

What is Signal Processing?

Signal Processing

Digital vs Analog

Digital Signal Processing (DSP)

Sampling frequency (Rate)

Aliasing

Nyquist's Theorem

Quantization and Quantization Noise

Peak clipping and Dynamic Range

Overflow (Wrapping)

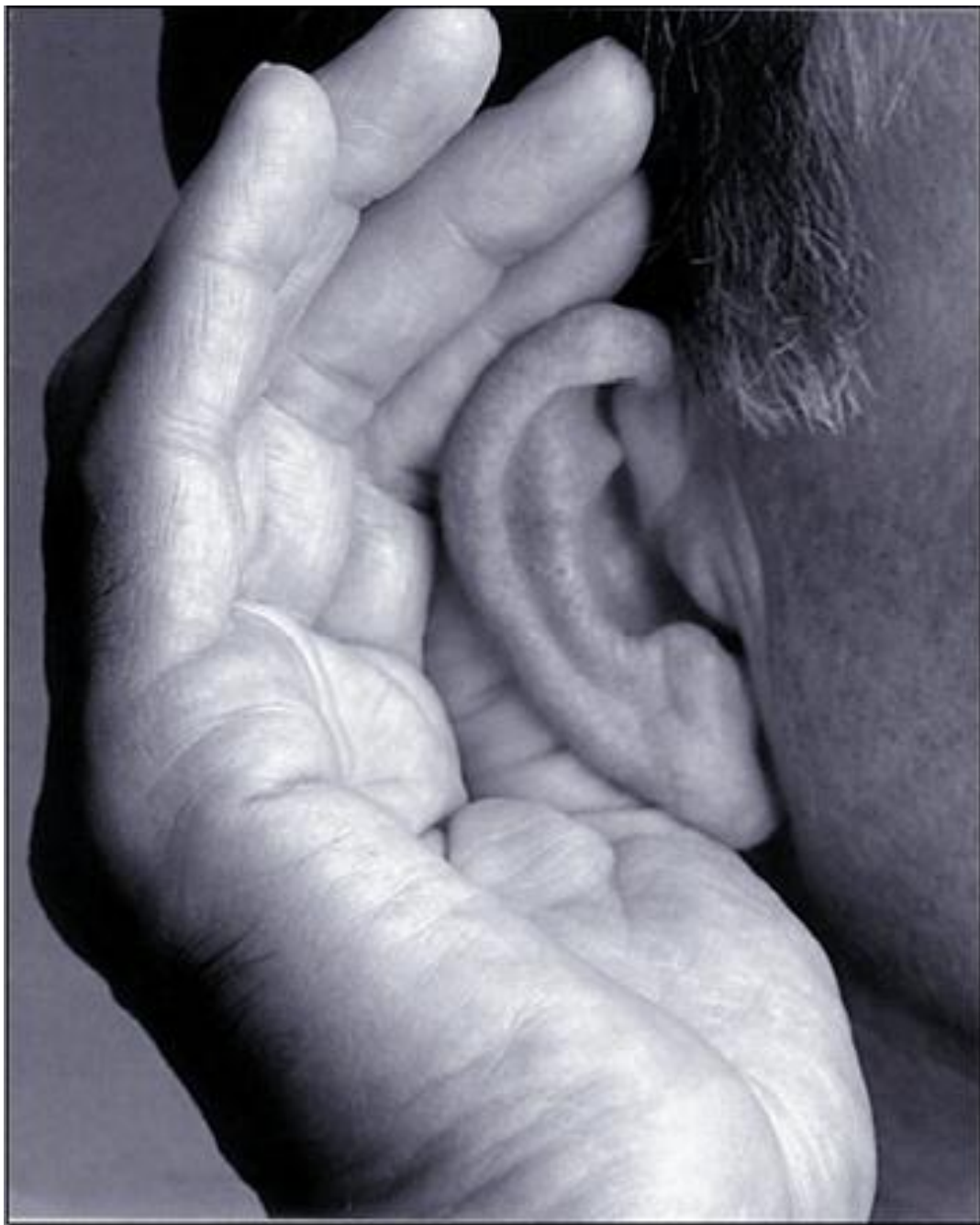
Extraction,

enhancement,

or recovery

of information from a signal.

We have
built-in signal processing



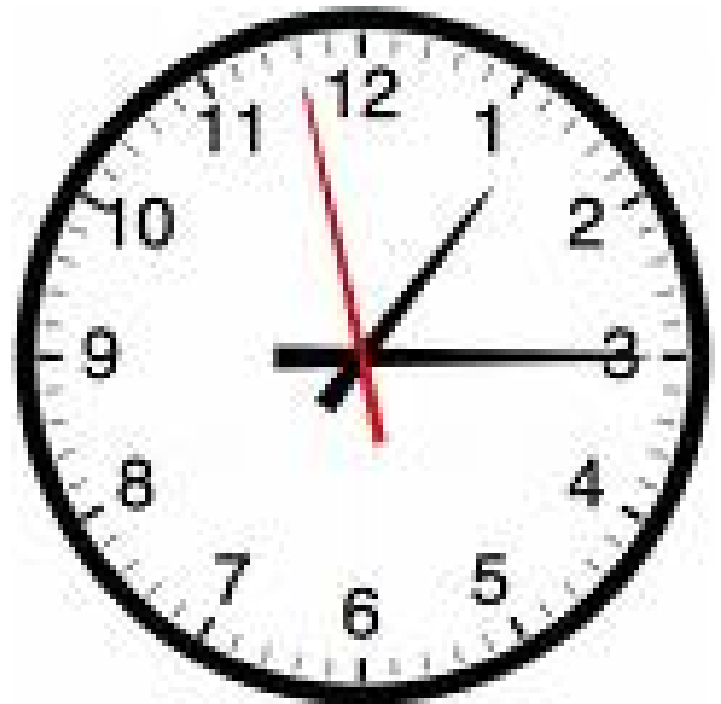


And

We have instruments to
enhance signal processing.







Natural signals vary along a
continuum.

Such natural continuous
signals are **analog**.

BUT

the most amazing advances in
signal processing

have been made possible by
computers.

To be analyzed with
computers...

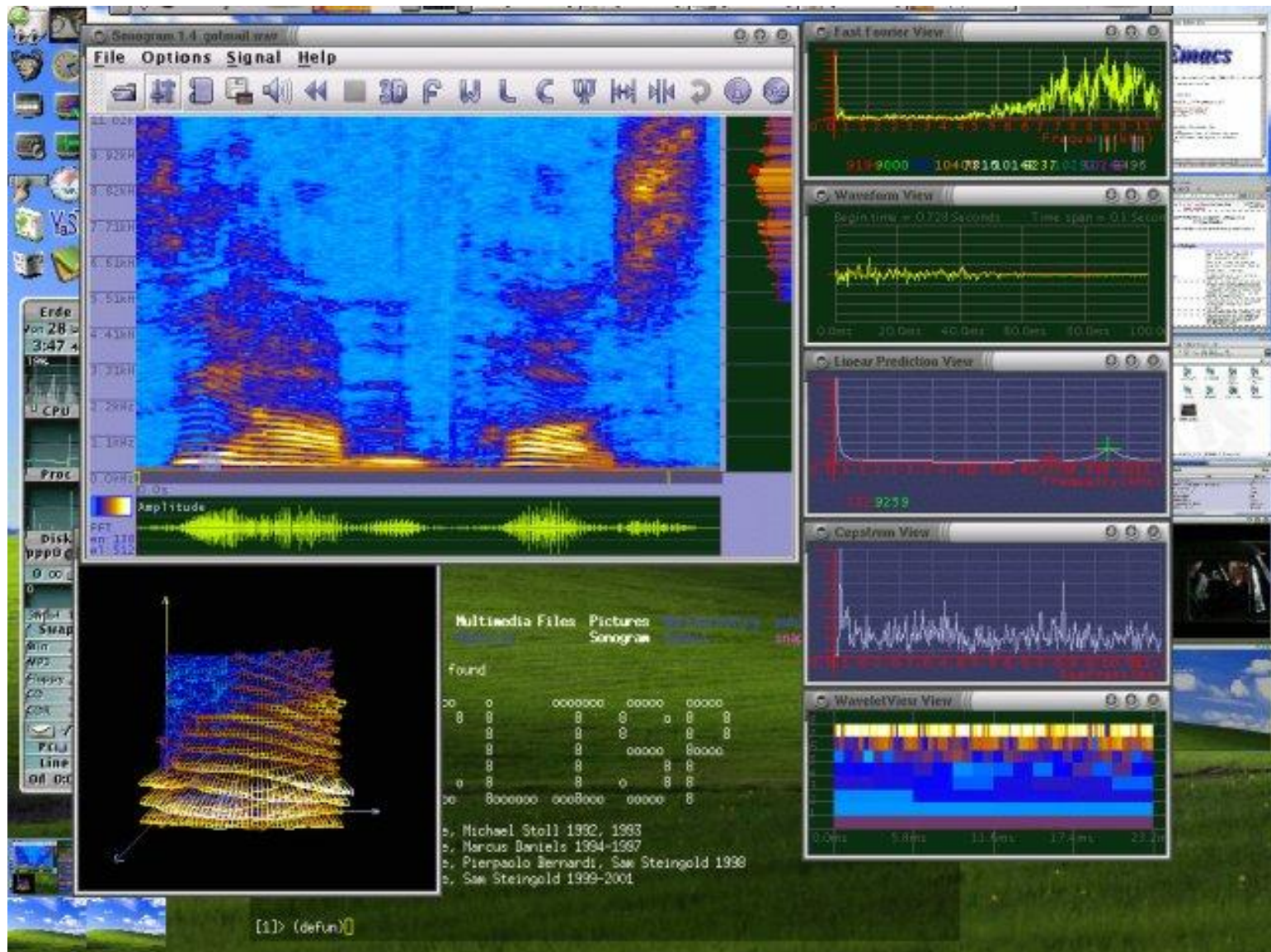
Signals must be digitized.

