# Gravitational Wave Observatories III: Ground Based Interferometers 

Neil J. Cornish

## Outline

- Interferometer design
- Sources of noise
- LIGO data analysis, theory and search results
- Astrophysical rates



## Gravitational Wave Telescopes



1 Ångström $(=100.000$ fmu


## Interferometer Design

$$
\Phi(t)=2 \pi \nu_{0} \Delta T(t)
$$



$$
\text { Consideration } 1 \quad \Delta T \propto h L \quad \text { for } \quad f_{\mathrm{gw}}<\frac{c}{L}
$$

Want $L$ as large as possible up to $L \sim \frac{c}{10^{3} \mathrm{~Hz}}=300 \mathrm{~km}$ Expensive!

## Solution: folded arms

Consideration $2 \quad \Phi \propto \nu_{0} \Delta T$
Fluctuations in Laser frequency can masquerade as GW signal

## Partial Solution: Highly stable lasers

Solution: Michelson topology - cancel laser frequency noise

## Interferometer Design



The 4 km Fabry-Perot cavities effectively fold the arms
Can calculate the response using basic E\&M, electric field transmission and reflection coefficients at each mirror. (See Maggiore's text)

In the long wavelength limit, phase shift is

$$
\begin{gathered}
\left|\Delta \Phi_{\mathrm{FP}}\right|=\left(\frac{\nu_{0} h L}{c}\right)\left[\frac{8 \mathcal{F}}{\sqrt{1+\left(f_{\mathrm{gw}} / f_{p}\right)^{2}}}\right] \\
\mathcal{F}=\frac{\pi \sqrt{r_{1} r_{2}}}{1-r_{1} r_{2}} \quad \text { Cavity Finesse } \\
f_{p}=\frac{1}{4 \pi \tau_{s}} \approx \frac{c}{4 \mathcal{F} L} \quad \text { Pole frequency }
\end{gathered}
$$

## Single Fabry-Perot Cavity



$$
\begin{aligned}
& \left|\Delta \Phi_{\mathrm{FP}}\right|=\left(\frac{\nu_{0} h L}{c}\right)\left[\frac{8 \mathcal{F}}{\sqrt{1+\left(f_{\mathrm{gw}} / f_{p}\right)^{2}}}\right] \\
& \mathcal{F}=\frac{\pi \sqrt{r_{1} r_{2}}}{1-r_{1} r_{2}} \\
& f_{p}=\frac{1}{4 \pi \tau_{s}} \approx \frac{c}{4 \mathcal{F} L} \quad \text { Cavity Finesse } \\
& \quad \text { Pole frequency }
\end{aligned}
$$

Reflectivities are very close to unity
e.g. advanced LIGO $\mathcal{F}=450 \quad f_{p}=42 \mathrm{~Hz}$

> Note that increasing the Finesse improves the low frequency
sensitivity (good), but lowers the pole frequency (bad)

Advanced LIGO gets around this problem by using signal recycling

## Michelson Interferometer with coupled Fabry-Perot Cavities

The actual LIGO design is much more complicated. FP cavities are coupled by a power recycling and signal recycling mirrors


There is a common mode and a differential mode

$$
L_{+}=\frac{L_{1}+L_{2}}{2} \quad L_{-}=\frac{L_{1}-L_{2}}{2}
$$

Differential mode contains the GW signal

$$
\begin{aligned}
& f_{-}=\frac{2}{4 \pi L_{+}} \ln \left(\frac{1-r_{i} r_{s}}{r_{e} r_{i}-r_{e} r_{s}\left(t_{i}^{2}+r_{i}^{2}\right)}\right) \\
& i=\text { input mirror } \\
& e=\text { end mirror } \\
& s=\text { signal recycling mirror } \\
& \text { Advanced LIGO } f_{-}=350 \mathrm{~Hz} \\
& \text { Transfer function } \frac{1}{\sqrt{1+\left(f_{\mathrm{gw}} / f_{-}\right)^{2}}}
\end{aligned}
$$

The gain from folding and recycling is now a complicated combination of terms. Comes out at a factor of $\sim 1,100$

## Signal recycling and response shaping

The cavity transfer function for the Michelson-Fabry-Perot topology with signal recycling allows us to shape the response and target particular signals by changing the distance to the signal recycling mirror

AdvLIGO tunings

$$
C(f)=\frac{t_{s} e^{-i\left(2 \pi f \ell_{s} / c+\phi_{s}\right)}}{1-r_{s}\left(\frac{r_{i}-e^{-4 \pi i f L / c}}{1-r_{i} e^{-4 \pi i f L / c}}\right) e^{-2 i\left(2 \pi f \ell_{s} / c+\phi_{s}\right)}}
$$



