

# **Systematic Error: Good vs Bad Science**

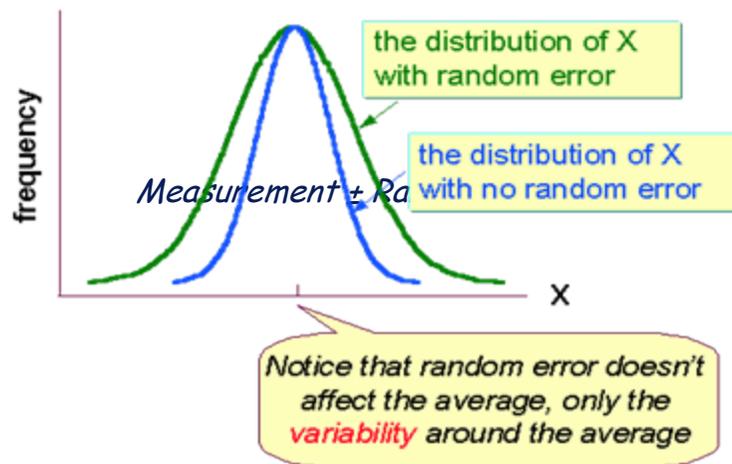
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Physics Department  
UC Davis**

# Random Errors

- ALWAYS present.

- Sources:

- Random operator errors
- Random changes in experimental conditions
- Noise in apparatus
- Noise in Nature

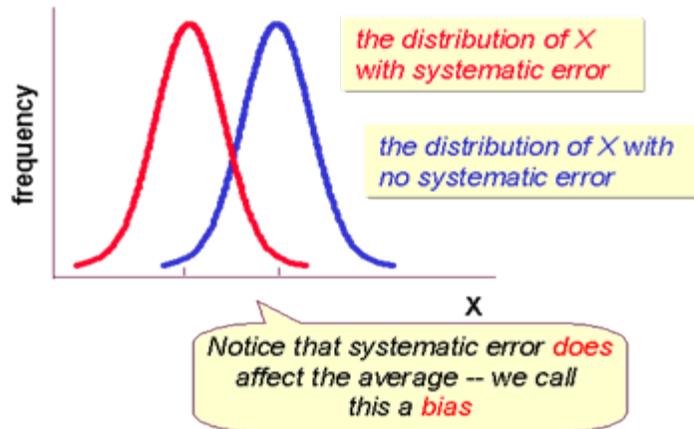


- How to minimize them?

- Take repeated measurements and calculate their average.

# Systematic Errors

- Are TYPICALLY present.

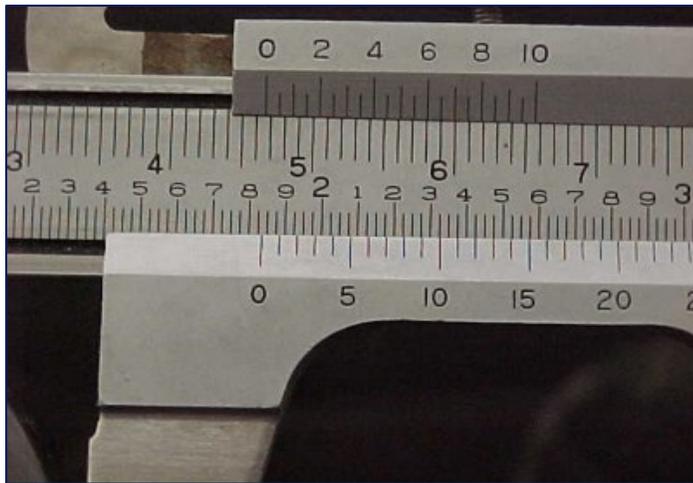


- Sources:
  - Instrumental, physical and human limitations.
    - » Example: Device is out-of-calibration.
- How to minimize them?
  - Careful calibration.
  - Best possible techniques.
  - Discover and control them.

# *Precision and Accuracy in Measurements*

- Precision

How reproducible are measurements?

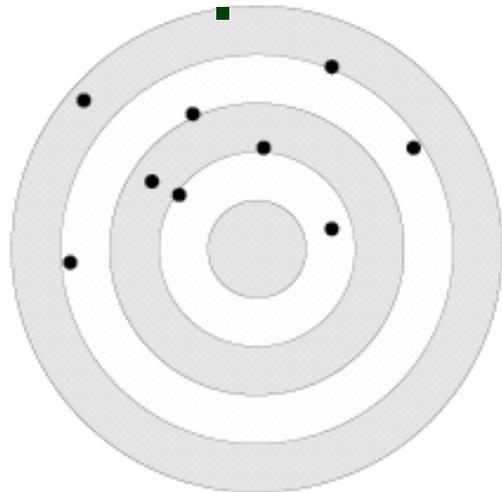


- Accuracy

How close are the measurements to the true value.