So, the whole field is called

Digital Signal Processing

and it's Ubiquitous

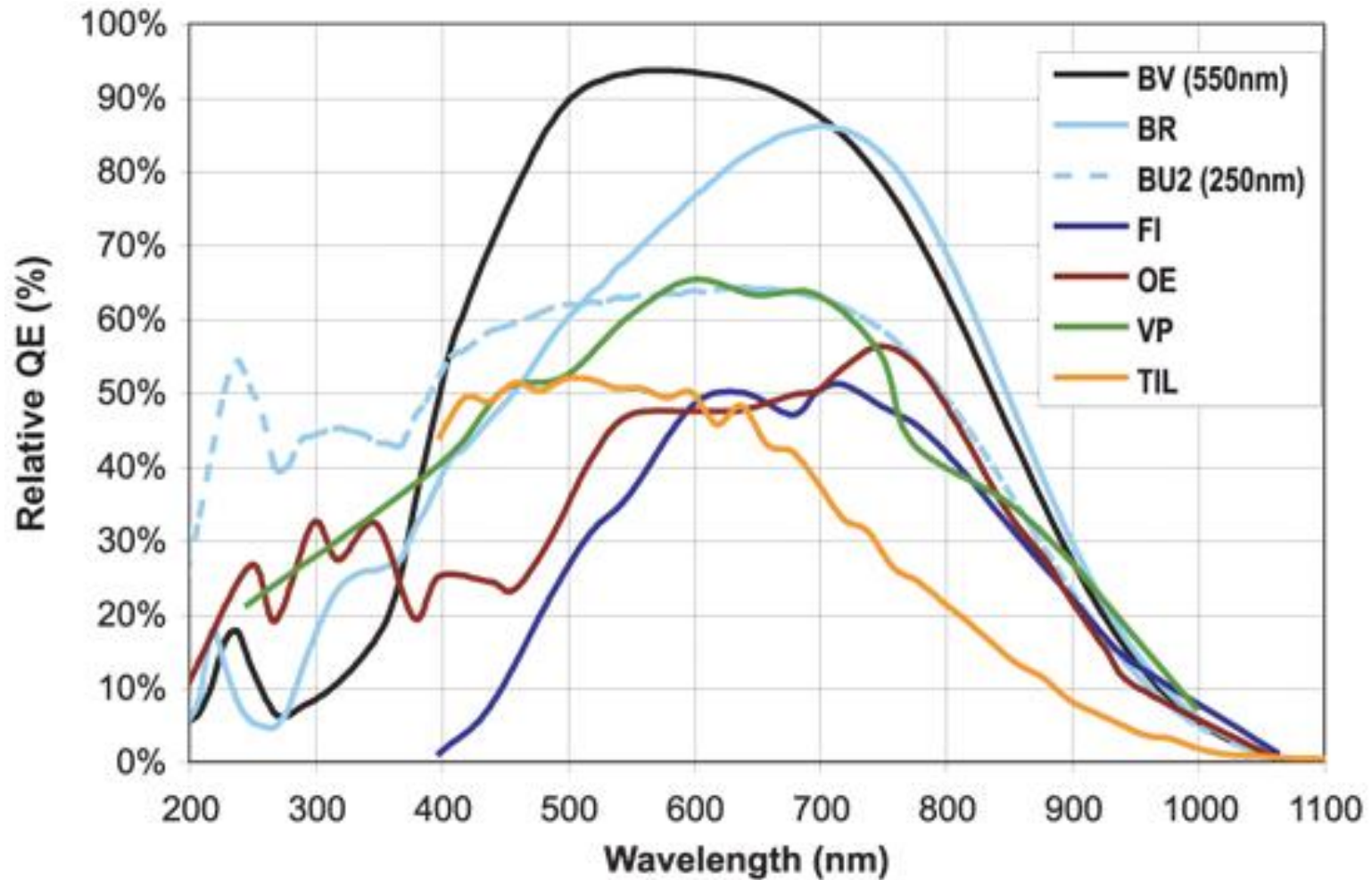
Acoustic Analysis



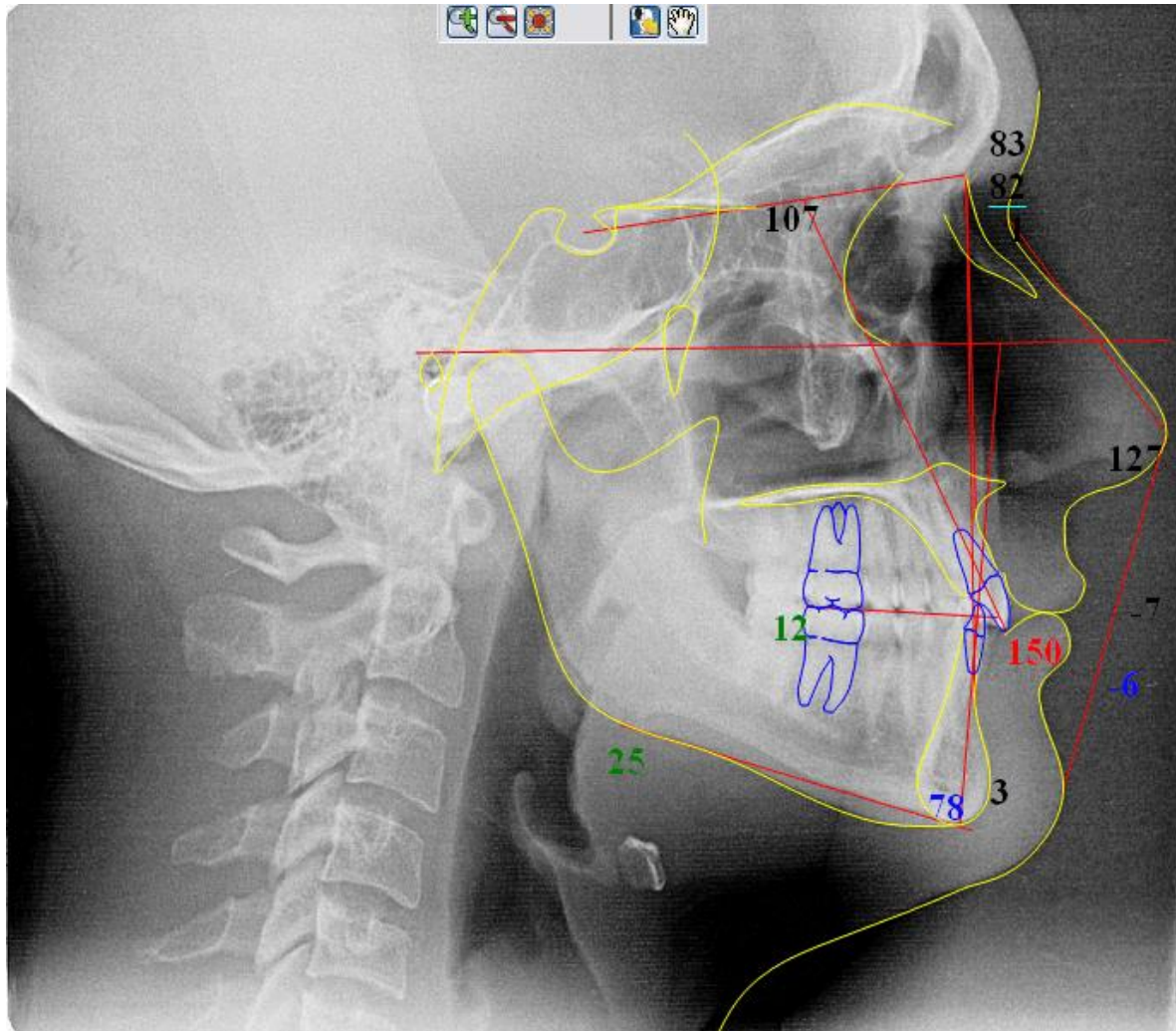
Art



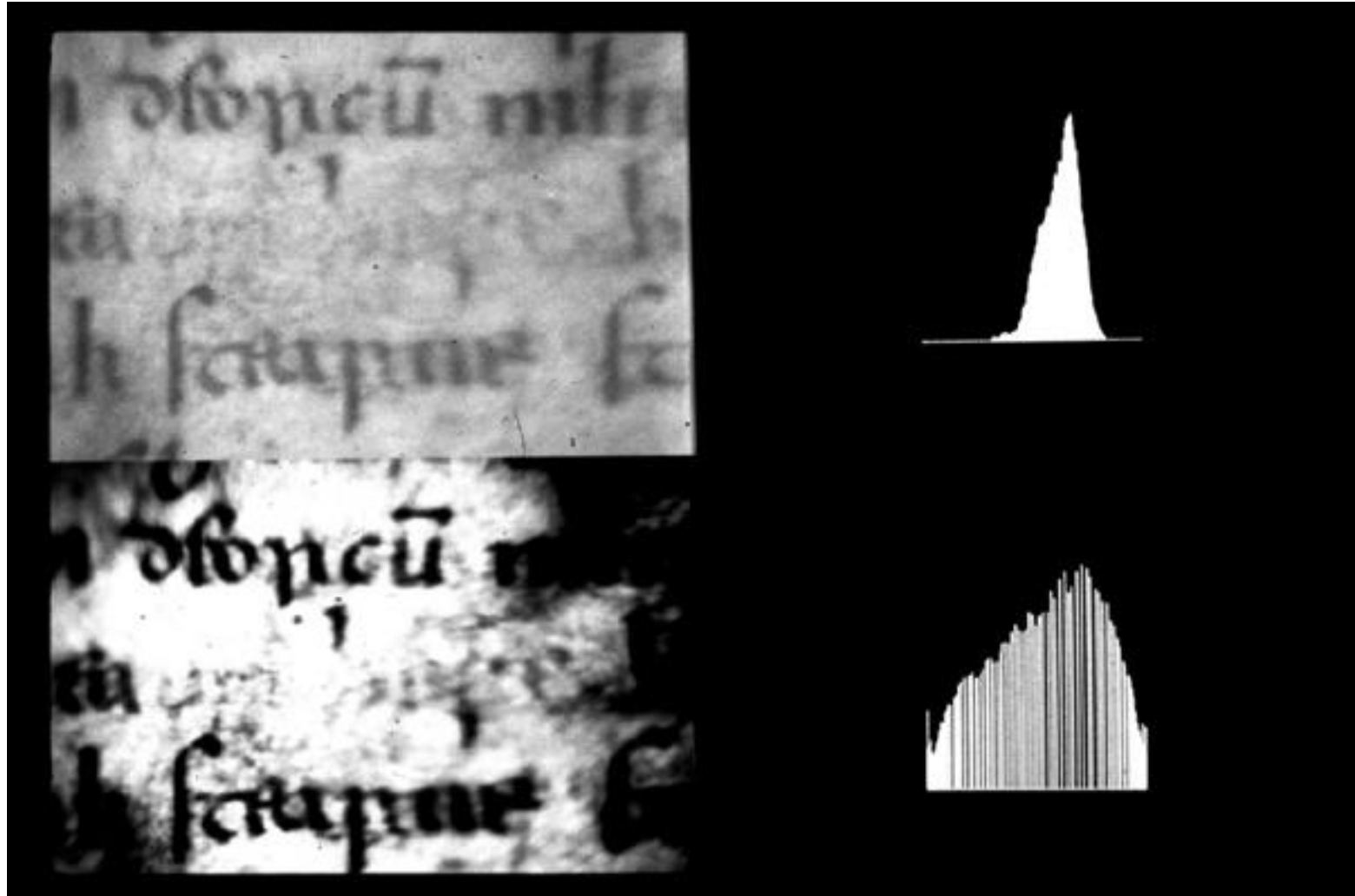
Astronomy



Dentistry



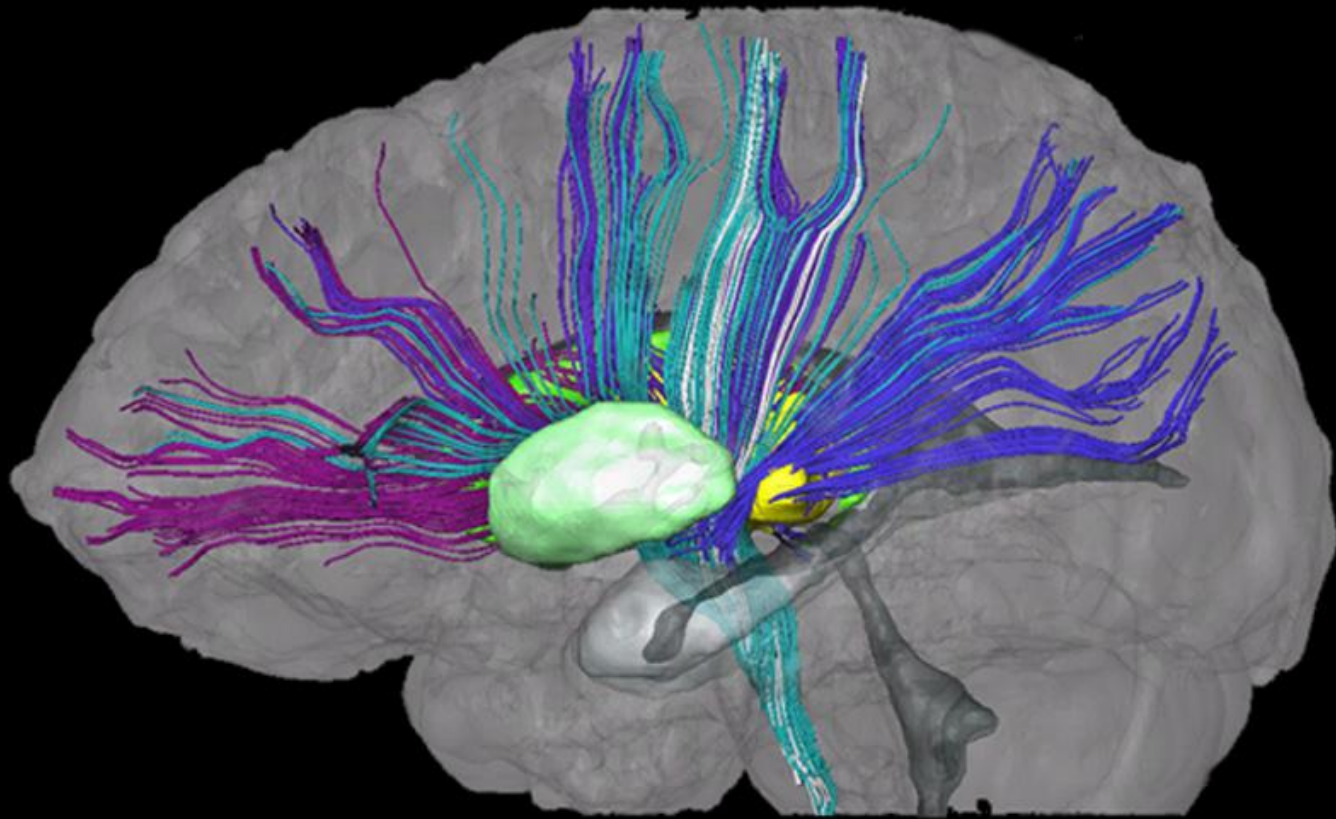
Document Restoration



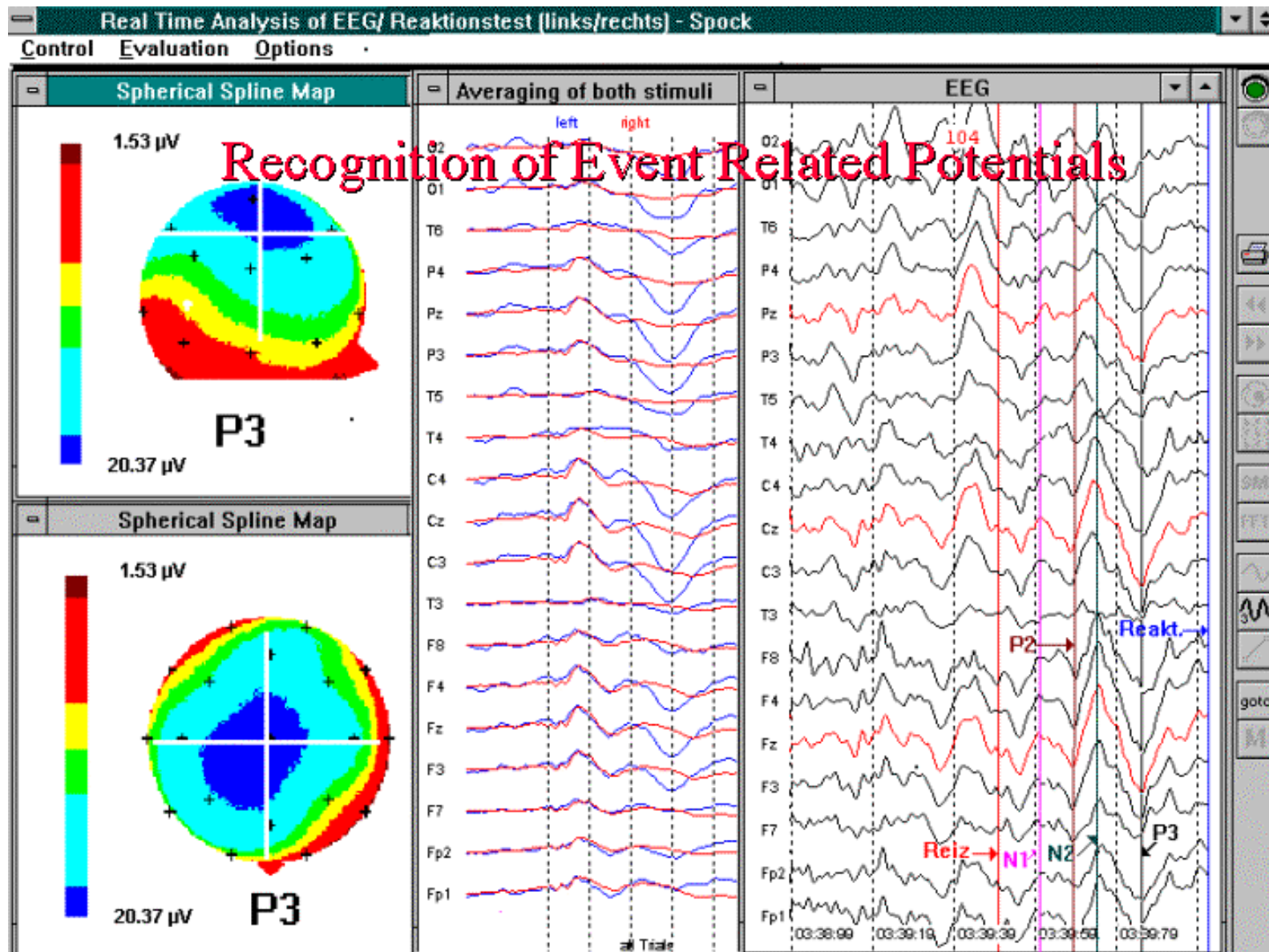
130
ende þasyc he him aſet don ſeſen
denne heah ofen heapod leon holim by
ſaſon on ſaſ ſeſ him þaſ ſeomor ſeſa
munende mod men ne cunnon ſeſan a
ſode ſele ꝥædenne hæled under heofen
þa þam hlæſte on feng

