

Measuring Cultivation Parcels with GPS: a Statistical Evidence

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Studying the statistical relevance of measuring cultivation parcels with GPS: **the data set**

- African survey data (2005-2006) for Cameroon, Niger, Madagascar and Senegal.
- Cultivation parcel selection **was not random**.
- The surfaces of cultivation parcels were measured using:
 - the compass and meter method (or traditional method) as statistical point of reference.
 - more types of GPSs (GPS60, GPS72 and Magellan400).

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Studying the statistical relevance of measuring cultivation parcels with GPS: **the covariates of interest**

The covariates of interest (all expressed in squared meters) are:

- **S_1** = Compass and meter cultivation parcel surface.
- **S_21_1** = Garmin60 (GPS60) cultivation parcel surface.
- **S_22_1** = Garmin72 (GPS72) cultivation parcel surface.
- **S_24_1** = Magellan400 (MAG400) cultivation parcel surface.

We shall interested in the following differences:

- 1 **c_g60diff** = The difference between compass cultivation parcel surface and Garmin60 cultivation parcel surface.
- 2 **c_g72diff** = The difference between compass cultivation parcel surface and Garmin72 cultivation parcel surface.
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Studying the statistical relevance of measuring cultivation parcels with GPS: **the main matter**

The cultivation parcel selection **was not random**. Indeed, samples have not been generated by a random mechanism (intentional selection exists). It implies that:

- Common statistical tests, such as *t*-tests, cannot work well since they assume randomness.
- The **lose of accuracy** may become greater when samples are smaller.
- The **statistical inference** cannot have nothing to do with the sampling (we must take care of the nonrandomness of the samples).

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Statistical Inference: **the theory**

Basically, there are two ways to do statistical inference:

- Unconditional (or simple) Inference
 - *randomness* of parcel selection **is assumed**.
 - we may assume *normality* (parametric approach) or not (nonparametric approach) of the differences.
 - we may assume *paired samples* (pairing is effective when two measurements are strongly correlated) *unpaired samples* (measurements are uncorrelated - they cannot influence each other).
- Conditional Inference
 - *randomness* of parcel selection **is not assumed**.
 - parametric statistical tables (such as *t* or *F* tables) are not valid, because they are based on *theoretical distributions* which assume randomness. *Empirical distributions* of the test statistic should be used instead.
 - the *resampling* is the tool to depart from theoretical

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Statistical Inference: **the Unconditional Inference**

The Unconditional inference approach can be done according to this table:

Statistical aim	Data-set features			
	Continuous Data		Non-Continuous Data	
	Measurements from a Gaussian distribution	Measurements, Ranks or Scores, from a non-Gaussian distribution	Binominal Data (two possible outcomes)	Survival Data
Describe one sample	Mean Standard deviation	Median Interquartile range	Proportion test	Kaplan Meier Survival Curve
Compare one sample to a hypothetical value	One sample <i>t</i> -test	One sample Wilcoxon test	Chi-square test Binominal test	
Compare two unpaired samples	Unpaired <i>t</i> -test	Unpaired Wilcoxon test (Wilcoxon Rank Sum test)	Fisher's test (chi-square test for large samples)	Log-rank test
Compare two paired samples	Paired <i>t</i> -test	Paired Wilcoxon test (Wilcoxon Sign Rank test)	McNemar's	Hazards regression
Compare three or more unmatched samples	One-way ANOVA	Kruskal-Wallis test	Chi-square test	Cox-regression
Compare three or more matched samples	Repeated-measures ANOVA	Friedman test	Cochrane Q	Hazards regression
Quantify association between two variables	Pearson correlation	Sperman correlation	Contingency coefficients	
Predict value from another measured variable	Linear regression Non-linear regression	Non-parametric regression	Logistic regression	Cox-regression
Predict value from several measured or binominal variables	Multiple linear regr Multiple non-linear regression		Multiple logistic regression	Cox-regression

- We found strong correlation between couples of measurements, it implies that pairing is effective, then samples must be treated as **paired**.
- Then, to study the statistical relevance of measuring cultivation parcels with GPS, we may use both **parametric** and **nonparametric** tests. Since the data set is continuous, we shall have to deal with **paired *t*-test** and the **Wilcoxon Sign Rank test** respectively.