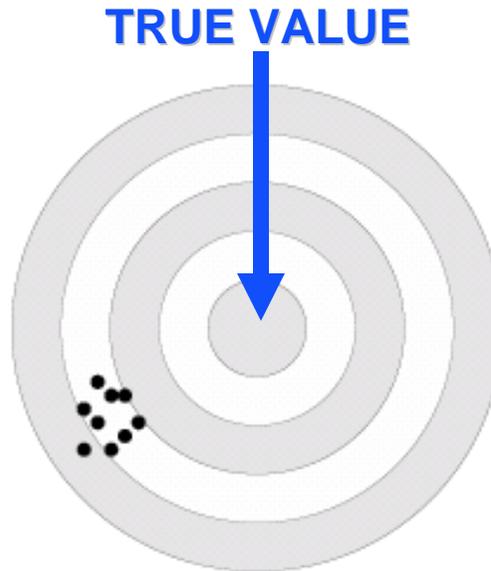


# accuracy and precision



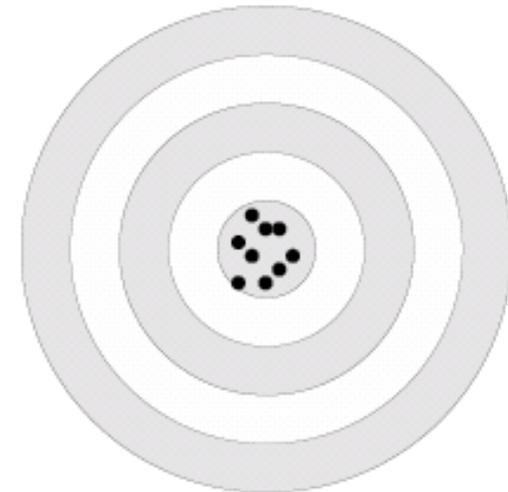
**not precise and  
not accurate**

**large random  
and *systematic*  
errors**



**precise but  
not accurate**

**small random  
error, large  
*systematic*  
error**



**precise and  
accurate**

**small random  
error, small  
*systematic*  
error**

# systematics

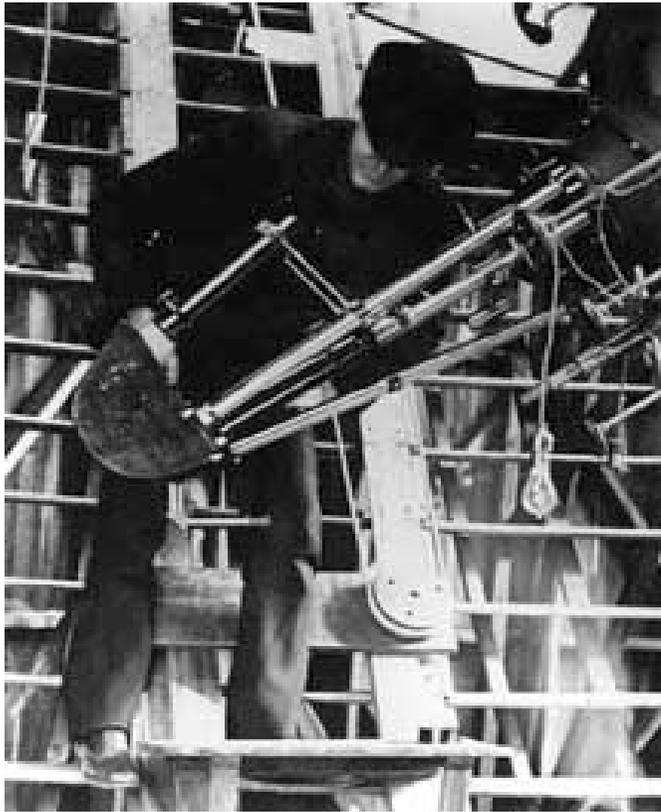
Particularly troubling today is that we don't fully know what we don't know

Testimony by Bert Ely to the Subcommittee on Financial Management, the Budget, and International Security of the Senate Committee on Governmental Affairs July 21, 2003

