

A short walk in human reproduction

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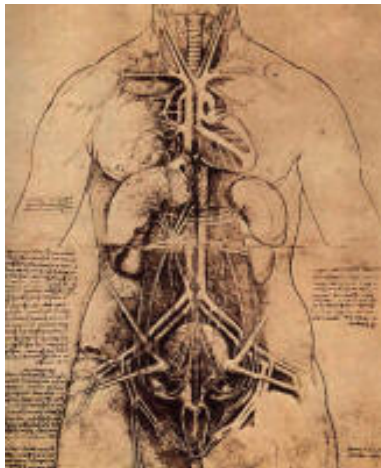
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The Reproductive Function : a very special physiologic function

Leonardo da Vinci (1452- 1519) and the utero- mammary duct :
when you see what you expect !




Reproduction and diseases



The Reproductive Function : a very special physiologic function

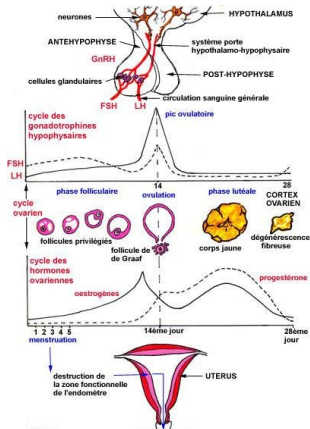
- ▶ not essential for the individual's survival...but essential for the group survival
- ▶ Changes in reproductive behavior concern societies and their evolution
 - ▶ The one- child policy and the gender selection
 - ▶ The delayed child bearing age in westernised countries and the demographic changes
 - ▶ A "cultural weapon"

How to optimize mating both quantitatively and qualitatively ?

- ▶ A very old question, which attracted many famous scientists from all fields
 - ▶ W Harvey 1651 : *Exercitationes de Generatione Animalium* edited by George Ent
 - ▶ GLL Buffon 1749 : Histoire naturelle. Life tables (Le Bras, 2000)
 - ▶ G Mendel (1822- 1884)
- ▶ The Reproductive Function and mathematical modeling
 - ▶ Usually driven by agricultural issues for improving efficiency (cultures, herding)
 - ▶ The sex ratio issue and the arguments between *J Arbuthnot*, *Bernoulli* *DeMoivre*
 - ▶ Callipedia, Orthopedia, Eugenism...
 - ▶ The study of complex psychological traits, intelligence (IQ)
 - ▶ The problem of the extinction of the family names and the 19th century context : *the Galton- Watson process*
- ▶ Any statistical modeling in reproduction needs to define both the correct **statistical unit** and an adapted **time scale** 

The Reproductive Function : a quick reminder (XY excluded !)

- ▶ The fallacy of menstrual bleeding
- ▶ The hidden endocrine system
- ▶ A complex system regulated by both internal and external stimuli
 - ▶ A subtle dynamic interplay between 3 entities
 - ▶ Each one has its own timescale and tempo
- ▶ Two important landmarks : menarche and menopause
- ▶ A dynamical system with reversible and irreversible states



The neuro- endocrine control of the pituitary- gonadal axis

- ▶ G Harris and the beginning of neuroendocrinology (Kreier and Swaab, 2010) : the retino- ejaculatory reflex in ducks
- ▶ Multiple signals, both endogenous and exogenous, mostly inhibitory
 - ▶ Light/ Stressors/ Olfactory stimuli
 - ▶ Steroid sexual hormones, both endogenous and exogenous (contraception, *endocrine disruptors* -cf. Obseff)
 - ▶ Insulin, Leptin in relation to nutritional and metabolic stimuli
 - ▶ Immune System (IL) and infectious/ chronic diseases
 - ▶ *Breastfeeding* R Short and the WHO study(P Howie et al), cf Bangladesh tea plantation study NMT & LR, (LeStrat and Thalabard, 2001)

