

# CLSA Webinar Series



## Anticipating new weights in the CLSA: Unpacking sampling weights and their use

Lauren Griffith, PhD, CLSA, McMaster University

**12 pm to 1 pm ET | October 27, 2020**

It is standard practice in surveys to use sampling weights, however, when surveys involve complex sampling, individuals in selected populations might not have equal probabilities of participation. Participants in the Canadian Longitudinal Study on Aging (CLSA) are assigned sample weights based on their inclusion probability. Essentially, the inflation weight provided with CLSA data tells a researcher how many people the participant represents in the target population. The use of weights can be complex, and the method of calculation might seem opaque to researchers. This webinar will present an overview of weight calculations in anticipation of new weights in the CLSA and aim to unpack the complexities of sampling weights and how they are implemented in the CLSA Tracking and Comprehensive cohorts.

Dr. Lauren Griffith is an associate scientific director and Hamilton site lead of the Canadian Longitudinal Study on Aging. She is an associate professor in the Department of Health Research Methods, Evidence, and Impact at McMaster University. Her research interests include physical functioning, injury and aging as well as the harmonization of longitudinal data.

Webinars will be broadcast using WebEx.  
Further instructions will be sent by email.

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**[clsa-elcv.ca/  
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# Land Acknowledgement

The National Coordinating Centre of the Canadian Longitudinal Study on Aging (CLSA) is located on the traditional territories of the Mississauga and Haudenosaunee Nations, and within the lands protected by the Dish With One Spoon wampum agreement.

The CLSA Data Curation Centre (DCC) located at the Research Institute of the McGill University Health Centre is situated on the traditional territory of the Kanien'kehà:ka known as the Mohawk people, and is a place which has long served as a site of meeting and exchange amongst nations.

As attendees of this webinar, we want to acknowledge the original inhabitants of the land where we currently have the privilege to research, live and work, wherever that may be.

# Anticipating new weights in the CLSA: Unpacking sampling weights and their use

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*on behalf of the CLSA Research Team*

**CLSA Webinar Series  
Oct. 27, 2020**

# Acknowledgement

- Dr. Mary Thompson, Dr. Changbao Wu, Dr. Harry Shannon, Dr. Nazmul Sohel, Dr. Urun Erbas Oz, Dr. Hon Yiu (Henry) So

# Webinar Outline

- Why do we use sampling weights?
- CLSA sampling and use of sampling weights
- Why do we need new sampling weights?
- How do the original weights and the new weights differ?
- When will the new weights be available?
- What is coming next?

# Webinar Outline

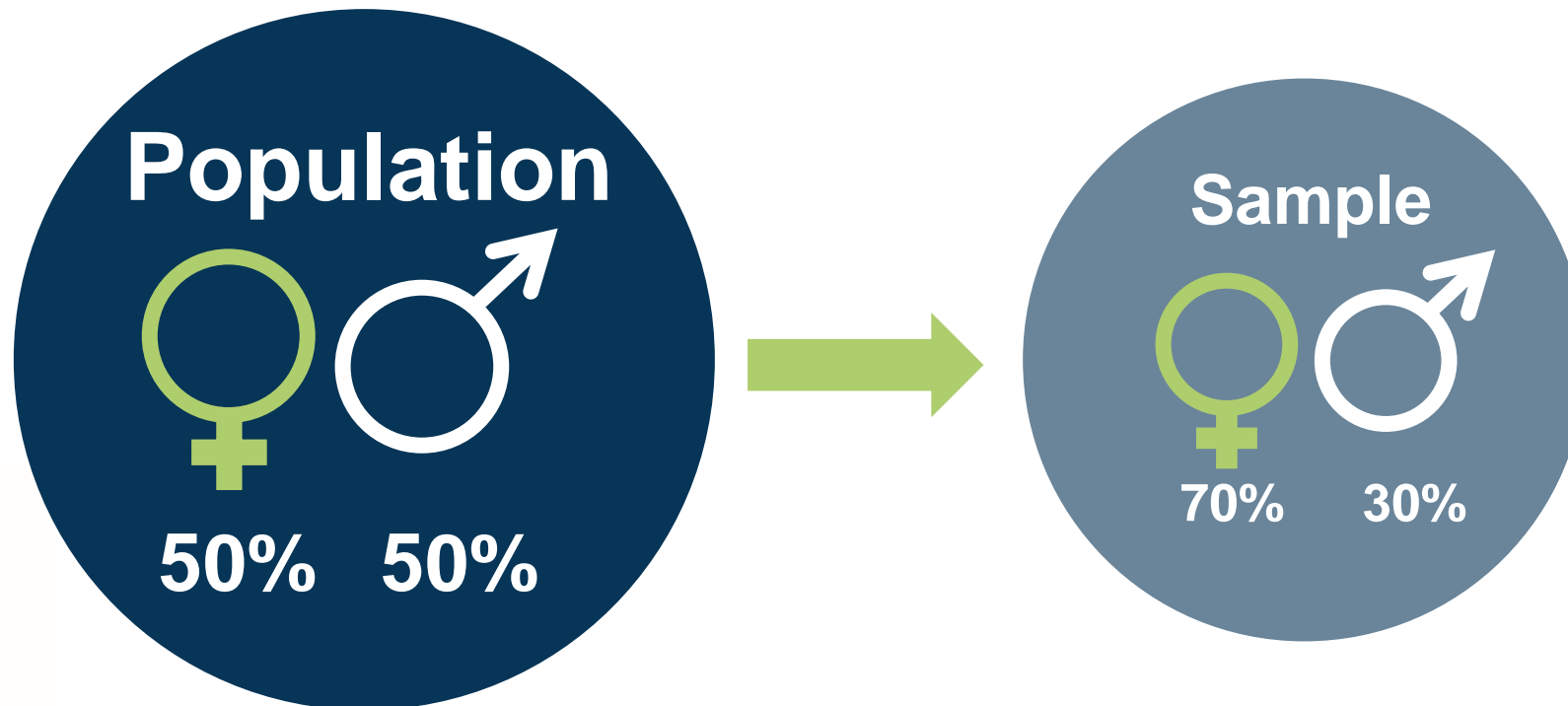
- What will not be included:
  - Technical guidance on the use of sampling weights

# Why do we use sampling weights?

We want to generalize from the sample to the population, but the sample is almost never fully representative