1.
D A þaſ on buſum beoþulſ ſeſ dīnza be
leod cýnīng longe þraſe folcum ſeſne
ſe ꝥæden ellor hþeapꝥ aldor of ear de
of þ him æt on poc heah heaſ dene heold
þenden līde ſamol 7 ſud ꝥeowꝥ glæde ſeſ
dīnzaſ dām ꝥeowꝥ beapn fōrd ſeſmed in
poſold pocum ꝥeowda ꝥæſpa heowꝥ ſaſ
hþod ſaſ 7 halga til hþide ic þelan cō
heado ſeſfīnzaſ heaſ ſebedda þaþaſ hþod
ſaſe hepe ſped ſýſen ꝥiſeſ ꝥeowd mýnd þ
him hþ ſine maſaſ ſeowne hþdon odd þ
ſe ſeow ſod ſeþeow maſe dþeſe micel hþ
on mod beapn þ hail ꝥeowd hþaſn polde

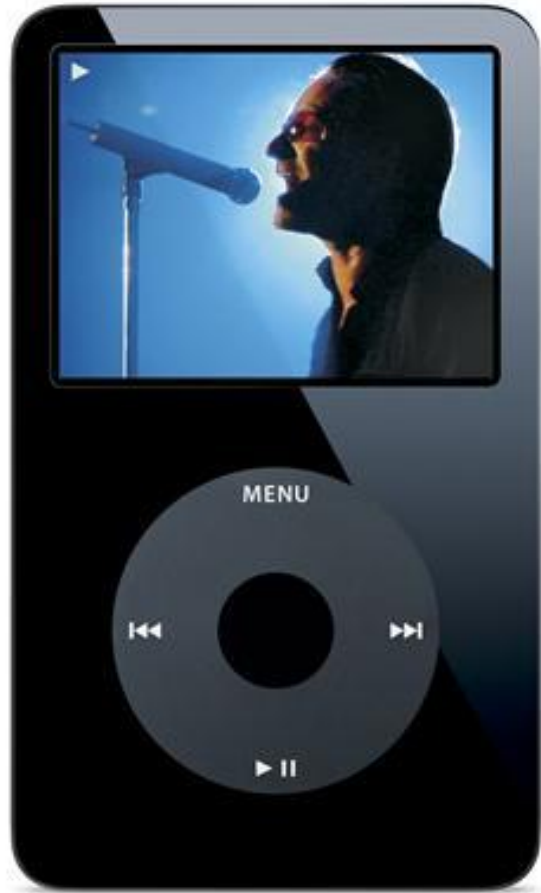
DTI