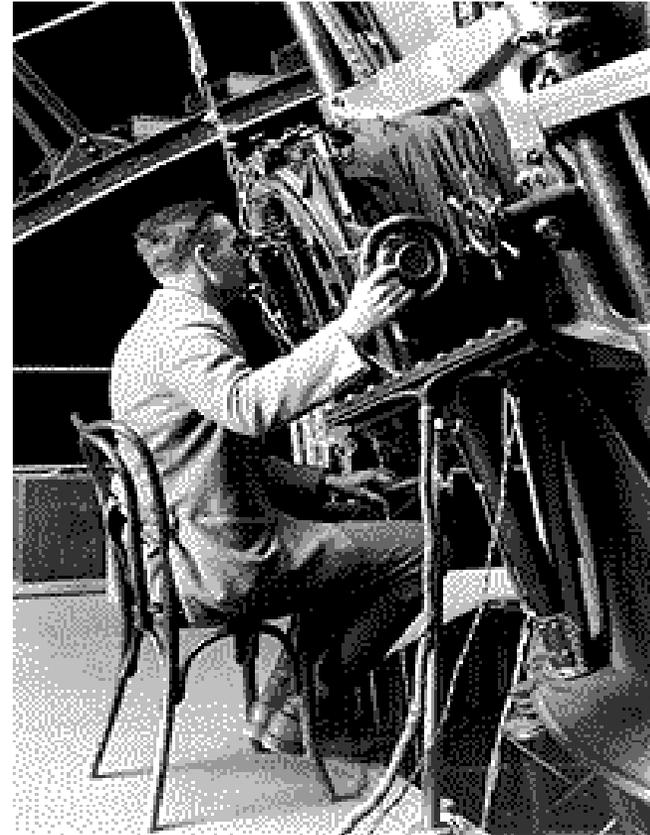


# Example: Measurements of expanding universe

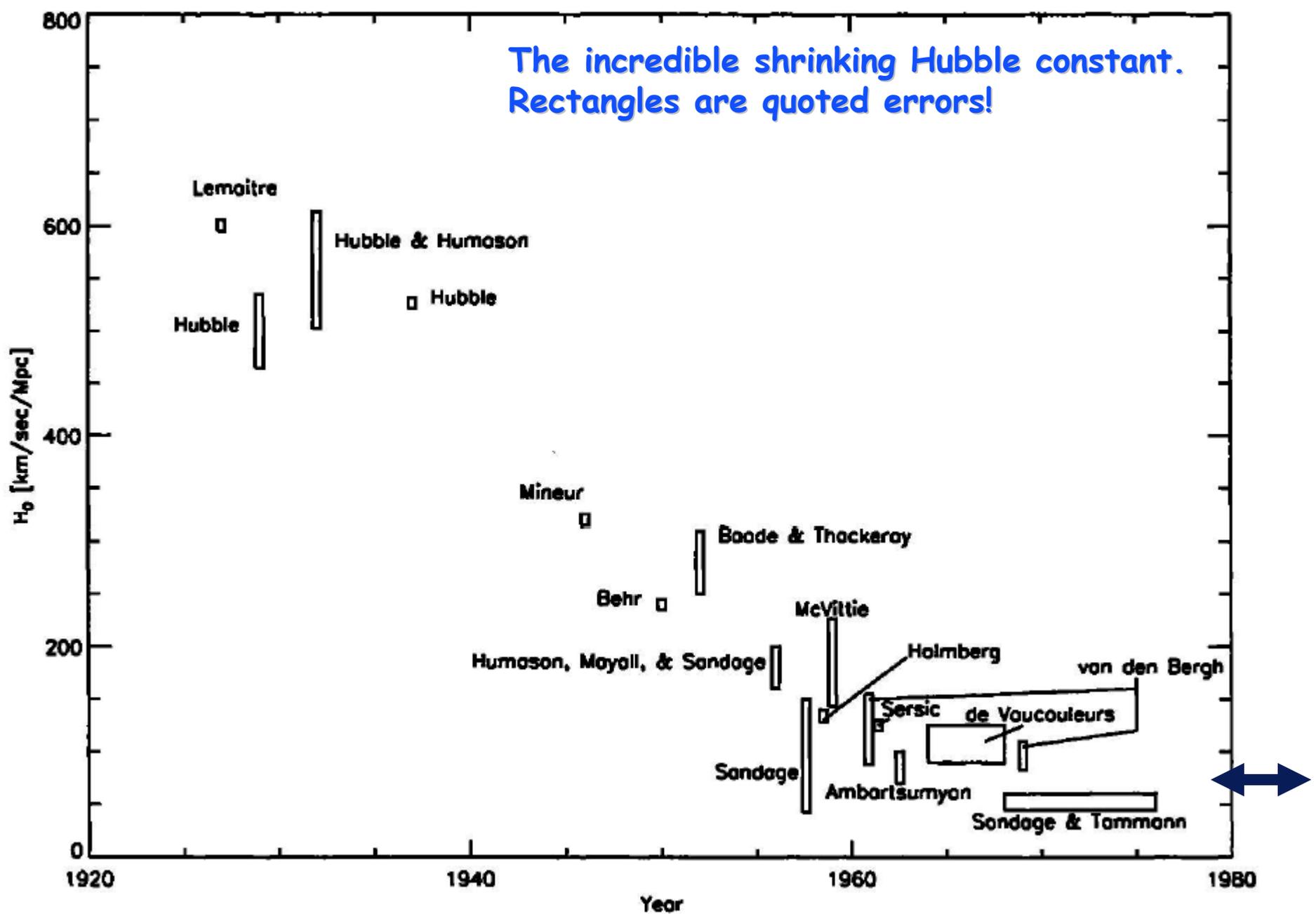
Vesto Slipher



Edwin Hubble



The incredible shrinking Hubble constant.  
Rectangles are quoted errors!