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Let's assume for example:



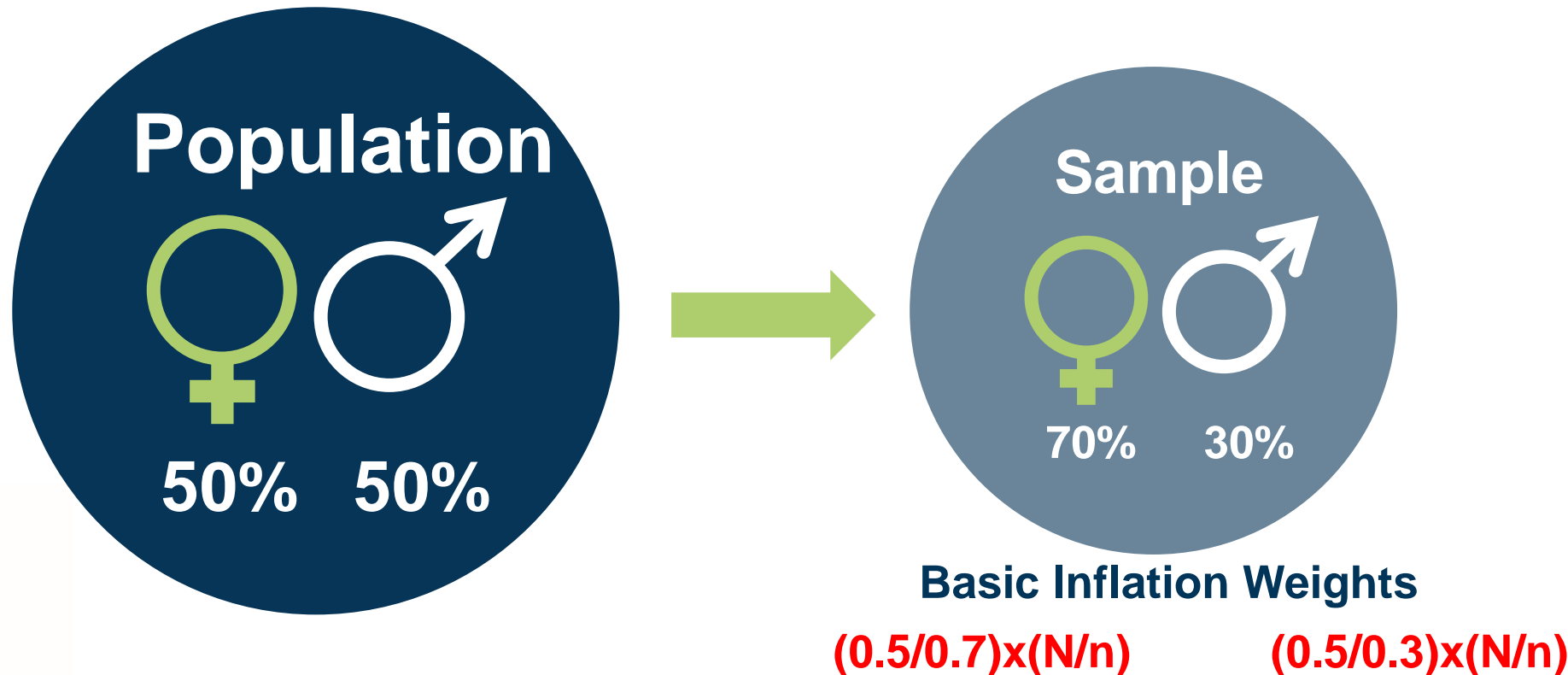


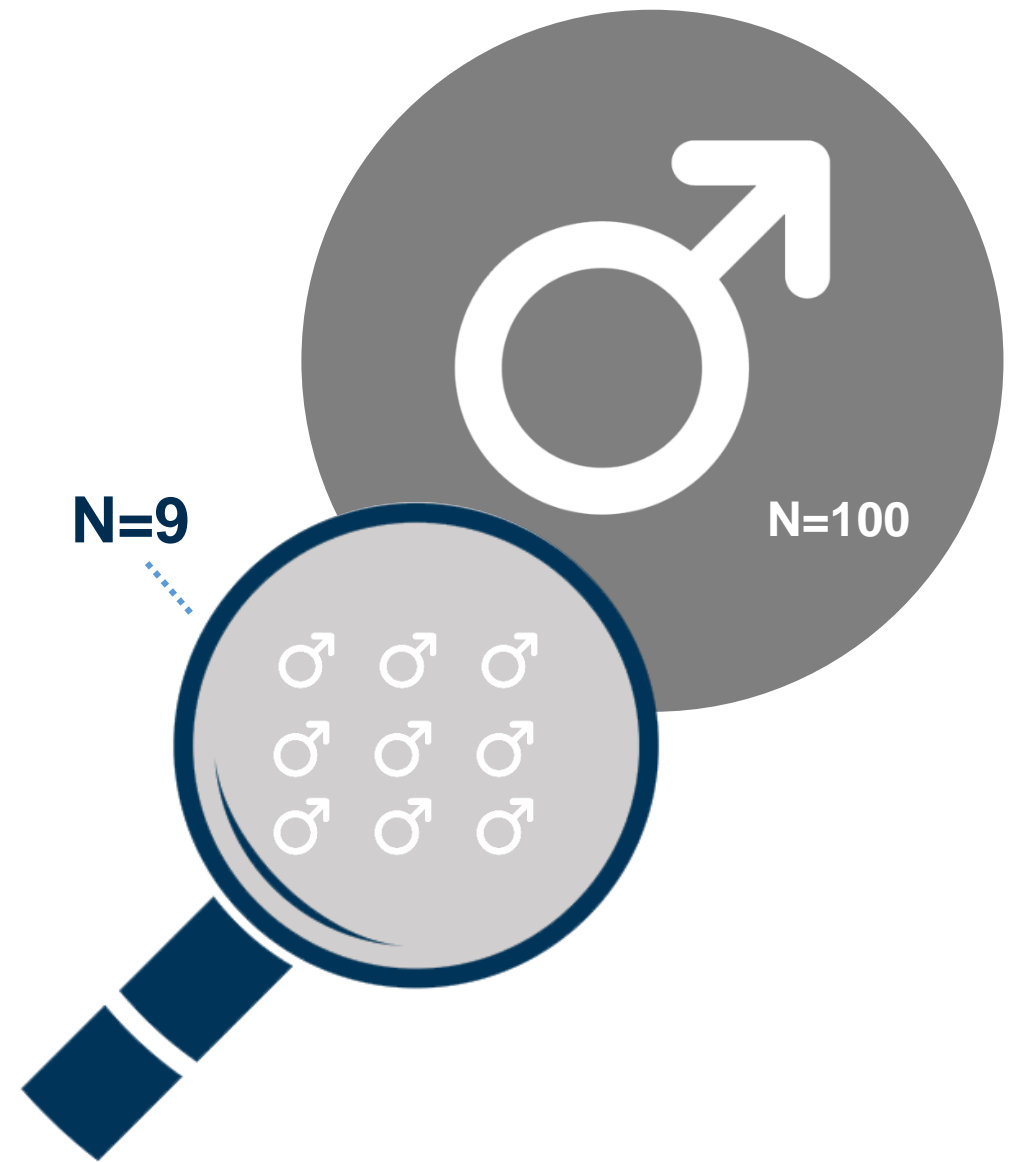
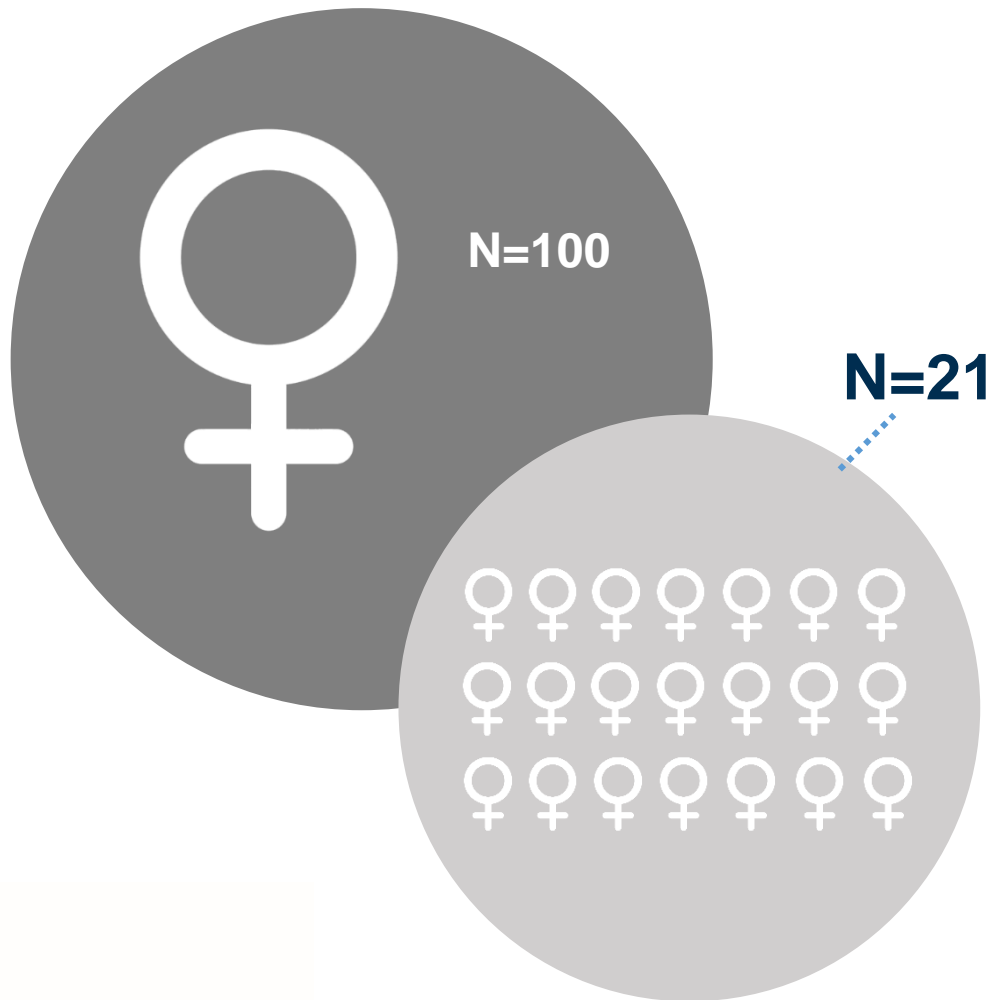
# Sample Weights

- Sample weights are used to make statistics computed from the data more representative of the population.
- It is a standard practice in surveys to use sampling weights.
- Each participant in the study is assigned a sample weight constructed based on the inclusion probability.
- Sample weights are always positive and non-zero.

