# NOISE IN THE CROSS-POWER SPECTRUM OF THE VELA PULSAR

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# ABSTRACT

We compare the noise in interferometric measurements of the Vela pulsar from ground- and space-based antennas with theoretical predictions. The noise depends on both the flux density and the interferometric phase of the source. Because the Vela pulsar is bright and scintillating, these comparisons extend into both the low and high signal-to-noise regimes. Furthermore, our diversity of baselines explores the full range of variation in interferometric phase. We find excellent agreement between theoretical expectations and our estimates of noise among samples within the characteristic scintillation scales. Namely, the noise is drawn from an elliptical Gaussian distribution in the complex plane, centered on the signal. The major axis, aligned with the signal phase, varies quadratically with the signal, while the minor axis, at quadrature, varies with the same linear coefficients. For weak signal, the noise approaches a circular Gaussian distribution. Both the variance and covariance of the noise are also affected by artifacts of digitization and correlation. In particular, we show that gating introduces correlations between nearby spectral channels.

*Key words:* methods: statistical – pulsars: individual: Vela pulsar – radio continuum: stars – techniques: interferometric

## 1. INTRODUCTION

Radio astronomical observations yield a deterministic part, the signal, and a random part, noise (Thompson et al. 1986). Consequently, the signal-to-noise ratio (S/N), the magnitude of the deterministic part divided by the standard deviation of the random part, characterizes them. An understanding of the noise is fundamentally important because it provides a measure of the possibility of detecting a weak signal, and of the reliability of the measurements of a detected signal. The noise is particularly important in situations where the signal varies, because the noise can mimic the signal.

Noise includes background noise from the instrument and sky. However, because all radio astronomical signals are noiselike (with one possible exception: Jenet et al. 2001; Smits et al. 2003), they also contribute *self-noise* (Kulkarni 1989; Anantharamaiah et al. 1991; Vivekanand & Kulkarni 1991; McCullough 1993; Gwinn 2006; Gwinn & Johnson 2011). As argued previously (Gwinn 2006; Gwinn & Johnson 2011) and in Section 2.2 below, for interferometric visibility, the variance of the noise increases quadratically with the signal in phase with the signal, and linearly with the signal at quadrature to the signal. The constant and linear coefficients in these two directions are equal.

We tested this picture for the cross-power spectrum of a scintillating source—the Vela pulsar. These observations provided an ideal laboratory for such studies because the pulsar varies greatly in flux density and interferometric phase with frequency and time, because of interstellar scintillation (Desai et al. 1992). Thus, each spectrum spanned many scintillation elements. Furthermore, the S/N of the strongest spectral peaks can be high, even for short integrations, and the source contributes significantly to system temperature, so that self-noise is important.

We compared predictions with observational estimates, formed by differencing samples close together in time and binning them according to their estimated average visibility. This procedure provides for convenient visualization of the noise distribution. Our investigation extends our previous results (Gwinn et al. 2011) to the regime of high S/N and large interferometric phase variations. Because of pulsar gating, the number of samples per integration time was small and depended on the number of gated pulses within the integration time. From correlation functions, we determined the covariances of noise among spectral channels. Such covariances can be produced by quantization and by correlator effects. We discuss these effects and compare results with observations.

# 1.1. Organization of This Paper

Because the noise in the spectrum is drawn from a nearly Gaussian distribution with zero mean, variances and covariances characterize it. In Section 2, we introduce the theoretical basis for noise in interferometric visibility and present the mathematical descriptions used in the paper. In Section 3, we discuss our observations, correlation, and initial data processing. The remainder of the paper analyzes the noise in these observations. In Section 4, we quantify the distribution of noise and the influence of a signal. In Section 5, we discuss quantization and

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correlator effects. In Section 6, we summarize our results and discuss implications for future observations and instruments.

### 2. THEORETICAL BACKGROUND AND NOTATION

#### 2.1. Correlation Functions and Spectra

Observations of electromagnetic radiation from astronomical sources measure and compare finite samples of electromagnetic fields. We suppose that these are drawn from ensembles of statistically identical measurements. Noise is the difference between the result of a measurement and the average of an infinite ensemble of such measurements. The measurements, as well as their statistical averages, can be expressed either as spectra, varying with frequency, or as correlation functions, varying with lag in the Fourier-conjugate domain. In practice, the samples are digitized, quantized, and time sampled. We introduce conventions for notation that help distinguish among these various domains. The tilde denotes entities in the spectral domain, indexed by the spectral channel as a subscript, for example,  $\tilde{r}_k$ . Unaccented symbols designate the Fourier-conjugate domain of the correlation function, indexed by lag:  $r_{\tau}$ . Angular brackets  $\langle ... \rangle_n$  denote a statistical average over many realizations of the noiselike electric field, with the scintillation spectrum held fixed. The subscripted brackets  $\langle ... \rangle_{S}$  denote an average over many samples of the scintillation spectrum. These conventions are consistent with earlier work (Gwinn 2004; Gwinn & Johnson 2011).