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Statistical Inference: the Unconditional Inference

For **paired samples**, unconditional inference can be done by using:

The *paired t-test* statistic

It's a parametric test on means:

$$t_{paired} = \frac{\bar{X}_{1;i} - \bar{X}_{2;i}}{SE_{(\bar{X}_{1;i} - \bar{X}_{2;i})}} = \frac{\bar{d}}{SE_{\bar{d}}} = \frac{\bar{d}}{S_{\bar{d}}/\sqrt{n}} \xrightarrow{d} t_{n-1} \quad (1)$$

Where: $\bar{d} = n^{-1} \sum_{i=1}^n d_i$; $S_{\bar{d}} = \sqrt{\frac{\sum_{i=1}^n (d_i - \bar{d})^2}{n-1}}$

The *Wilcoxon Sign Rank test* statistic

It's the nonparametric analogous test of the *paired t-test*:

$$WSR^+ = \sum_{i=1}^n 1\{d_i > 0\} \times R_i \quad (2)$$

Where n is the number of pairs, $1\{\cdot\}$ is an *indicator function* that permits just the summation of positive differences, and R_i is the signed rank of the i -th obs.

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When the random sampling assumption **is not satisfied**, statistical inference can be done through *resampling methods*:

- **Randomization tests:** Also known as *permutation tests*. The aim is to make inference by estimating the empirical distribution of the test statistic (called the permutation distribution).
- **Jackknife:** The aim is to estimate the population distribution by deleting one observation at time (standard error and bias estimation).
- **Bootstrap:** The aim is to estimate the distribution of a population by resampling *with replacement* (standard error and bias estimation).

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The preliminary work

Working on differences, as preliminary work we have checked the satisfaction of all assumptions for applying correctly a t -test. We found:

t -test assumptions	Features found
1) Normality (measurements must be normal or near normal distributed)	1a) c_g60diff can be considered near normal. 1b) c_g72diff can be considered near normal. 1c) c_m400diff cannot be considered normal.
2) Independence (measurements cannot be influence each other)	2a) It is satisfied, because measurements cannot influence each other.
3) Random Sampling (measurements must be random variables) (random selection avoids conscious or unconscious bias)	We may assume that the selection was: 3a) Random \rightarrow t -tests work well 3b) Not random \rightarrow t -tests do not work well \rightarrow use permutation tests
4) Variance Homogeneity (measurements must have the same variance)	We must assume that samples are paired: \rightarrow tests on variances have not any sense \rightarrow the standard deviation of paired differences S_d is assumed as the only measure of variability
5) No Outliers (all possible outliers must be deleted before the applied analysis)	5a) Some evidence of outliers remains.

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The results: the paired t -test

Paired t -test

Panel: A

data: S.1 and S.21.1

$t_{paired} = 0.7262$; $df = 87$; p -value = **0.4697**

alter. hypothesis: true difference in means is not equal to 0

95 percent confidence interval: [-30.61026 ; 65.85185]

mean of the differences: 17.62080

Panel: B

data: S.1 and S.22.1

$t_{paired} = 3.9084$; $df = 125$; p -value = **0.0001514**

alter. hypothesis: true difference in means is not equal to 0

95 percent confidence interval: [50.44549 ; 153.94531]

mean of the differences: 102.1954

Panel: C

data: S.1 and S.24.1

$t_{paired} = 5.8224$; $df = 125$; p -value = **4.601e-08**

alter. hypothesis: true difference in means is not equal to 0

95 percent confidence interval: [95.06151 ; 192.96658]

mean of the differences: 144.0140

- In Panel A, traditional method and Garmin60 method are compared. Since the p -value is greater than the significance level ($0.4697 > 0.05$), **we cannot reject** the null hypothesis that the true difference in **means** is equal to zero, then we can conclude stating that parcel estimates using Garmin60 **are not statistically different** from parcel estimates using traditional method.
- In Panel B, traditional method and Garmin72 method are faced toward. Since the p -value is now smaller than the significance level ($0.0001514 < 0.05$), we can **reject** the null hypothesis and we can conclude stating that parcel estimates using Garmin72 are **statistically different** from parcel estimates using traditional method.
- In Panel C, traditional method and Magellan400 method are compared. Since the p -value is smaller than the significance level ($4.601e^{-08} < 0.05$), we can **reject** the null hypothesis and we can conclude stating that parcel estimates using Magellan400 are **statistically different** from parcel estimates using traditional method.
- In panel B and C, the mean of the differences is positive, it implies that parcel estimates using traditional method are larger than parcel estimates using GPS72 and MAG400.