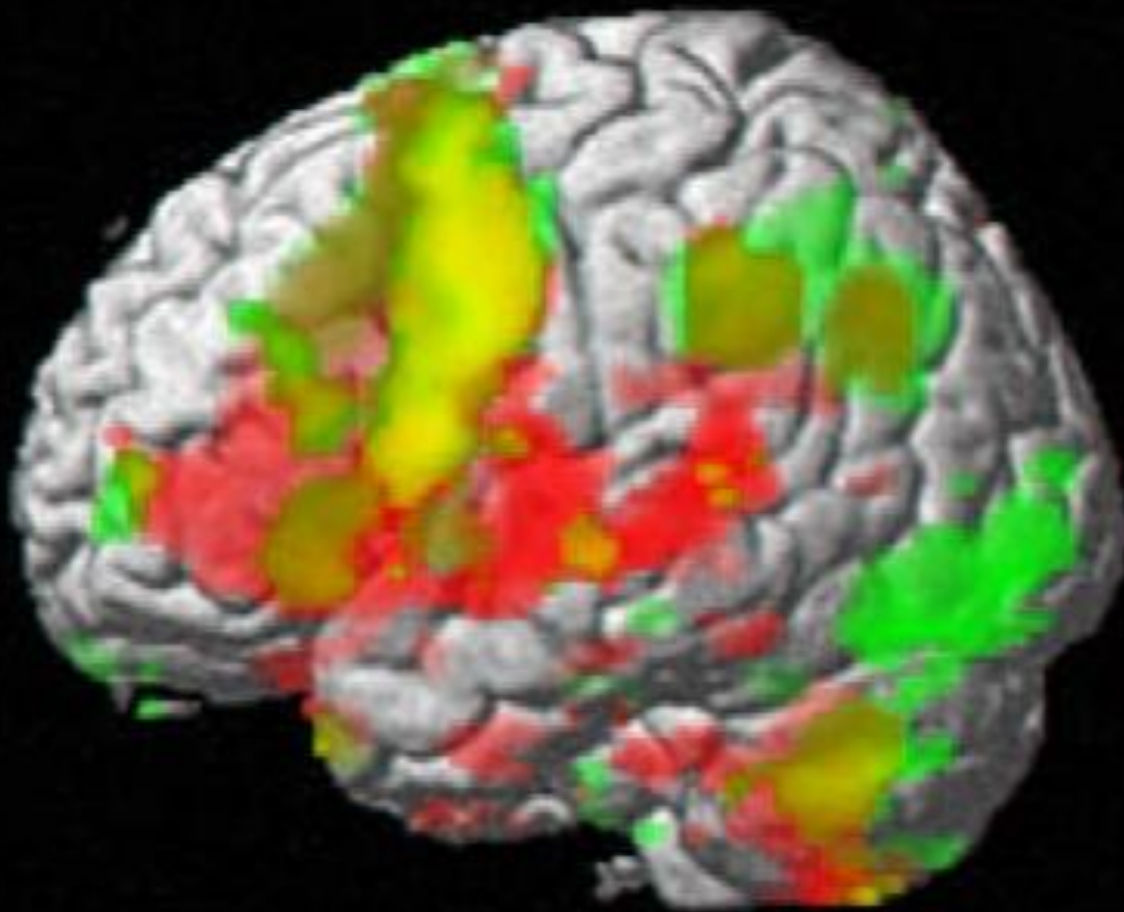
EEG



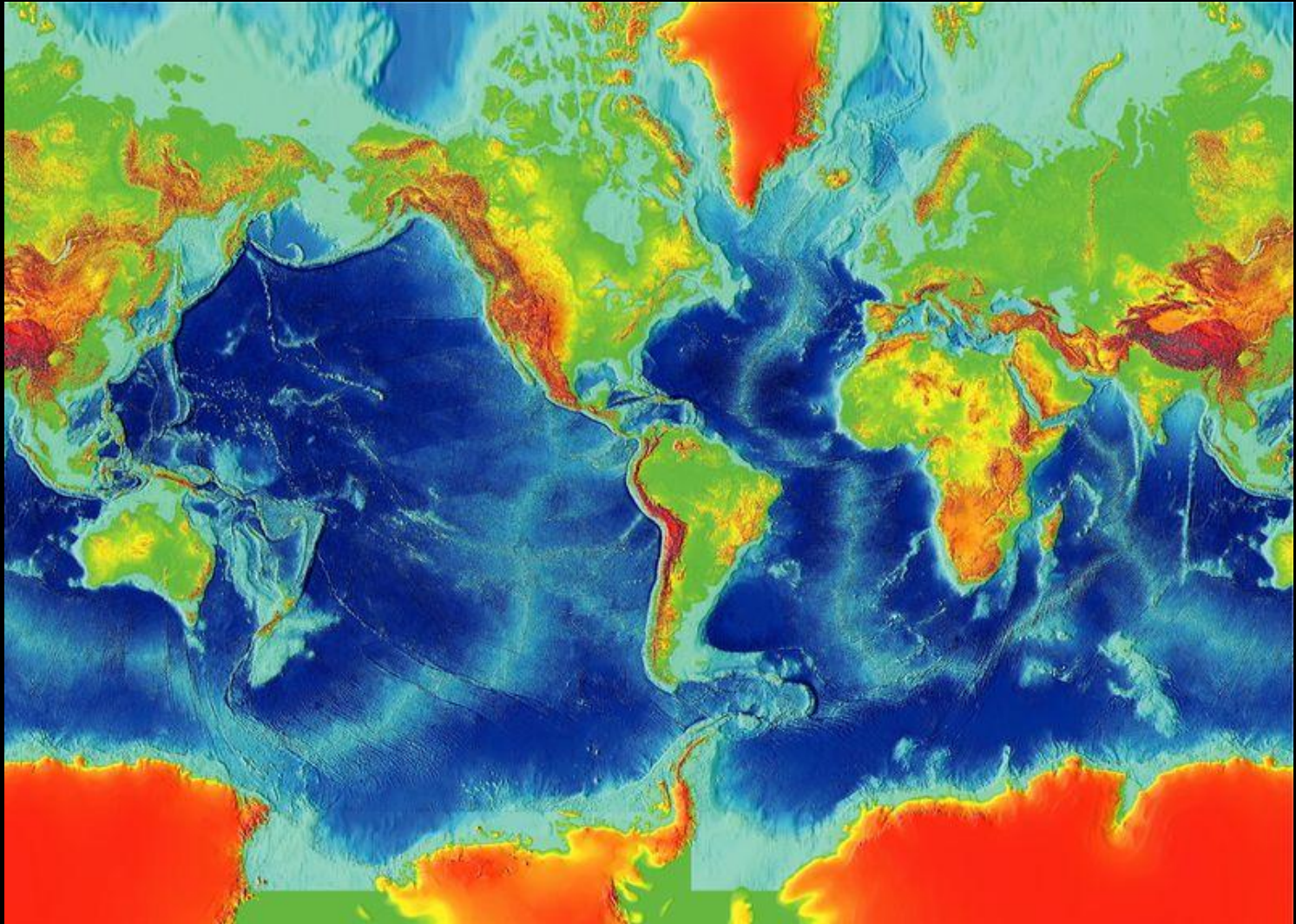
Entertainment



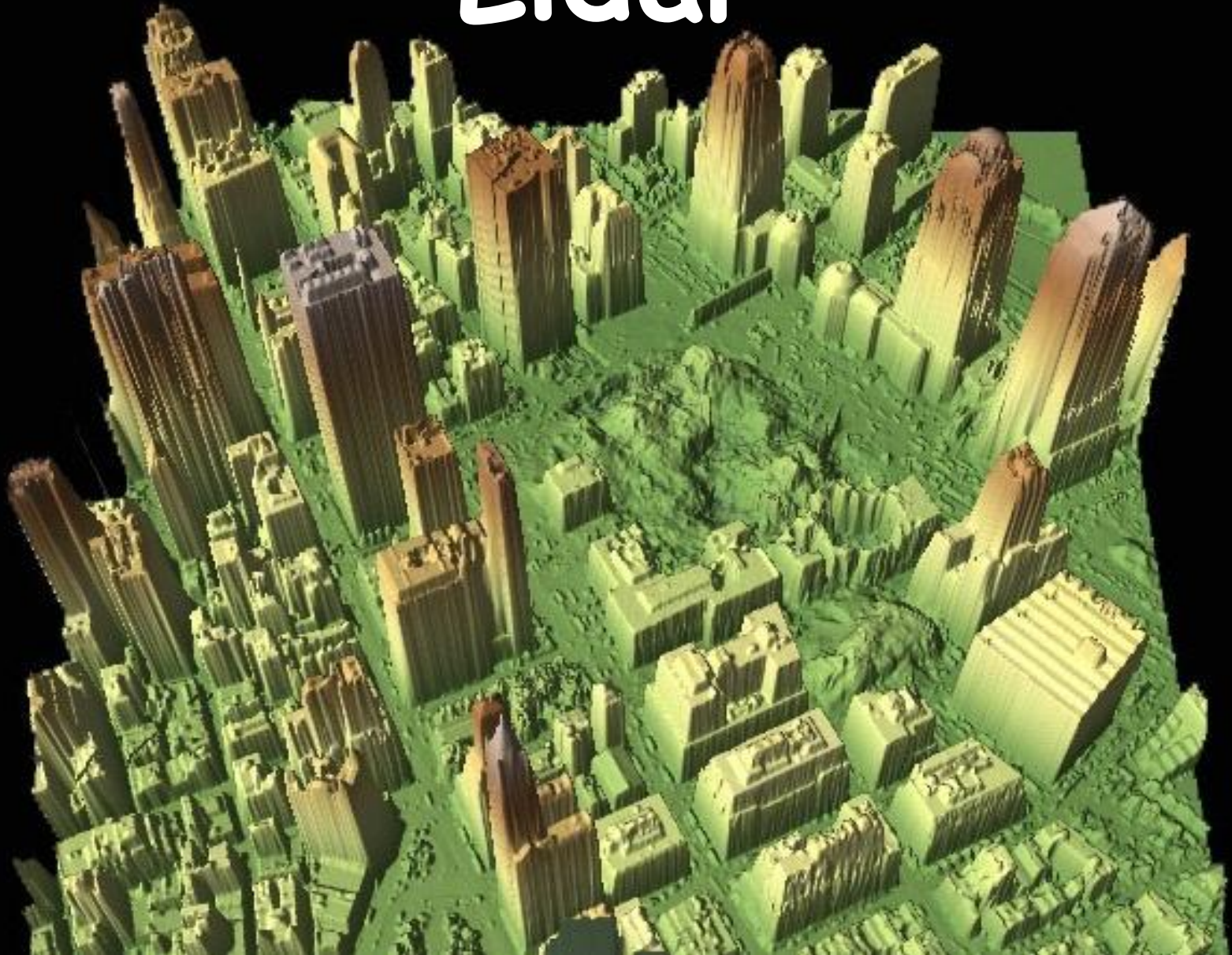
fMRI



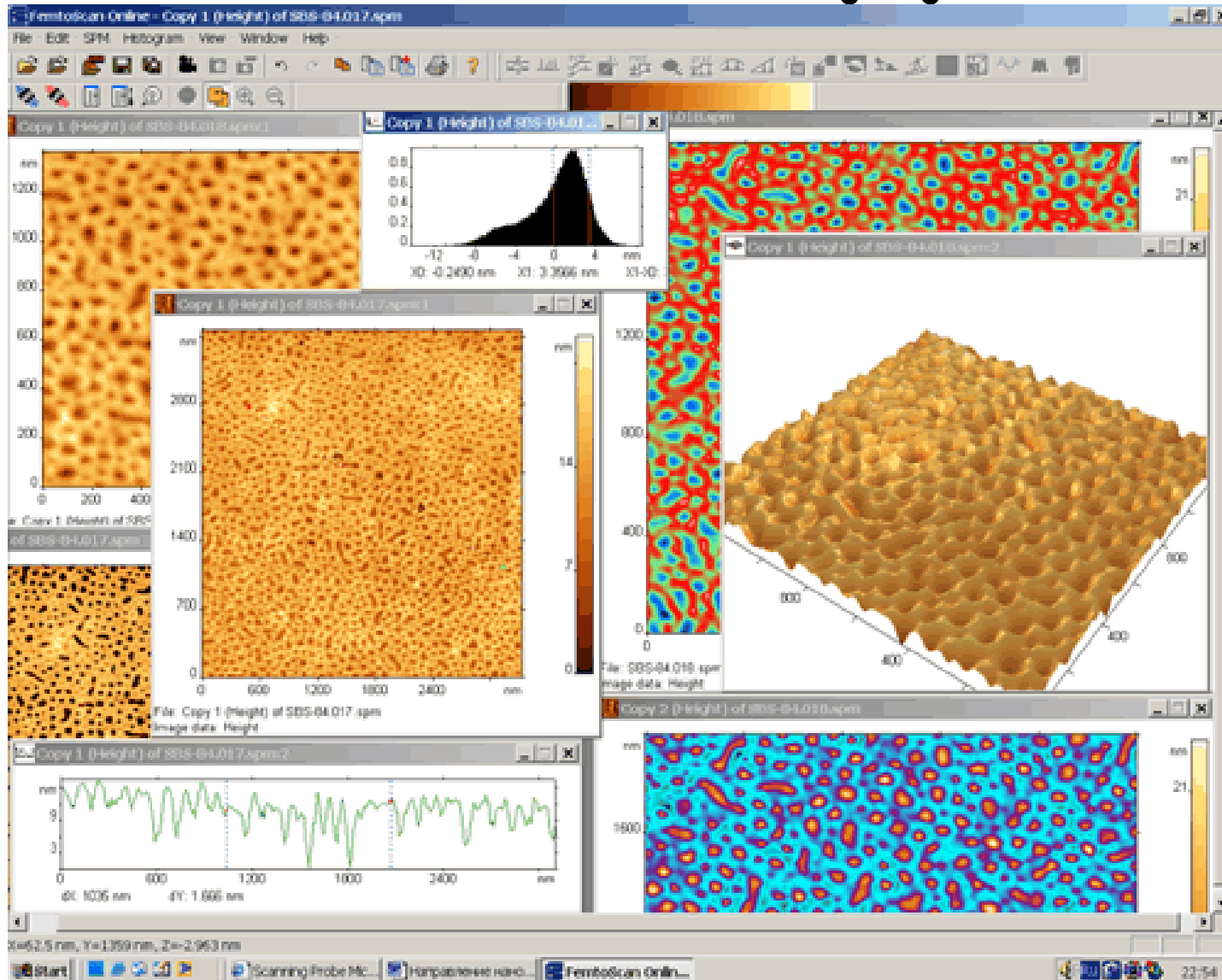
Geo-Imaging



Lidar



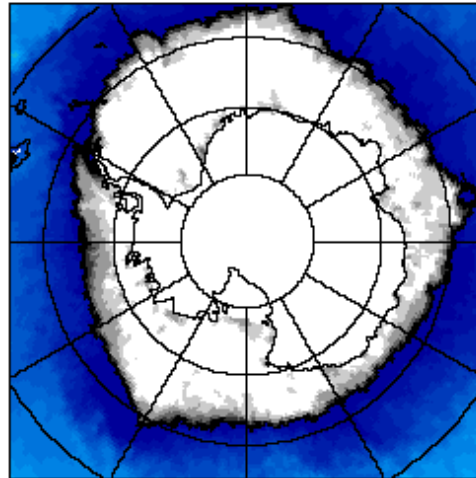
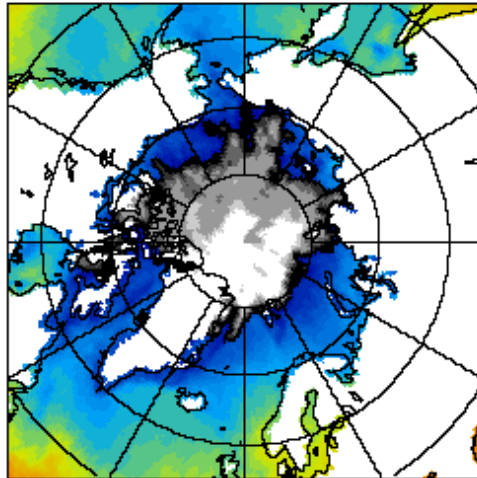
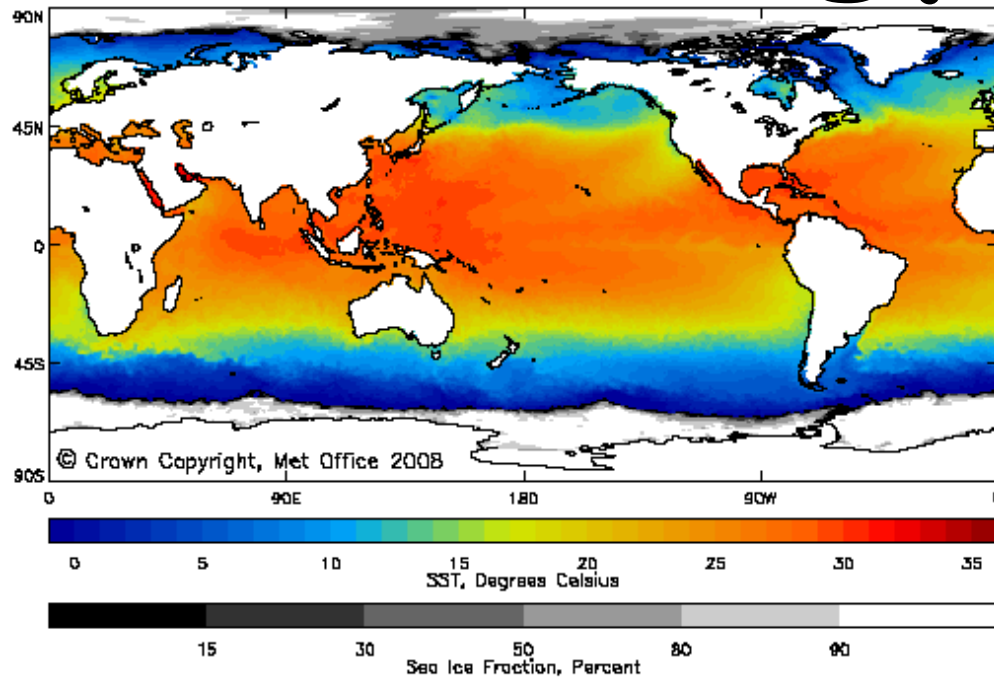
Microscopy



PET Scanning



Meteorology

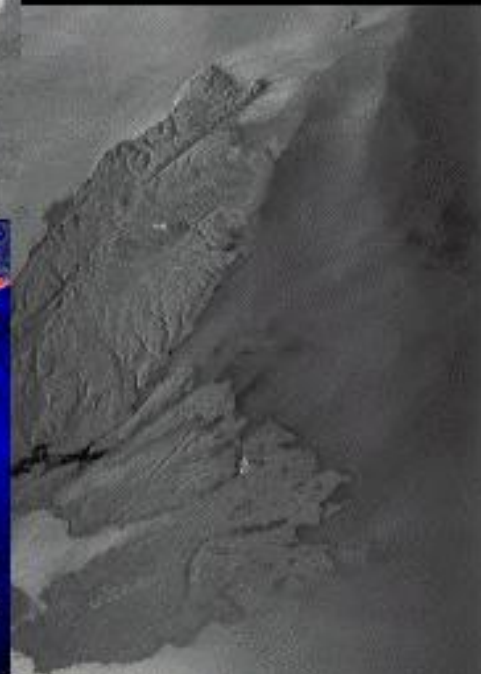
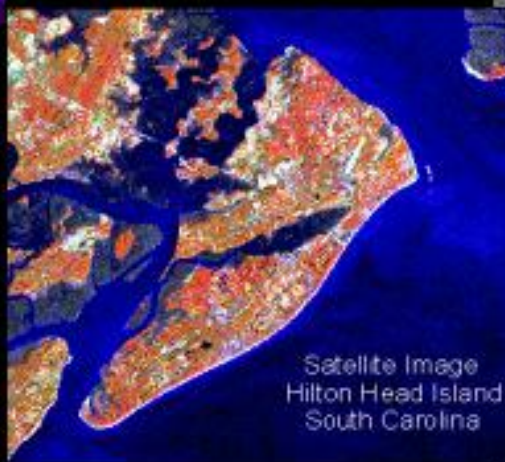
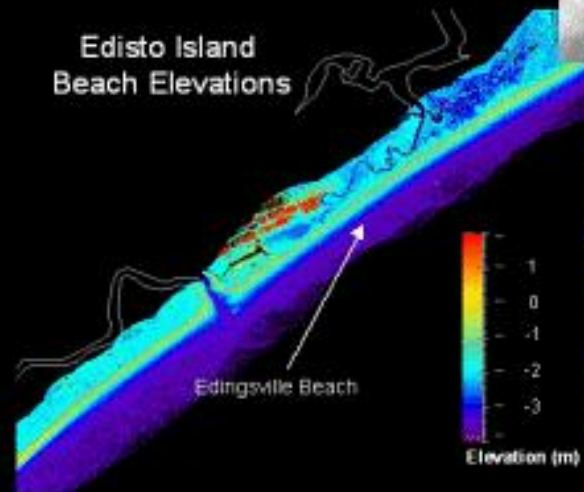
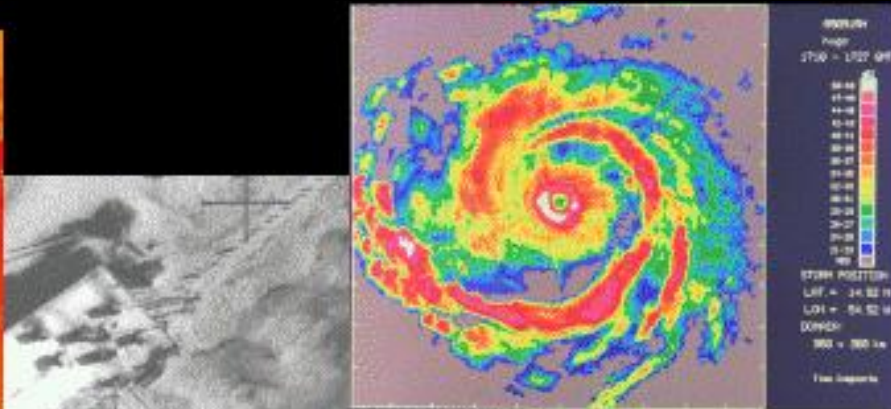
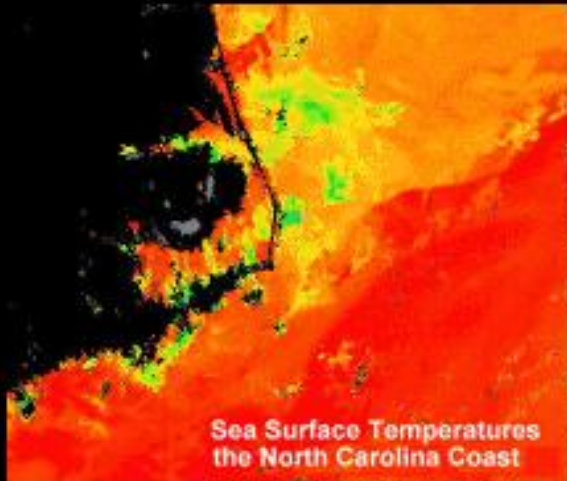