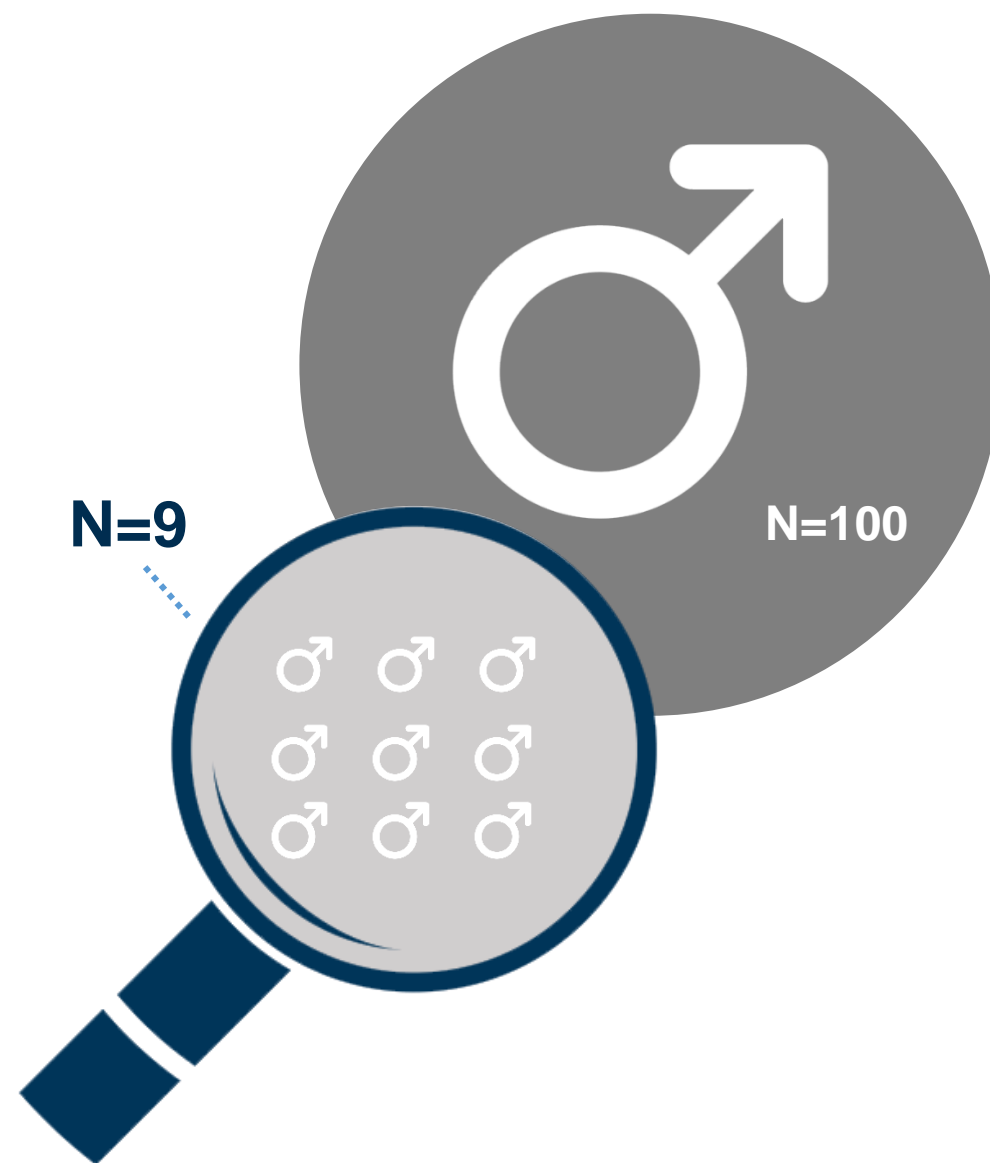
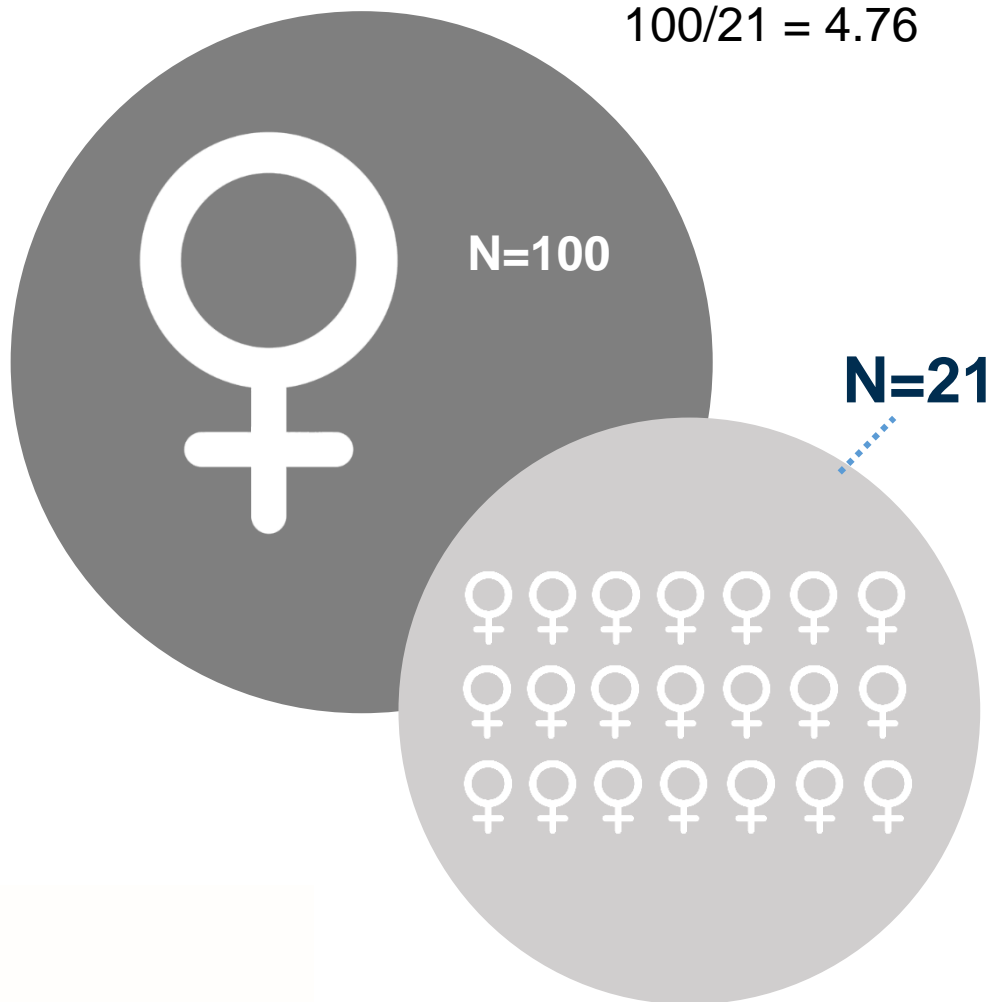
# Sample Weights

- Respondent in under-represented group gets higher weight; respondent in over-represented group gets lower weight.