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- In Panel B, traditional method and Garmin72 method are faced toward. Since the p -value is now smaller than the significance level ($0.0001514 < 0.05$), **we can reject** the null hypothesis and we can conclude stating that parcel estimates using Garmin72 **are statistically different** from parcel estimates using traditional method.
- In Panel C, traditional method and Magellan400 method are compared. Since the p -value is smaller than the significance level ($4.601e^{-08} < 0.05$), we can reject the null hypothesis and we can conclude stating that parcel estimates using Magellan400 are **statistically different** from parcel estimates using traditional method.
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- In Panel C, traditional method and Magellan400 method are compared. Since the p -value is smaller than the significance level ($4.601e^{-08} < 0.05$), **we can reject** the null hypothesis and we can conclude stating that parcel estimates using Magellan400 are **statistically different** from parcel estimates using traditional method.
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- In Panel B, traditional method and Garmin72 method are faced toward. Since the p -value is now smaller than the significance level ($0.0001514 < 0.05$), **we can reject** the null hypothesis and we can conclude stating that parcel estimates using Garmin72 **are statistically different** from parcel estimates using traditional method.
- In Panel C, traditional method and Magellan400 method are compared. Since the p -value is smaller than the significance level ($4.601e^{-08} < 0.05$), **we can reject** the null hypothesis and we can conclude stating that parcel estimates using Magellan400 are **statistically different** from parcel estimates using traditional method.
- In panel B and C, the **mean of the differences** is positive, it implies that parcel estimates using traditional method are **larger** than parcel estimates using GPS72 and MAG400.

The results: **the paired t -test**

Summarizing, the paired t -test states that:

Paired t -test: the results

1) Statistical equivalency:

- * traditional method is *statistically equivalent* to the Garmin60 method.
- * traditional method is *statistically different* to the Garmin72 method.
- * traditional method is *statistically different* to the Mag400 method.

2) Parcel estimates:

- * using traditional method are *larger* than parcel estimates using Garmin72 method.
- * using traditional method are *much more larger* than parcel estimates using Mag400 method.

Here, **randomness** and **normality** are supposed, but these assumptions are not satisfied by the data set. We need: **first**, to relax the assumption of normality maintaining randomness (Wilcoxon Sign Rank test (WSR)), **second**, to relax both the assumption of normality and randomness (paired t -permutation test).

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The results: the WSR test

Wilcoxon Sign Rank test

Panel: AW

data: S.1 and S.21.1

$W^+ = 1886.5$; p-value = **0.796**

alternative hypothesis: true location shift is not equal to 0
pseudo-median of the differences: 5.99996

Panel: BW

data: S.1 and S.22.1

$W^+ = 5428$; p-value = **0.0001076**

alternative hypothesis: true location shift is not equal to 0
pseudo-median of the differences: 91

Panel: CW

data: S.1 and S.24.1

$W^+ = 6276$; p-value = **3.018e-08**

alternative hypothesis: true location shift is not equal to 0
pseudo-median of the differences: 109.565

- In Panel AW, since the p-value is greater than the significance level ($0.7977 > 0.05$), **we cannot reject** the null hypothesis that the true difference in **medians** is equal to zero, then we can conclude stating that parcel estimates using Garmin60 **are not statistically different** from parcel estimates using traditional method.
- In Panel BW and CW, since the p-value is smaller than the significance level, we can reject the null hypothesis concluding that both Garmin72 and Magellan400 parcel estimates should be considered **statistically different** from parcel estimates using the traditional method.
- In Panel BW and CW, the median of the differences is positive, it implies that parcel estimate using traditional method are **slightly larger** and **larger** than GPS72 and MAG400 respectively.

The results: the WSR test

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Summarizing, we WSR test states that:

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Here, normality is relaxed, but **randomness is maintained**. The second step is to relax randomness too. We will provide that, in the conditional inference approach.

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Comparing the results

Bringing the unconditional inference results together:

Paired t -test: the results

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The results

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Unconditional Inference Result

The nonparametric unconditional inference approach based on WSR test supports the parametric conclusions from the paired t -test:

- On the **statistical equivalency hand**, **only** Garmin60 is found **statistically equivalent** to the traditional method.
- On the **parcel estimates hand**, the traditional method tends to produce **larger parcels** estimates respect to **all** GPSs measurements methods.

The results

... we can state that:

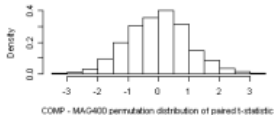
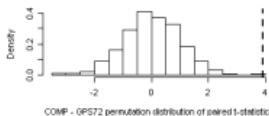
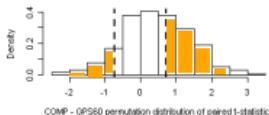
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The permutation distribution of paired t -statistic

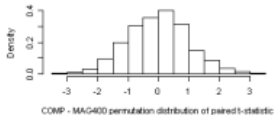
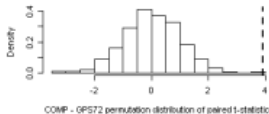
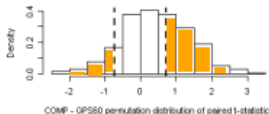
Generating sample replicates *without replacement* from the observed samples, we have estimated the **permutation distribution function** of the paired t -statistic:



- These histogram estimates are the **empirical distribution functions** of paired t -test statistic worked out *conditionally* to the data at hand.
- Under the null hypothesis (that samples have the same distribution), the **empirical p-value** of the test will be the area of the histogram estimate outside the absolute value interval of the observed statistic (this area is emphasised in **gold brown**).
- A smooth estimate of these histogram densities can be obtained by using an appropriated **Kernel function**.