As in earlier studies, we suppose that two antennas record time series of zero-mean, complex Gaussian random variables (Gwinn 2004, 2006; Gwinn & Johnson 2011; Gwinn et al. 2011). These time series can be regarded as the amplitude and phase of one polarization of electric field. The antennas are X and Y, and the time series  $x_{\ell}$  and  $y_{\ell}$ , where  $\ell$  indices time. The ensemble-averaged cross-power spectrum  $\tilde{\rho}_k$  and the ensemble-averaged autocorrelation spectrum  $\tilde{\alpha}_k$  fully describe the spectral properties of these series. At shorter wavelengths quantum-mechanical effects introduce shot noise, but the ensemble-averaged spectrum remains the same (Zmuidzinas 2003). For convenience, we assume unit variances for the real and imaginary parts.

An observer forms the cross-correlation function,  $r_{\tau}$ , of the time series  $x_{\ell}$  and  $y_{\ell}$ . The Fourier transform of  $r_{\tau}$  gives the observed cross-power spectrum,  $\tilde{r}_k$ . This observed spectrum is an estimate of  $\tilde{\rho}_k$ , multiplied by a correlator-dependent gain factor (see Section 5). Similarly, autocorrelation of data at a single antenna yields an autocorrelation spectrum  $\tilde{a}_k$ , an estimate of  $\tilde{\alpha}_k$ . The autocorrelation spectrum may include an offset, from the correlation of spectrally flat background noise, as well as a gain factor. In practice, individual measurements  $\tilde{r}_k$  differ from the "true" spectrum  $\tilde{\rho}_k$  by a random amount: the noise. If many samples of  $\tilde{r}_k$  are averaged together, the noise for the average approaches a Gaussian distribution.

At lag  $\tau$ , the cross-correlation function  $r_{\tau}$  is

$$r_{\tau} = \frac{1}{N_{\rm obs} - |\tau|} \sum_{\ell=1}^{N_{\rm obs} - |\tau|} x_{\ell} y_{\ell+\tau}^{*}.$$
 (1)

This equation parallels Equation (6) of Gwinn (2004); in particular,  $N_{obs}$  is the number of samples. However, we have reduced the definition of  $r_{\tau}$  by a factor of two, by changing the normalization of  $x_{\ell}$  and  $y_{\ell}$  so that  $\langle |x_{\ell}|^2 \rangle = \langle |y_{\ell}|^2 \rangle = 1$ . Note that the sum here runs from 1 only to  $N_{obs} - |\tau|$ , so that

large lags are averaged over fewer samples. If the lag  $\tau < 0$ , then the sum runs from  $|\tau| + 1$  to  $N_{obs}$ . The finite spans of the time series prevent the correlation of all samples: for  $\tau > 0$ , no  $y_{\ell+\tau}$  exists for the last  $\tau$  samples of  $x_{\ell}$ . For  $\tau < 0$ , no  $x_{\ell}$  exists for the first  $|\tau|$  samples of  $y_{\ell+\tau}$ . A pulsar gate, for example, can truncate the time series in this way. Equation (1) describes the calculation of  $r_{\tau}$  in many correlators of the "XF" design, where correlation "X" precedes Fourier transform "F." The S2 correlator at Penticton, used for the work described here, is of this design. In contrast, our previous theoretical work assumed averaging of all lags  $\tau$  over  $N_{\rm obs}$  elements, because of the identification  $x_{\ell-N_{obs}} \equiv x_{\ell}$  for any  $\ell$  (Gwinn 2006; Gwinn & Johnson 2011). We call this the "wrap" assumption. Most correlators of the alternative "FX" design, where Fourier transform precedes correlation, obey the "wrap" assumption. However, by zero padding the time series they can emulate the sum in Equation (1). We discuss the consequences of these two formulations for the cross-power spectrum in Section 5.2 below.

The statistical average of the cross-correlation function  $r_{\tau}$  is  $\langle r_{\tau} \rangle_n = \rho_{\tau}$ . This average runs over many realizations of the electric field, with uniform statistics. Our observations are not stationary and do not approximate an ensemble average because both the scintillation spectrum and the intrinsic flux density of the pulsar change with time. However, we can regard each observation as being drawn from an ensemble of observations of statistically identical pulses at the same pulse phase and in the same scintillation state (see Gwinn et al. 2011).

