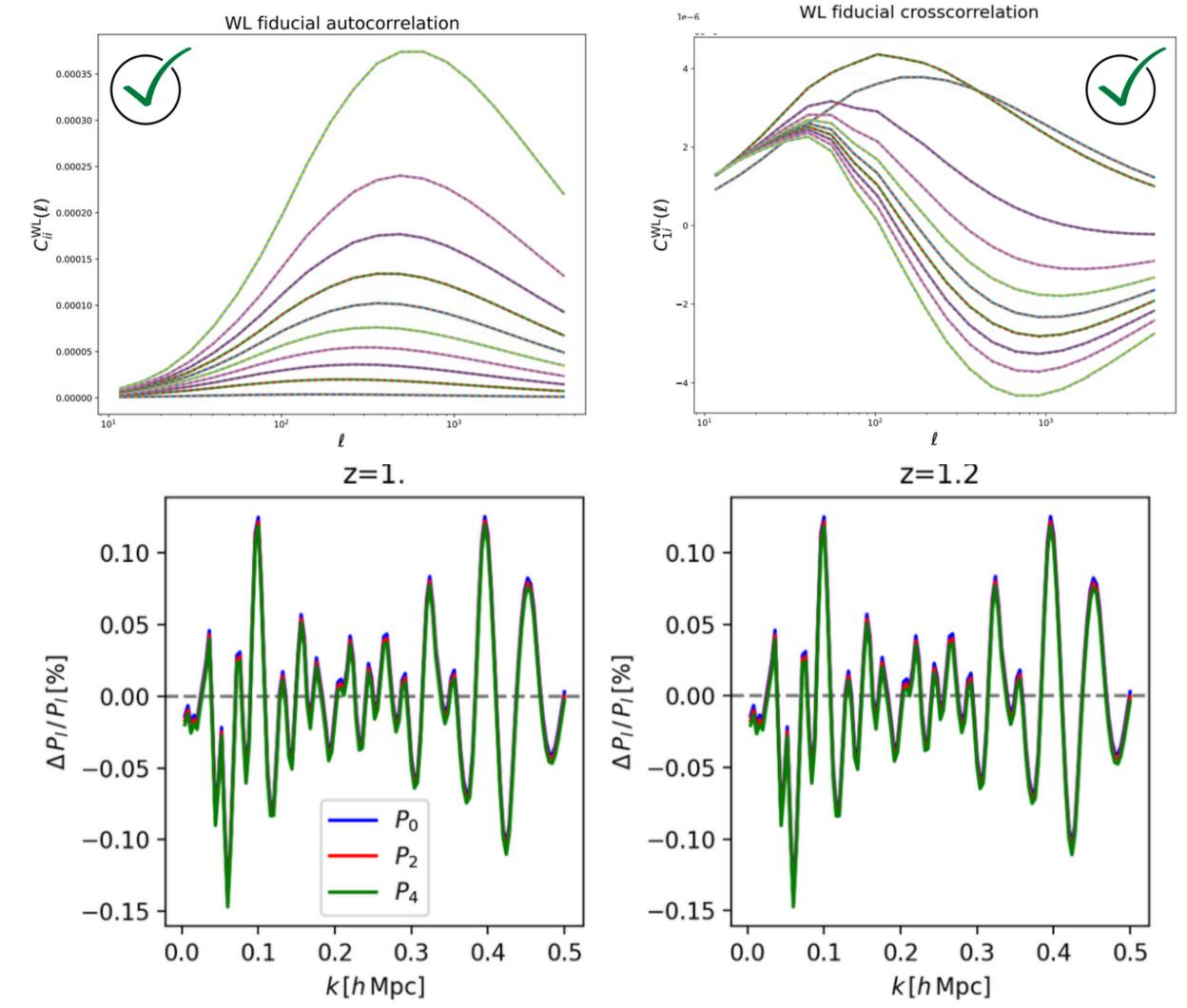
- observables
  - WL + GCph spectra
  - Legendre multipoles
- recovering input cosmology