Regional 3D Radar

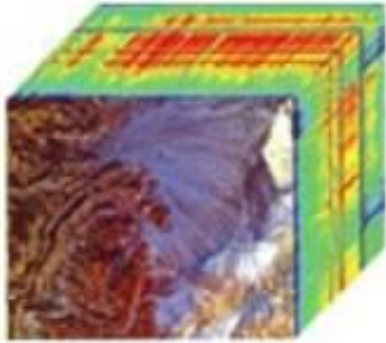
08/16/08 10:36 PM CT



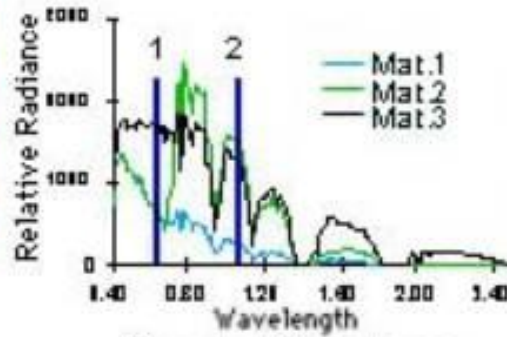
Remote Sensing



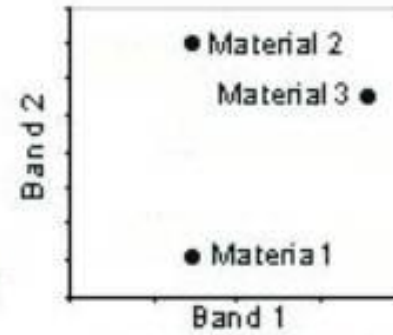
Seismology



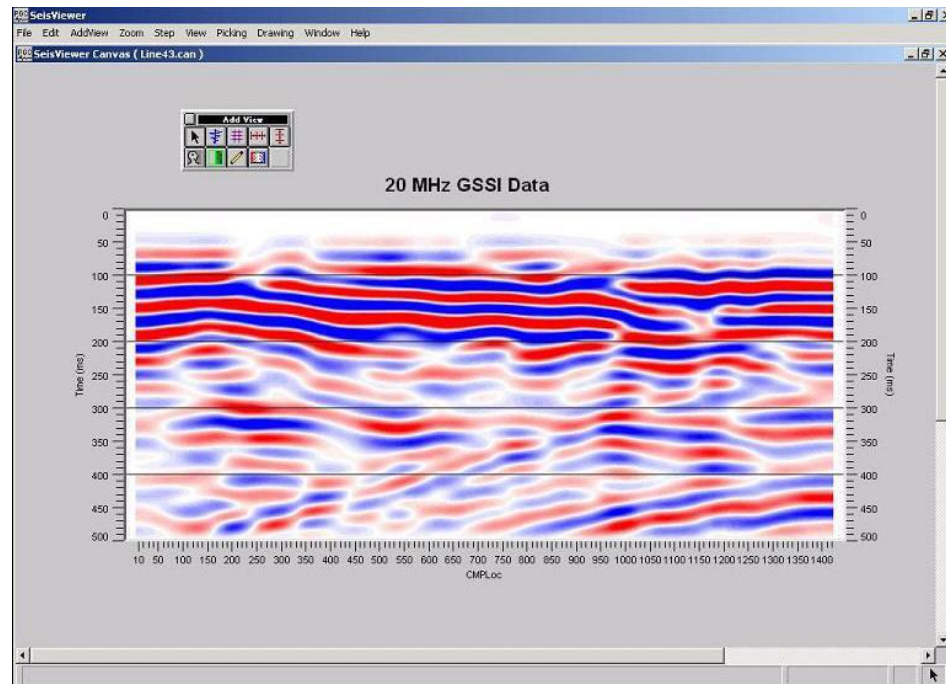
Image



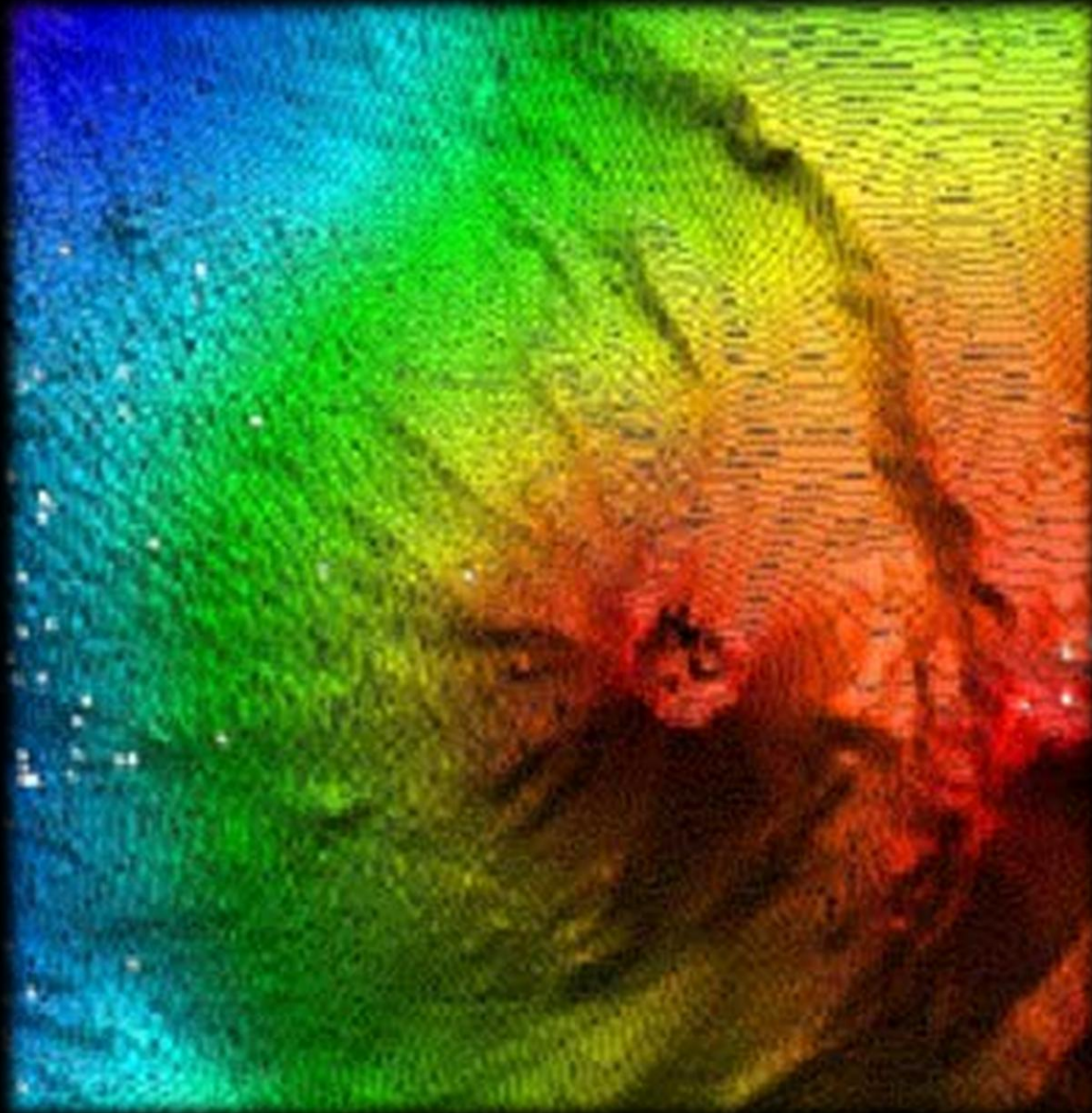
Spectral Signatures



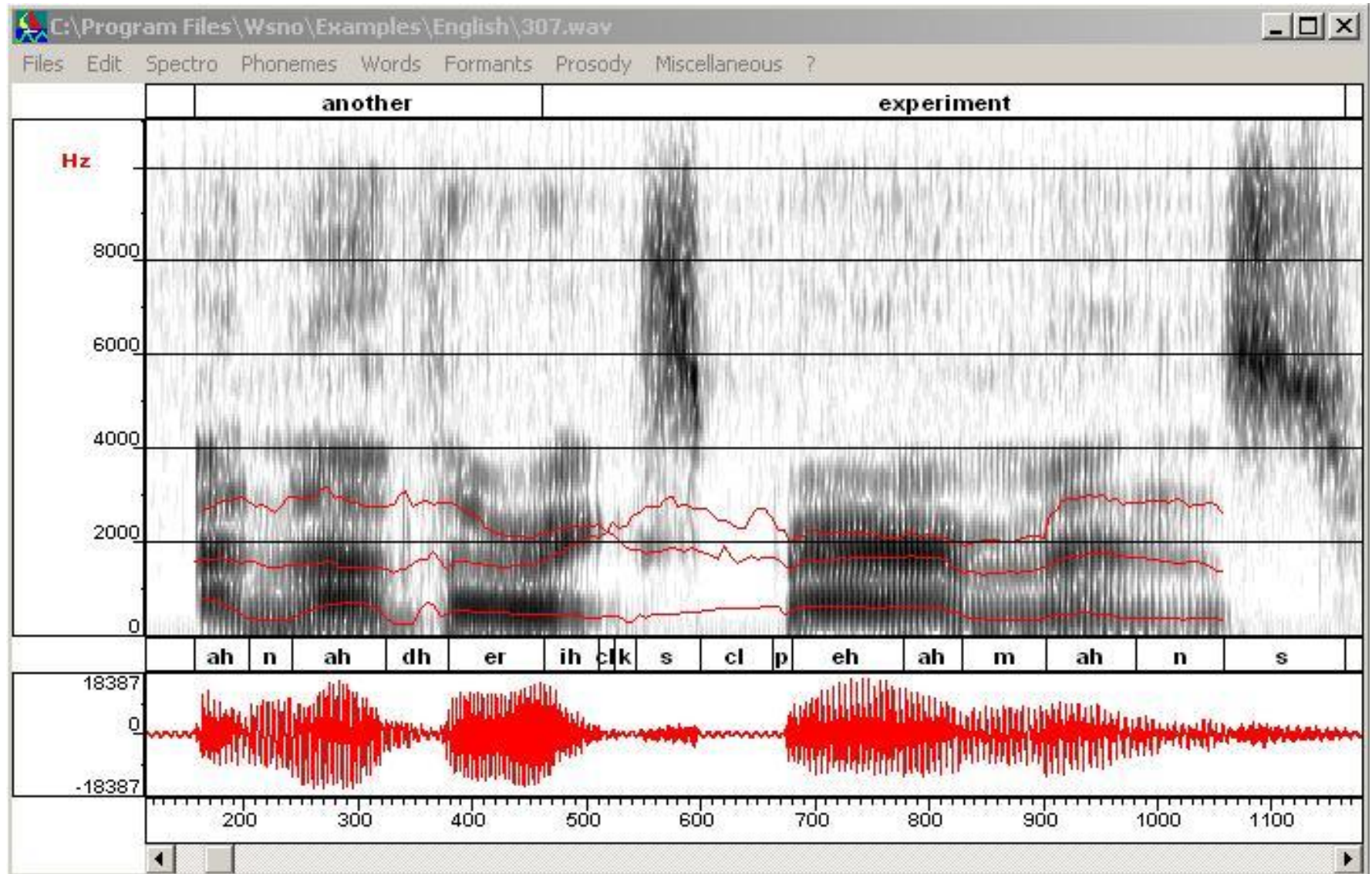
Discrete Space



Sonar



and Voice Analysis

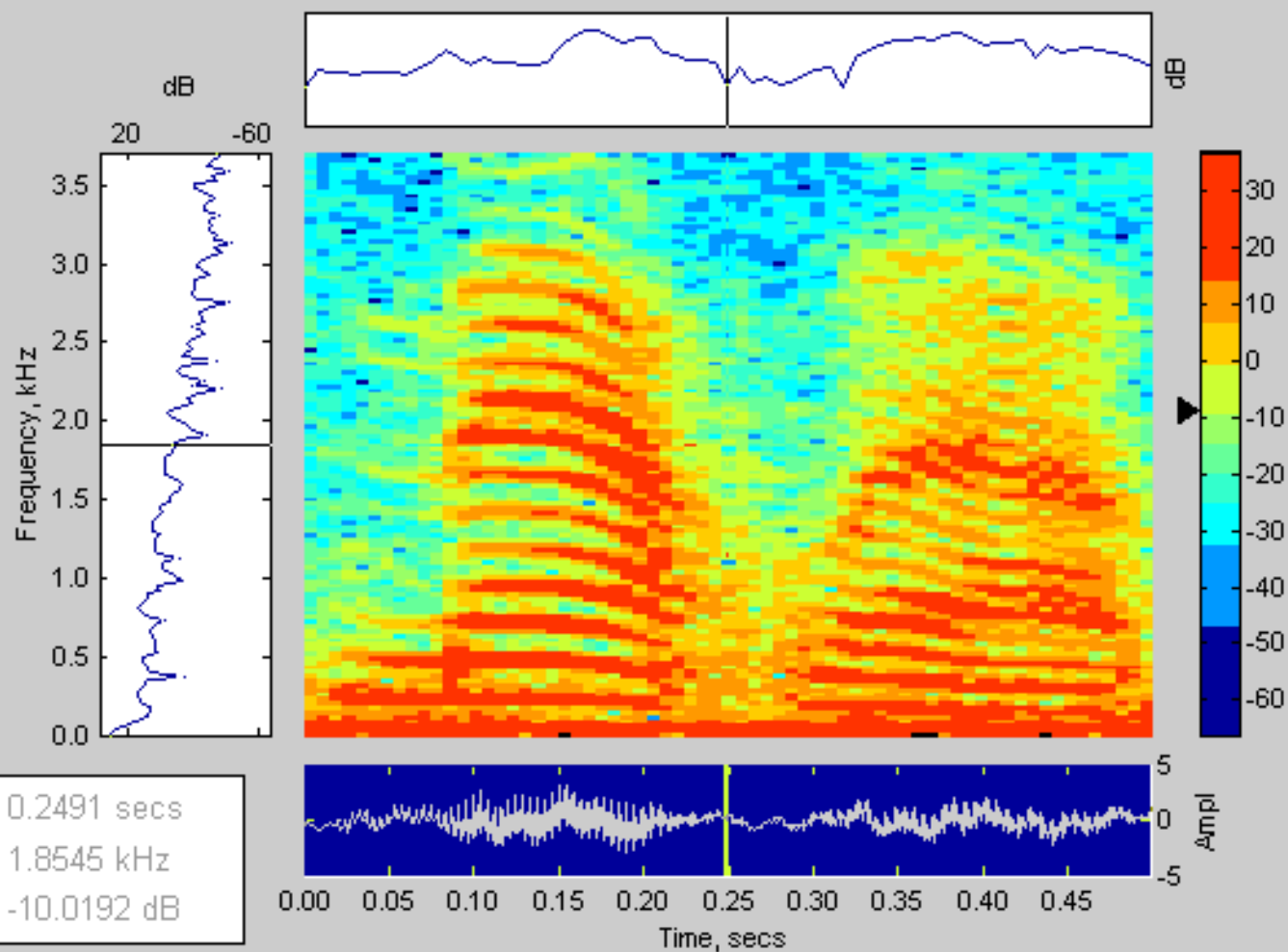


Spectrogram Demo

File Window Help



Data=[4001x1], Fs=7.418 kHz



Ready

Nwin: 256

Nlap: 200

Nfft: 256

to name a few.

So, what is
digitization?

Representing an otherwise
continuous signal with a
discrete set of samples.

**Digital
Discrete**


**Analog
Continuous**



How many samples are there in that "discrete set of samples"?