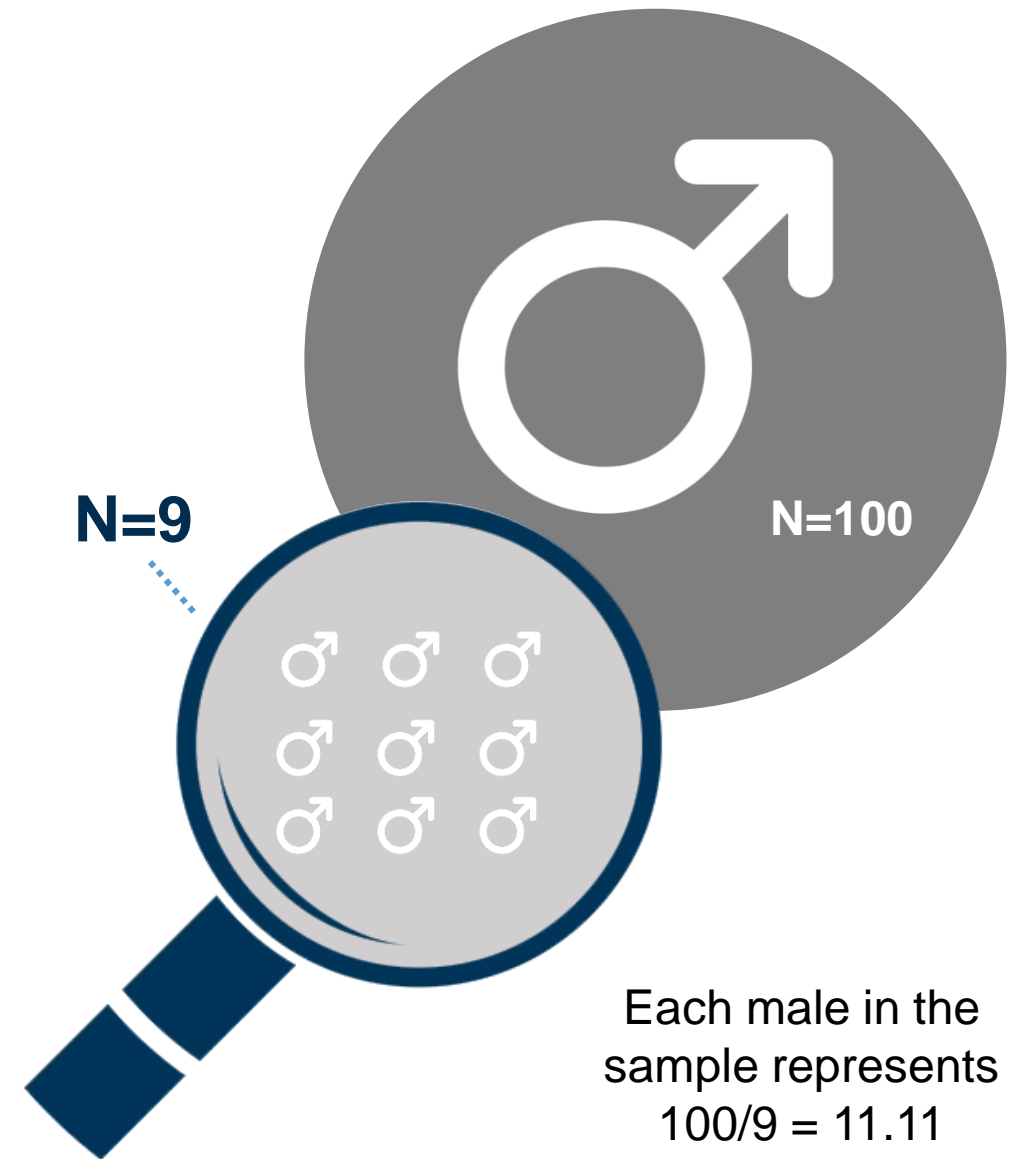
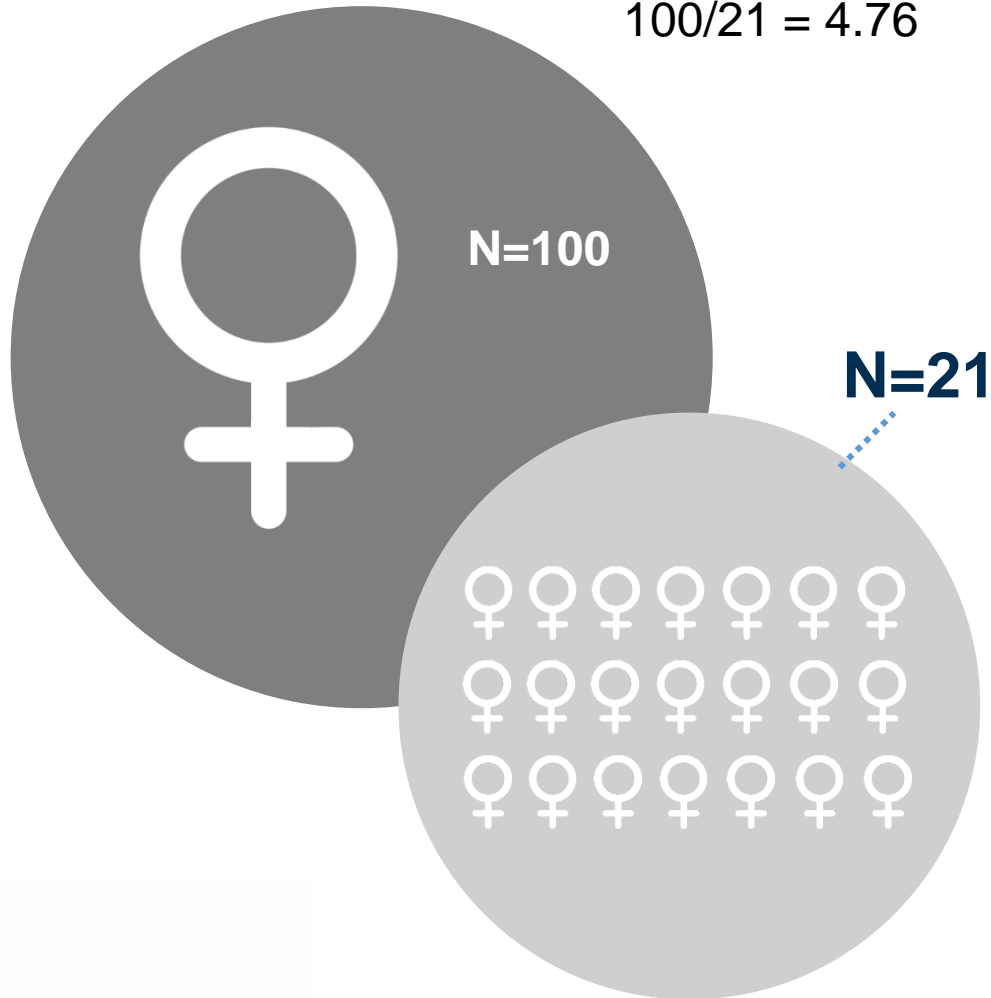