## Sources of Noise



Fundamental (quantum) noise

$\begin{aligned} S_{\text {shot }}^{1 / 2} & \propto \frac{1}{\sqrt{I_{0}}} \\ S_{\mathrm{rp}}^{1 / 2} & \propto \sqrt{I_{0}}\end{aligned}$
$\operatorname{SQL} \Delta \quad x \Delta p \geq \hbar$

## Shot noise: Digital camera, photons per pixel



## Radiation pressure noise

The test masses are essentially free (inertial) in the horizontal direction for frequencies above the pendulum frequency of the suspension

$$
\ddot{x}=\frac{F_{\mathrm{rad}}}{M}
$$

$$
\Rightarrow \quad \tilde{x}=-\frac{\tilde{F}_{\mathrm{rad}}}{4 \pi^{2} f^{2} M} \quad \mathbb{E}[\tilde{x}]=0 \quad \mathbb{E}\left[\tilde{x} \tilde{x}^{*}\right] \propto \frac{I_{0}}{f^{4} M^{2}}
$$

$$
\Rightarrow \quad S_{\mathrm{rp}}^{1 / 2} \propto \frac{\sqrt{I_{0}}}{f^{2} M}
$$

## Fundamental (quantum) noise



The intensity of the laser light is frequency dependent due to the cavity response

$$
\begin{gathered}
S_{\mathrm{Q}}=\frac{\hbar}{\pi^{2} f^{2} M L^{2}}\left(\frac{I(f)}{\pi^{2} f^{2} M c}+\frac{\pi^{2} f^{2} M c}{I(f)}\right) \\
I(f) \sim \frac{I_{0}}{1+\left(f / f_{-}\right)^{2}}
\end{gathered}
$$

SQL is reached when the Shot and RP contributions are equal (minimum of $S_{\mathrm{Q}}$ )

$$
S_{\mathrm{SQL}}=\frac{2 \hbar}{\pi^{2} f_{\mathrm{opt}}^{2} M L^{2}}
$$

## Standard Quantum Limit

## $\operatorname{SQL} \Delta \quad x \Delta p \geq \hbar$

$$
S_{\mathrm{SQL}}=\frac{2 \hbar}{\pi^{2} f_{\mathrm{opt}}^{2} M L^{2}}
$$

## The SQL is not a fundamental limit to GW detector sensitivity

1) Measure momentum change rather than position change (speedmeter)
2) The RP and Shot noise can be made to be correlated. Allows us to reshape uncertainty ellipse using squeezed light (Quantum no-demolition measurement)


## Facility Noise



## Seismic Noise

Need one of these


$$
S_{\text {seis }}^{1 / 2} \sim 10^{-12}\left(\frac{10 \mathrm{~Hz}}{f}\right)^{2} \mathrm{~Hz}^{-1 / 2}
$$

## Seismic Noise



$$
S_{\text {seis }}^{1 / 2} \sim 10^{-12}\left(\frac{10 \mathrm{~Hz}}{f}\right)^{2} \mathrm{~Hz}^{-1 / 2}
$$

Single pendulum suspension

$$
S_{\mathrm{seis}, \mathrm{filt}}^{1 / 2}=\frac{1}{\left|1-\left(f / f_{\text {pend }}\right)^{2}\right|} S_{\mathrm{seis}}^{1 / 2} \quad \quad f_{\text {pend }} \sim 1 \mathrm{~Hz}
$$

$$
S_{\mathrm{seis}, \mathrm{filt}}^{1 / 2} \approx 10^{-12}\left(\frac{f_{\mathrm{pend}}}{f}\right)^{2}\left(\frac{10 \mathrm{~Hz}}{f}\right)^{2} \mathrm{~Hz}^{-1 / 2}
$$

aLIGO 5-stage pendulum suspension

$$
S_{\mathrm{seis}, \mathrm{filt}}^{1 / 2} \approx 10^{-12}\left(\frac{f_{\mathrm{pend}}}{f}\right)^{10}\left(\frac{10 \mathrm{~Hz}}{f}\right)^{2} \mathrm{~Hz}^{-1 / 2}
$$