Good Question

Sampling Frequency
(Sampling Rate) is the
number of samples we
take...



```
graph TD; A[Sampling Frequency (Sampling Rate) is the number of samples we take...] --> B[per unit of time (e.g., per second for sounds)]; A --> C[Or per unit of space (e.g., per picture height)];
```

per unit of time
(e.g., per second for
sounds)

Or per unit of space
(e.g., per picture
height)

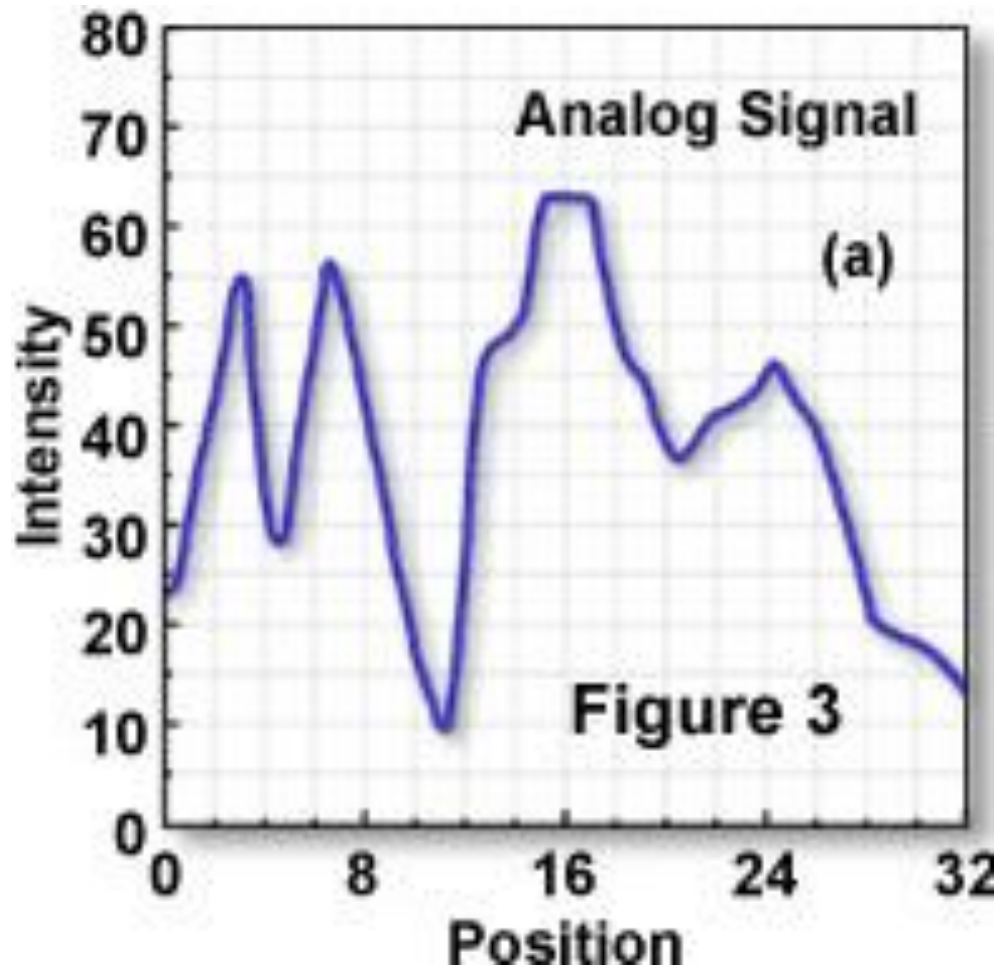
The higher the sampling frequency, the better the resolution,



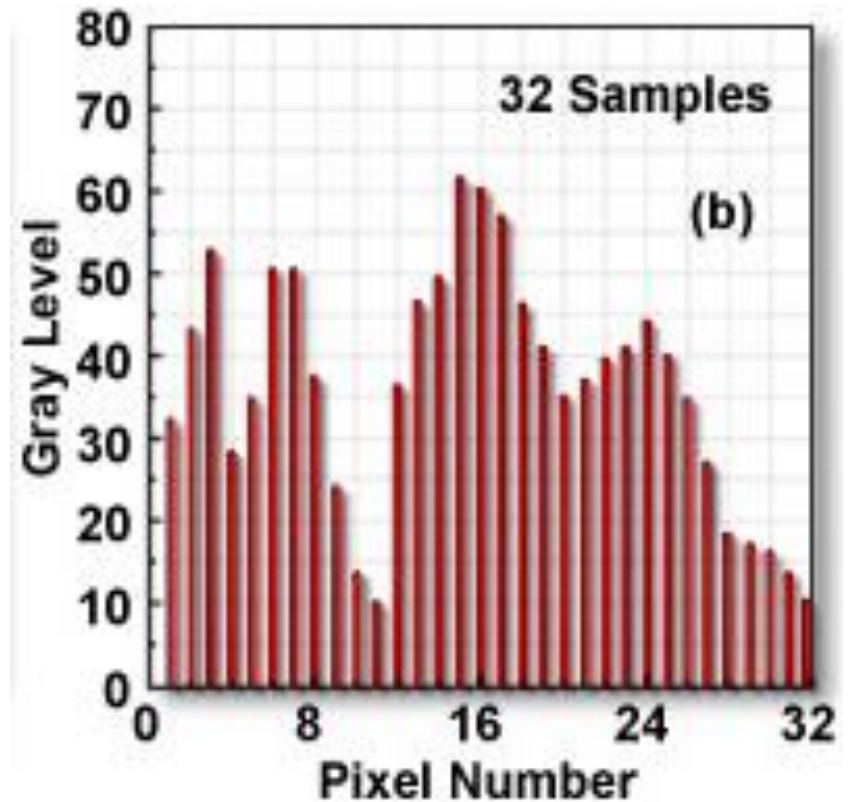
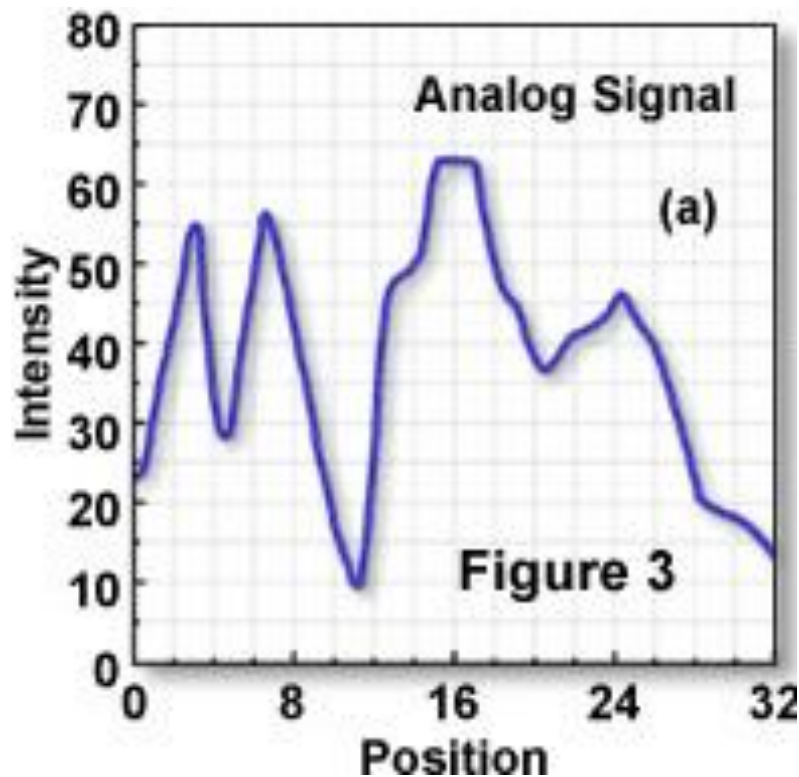
but the better the resolution,
the more space it takes to
store on your hard drive.



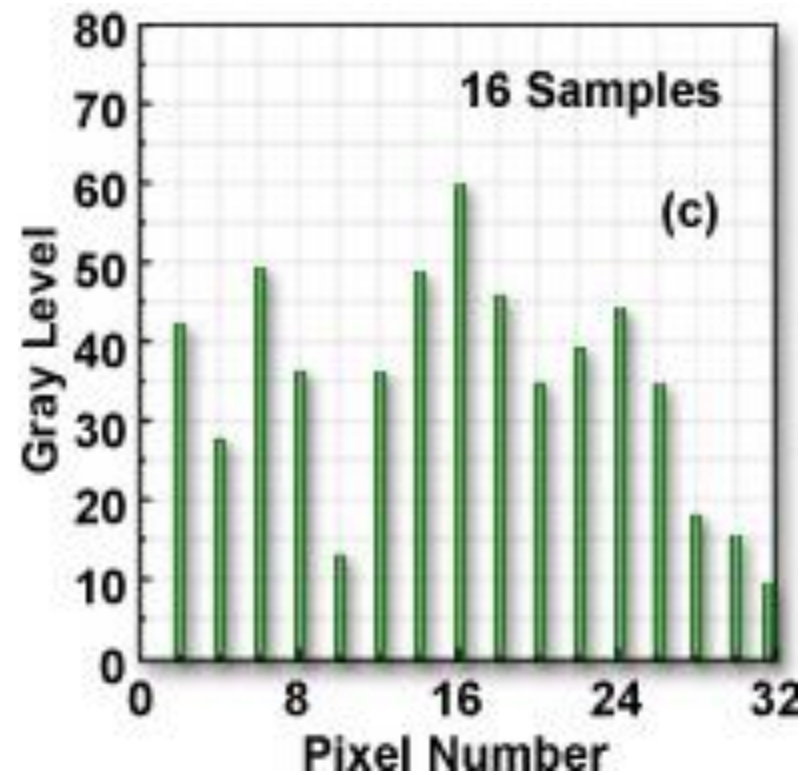
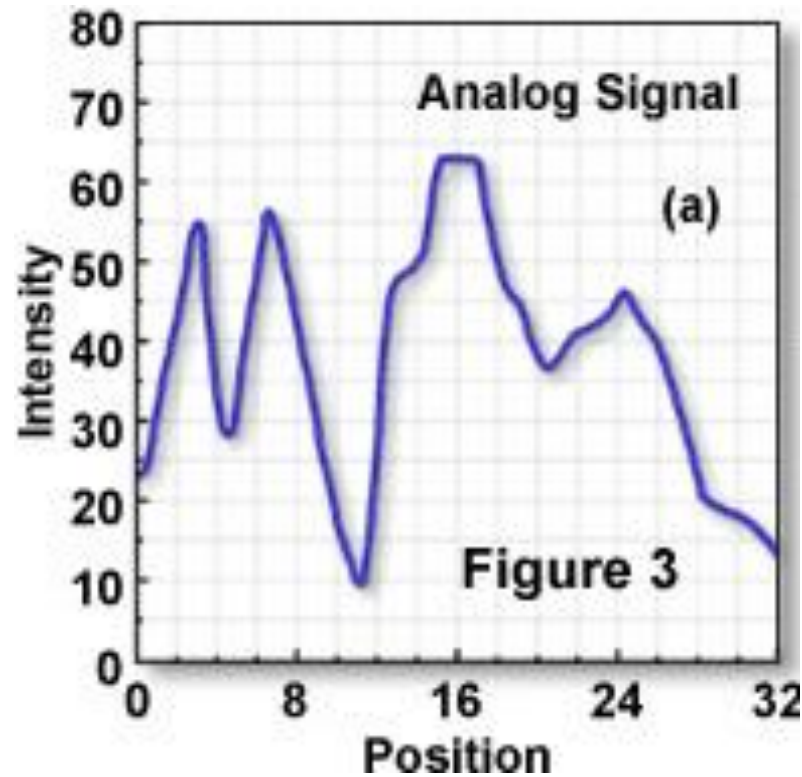
Here's a continuous
analog signal



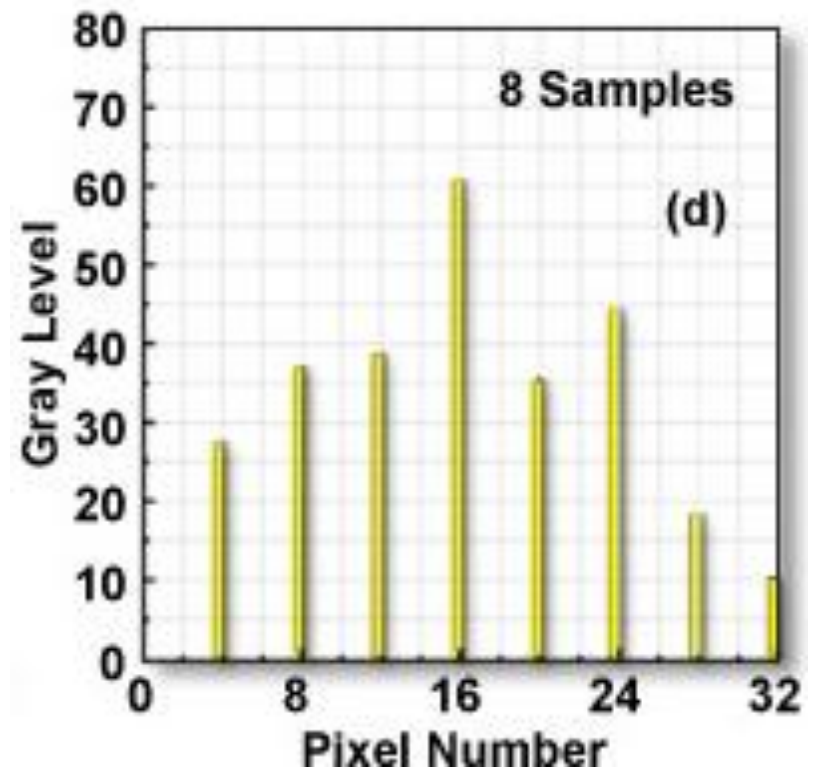
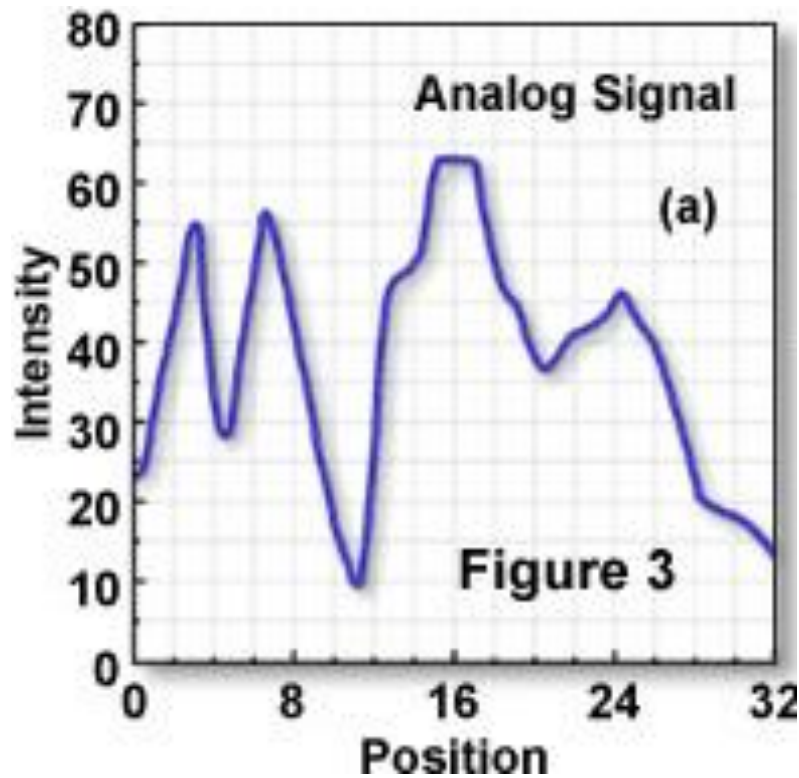
We can sample frequently



Or less



Or even less



So, where's the tradeoff?

