

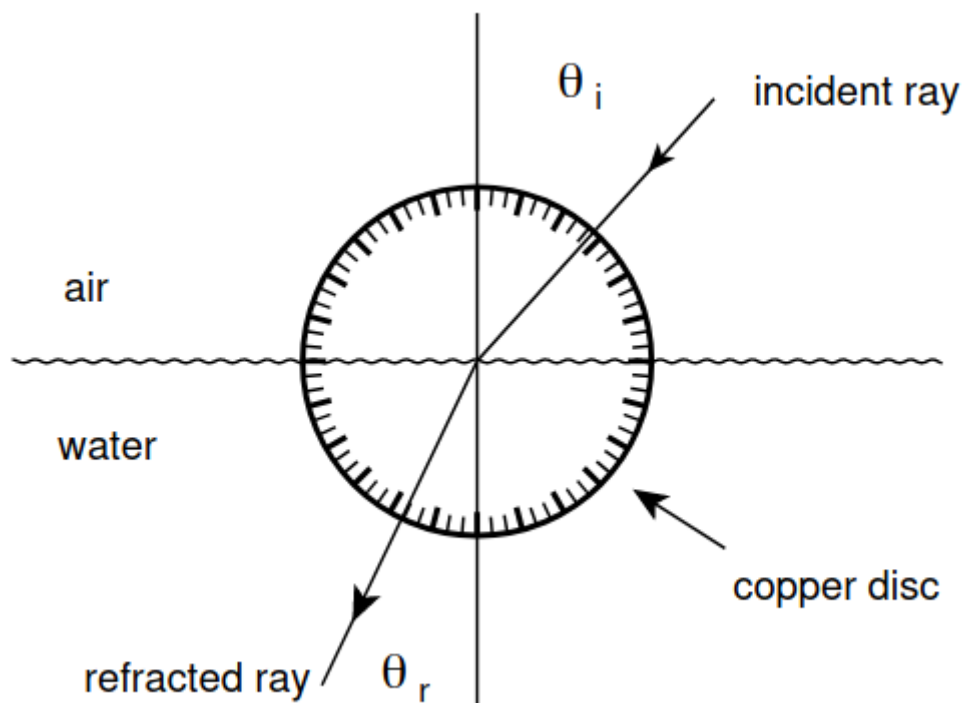
# PH2255 Week 19. Statistical Data Analysis 3.

Generic Python header: here the interactive/inline plotting style is selected, relevant libraries are imported, python2/3 compatibility is addressed.

```
In [1]: # %matplotlib inline
# this line is required for the plots to appear in the Jupyter cells,
# rather than launching the matplotlib GUI
%matplotlib widget
# this allows interactive view but you need to be in classic
# rather than CoCalc Jupyter notebook for this to work
from __future__ import division, print_function
import matplotlib
import matplotlib.pyplot as plt
import numpy as np
from scipy.optimize import curve_fit
import scipy.stats
```

## Exercise 3. Analysis of refraction data from Ptolemy

The astronomer Claudius Ptolemy performed experiments on the refraction of light using a circular copper disc submerged to its centre in water:



Angles of refraction  $\theta_r$  for 8 values of the angle of incidence  $\theta_i$  obtained by Ptolemy around 140 A.D. are given in the Table 2 (reproduced from Glen Cowan's "Introduction to Statistic Methods"):

Table 2: Angles of incidence and refraction (in degrees).

$\theta_i$	$\theta_r$
10	8
20	$15\frac{1}{2}$
30	$22\frac{1}{2}$
40	29
50	35
60	$40\frac{1}{2}$
70	$45\frac{1}{2}$
80	50

For purposes of this exercise we will take the angles of incidence to be known with negligible error and treat the angles of reflection as independent Gaussian-distributed measurements with standard deviations of  $\sigma = \frac{1}{2}^\circ$ . (This is a reasonable guess given that the angles are reported to the nearest half degree. Note that we can absorb an error in  $\theta_i$  into an effective error in  $\theta_r$ .)

In this exercise you will need to input the data into Python yourself.

In [2]: `# Define the data set`

**Report the parameter estimates, their standard deviations, and where relevant the covariance matrix for all of the fits below. Make plots of the fitted curves and the data.**

### Exercise 3(a).

Until the discovery of the correct law of refraction (see below), a commonly used hypothesis was

$$\theta_r = \alpha\theta_i,$$

although it is reported that Ptolemy preferred the formula

$$\theta_r = \alpha\theta_i - \beta\theta_i^2.$$

Find the least-squares estimates of the parameters for both hypotheses and determine the minimized  $\chi^2$ . Comment on the goodness-of-fit for both hypotheses. Is it plausible that all of the data values are based on actual measurements?

In [3]: `# Exercise 3a`

### Exercise 3(b).

The law of refraction discovered by the Persian mathematician and physicist Ibn Sahl in the 10th century and rediscovered by others including Snell in 1621 is

$$\theta_r = \sin^{-1} \left( \frac{\sin \theta_i}{r} \right),$$

where  $r = n_r/n_i$  is the ratio of indices of refraction of the two media.

Determine the least-squares estimate for  $r$  and find value of the minimized  $\chi^2$ . Comment on the validity of assumption that  $\sigma = \frac{1}{2}^\circ$ .

Suggestions: `np.sin(x)` returns  $\sin x$  for angle  $x$  measured in radians; `np.arcsin(y)` returns  $\sin^{-1} y$  in radians; `np.deg2rad(x)` and `np.rad2deg(x)` convert between degrees and radians. All these functions correctly handle `np.array` arguments.

In [4]:

```
# Exercise 3b
```

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26/01/2021. This Jupyter notebook was assembled by Lev Levitin based on the course written by Glen Cowan.