# Systematics: catch-22

The difficulty is this: if we understand the systematic we can correct for it, but if we don't understand the systematic we won't think of it at all or our error estimate will be wrong.

It is only at the edge of understanding where systematic errors are meaningful: we understand enough to realize it might be a problem, but not enough to easily fix it.

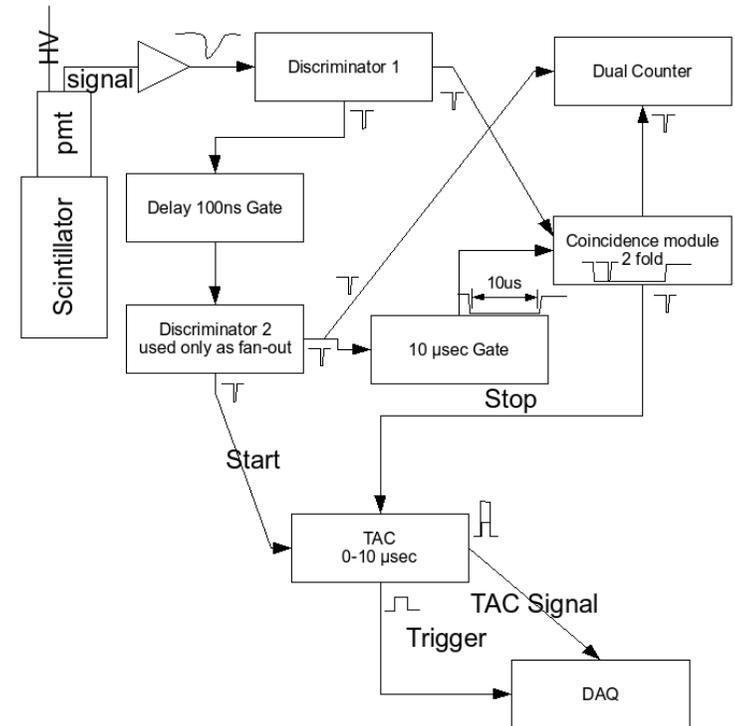
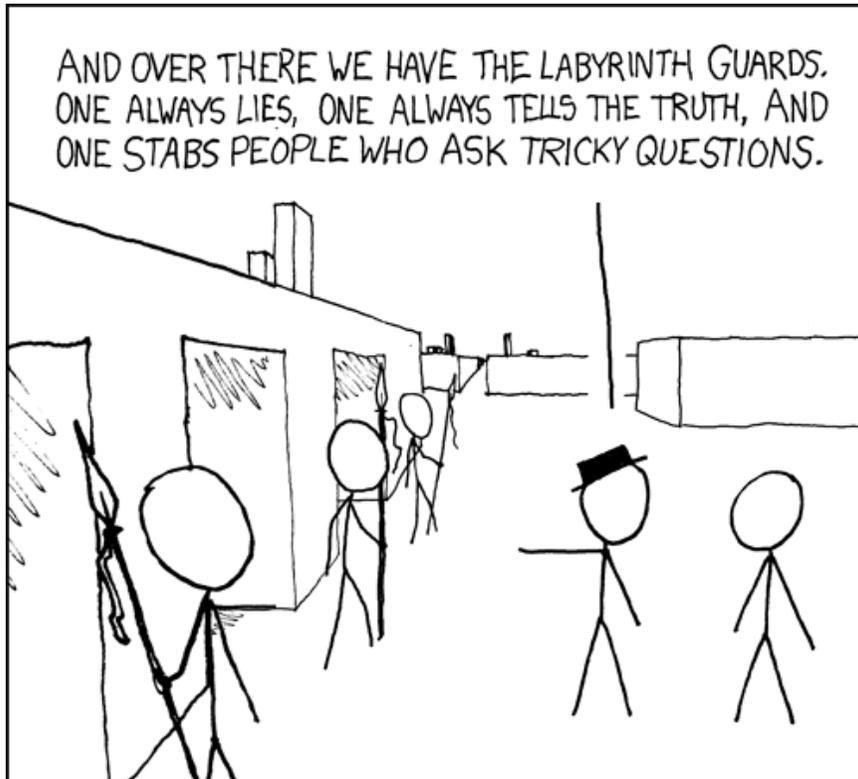


# How can we find systematic errors?

Calibrate everything.