How often SHOULD we
sample?

We need to examine two
ideas to answer that question

Aliasing

Nyquist's Theorem

If a signal is undersampled,
it will be **aliased**.

Aliasing folds or wraps the signal, resulting in artifacts and distortions.

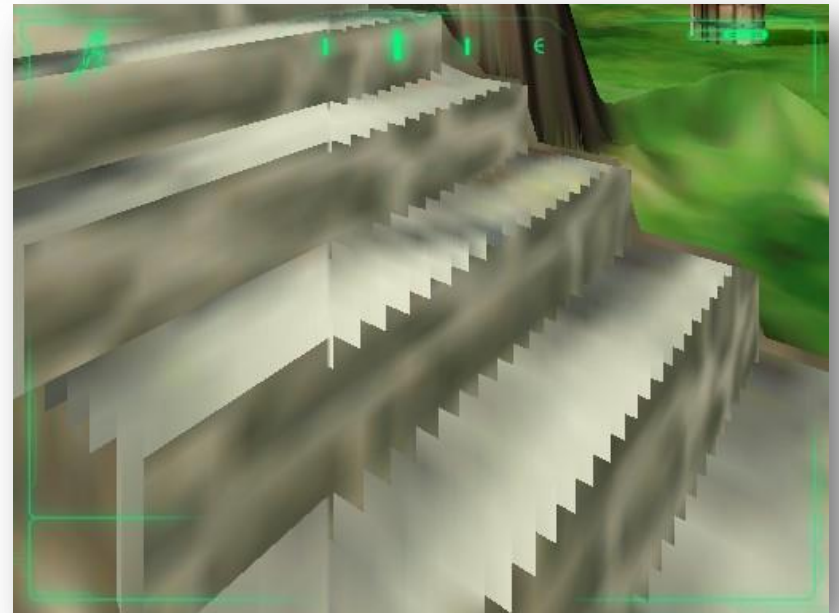
In the sound domain aliasing
can appear as rough,
dissonant, or spurious tones,
or as noise.

When spatial frequency is
undersampled,



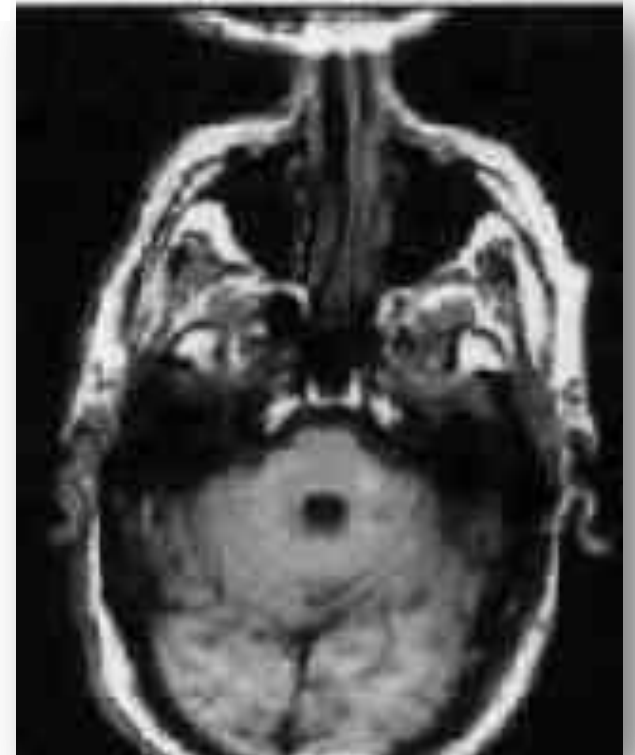
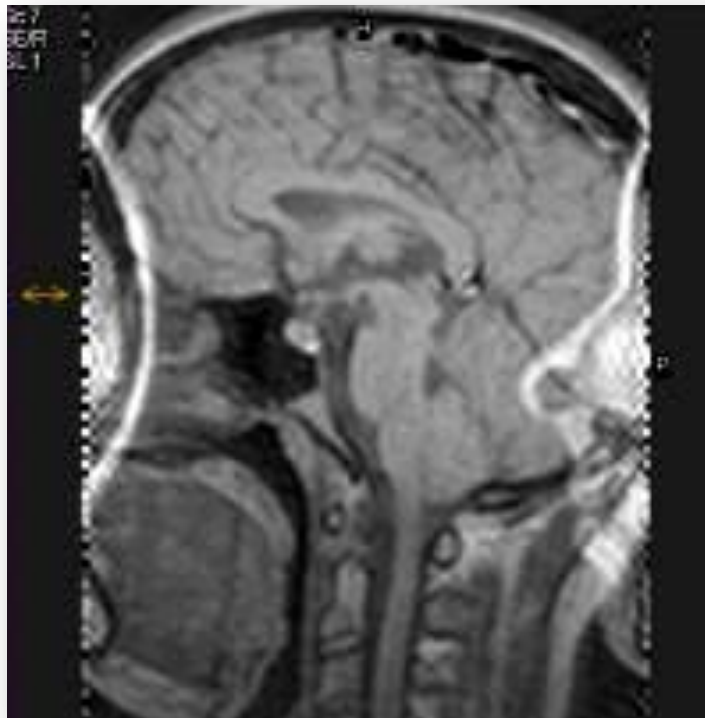
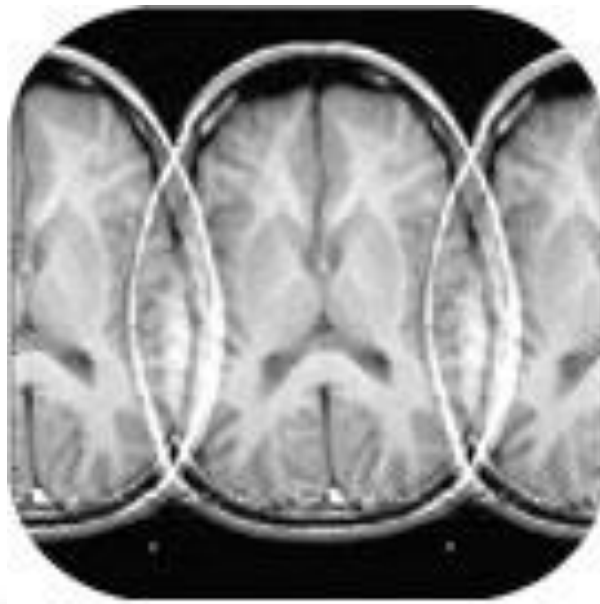
We see
Moiré
patterns...

stair
stepping
etc.



In MR scans, aliasing occurs when any part of the imaged object extends outside the imaging volume.

We explicitly see the wrap around.



Nyquist's Theorem says that

Aliasing can be avoided if we sample at twice the bandwidth of the signal.

Usually this means twice the highest frequency in the signal.

For example, if the maximum frequency in a signal is 100 Hz,

We need to sample at 200 Hz (200 times per second) or more to prevent aliasing.

Aliasing in MRI images

Aliasing in MRI images can occur in the **frequency** or **phase** encoding direction.

To resolve aliasing in the "frequency encoding direction" we must have a high enough sample rate. So this is rarely an issue.

It is more difficult to correct aliasing in the "phase encoding direction" because phase space is 360 degrees*.

So, when you see aliasing in an MR image, it is usually in the phase encoding direction.

*For the incorrigibly curious: see notes for further explanation and reference, but more background is needed.

Nyquist's theorem is about
sampling
frequency

...that is, sampling a cyclic event.

But not all aspects of a signal are cyclic.

In particular, amplitude is not cyclic,

So, Nyquist is not relevant to sampling amplitude.

Then, what do we do about digitizing amplitude?

Quantization is the process of digitizing amplitude information.

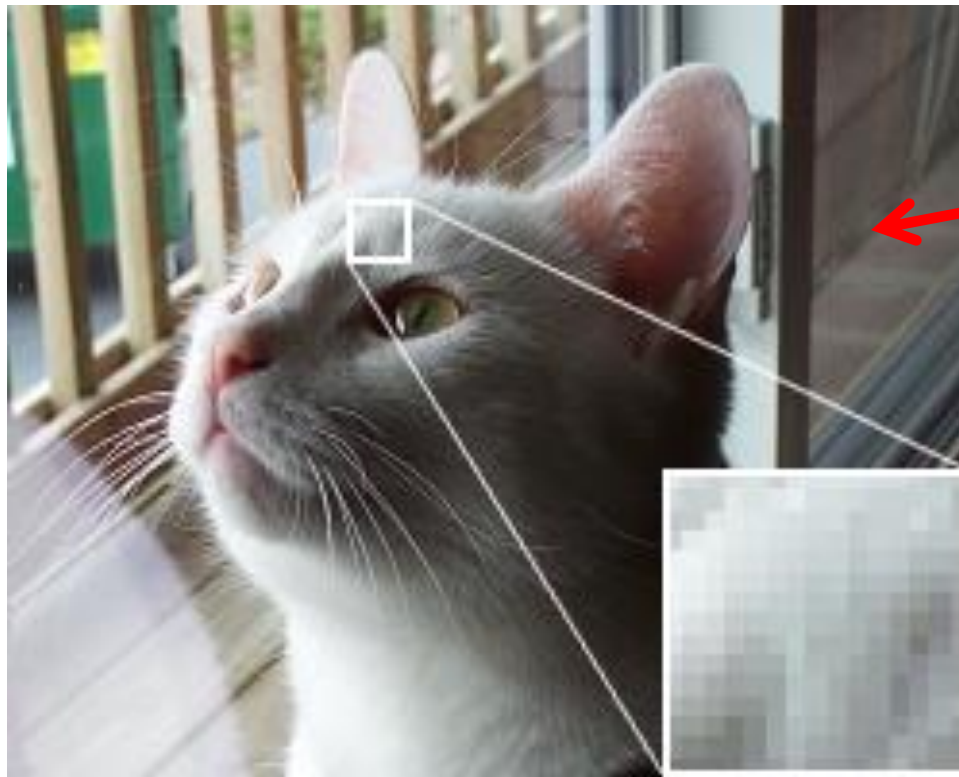
It involves approximating a continuous range of values with a **relatively-small set** of discrete values.

- similar to digitizing frequency, but with different rules

e.g., CD audio is quantized at 16 bits...

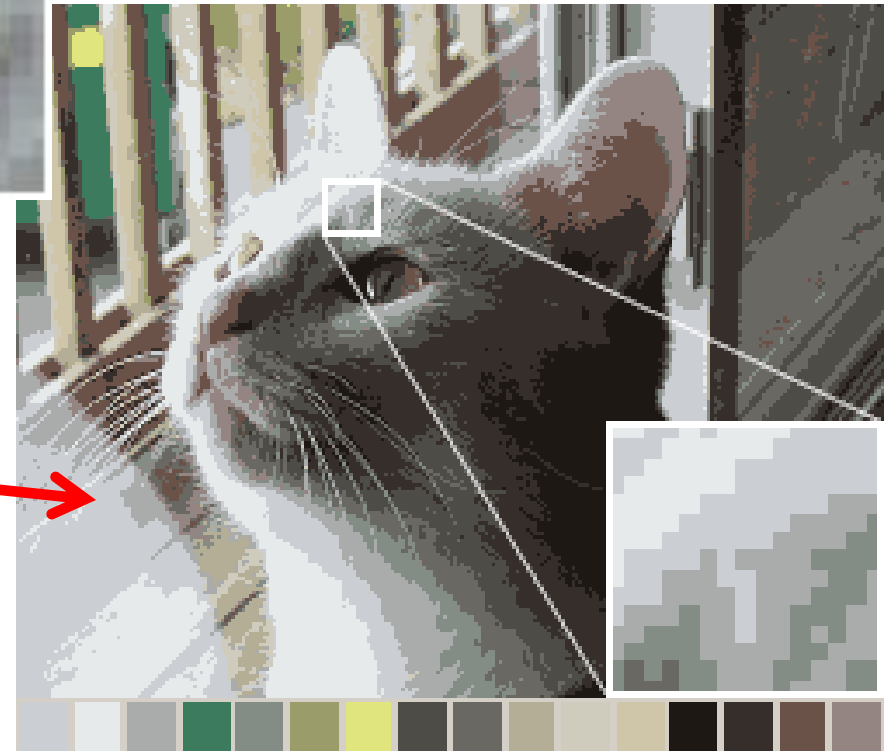
- ...65,536 (i.e. 2^{16}) possible amplitude levels

In image processing,
quantization may, for example,
reduce the number of colors
required to represent a digital
image --



The 24 bit
image... ~16
million+
colors (left)

-is quantized to
4 bits...16 colors
(right)



making it possible to reduce file size, but at the expense of color range (bit depth).

Discrepancies in amplitude between the analog signal and the digital signal are called quantization noise.

Quantization noise occurs because of rounding errors that the computer inevitably makes in the process of digitizing a continuous signal.

Quantization noise is random.