Example 1 : The Obseff study. Context and aims

- ▶ Context and aims
 - ▶ Participants : A Bohet, J Bouyer, B Ducot, N Keiding, **L Rosetta**, **R Slama (PI)**, JCT
 - ▶ Current issue : is there a decline in fertility in Europe in relation to environment? ⇒ **Obseff main objective** : assessing the actual fertility and its trend in relation to environment in French couples **from the general population** wishing to conceive (Slama et al., 2012)
- ▶ Ancillary study : what is the female ovulatory status in those couples?
 - ▶ Its evidence usually based in clinical practice on a set of complementary tools
 - ▶ Menstrual Diary, Body Temperature Chart, Follicular US Monitoring
 - ▶ ± Repeated Collections of either Blood or Salivary or Urinary Individual Samples
 - ▶ **QS1 : Is urinary repeated collection an acceptable tool in Field Studies?**
 - ▶ **QS2 : Can we reduce the urinary frequency collection without compromising ovulation assessment?**

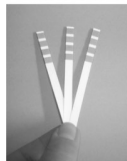
Example 1 : The Obseff study : a complex survey

- ▶ 64,805 homes contacted by random digit dialling
- ▶ 15,811 women identified 18-44 yrs \propto eligibility questionnaire
- ▶ 997 with regular intercourse, without any contraception, no delivery within previous 6 mo
 - ▶ 685 accepted hormonal assessment \rightarrow 250 complied with protocol including ethical agreement + booklet filled in
 - ▶ 41 only filled in the booklet
 - ▶ 209 accepted urinary sampling. Among them, 49 women **randomly** sampled for every day sampling, whereas 160 collected every other day.
 - ▶ 15 pregnancies reported

Example 1 : The Obseff study. Urinary collection and E1G/PdG determinations

▶ Urine collection

- ▶ Set of calibrated filter papers for a full menstrual cycle
- ▶ Self- collection **every- or every other- day**
- ▶ Each measure = 3 pH strips \times 4 squares (1 square $\simeq 5 \mu$ l)
- ▶ Strips exposed to 1st urine flow after wake up, dried at room θ , stored into a plastic bag.
- ▶ All plastic bags for a cycle sent by regular mail to central lab

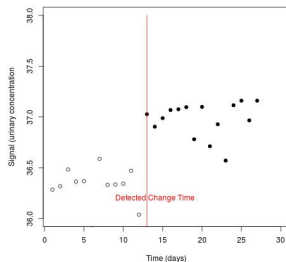
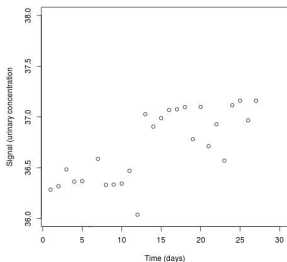


▶ Urinary assay

- ▶ Assay in duplicate PdG, EiG, Creat
- ▶ Procedure \propto WHO procedure using WHO reagents

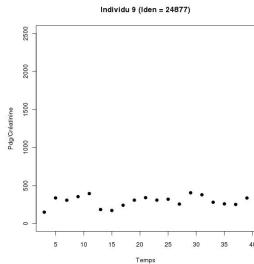
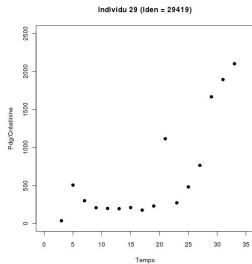
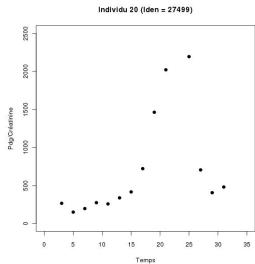
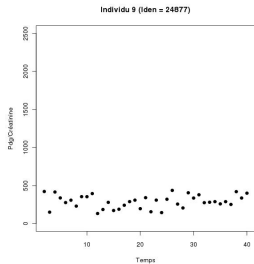
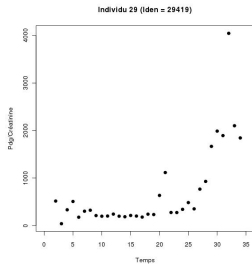
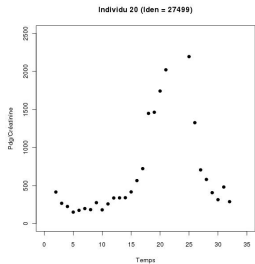
Example 1 : the Obseff study : Ovulation detection

- ▶ The mathematical problem relates to the detection of a signal change in a time series



- ▶ The distinction **on- line** \neq **off- line** detection but a situation of **sparse** series
- ▶ Several methods reported (Santoro et al., 2003, Thalabard et al., 2011)
- ▶ Validation : 3 independent experts analysed blindly 96 anonymous profiles in random order (2×48)

Example 1 : Obseff study. Some PdG Profiles



Example 1 : Obseff study. Did the experts agree ?