Do *experiments* on our Experiment.

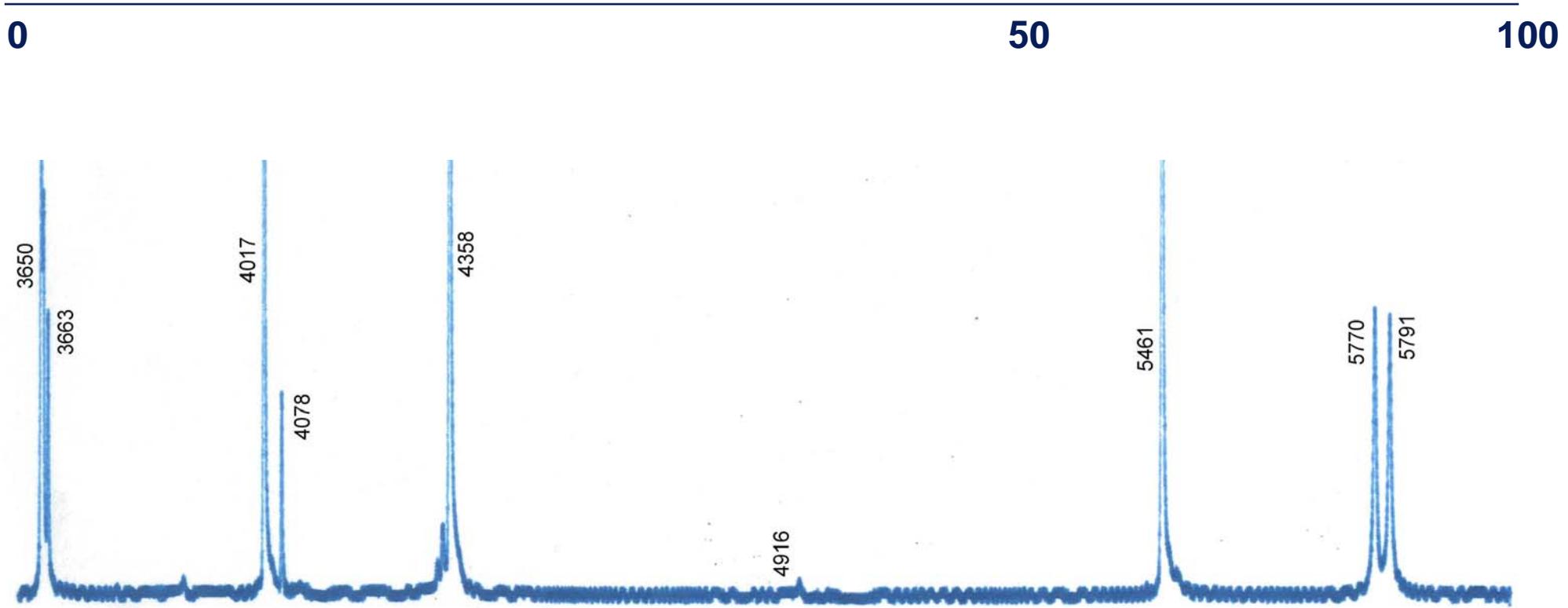
Logical deduction.



Logical process of elimination

# Calibration

Your instrument reading



# Avoiding Systematics

The best prevention of systematic error is good experiment design.

How can we robustly attack this problem in an existing experiment or observation?

*A mix of calibration, simulations and exploratory tests.*

Simulations can teach us where sensitivity to systematics are. We may then explore these avenues; search for the signature of each systematic, isolate it, understand it, and gain control of it.

In practice, for each experimental field it is a kind of “art” which demands familiarity with the likely systematics. It is the responsibility of the experimentalist to probe for systematics and of the theorist to allow for them.

# Healthy skepticism

- Be skeptical of your own work
- Test relentlessly for systematics
- Avoid early press conferences



# A Result of Unexplored Systematics: *Pathological science*

Not fraud

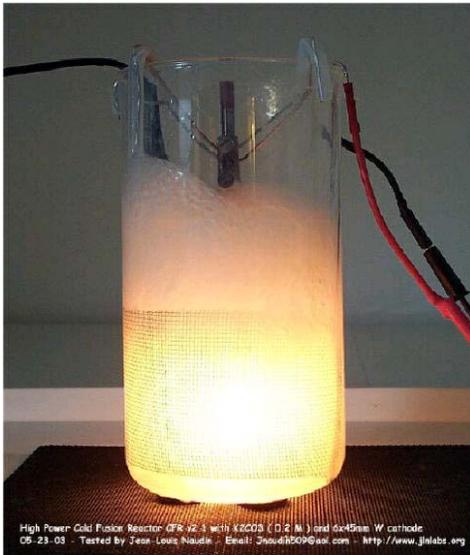


Well intentioned, enthusiastic scientists are led astray

Examples abound in every field of science

# Example: Cold fusion

- Pons and Fleischman claimed bench-top fusion using a palladium battery
- Before doing a control experiment, and before peer review, they held a press conference



“Cold fusion” has since been debunked.