## Thermal Noise



## Thermal Noise

Fluctuation-dissipation theorem: PSD of fluctuations of a system in equilibrium at temperature $T$ is determined by the dissipative terms that return the system to equilibrium

$$
S_{T}(f)=\frac{4 k_{B} T}{(2 \pi f)^{2}} \mathbb{R}[Y(f)]
$$

For an anelastic spring with loss angle $\phi \quad$ Hooke's law becomes $F=-k x(1+i \phi)$

$$
S_{T}(f)=\frac{k_{B} T}{2 \pi^{3} M f} \frac{f_{\text {res }}^{2} \phi(f)}{\left(f_{\text {res }}^{2}-f^{2}\right)^{2}+f_{\text {res }}^{4} \phi^{2}(f)}
$$

## Mirror Coating Thermal Noise

$$
S_{T}(f)=\frac{k_{B} T}{2 \pi^{3} M f} \frac{f_{\mathrm{res}}^{2} \phi(f)}{\left(f_{\mathrm{res}}^{2}-f^{2}\right)^{2}+f_{\mathrm{res}}^{4} \phi^{2}(f)}
$$

The resonant frequencies for the coatings are very high (tens of kHz ), and the loss angle small (millionths)

$$
S_{\mathrm{MC}}=\left(\frac{2 k_{B} T \phi}{\pi^{3} M L^{2} f_{\mathrm{MC}}^{2}}\right) \frac{1}{f}
$$

For advanced LIGO

$$
S_{\mathrm{MC}}^{1 / 2}=2.5 \times 10^{-24}\left(\frac{100 \mathrm{~Hz}}{f}\right)^{1 / 2} \mathrm{~Hz}^{-1 / 2}
$$

## Suspension Thermal Noise



## Pendulum Suspension Thermal Noise

$$
\begin{gathered}
S_{T}(f)=\frac{k_{B} T}{2 \pi^{3} M f} \frac{f_{\text {res }}^{2} \phi(f)}{\left(f_{\text {res }}^{2}-f^{2}\right)^{2}+f_{\text {res }}^{4} \phi^{2}(f)} \\
f_{\mathrm{res}}=f_{\mathrm{pen}} \ll f
\end{gathered}
$$

For advanced LIGO

$$
S_{\mathrm{pen}}^{1 / 2}=3.5 \times 10^{-25}\left(\frac{100 \mathrm{~Hz}}{f}\right)^{5 / 2} \mathrm{~Hz}^{-1 / 2}
$$

## Violin mode Thermal Noise

$$
S_{T}(f)=\frac{k_{B} T}{2 \pi^{3} M f} \frac{f_{\text {res }}^{2} \phi(f)}{\left(f_{\text {res }}^{2}-f^{2}\right)^{2}+f_{\text {res }}^{4} \phi^{2}(f)}
$$

$$
f_{\mathrm{res}}=f_{\mathrm{v}}=500 \mathrm{~Hz}, 1000 \mathrm{~Hz}, \ldots
$$

For advanced LIGO, first harmonic

$$
S_{\mathrm{v}}^{1 / 2}=\frac{3 \times 10^{-24}}{1+\left(f_{\mathrm{v}}^{2}-f^{2}\right)^{2} / \delta f^{4}} \mathrm{~Hz}^{-1 / 2}
$$

$$
\delta f=f_{\mathrm{v}} \phi^{1 / 2} \approx 2 \mathrm{~Hz}
$$

## Gravity Gradient Noise



We can't escape Newton

$$
\ddot{\mathbf{x}}=G \int \frac{\delta \rho\left(\mathbf{x}^{\prime}, t\right)}{\left|\mathbf{x}-\mathbf{x}^{\prime}\right|^{3}}\left(\mathbf{x}-\mathbf{x}^{\prime}\right) d^{3} \mathbf{x}
$$



This is why we need LISA!

## Real aLIGO noise spectra from O1



## Real aLIGO noise spectra from O1



## Real aLIGO noise spectra from O1/S6



## LIGO searches for binary inspired signals

Recall: Likelihood for Stationary Gaussian Noise

$$
\chi^{2}(\vec{\lambda})=(\mathbf{d}-\mathbf{h}(\vec{\lambda}) \mid \mathbf{d}-\mathbf{h}(\vec{\lambda}))
$$

Suppose that we have two hypotheses:

$$
p(\mathbf{d} \mid \vec{\lambda})=\text { const. } e^{-\frac{\chi^{2}(\vec{\lambda})}{2}}
$$

$$
(\mathbf{a} \mid \mathbf{b})=2 \int_{0}^{\infty} \frac{\tilde{a}(f) \tilde{b}^{*}(f)+\tilde{a}^{*}(f) \tilde{b}(f)}{S_{n}(f)} d f
$$