Each female in the  
sample represents  
 $100/21 = 4.76$



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 $100/21 = 4.76$



# CLSA Research Platform

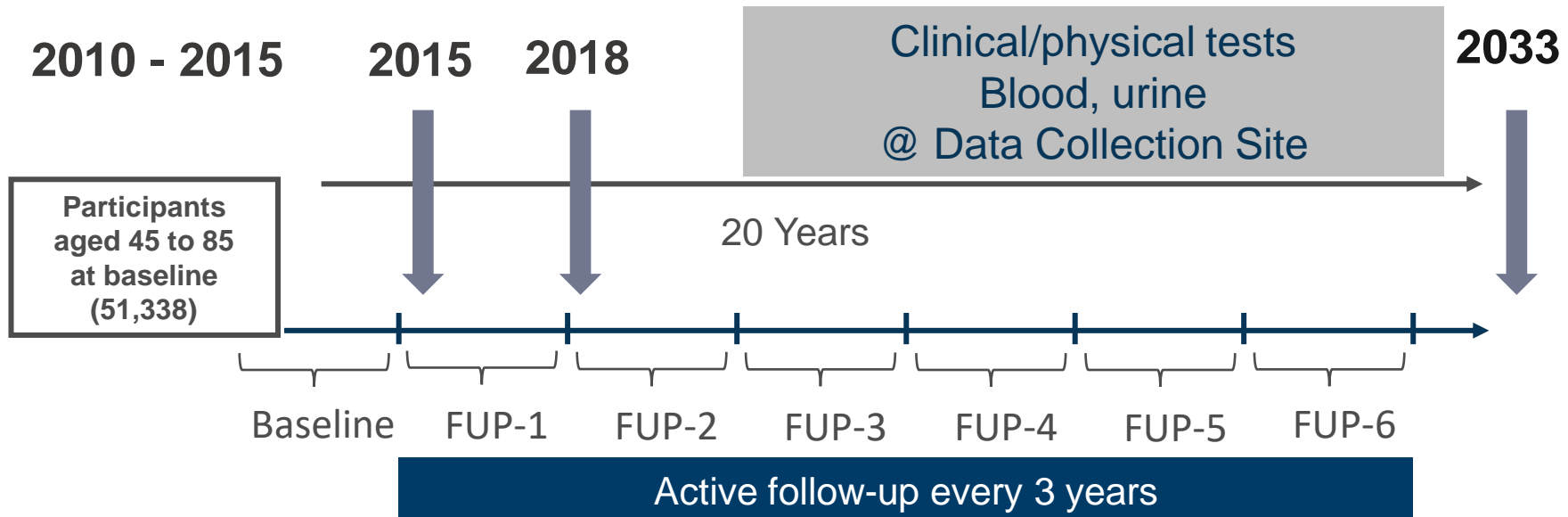
50,000 participants aged 45 - 85 at baseline

Target: 20,000  
Actual: 21,241  
Randomly selected within  
provinces

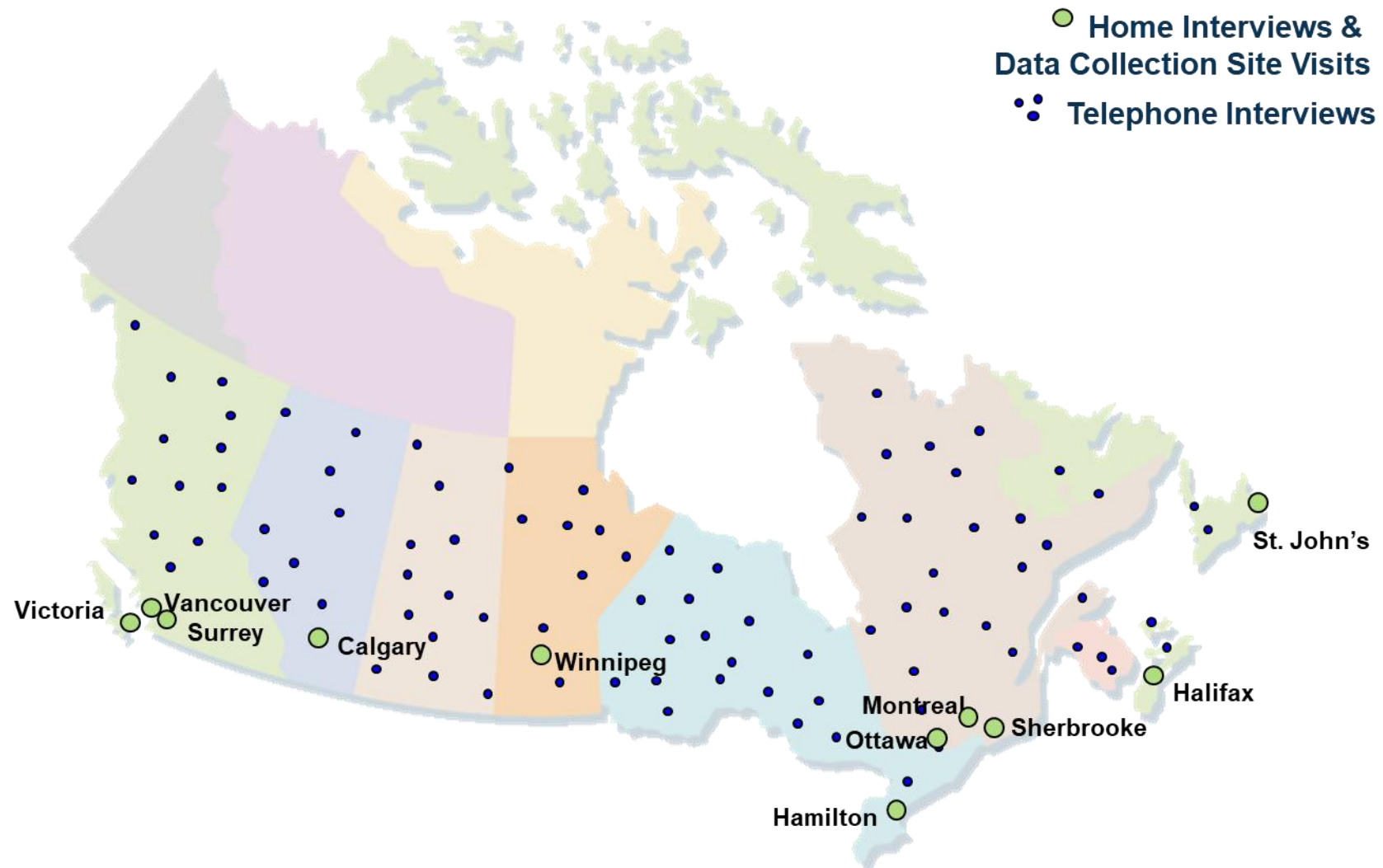
Target: 30,000  
Actual: 30,097  
Randomly selected  
within 25-50 km of 11 sites