► Ovulation Discordances

Frequency	Exp 1 vs 2	Exp 1 vs 3	Exp 2 vs 3
1	2	1	1
2	3	1	2

► Day of Ovulation

Frequency	ICC	95%CI	Mean 2-2 CC	Robinson	Finn
1/1	0.90	0.84 0.95	0.91	0.94	0.95
2/1	0.94	0.89 0.96	0.91	0.93	0.95
2/2	0.84	0.76 0.90	0.86	0.90	0.96

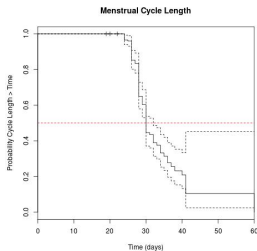
Example 1 : Obseff study. How the automatic detectors agreed with the experts ?

Frequency	Method	Se	Sp	True Ovulating	Non Ovulating
1	Brown	1.00	0.50	44	4
1	Kassam	0.93	0.75	44	4
1	Waller1	0.93	0.75	44	4
1	Black95	1.00	0.25	44	4
1	Black99	1.00	0.00	44	4
1	NLR	1.00	0.25	44	4
1	MBP	1.00	0.25	44	4
1	PWR	1.00	0.25	44	4
1	Cusum	1.00	0.25	44	4
1	Ewma	0.84	0.75	44	4
2	Brown	0.93	0.6	43	5
2	Kassam	1.00	0.8	43	5
2	Waller1	0.98	0.8	43	5
2	Black95	0.98	0.4	43	5
2	Black99	0.98	0.4	43	5
2	NLR	1.00	0.2	43	5
2	MBP	1.00	0.4	43	5
2	PWR	1.00	0.2	43	5
2	Cusum	1.00	0.4	43	5
2	Ewma	0.35	0.8	43	5

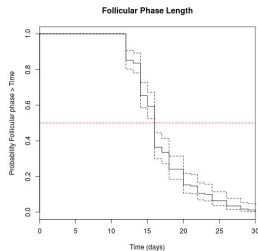
Example 1 : Obseff study. Cycle characteristics in couples from the general population

The Kaplan Meier representation for **right**censored data

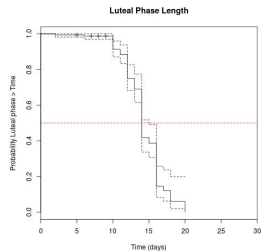
Cycle Length



Follicular Phase



Luteal Phase



Discussion and conclusions

- ▶ Urinary self collection appears feasible
 - ▶ In field situation the choice of urine collection on pH strips appears well adapted & well accepted
 - ▶ Few missing points as soon as the woman accepts starting
 - ▶ No need of storage in the fridge = well accepted by family!
 - ▶ The whole set not cumbersome, sent by post to the lab, reliable, not costly
 - ▶ Enzyme immuno assay not expensive and friendly for the environment
- ▶ Main Results
 - ▶ 3 experts gave consistent results with no doubtful situations
 - ▶ The simple creat- corrected PdG threshold Kassam's one gave the "best" results
 - ▶ Use of every other day versus every day collection : the range of variation remained small and acceptable for **off line detection** in population study

Example 2 : Is mating for height associated with fertility ?