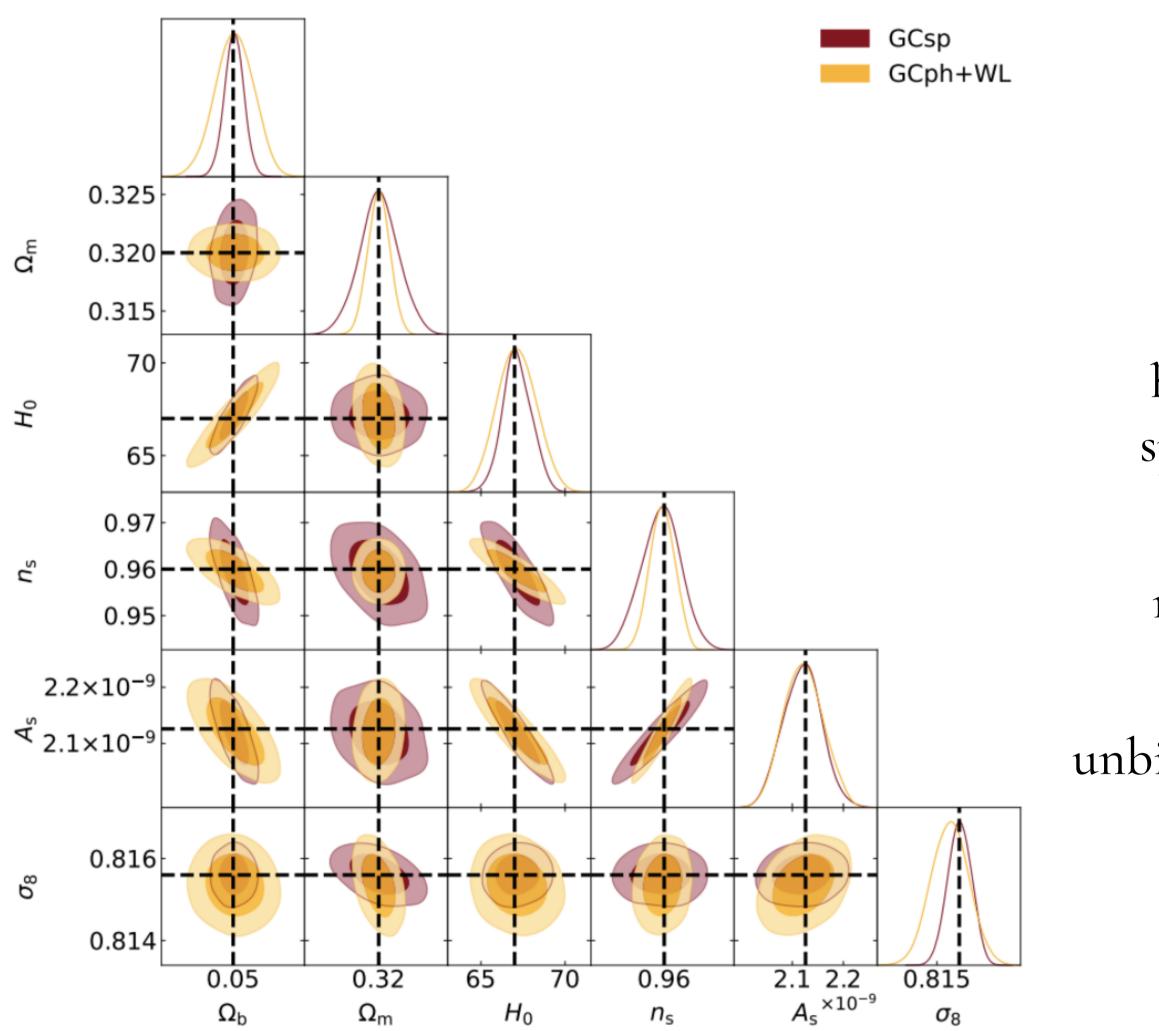
## PHOTOMETRIC

rely on external benchmarks WL within 0.2 - 1% GCph within 1 - 2% WL x GCph within 1 - 2%