# Features of Pathological Science

- ❑ The maximum effect is produced by a barely perceptible cause, and the effect doesn't change much as you change the magnitude of the cause.
- ❑ The effect only happens sometimes, when conditions are just right, and no one ever figures out how to make it happen reliably. The people who can do it are unable to communicate how they make it happen to the people who can't.
- ❑ The effect is always close to the limit of detectability.
- ❑ There are claims of great accuracy, well beyond the state of the art or what one might expect.
- ❑ Fantastic theories contrary to experience are suggested. Often, mechanisms are suggested that appear nowhere else in physics.
- ❑ Criticisms are met by ad hoc excuses thought up on the spur of the moment.

# Some common mistakes

**Poor experiment design**

**Not testing for systematics (control)**

**Ignoring sample selection effects (bias)**

**Bad statistics: assume wrong distribution (tails!)**

**Failure to repeat the experiment using different sample with same physics**

# Trick

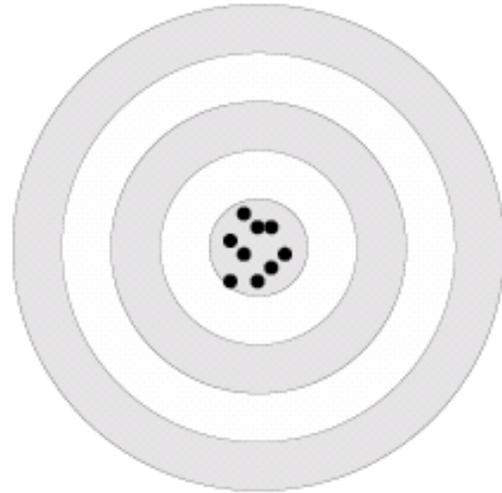
You are trying to measure hopelessly small **SIGNAL**

Suppose you suspect your experiment has systematic error (drift, false signal...)

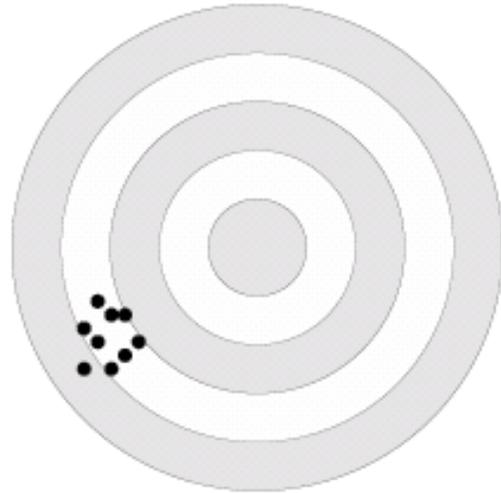
Somehow arrange to turn the **SIGNAL** off and on

Result: **SIGNAL** without systematic error!