$H_{1}$ : A signal with parameters $\vec{\lambda}$ is present $H_{0}$ : No signal is present

Likelihood ratio: $\quad \Lambda(\vec{\lambda})=\frac{p\left(\mathbf{d} \mid \mathbf{h}(\vec{\lambda}), H_{1}\right)}{p\left(\mathbf{d}, H_{0}\right)}$ For Gaussian noise: $\quad \Lambda(\vec{\lambda})=e^{-(\mathbf{d} \mid \mathbf{h})+\frac{1}{2}(\mathbf{h} \mid \mathbf{h})}$

## Frequentist Hypothesis Testing

$\Lambda$ - Detection Statistic
$H_{0}$ - Noise Hypothesis
$H_{1}-$ Noise + Signal Hypothesis


Set threshold $\Lambda_{*}$ such that $\Lambda>\Lambda_{*}$ favors hypothesis $H_{1}$


Type I error - False Alarm<br>Type II error - False Dismissal

## Neyman-Pearson Theorem

For a fixed false alarm rate, the false dismissal rate is minimized by the likelihood ratio statistic

$$
\Lambda(\vec{\lambda})=\frac{p\left(\mathbf{d} \mid \mathbf{h}(\vec{\lambda}), H_{1}\right)}{p\left(\mathbf{d}, H_{0}\right)}
$$

The likelihood ratio is maximized over the signal parameters.

The rho statistic is often used in place of the likelihood ratio

$$
\text { Writing } \mathbf{h}=\rho \hat{h} \text { where }(\hat{h} \mid \hat{h})=1 \quad \Lambda(\vec{\lambda})=e^{\rho(\mathbf{d} \mid \hat{h})-\frac{1}{2} \rho^{2}}
$$

Maximizing wrt rho

$$
\frac{\partial \Lambda(\vec{\lambda})}{\partial \rho}=0 \quad \Rightarrow \quad \rho(\vec{\lambda})=(\mathbf{d} \mid \hat{h}(\vec{\lambda}))
$$

$$
\log \Lambda(\vec{\lambda})=\frac{1}{2} \rho^{2}(\vec{\lambda})
$$

## The rho statistic and SNR

The signal-to-noise ratio (SNR) is defined:

In practice, the detector noise is not perfectly Gaussian, and variants of the rho statistic are now used, notably the "new SNR" statistic, introduced by B. Allen Phys.Rev. D7I (2005) 06200 I

$$
\mathrm{SNR}=\frac{\text { Expected value when signal present }}{\text { RMS value when signal absent }}
$$

$$
\begin{aligned}
& =\frac{E[\rho]}{\sqrt{E\left[\rho_{0}^{2}\right]-E\left[\rho_{0}\right]^{2}}} \\
& =(h \mid \hat{h}) \\
& =\sqrt{(h \mid h)}
\end{aligned}
$$

$$
\mathrm{SNR}^{2}=4 \int_{0}^{\infty} \frac{|\tilde{h}(f)|^{2}}{S_{n}(f)} d f
$$

## Matched Filtering $=$ Maximum Likelihood

Convolve the data with a filter (template) $\mathrm{K}: \quad Y=\int d t \int d u K(t-u) d(u)$

$$
\begin{aligned}
\operatorname{SNR} & =\frac{E[Y]}{\sqrt{E\left[Y_{0}^{2}\right]-E\left[Y_{0}\right]^{2}}} \\
& =\frac{2 \int_{0}^{\infty} d f\left(\tilde{h}^{*}(f) \tilde{K}(f)+\tilde{h}(f) \tilde{K}^{*}(f)\right)}{\sqrt{4 \int_{0}^{\infty} d f|\tilde{K}(f)|^{2} S(f)}}
\end{aligned}
$$

Maximizing the SNR yields

$$
\tilde{K}(f)=\frac{\tilde{h}(f)}{S(f)} \quad \Rightarrow \quad Y=(\mathbf{d} \mid \mathbf{h})=\rho \sqrt{(h \mid h)}
$$

## Frequentist Detection Threshold

For stationary, Gaussian noise the detection statistic $\rho$ is Gaussian distributed.