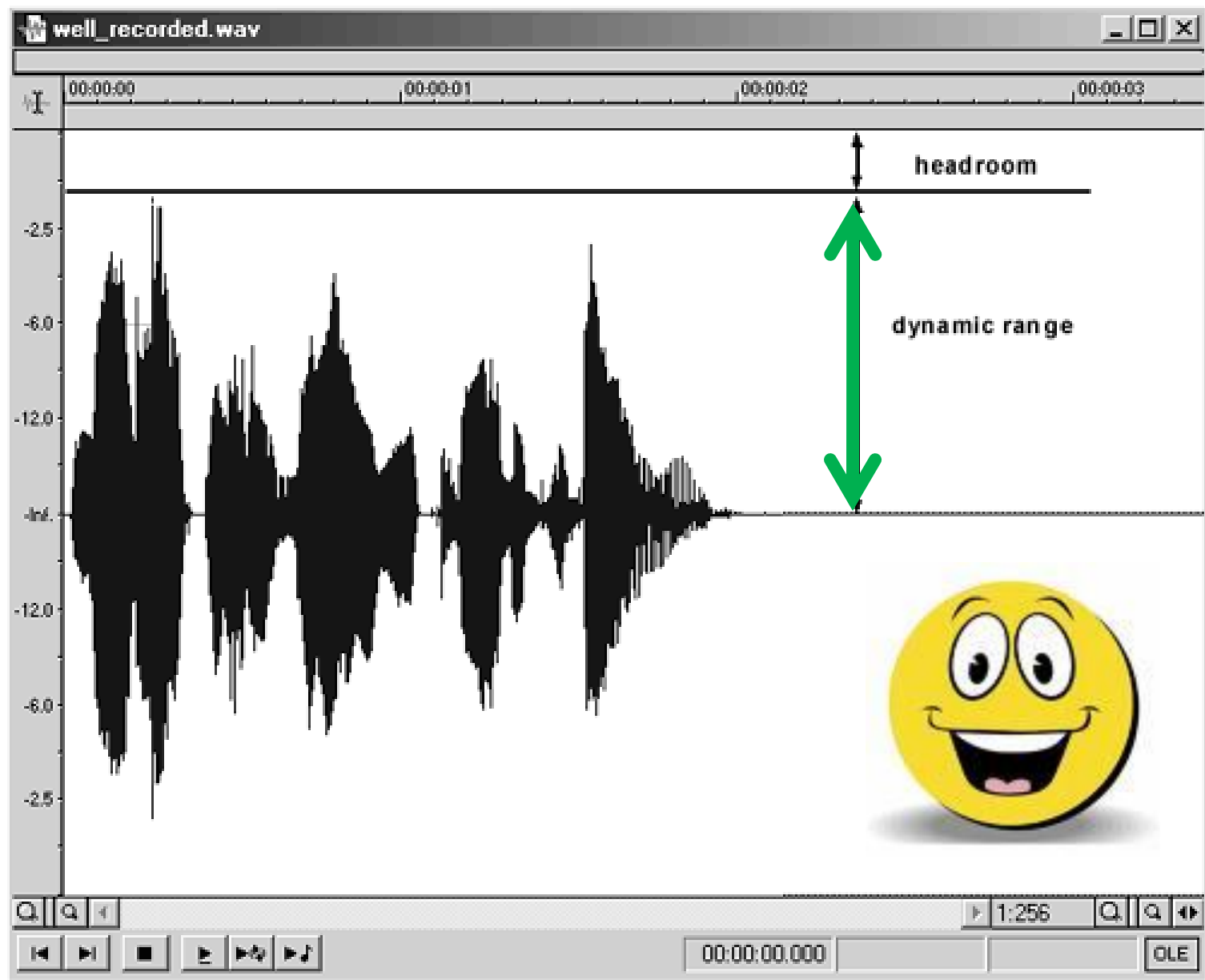
So, it is the same across the whole spectrum.

Thus the shape of the signal is preserved.

This means that quantization noise is **not as bad as aliasing**, because it doesn't distort the signal.

Dynamic range describes the ratio between the smallest and largest values of a signal.

Quantization is improved by matching the **dynamic range** of the digitized signal to the actual signal range.



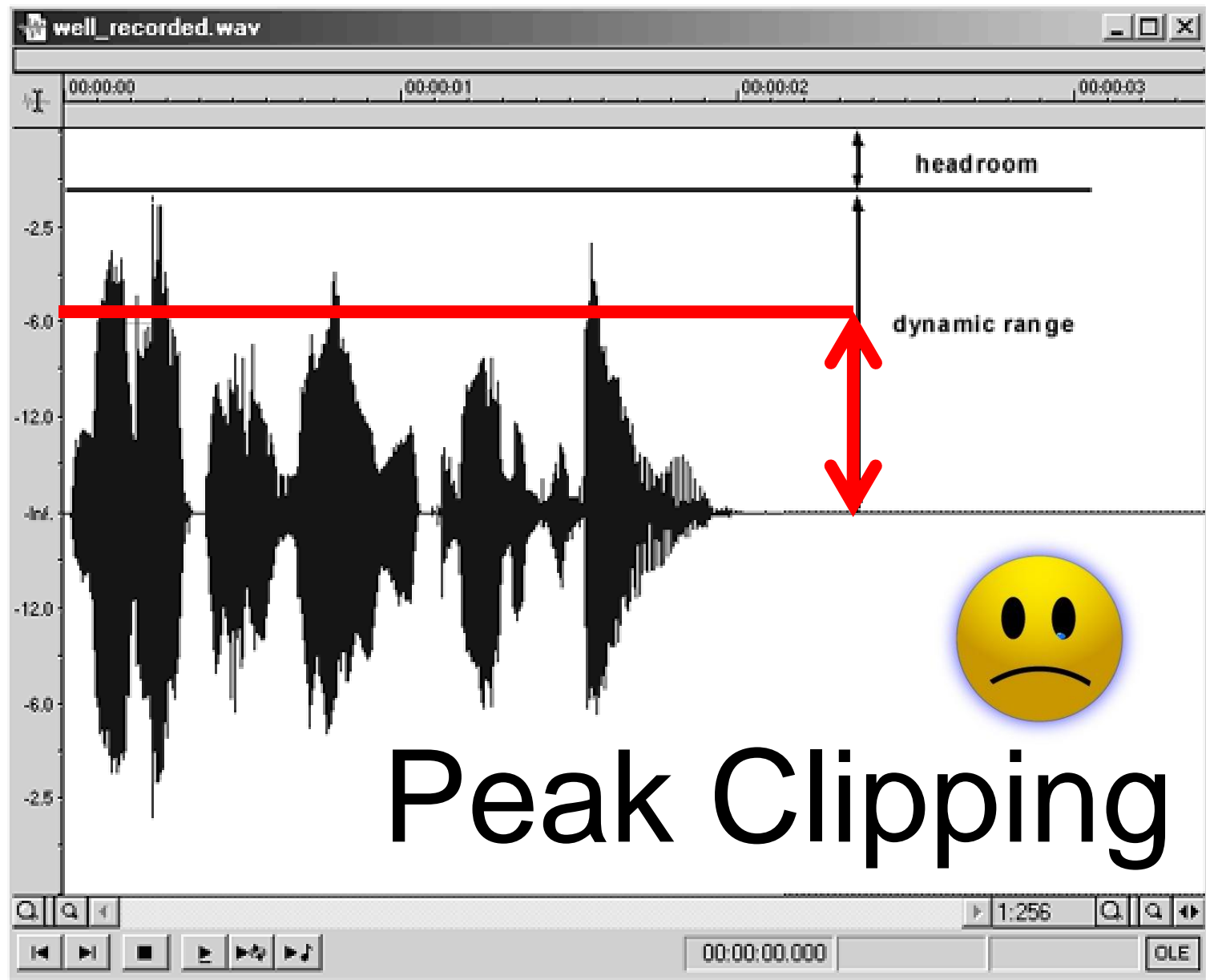
Dynamic Range too Large

- If the dynamic range is larger than the signal range, then you create files that are larger than necessary, with no quality improvement.

Dynamic range too Small

- The range you sample must not be smaller than the actual signal range.
- When the dynamic sampling range is too small, it causes **peak clipping**





Clipping

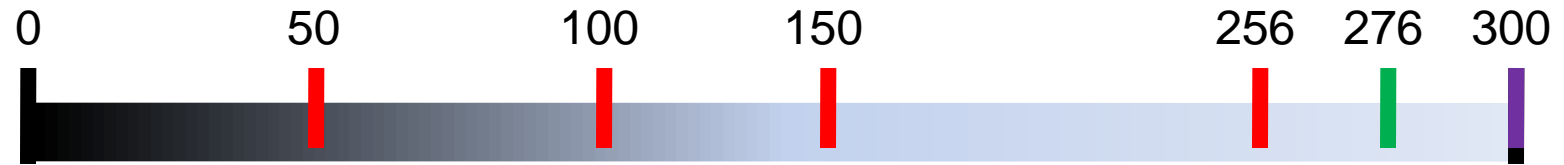
e.g., A system using 8-bit quantization, can represent 256 values.

If a signal contains values from 1 to 300

then all values over 256 in the original signal will be **clipped** at the maximum, 256.

Clipping

Original



Clipped Result

Image Clipping

Range: 0-255



Subtracted 100:
Range 0-155



Added 100:
Range 100-255



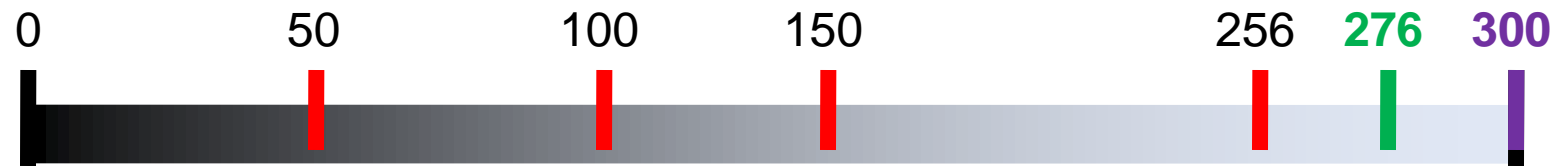
Clipping is preferable to the alternative:

Wrapping (overflow), which results in gross signal distortion



If values overflowed/wrapped past 256,
they would do this:

Original



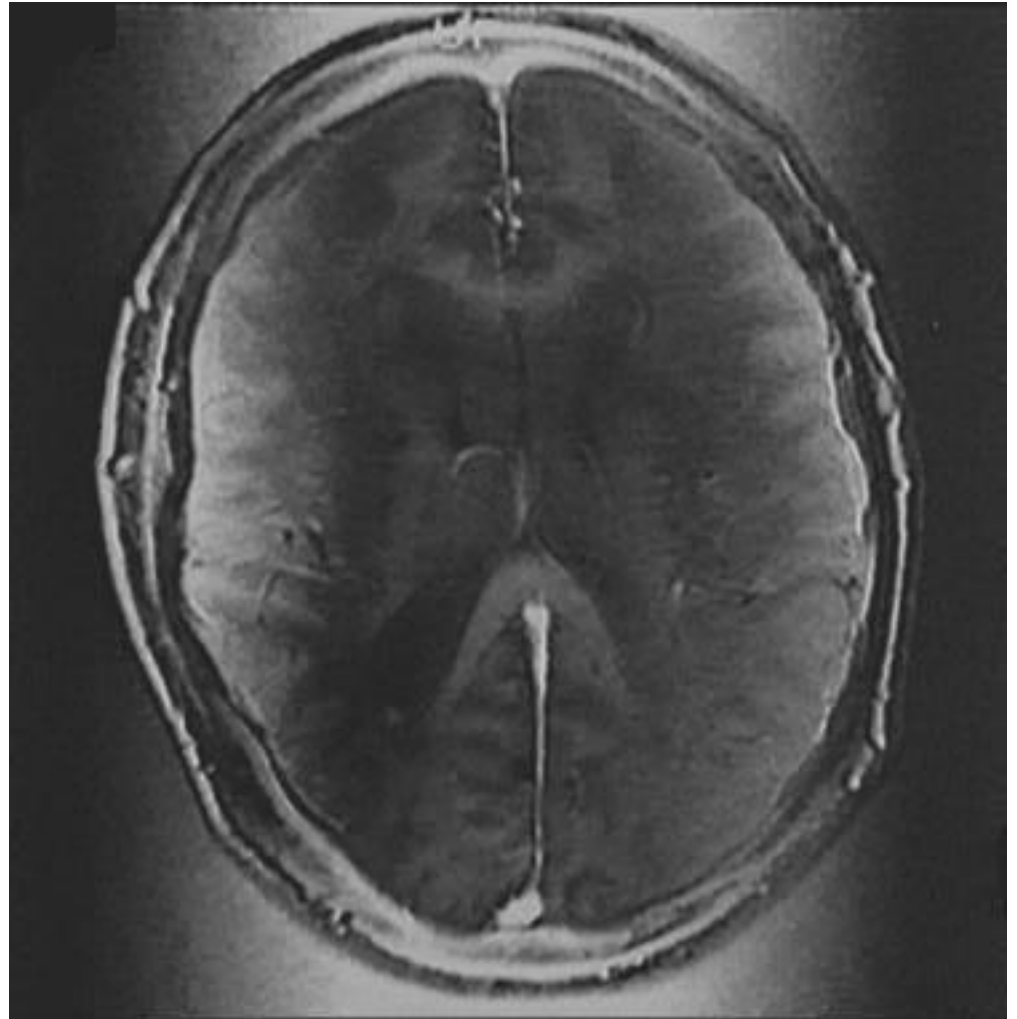
Wrapped Result

RF Overflow Artifact

Nonuniform, washed-out image.

Signal is too intense to be accurately digitized by Analog to Digital converter.

To fix it, one must adjust the receiver gain.



Let's Summarize

Digital Signal Processing is a
fabulous extension of signal
processing.

It depends on digitization.

Good digitization depends on getting sampling rate right.

Undersampling results in aliasing.

Correct sampling relies on
Nyquist's theorem.

Quantization is digitization,
measured in bits, which can be
used to chop up
the non-time-dependent
continuum, amplitude.

Amplitude quantization
benefits from appropriate
dynamic range.

A dynamic sampling range that is too small for the signal, results in peak clipping.

Quantization is never perfect,
but quantization noise is not
as serious as aliasing.

Signal Processing

Digital vs Analog

Digital Signal Processing (DSP)

Sampling frequency (Rate)

Aliasing

Nyquist's Theorem

Quantization and Quantization Noise

Peak clipping and Dynamic Range

Overflow (Wrapping)