# Overcoming systematics: *Chop*

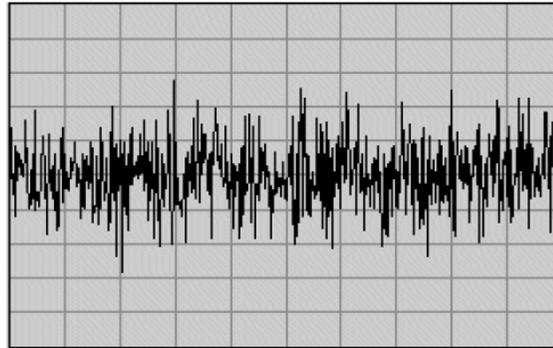


# Overcoming systematics: *Chop*

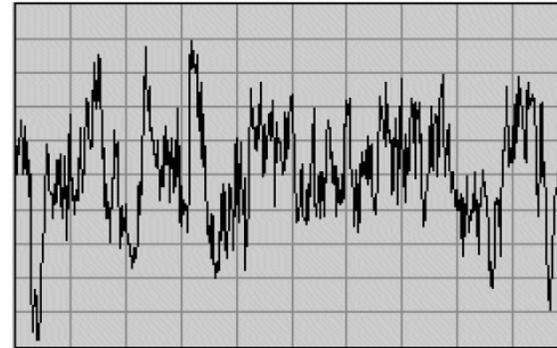


Suppose your signal is at zero frequency and smaller than the noise

Detector output: signal+noise



White Noise



1/f Noise

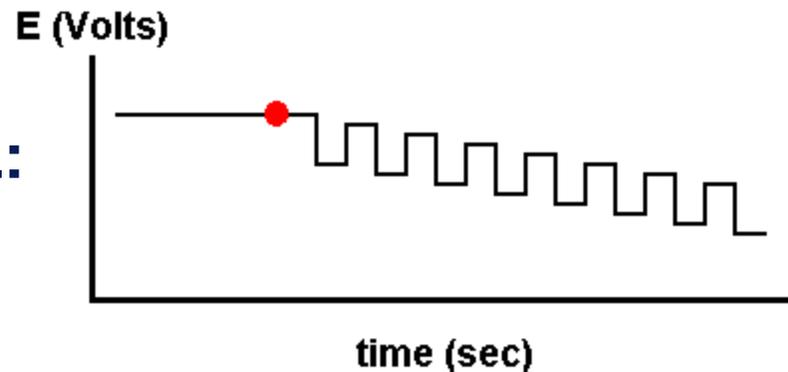
Signal  $\updownarrow$

Random error  
(noise)

*+Drift*

Systematic error

CHOP SIGNAL:



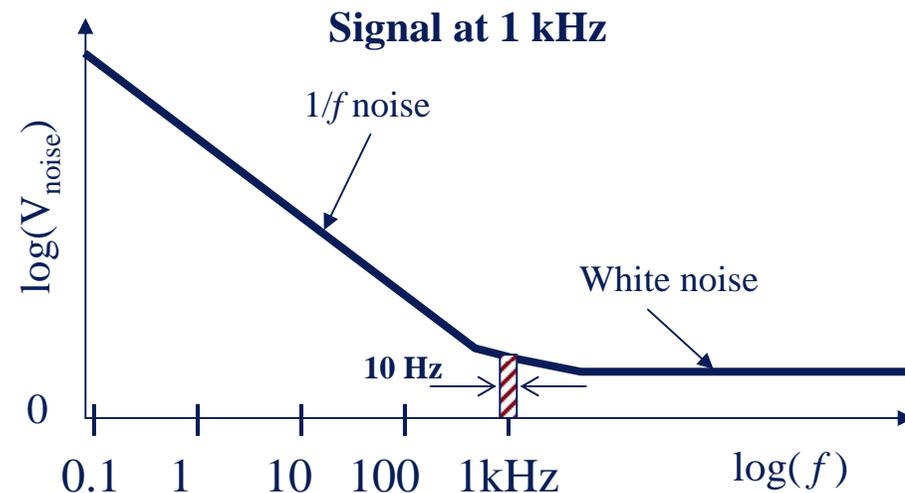
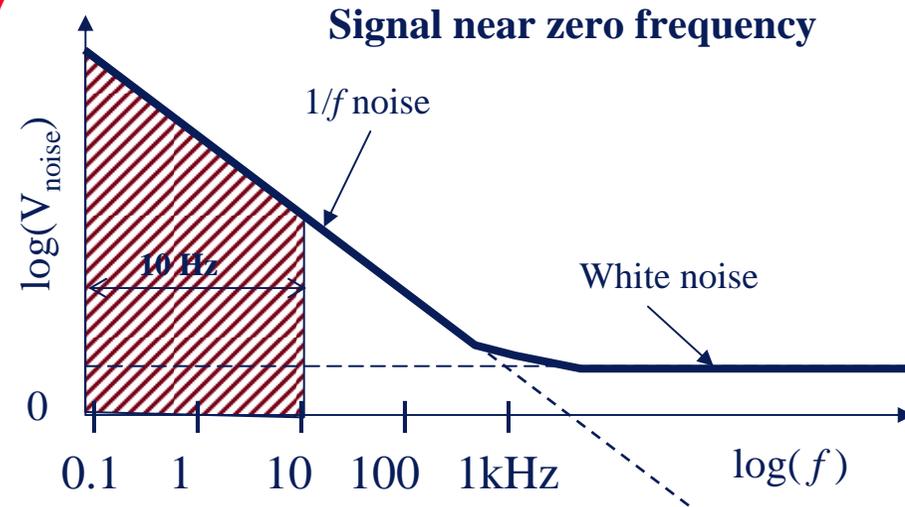
# Signals and noise