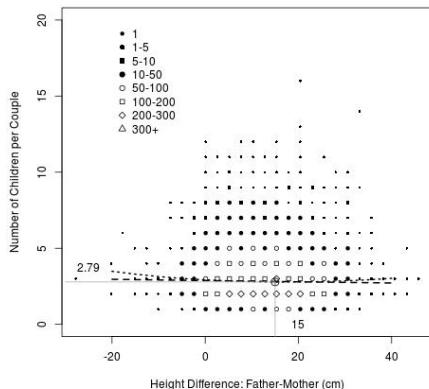
current work with Monika Krzyzanowska and NMT

- ▶ How to select his or her partner remains a burning issue !
 - ▶ From the oracle's advice and regional recipes to the current illusion of scientifically mastering an event, which is indeed largely influenced by the socio- economic context, the cultural environment and chance.
 - ▶ What has really changed ? (Allen, 1997)
- ▶ QS : are basic biometric parameters still important for fertility ?

Example 2 : Revisiting an old question. An intriguing graph

The UK National Child Development Study (NCDS) data set

- ▶ Children born March, 3rd-9th 1958. Regular FU : 1965, 1969, 1991, 2000, 2004, 2008, 2013.
- ▶ 1974 FU : 6535 index children, with information on age, weight and height, education and social class in both parents.



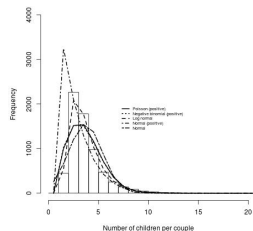
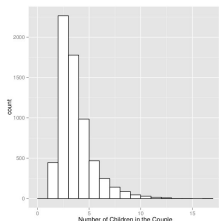
Example 2 : The choice of the regression model

▶ Here, Y , the number of children is integer- valued \Rightarrow a **counting process**

▶ In addition, only couples with at least one child are recorded : Y is

left- truncated

- ▶ Linear regression analysis tries to explain a dependent variable Y with a set of independent regressors X_1, X_2 as *parcimonious as possible*
- ▶ Potential regressors are either continuous like height, weight or categorical with a natural order like education- or social- scores or without like regions
- ▶ The culturally- linked regressor variables are expected to be somehow highly correlated : "qui se ressemblent s'assemblent !"

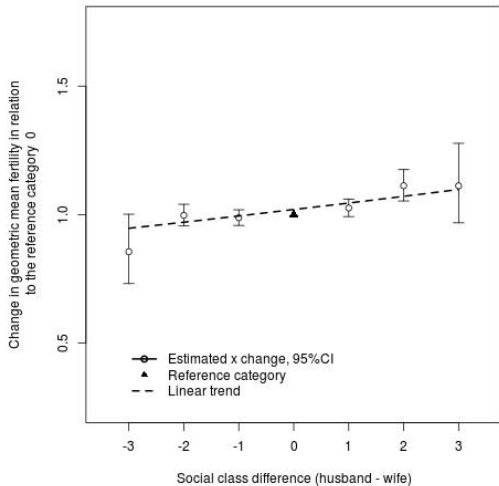


Example 2 : adjusting on covariates

Covariate		Estimate	p-value
Region	Scotland (Reference)	1.66	1.73e-11
Δ	North	-0.06	8.34e-02
	Yorks+Humber	-0.12	1.17e-03
	East Midlands	-0.08	3.36e-02
	East Anglia+South East	-0.13	5.12e-07
	South West	-0.06	7.02e-02
	West Midlands	-0.08	7.27e-03
	North West	-0.03	3.47e-01
	Wales	-0.05	1.740e-01
Age	mean	0.02	3.03e-57
	difference	-0.00	1.35e-01
Social class	mean	0.14	2.31e-29
	difference	0.02	3.48e-04
Education	mean	0.04	4.64e-04
	difference	0.01	2.77e-01
Height	mean	-0.01	1.48e-11
	difference	0.001	1.76e-01

The height difference is no more significant, but the social difference seems important

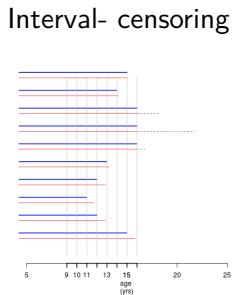
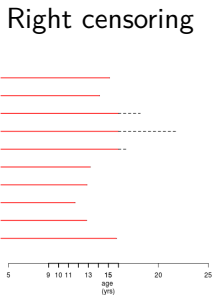
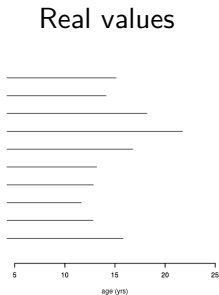
Example 2 : the unexpected effect of the difference in social class