### **SPECTROSCOPIC**

rely on external benchmarks GCsp within 0.1% (slower than 3x2pt)





# MCMC TEST

photometric probes only spectroscopic probes only WL + GCph + GCsp mock data with no noise Gaussian covariance unbiased estimate of parameters



### NEW USER INTERFACE



- run as executable and interactively
- use command line arguments
- read yaml files with settings
- interface with CAMB/CLASS
- embedded in Cobaya

# CLOE VI.I



### INTERFACE WITH IST:NL

- added nonlinear flags
- HaloFit and HMCode from Cobaya
- boost factors from emulators
- defined nuisance parameters files
- skipping CAMB for liner if needed

## MASKING VECTOR

- composed by 1s and os
- mapping with the data vector
- first choose which probes to be used
- scale cuts in separate yaml files
- cut data vector and covariance

### CODE OPTIMIZATION

- continuous integration
- revised unit tests
- updated API documentation
- fixed bugs in v1.0
- recoded some parts for speeding up

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WL Expert	GC Expert	Th Expert	
Virginia Ajani	Domenico Sapone	Stéphane Ilic	

# A - Team



Reviewer

Konstantinos Tanidis



Reviewer

Ziad Skar



Developer

Linda Blot



Computational Scientist Consultant

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# Mare Nostrum Team



Reviewer

#### Marco Bonici



Reviewer

Isaac Tutusaus

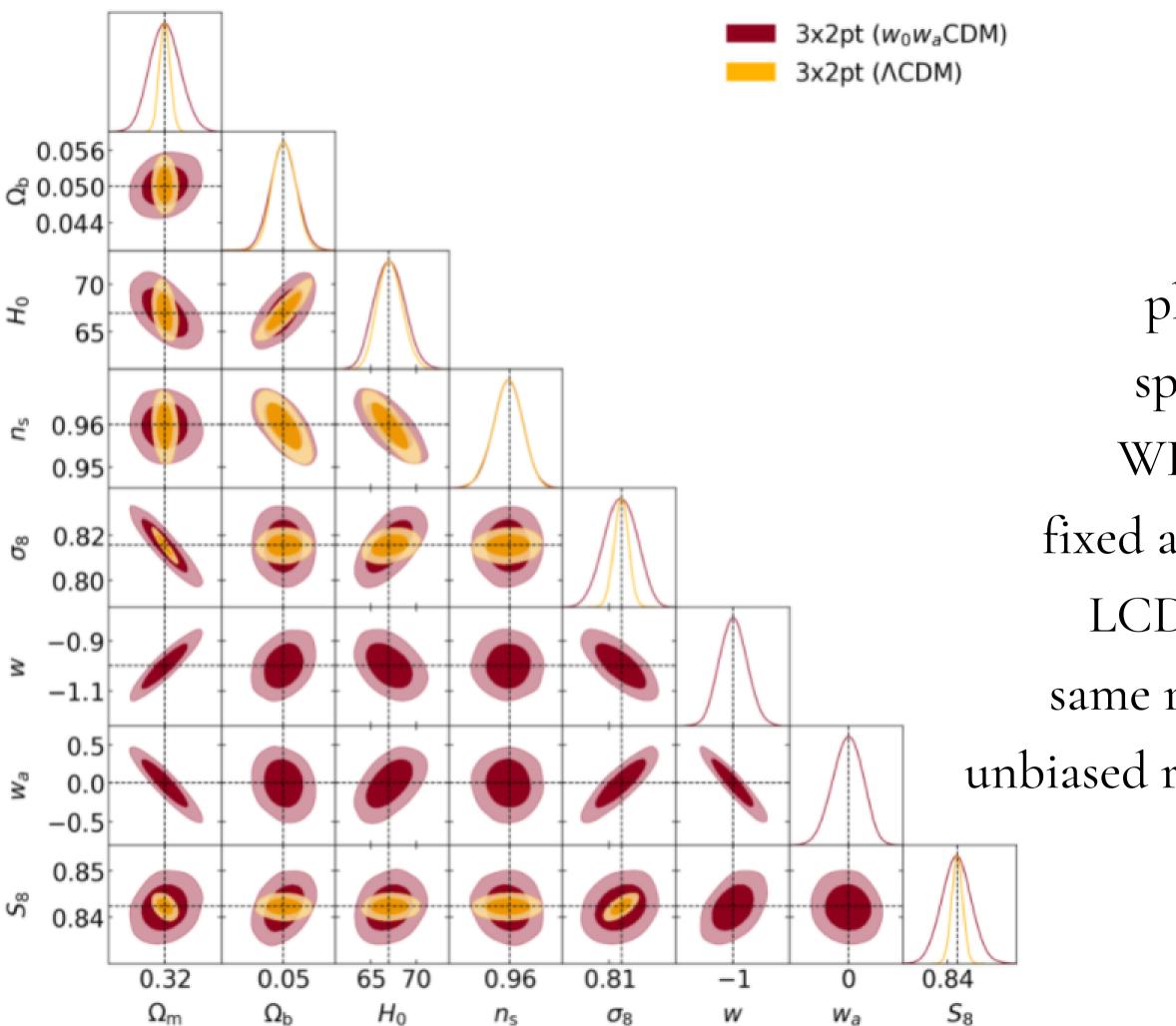


Developer

Amandine Le Brun



### Computational Scientist Consultant



# MCMC TEST

photometric probes only spectroscopic probes only WL + GCph + GGL + GCsp fixed and free nuisance parameters LCDM and wowaCDM model same recipe and covariance as v1.0 unbiased recovery of the input parameters