Many systems have more noise at low frequency

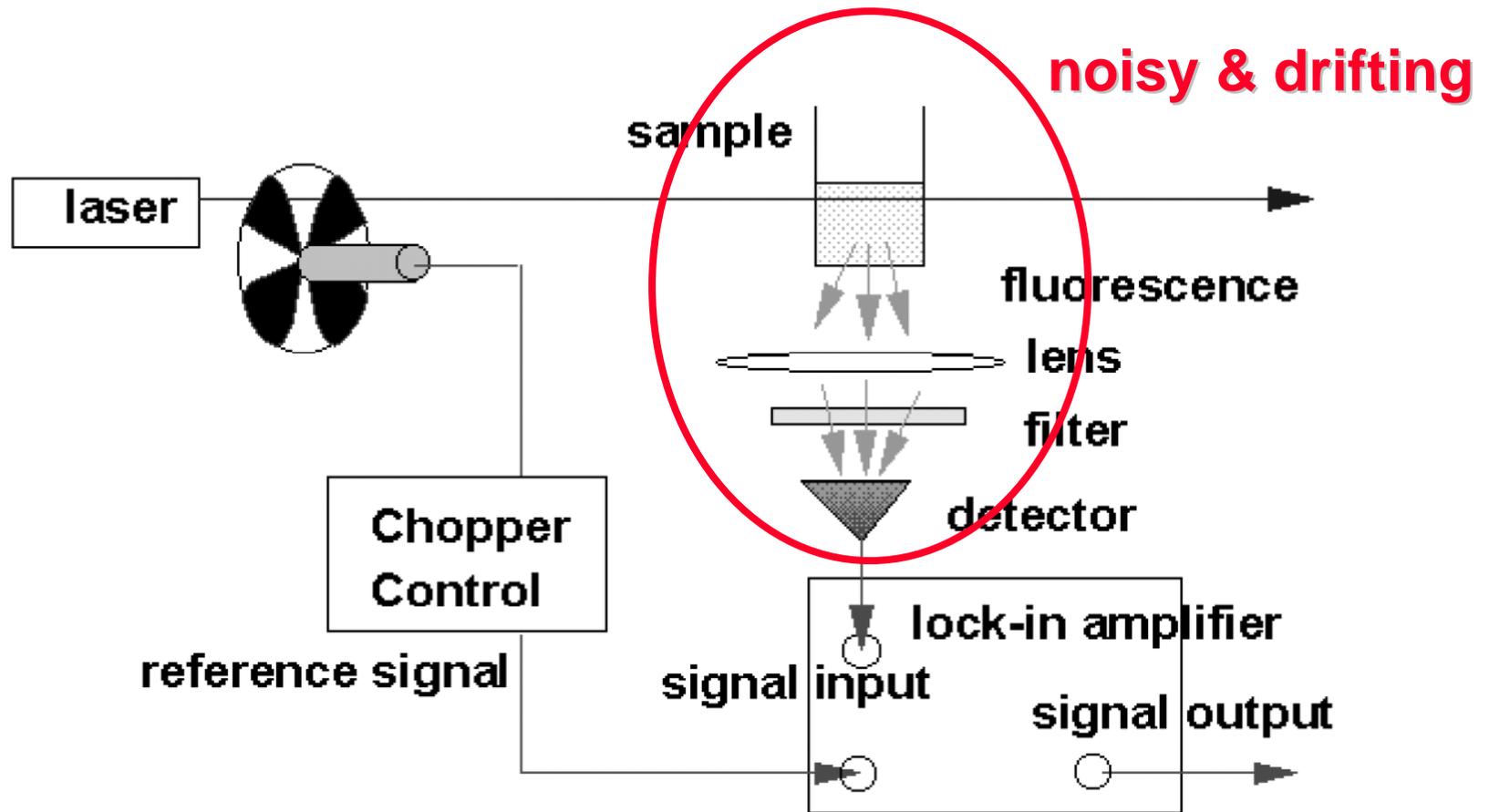
## Frequency dependence of noise

- **Low frequency  $\sim 1/f$** 
  - example: temperature (0.1 Hz), pressure (1 Hz), acoustics (10 -- 100 Hz)
- **High frequency  $\sim$  constant = white noise**
  - example: shot noise, Johnson noise, spontaneous emission noise
- **Signal/Noise ratio depends strongly on signal freq**
  - worst at DC, best in white noise region
- **Problem: most signals at DC or at low frequency**
- **Solution: chop, thus moving signal to high (chop) frequency**

Total noise in 10 Hz bandwidth:



# Phase-sensitive detection



# Quoting errors

## Fourth Test of General Relativity: New Radar Result

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(Received 15 March 1971)

New radar observations yield a more stringent test of the predicted relativistic increase in echo times of radio signals sent from Earth and reflected from Mercury and Venus. These “extra” delays may be characterized by a parameter  $\lambda$  which is unity according to general relativity and 0.93 according to recent predictions based on a scalar-tensor theory of gravitation. We find that  $\lambda = 1.02$ . The formal standard error is 0.02, but because of the possible presence of systematic errors we consider 0.05 to be a more reliable estimate of the uncertainty in the result.