Questionnaire  
By telephone (CATI)

Questionnaire  
In person, in home (CAPI)



# National Scope



# CLSA Sample

## Sample was obtained via four sources:

- Canadian Community Health Survey-Healthy Aging (CCHS-HA) [Tracking only]
- Provincial Health Registries (HR)
- Telephone Sampling (TS)
- Quebec Longitudinal Study on Nutrition and Aging (NuAge) [Comprehensive only]



# CLSA Sample

## Stratified Random Sampling:

- A population is subdivided into mutually exclusive subpopulations
- A simple random sample is drawn from each subpopulation

# CLSA Sample

## Why Stratified Random Sampling?

- Can be done for convenience
- To obtain more precise estimates (under many circumstances)
- To obtain an estimate for the subpopulations

# CLSA Sample

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# CLSA Strata

- **10 Provinces**
  - 10 (Tracking)
  - 7 (Comprehensive)
- **Age groups**
  - 45-54
  - 55-64
  - 65-74
  - 75-85
- **Sex**
  - Female
  - Male
- **Geographic areas**
  - DCS
  - Non-DCS

# CLSA Strata

- Early analyses showed under-representation of people with lower SES (education, income)
- This could potentially lead to low statistical power
- Thus, to increase heterogeneity in SES, we chose to over-sample people from dissemination areas with higher percent of people with lower levels of education

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  - Female
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- **Geographic areas**
  - DCS
  - Non-DCS
- **Education**
  - Low-Ed
  - High-Ed

# Types of Weights: Inflation Weights

- The CLSA Tracking and Comprehensive Cohort inflation weights were constructed
- First, basic design weights, which are proportional to the reciprocals of the individual inclusion probabilities, were computed; they were then re-calibrated to the sum of the targeted (eligible) Canadian population

# Types of Weights: Inflation Weights

- The CLSA Tracking and Comprehensive Cohort inflation weights were constructed
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# Types of Weights: Inflation Weights

- For the estimation of a descriptive parameter
- Reflect the estimated parameters in the target population, e.g.
  - Mean grip strength
  - Prevalence of CHD

# Types of Weights: Inflation Weights

- Prevalence of CHD

$$\frac{\sum_{i=1}^N w_i y_i}{\sum_{i=1}^N w_i}$$

**Where:**

N = Number in the sample

$w_i$  = weight for the  $i$ th participant

$y_i$  = 1 if participant has CHD and 0 otherwise

# Types of Weights: Inflation Weights

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Number of people in the  
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Number of people in the  
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# Types of Weights: Inflation Weights

- Prevalence of CHD

$$\frac{\sum_{i=1}^N w_i y_i}{\sum_{i=1}^N w_i}$$

Number of people in the  
**CLSA** with CHD

Number of people in the  
**CLSA**

If all  $w_i = 1$

**Where:**

N = Number in the sample

$w_i$  = weight for the  $i$ th participant

$y_i = 1$  if participant has CHD and 0 otherwise

# Types of Weights: **Analytic Weights**

- Analytic weights are proportional to the inflation weights but **rescaled** to sum to the **sample size** within each province, so that their mean value is **1** within each province.
- They are intended for use in modeling, e.g. regression analyses, where the weighting variables are included in the models.

# Why Analytic vs. Inflation Weights?

- Provinces with larger populations will tend to have much higher inflation weights compared to smaller provinces
- The observations from those strata would tend to dominate the statistical analysis
- With analytic weights point estimators will remain the same, but they are more efficient if the model is correctly specified

# Sample Weights for Pooled Data

- Inflation weights were also provided for the pooled sample from two cohorts based on:
  - Combined Tracking and Comprehensive inclusion probability for participants in the DCS areas
  - Tracking inclusion probability for participants in the non-DCS areas.



# Sample Weights in CLSA Data (previous)

## Inflation Weights

WGHTS\_TRIMMED\_TRM

WGHTS\_TRIMMED\_COM

WGHTS\_TRIMMED\_CLSA

## Analytic Weights

WGHTS\_ANALYTIC\_TRM

WGHTS\_ANALYTIC\_COM

WGHTS\_ANALYTIC\_CLSA

# Why new weights?

## Originally

- We anticipated that most analyses would be conducted at the Province-level
- CCHS-HA was used to calibrate both Tracking and Comprehensive weights
- CCHS-HA weights could be used to estimate parameters at the level of a Health Region

# Why new weights?

## Our thinking evolved

- While CCHS-HA worked well to calibrate the Tracking cohort it worked less well at the DCS-level (Area represented 25-50 km around the DCSs)
- There was interest in using the CLSA data at sub-Province level

# How do the old and new weights differ?

- Calibration Source
  - CCHS-HA used 2006 Census
  - CLSA Recruitment began in 2011; we now use 2011 National Household Survey
- Additional refinement
  - Use of individual rather than geographic education level for weight calibration

# How do the old and new weights differ?

 <b>Age categories</b>	CLSA Tracking (21,241)			CLSA Comprehensive (30,097)			CLSA Overall (51,338)		
	Un-weighted	Old Weight	New Weight	Un-weighted	Old Weight	New Weight	Un-weighted	Old Weight	New Weight
	%	%	%	%	%	%	%	%	%
45-54	27.46	36.67	38.09	25.24	41.97	39.02	26.15	37.56	38.09
55-64	30.90	30.91	31.40	32.75	29.76	31.02	31.98	30.88	31.40
65-74	21.82	19.64	19.02	24.46	17.16	18.31	23.37	19.17	19.02
75-85	19.82	12.77	11.50	17.56	11.11	11.65	18.50	12.39	11.50
%Female	51.00	51.50	51.80	50.90	50.40	52.40	50.90	51.50	51.83