Example 3 : Determinants of age at menarche in UK

current work with Monika Krzyzanowska and NMT

- ▶ Age at menarche is an important natural event in a woman's life occurring on a continuous age time- scale
 - ▶ But its precise value can be altered by **right censoring**, recall bias and rounding bias leading to **interval censored** data
- ⇒ A very frequent situations in clinical and field studies



Example 3 : Determinants of age at menarche in UK

- ▶ Classical tool for right censored survival data : Cox semi-parametric proportional hazard regression model
 - ▶ Continuous time scale, few, if any, tied values
 - ▶ Asymptotic results now connected to the counting process theory
- ▶ Alternative models
 - ▶ Parametric models, Accelerated Failure Time (AFT) model
 - ▶ Poisson regression for counting data
- ▶ Direct interval censored survival data analysis
 - ▶ Peto (1973) pointed out the issue precisely in relation to menarche data !
 - ▶ Recent algorithmic developments are now accessible (Gomez et al., 2009)

Example 3 : Some very cautious preliminary results

Origin	Variable		Estimate	p-value
Daughter	Weight (kg) at 7 yrs		0.067	0.0e + 00
	Height (cm) at 7 yrs		0.03	0.0e + 00
	Breast Fed	1/2/3		NS
Mother	Age at menarche		-0.15	0.0e + 00
	Educ cat	2/3/4		NS
	Smoking during Pregnancy	Yes		NS
Father	Educ. cat	2/3/4		NS
	Mobility 58-65 7	0/1		NS
	Financial Diff.	Yes	0.20	2.8e - 35
Family	Social cat	1/2/3/		NS
	Birth order	2	-0.04	1.6e - 01
		3	-0.09	3.0e - 04
Environment	Number of Children	1 - 1.5	-0.1288	6.1e - 06
		1.5 - 2	-0.2324	2.7e - 07
		2+	-0.2843	3.1e - 04
	Bedroom share	2	-0.092	1.3e - 04
		3	-0.23	2.0e - 09
	Amenities at 7			NS
	Tenure at 7	2	-0.10	1.1e - 05
		3	0.03	5.0e - 01
		4	0.121	6.1e - 02
	Free School Meals	Yes	0.29	1.2e - 76
Accommodation	1/2/3		NS	
Region	North		-0.051	3.1e - 01
	Yorks.Humber		0.048	3.6e - 01
	East.Midlands		0.02	7.0e - 01
	East.Anglia.SouthWest		0.18	2.1e - 11
	SouthWest		0.11	5.9e - 02
	West.Midlands		0.17	4.3e - 04
	NorthWest		0.01	8.3e - 01
	Wales		0.22	4.1e - 04

Politics, environment and reproduction : an unverified short story...

- ▶ *Heracleum Sphondylium* : (common) hogweed/ berce (commune)/ Bearfoot...
- ▶ Old popular knowledge about its side effects but also its health benefits



- ▶ Very abundant in Scotland, where the natality is high... ⇒ Queen Victoria is reported to have mandated her chemists to design one of the first herbicide against hogweed ?

⇒ Of course, correlation is not causation, but it frequently drives our decisions... and, if the story is correct, it visibly failed here !

Some concluding remarks

This 6- month overseas fellowship at Churchill was a unique opportunity

- ▶ to find more time to work on continuously postponed scientific tasks
- ▶ to enjoy the Churchill College life and the Cambridge fantastic environment
- ▶ to meet extraordinary people from so different fields in such a rather short period, something we are not very successful at SPC!
- ▶ to discover unexpected topics of interest !
- ▶ to foster scientific collaborations and envisage joint meetings (MD/ PhD program)
- ▶ to enjoy teaching practical use of R- based biostatistics for field studies to a very diversified audience

I sincerely thank all the people both at the French Embassy, at Churchill and at Nick's lab who made this stay possible and so enjoyable !

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