The permutation distribution of paired t -statistic

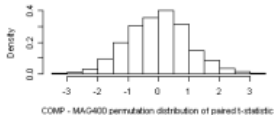
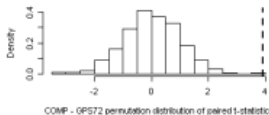
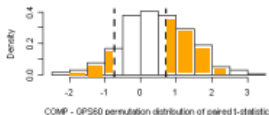
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The result: the permutation paired t -test

Permutation paired t -test

Panel: AR

data: S.1 and S.21.1

Observed test statistic: $\hat{\theta} = 0.7262$; Empirical p-value = **0.472**
alternative hypothesis; $H_A : F \neq 0$

Panel: BR

data: S.1 and S.22.1

Observed test statistic: $\hat{\theta} = 3.9084$; Empirical p-value = **0.001**
alternative hypothesis; $H_A : F \neq 0$

Panel: CR

data: S.1 and S.24.1

Observed test statistic $\hat{\theta} = 5.8224$; Empirical p-value = **0.001**
alternative hypothesis; $H_A : F \neq 0$

- In Panel AR, the empirical p-value is worked out for the differences between traditional method and Garmin60 method. Since it is greater than the significance level ($0.472 > 0.05$) **we cannot reject** the null hypothesis, then we can conclude that parcel estimate using Garmin60 are **not “conditionally” statistical different** from parcel estimates using traditional method.
- In Panels BR and CR, the empirical p-values are smaller than the significance level ($0.001 < 0.05$), then we can **reject the null hypothesis**, stating that parcel estimate using Garmin72 or Magellan400 are **“conditionally” statistical different** from parcel estimates using traditional method.

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Comparing the results

By comparing the paired t -test with its resampling test analogous:

Paired t -test	Permutation paired t -test
Panel: A: data S.1 and S.21.1	
$t_{paired} = 0.7262$; $df = 87$; p-value = 0.4697 $H_A : \mu \neq 0$ 95 percent confidence interval: [-30.61 ; 65.851] mean of the differences: 17.62080	$\hat{\theta} = 0.7262$; Empirical p-value = 0.472 $H_A : F \neq 0$
Panel: B: data S.1 and S.22.1	
$t_{paired} = 3.9084$; $df = 125$; p-value = 0.0001514 $H_A : \mu \neq 0$ 95 percent confidence interval: [50.445; 153.945] mean of the differences: 102.1954	$\hat{\theta} = 3.9084$; Empirical p-value: 0.001 $H_A : F \neq 0$
Panel: C: data S.1 and S.24.1	
$t_{paired} = 5.8224$; $df = 125$; p-value = 4.601e-08 $H_A : \mu \neq 0$ 95 percent confidence interval: [95.061;192.966] mean of the differences: 144.0140	$\hat{\theta} = 5.8224$; Empirical p-value: 0.001 $H_A : F \neq 0$

... taking into account these last two tables, we can state that:

... we can state that:

Conditional Inference Result

- On the **statistical equivalency hand**, empirical p-values produce the same conclusion of the theoretical ones: **only** cultivation parcel estimates using Garmin60 are found **statistically equivalent** to the traditional method.
- On the **parcel estimates hand**, **nothing can be state** about the **largeness** of the cultivation parcels using the conditional approach, then the **unconditional inference results remain valid**.

... then, collecting the two main findings:

... we can state that:

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Unconditional Inference Result

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... we can conclude stating that:

... the final conclusion

... because the GPSs methods are globally cheaper than traditional method using compass and meter, **it's strongly recommended the use of GPS60** to reduce the costs of the agricultural surveys.

Future research

For the upcoming papers:

- 1 We suggest to take care about the random mechanism which has generated the samples. When randomness is not satisfied, we recommend **permutation tests**.
- 2 We advise to develop this paper: **changing the statistical aim** or/and **changing the permutation procedure**.

Changing the statistical aim

- We may study the **statistical equivalency** taking into account of **smaller and bigger parcels separately** (find out, if exists, the *equivalency surface threshold*).
- We may study the **statistical equivalency** for the **time requested** to do the measurements (find out, if exists, the *equivalency time threshold*).

Changing the permutation procedure

- We may consider permutation tests which take care of **any differences** of the two samples, not only in means or in medians (**Kolmogorov-Smirnov test**).
- We may compare more than two samples at time (**multivariate permutation tests (MPT)**). The main type of MPT is based on *nearest neighbors*.

... thank you!!!