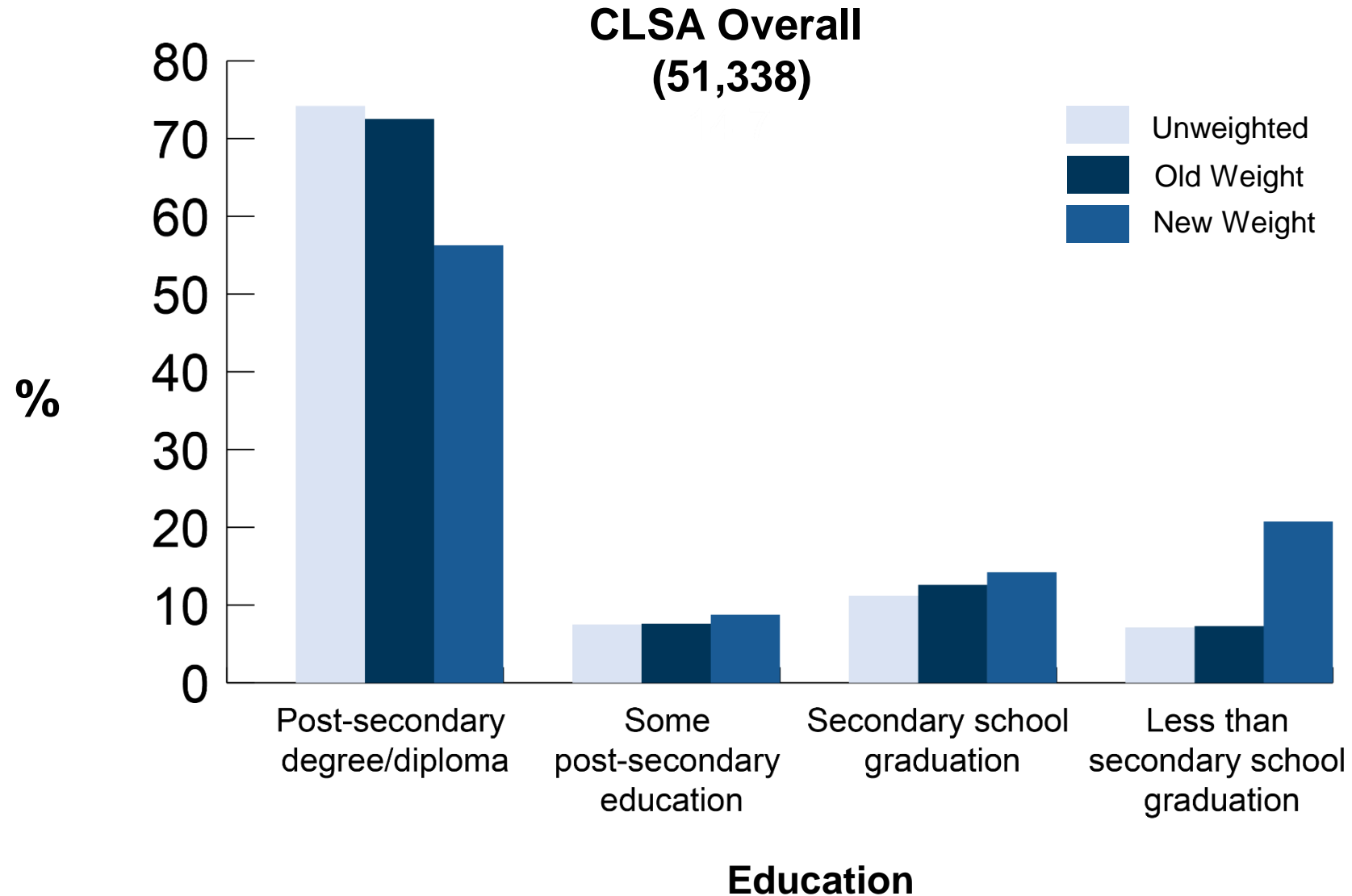
# How do the old and new weights differ?



## Education

	CLSA Tracking (21,241)			CLSA Comprehensive (30,097)			CLSA Overall (51,338)		
	Un-weighted %	Old Weight %	New Weight %	Un-weighted %	Old Weight %	New Weight %	Un-weighted %	Old Weight %	New Weight %
Post-secondary degree/diploma	69.30	72.60	56.50	77.60	79.50	62.10	74.20	72.50	56.27
Some post-secondary education	7.70	7.50	8.50	7.40	6.70	9.10	7.50	7.60	8.76
Secondary school graduation	13.60	12.80	14.60	9.40	9.00	11.50	11.20	12.60	14.22
Less than secondary school graduation	9.40	7.20	20.40	5.50	4.90	17.40	7.10	7.30	20.75

# How do the old and new weights differ?



# What should a researcher expect?

- In most cases, points estimates of prevalence or association will be similar
- Better reflect the target population, especially in the DCS catchment areas



# What should a researcher expect?

- Underestimates of low socioeconomic status will be lessened
- Parameter estimates for variables strongly associated with SES are likely to be more affected
- Overall estimates will better reflect the target population

# What should a researcher not expect?

- While data will better reflect the target population in the DCS area, they will not provide estimates at the “city-level”
- DCSs are in only 11 locations across Canada
- DCS catchment areas include a geographic region 25-50 km around the DCS

# When will new weights be available?

- New weights will be provided as a separate data release this Fall
- Old weights will no longer be provided except by special request

# What is coming next?

- Baseline **Analytic** weights can be used for longitudinal analyses using Baseline and F1
- F1 **Inflation** weights are being calculated to estimate descriptive parameters at F1
  - Reflect CLSA population attrition
  - Reflect changes in target population from BL to F1

# A New CLSA Technical Report

## Modelling Complex Survey Data Using R, SAS, SPSS and Stata: A Comparison Using CLSA Datasets

■ Available soon



**Contact:**

**Data inquiries: [access@clsa-elcv.ca](mailto:access@clsa-elcv.ca)**

**General inquiries: [info@clsa-elcv.ca](mailto:info@clsa-elcv.ca)**

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# QUESTIONS?



# Upcoming CLSA Webinar

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November 2020

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