$$
\begin{aligned}
& \text { For the null hypothesis we have } \quad p_{0}(\rho)=\frac{1}{\sqrt{2 \pi}} e^{-\rho^{2} / 2} \\
& \text { For the detection hypothesis we have } \quad p_{1}(\rho)=\frac{1}{\sqrt{2 \pi}} e^{-\left(\rho^{2}-\mathrm{SNR}^{2}\right) / 2} \\
& \text { Setting a threshold of } \rho_{*} \text { gives the false alarm and false dismissal probabilities } \\
& P_{\mathrm{FA}}=\frac{1}{2} \operatorname{erfc}\left(\rho_{*} / \sqrt{2}\right) \\
& P_{\mathrm{FD}}=\frac{1}{2} \operatorname{erfc}\left(\left(\rho_{*}-\mathrm{SNR}\right) / \sqrt{2}\right)
\end{aligned}
$$

LIGO/Virgo analyses do not use SNR thresholds, but rather use False Alarm Rate thresholds

$$
\mathrm{FAR}=\frac{P_{\mathrm{FA}}}{T_{\mathrm{obs}}}
$$

e.g. $\quad \mathrm{FAR}=$ One in million years and an observation time of one year

$$
P_{\mathrm{FA}}=10^{-6} \quad \text { aka } \quad 4.9 \sigma \quad \rho_{*}=4.8
$$

## Grid Based Searches

Goal is to lay out a grid in parameter space that is fine enough to catch any signal with some good fraction of the maximum matched filter SNR

The match measures the fractional loss in SNR in recovering a signal with a template and defines a natural metric on parameter space:

$$
M(\vec{x}, \vec{y})=\frac{(h(\vec{x}) \mid h(\vec{y}))}{\sqrt{(h(\vec{x}) \mid h(\vec{x}))(h(\vec{y}) \mid h(\vec{y}))}}
$$

Taylor expanding $\quad M(\vec{x}, \vec{x}+\Delta \vec{x})=1-g_{i j} \Delta x^{i} \Delta x^{j}+\ldots$
where $\quad g_{i j}=\frac{\left(h_{, i} \mid h_{, j}\right)}{(h \mid h)}-\frac{\left(h \mid h_{i, i}\right)\left(h \mid h_{, j}\right)}{(h \mid h)^{2}}$
(Owen Metric)

Number of templates (for a hypercube lattice in D dimensions)

$$
N=\frac{V}{\Delta V}=\frac{\int d^{D} x \sqrt{g}}{\left(2 \sqrt{\left(1-M_{\min }\right)} / D\right)^{D}}
$$

Cost grows geometrically with $D$ for any lattice

LIGO Style Grid Searches


Typically 2-3 dimensional, I 000 's points

## Reducing the cost of a search

In most cases it is possible to analytically maximize over 3 or more parameters

## Distance:

The unit normalized template $\hat{h}$ defines a reference distance $\bar{D}$
Scaling this template to distance $D$ gives

$$
h=\frac{\bar{D}}{D} \hat{h}
$$

The distance is then estimated from the data as

$$
D=\frac{\bar{D}}{(d \mid \hat{h})}
$$

## Reducing the cost of a search

## Phase Offset:

Generate two templates $h(\phi=0)$ and $h(\phi=\pi / 2)$

Then $\quad(d \mid h)_{\max \phi}=\sqrt{(d \mid h(0))^{2}+(d \mid h(\pi / 2))^{2}}$

Easy to see this in the Fourier domain.

Suppose $\tilde{d}=\tilde{h}_{0} e^{i \phi}$, then

$$
\begin{aligned}
(d \mid h(0)) & =\left(h_{0} \mid h_{0}\right) \cos \phi \\
(d \mid h(\pi / 2)) & =\left(h_{0} \mid h_{0}\right) \sin \phi
\end{aligned}
$$

## Reducing the cost of a search

## Time Offset:



Fourier transform treats time as periodic - use this to our advantage

Compute the inverse Fourier transform of the product of the Fourier transforms:

$$
(d \mid h)(\Delta t)=4 \int \frac{\tilde{d}^{*}(f) \tilde{h}(f)}{S(f)} e^{2 \pi i f \Delta t} d f
$$

Then if the template and data differ by a time shift: $\quad d(t)=h\left(t-t_{0}\right)$

$$
(d \mid h)_{\max t}=(d \mid h)\left(\Delta t=t_{0}\right)
$$



# Workflow for pyCBC search 

Template bank constructed

Matched filtering is done per-detector (not coherent)

Detection statistic computed ("new SNR")