# From VI.I to V2.0

- include magnification bias into GCph and GGL
- move to nonlinear recipe and improved IA modelling
- allow for different n(z) for lens and source samples
- include multiplicative shear and photo z systematics

# MORE REALISTIC OBSERVABLES

- 2pCFs in configuration space
- Pseudo Cl in harmonic space
- n(z) from OU-PHZ group
- Gaussian + Super Sample Covariance
- scale cuts to avoid bias from baryon contamination

- adopt SPV3 specifics for both photo and spec probes
- MCMC based forecasts for standard models (by IST:L)

UPDATED RECIPE FOR PHOTOMETRIC PROBES • account for Redsfhift Space Distortion in GCph and GGL

TO BE USED FOR SPV3 AND KEY PROJECTS • MCMC based forecasts for extended models (by other SWGs)

# From VI.I to V2.0

## UPDATED RECIPE FOR PHOTOMETRIC PROBES

- non flat models
- magnification bias
- redshift space distortion
- shear multiplicative bias
- photo z systematics

# MORE REALISTIC OBSERVABLES

- 2pCFs in configuration space for 3x2pt
- Pseudo Cl in harmonic space
- GCsp 2pCF in redshift space
- Gaussian + Super Sample Covariance
- scale cuts to avoid bias from baryon contamination

## TO BE USED FOR SPV3 AND KEY PROJECTS • adopt SPV3 specifics for both photo and spec probes • MCMC based forecasts for standard models (by IST:L) • MCMC based forecasts for extended models (by other SWGs)

# The Importance of Choosing the Right Likelihood Code



Disclaimer: no money has been given to the speaker for the advertising the shop mentioned in the picture

# Scegli la porta giusta.

Scegli Messere Porte. Qualità italiana al giusto prezzo, senza brutte sorprese.

# **CLOE** | €180 + IVA