Coincidence in time/mass enforced Data quality vetoes applied

Monte Carlo background to compute FAR vs new SNR

Things that go bump in the night
(Bandpass filtered, whitened, time domain)
$\left.\begin{array}{c}0.00 \\ \hline \hline 1.0 \\ 0.5 \\ 0.0 \\ 0.0 \\ -0.5 \\ -1.0\end{array}\right]$
$\left.\begin{array}{c}0.00 \\ \hline \hline 1.0 \\ 0.5 \\ 0.0 \\ 0.0 \\ -0.5 \\ -0.0\end{array}\right]$

| 0.0 |
| :--- |
| 0.5 |
| 0.0 |
| 0.0 |
| -0.5 |
| -1.0 |

Samples from the Syracuse Audio Study of Glitches

## Contending with non-stationary, non-Gaussian noise



## Analysis of 16 days of data from September 2015



## Early Morning, September 1420 I5



## BayesWave reconstruction of the signal




FIG. 1. The gravitational-wave event GW150914 observed by the LIGO Hanford (H1, left column panels) and Livingston (L1 right column panels) detectors. Times are shown relative to September 14, 2015 at 09:50:45 UTC. For visualization, all time series





## LIGO detections to-date




## Triangulating the Source



## Triangulating the Source



Hanford + Livingston

## Triangulating the Source



Hanford + Livingston + Virgo

## Parameter estimation



## Black Holes of Known Mass



## Detection without templates

## BayesWave Comish \& Literoberg 2015

- Bayesian model selection
- Three part model (signal, glitches, gaussian noise)
- Trans-dimensional Markov Chain Monte Carlo
- Wavelet decomposition
- Glitch \& GW modeled by wavelets
- Number, amplitude, quality and TF location of wavelets varies

Continuous Morlet/Gabor Wavelets


## Lines and a drifting noise floor



Glitches


## Gravitational Waves

## and model these



"Caedite eos. Novit enim Dominus qui sunt eius" Arnaud Amalric (Kill them all. For the Lord knoweth them that are His.)

## Example from LIGO's S5 science run



## Reconstructing GW150914 with wavelets



IFO 1


IFO 0


IFO 1


LIGO Hanford Observatory: GW150914



## Reconstructing GW170104 with wavelets



## Match GR prediction




GW150914
GW170104

## Astrophysical Inference



Would like to know merger rate to constrain population synthesis models. Even better, would like to know merger rate as a function of mass, spin, redshift etc

Many cool techniques being developed to do this using things like Gaussian processes

Only have time to discuss the total merger rate

## Astrophysical Rate Limits

Even without a detection we can produce interesting astrophysical results such as bounds on the binary merger rate for NS-NS

Expect binary mergers to be a Poisson process. If the expected number of events is $\lambda$, then the probability of detecting $k$ events is

$$
p(k \mid \lambda)=\lambda^{k} e^{-\lambda} / k!
$$

If the event rate is $R\left[\mathrm{Mpc}^{-3}\right.$ year $\left.^{-1}\right]$, and the observable 4-volume is $V T$ [ $\mathrm{Mpc}^{3}$ year]

$$
\lambda=R V T
$$

The probability of observing zero events $(\mathrm{k}=0)$ is then

$$
p(R)=V T e^{-R V T}
$$

$$
\text { Follows from } \quad p(0 \mid \lambda)=p(R) d R=e^{-R V T}
$$

## Astrophysical Rate Limits

$$
p(R)=V T e^{-R V T}
$$

The probability distribution is peaked at a rate of zero. A $90 \%$ rate upper limit can be computed:

$$
\begin{aligned}
& \int_{0}^{R_{*}} p(R) d R=1-e^{-R_{*} V T}=0.9 \\
& \Rightarrow \quad R_{*} V T=\ln (0.1) \\
& \Rightarrow \quad R_{*}=\frac{2.3}{V T}
\end{aligned}
$$

e.g. NS-NS Merger Rate, aLIGO at design sensitivity $\quad V=\frac{4 \pi}{3}(200 \mathrm{Mpc})^{3}$


## Astrophysical Rate Limits

When a signal is detected the probability distribution for the rate is no longer peaked at zero. For example, with a single detection $(\mathrm{k}=\mathrm{I})$ we have

$$
p(R)=R(V T)^{2} e^{-R V T}
$$

This distribution is peaked at

$$
R=\frac{1}{V T}
$$

The $90 \%$ confidence interval now sets upper and lower limits on the merger rate.

## Simulated NS-NS Merger Rate Constraints



Week 2

## Simulated NS-NS Merger Rate Constraints



Week 3

## Simulated NS-NS Merger Rate Constraints



Week 4

## Simulated NS-NS Merger Rate Constraints



Week 5

## Simulated NS-NS Merger Rate Constraints