The observed cross-power spectrum is the Fourier transform of the cross-correlation function:

$$\tilde{r}_k = \sum_{\tau=-N}^{N-1} e^{i\frac{2\pi}{2N}k\tau} r_{\tau}, \qquad (2)$$

where the number of spectral channels is 2*N*. The statistical average of  $\tilde{r}_k$  is  $\langle \tilde{r}_k \rangle_n = \tilde{\rho}_k$ . For autocorrelation, the average over  $x_\ell x_{\ell+\tau}^*$  analogous to Equation (1) forms the autocorrelation function  $a_\tau$ . A statistical average of  $a_\tau$  yields  $\langle a_\tau \rangle_n = \alpha_\tau$ . The Fourier transform analogous to Equation (2) yields the autocorrelation spectrum  $\tilde{a}_k$ , and an average over a statistical ensemble yields  $\langle \tilde{a}_k \rangle_n = \tilde{\alpha}_k$ .

### 2.2. Noise Distribution for Visibility

Noise in the cross-power spectrum is the difference of an observation and the ensemble average:  $\tilde{r}_k - \langle \tilde{r}_k \rangle_n$ . Typically, the observed spectrum is an average over a number of individually formed spectra, as described by Equations (1) and (2). Consequently, the Central Limit theorem suggests that the noise follows a Gaussian distribution. Because the cross-correlation function is complex, this distribution is an elliptical Gaussian distribution in the complex plane.

When the signal is completely absent, as when the pulsar is off, one expects that  $\tilde{\rho}_k = 0$  and that  $\tilde{r}_k$  consists of noise drawn from a zero-mean, circular complex Gaussian distribution. Our observations match this expectation closely, as we discuss in Section 5.1.

If the signal is present, then the Dicke equation describes the contribution of self-noise. This equation states that the error  $\delta T$  in measurements of antenna temperature varies with total system temperature *T*, including the contribution of the source (Dicke 1946):

$$(\delta T)^2 = \frac{T^2}{N_{\text{obs}}}.$$
(3)

Here,  $N_{obs} = \Delta \nu \times \Delta t$  is the number of samples, for an observed bandwidth  $\Delta \nu$  and integration time  $\Delta t$ . The analogous expression holds for interferometric visibility (Thompson et al. 1986). More generally, this equation describes the noise in the sample variance for draws from a Gaussian distribution.

The real and imaginary parts of statistical averages of  $\tilde{r}_k$  suffice to estimate both the signal and the noise (Gwinn 2006, Equations (11), (18), and (19)):

$$\langle \tilde{r}_k \rangle_{\mathbf{n}} = \tilde{\rho}_k$$
  
$$\delta \tilde{r}_k \,\delta \tilde{r}_k^* \equiv \langle \tilde{r}_k \tilde{r}_k^* \rangle_{\mathbf{n}} - \langle \tilde{r}_k \rangle_{\mathbf{n}} \langle \tilde{r}_k^* \rangle_{\mathbf{n}} = \frac{1}{N_{\text{obs}}} \tilde{\alpha}_{Xk} \tilde{\alpha}_{Yk}$$
  
$$\delta \tilde{r}_k \,\delta \tilde{r}_k \equiv \langle \tilde{r}_k \tilde{r}_k \rangle_{\mathbf{n}} - \langle \tilde{r}_k \rangle_{\mathbf{n}} \langle \tilde{r}_k \rangle_{\mathbf{n}} = \frac{1}{N_{\text{obs}}} \tilde{\rho}_k \tilde{\rho}_k. \tag{4}$$

Again,  $N_{obs}$  is the number of samples gathered, per spectral channel. The subscripted angular brackets  $\langle ... \rangle_n$  indicate an average over many realizations of noise. As the first expression indicates,  $\tilde{\rho}_k$  is the cross-power spectrum, averaged over an ensemble of statistically identical realizations of noise. Analogously,  $\tilde{\alpha}_{Xk}$  is the autocorrelation function at station *X*, and  $\tilde{\alpha}_{Yk}$  is the autocorrelation function at station *X*, and  $\tilde{\alpha}_{Yk}$  is the autocorrelation function spectra are always real and are often identical between stations after calibration, with offsets for background noise. For a scintillating source observed on a long baseline, the spectra need not be identical, because the stations may lie in different scintillation elements in the observer plane.

To help visualize the distribution of noise in Equation (4), we divide the noise into components parallel with and perpendicular to the phase of the average visibility. The expression for noise then takes the form

$$\tilde{\rho} = |\tilde{\rho}|e^{i\phi}$$

$$\sigma_{||}^{2} = \frac{1}{2N_{\text{obs}}}(|\tilde{\alpha}_{X}||\tilde{\alpha}_{Y}| + |\tilde{\rho}|^{2})$$

$$\sigma_{\perp}^{2} = \frac{1}{2N_{\text{obs}}}(|\tilde{\alpha}_{X}||\tilde{\alpha}_{Y}| - |\tilde{\rho}|^{2}).$$
(5)

Here,  $\phi$  is the phase of the average visibility. We have omitted the subscript *k* for clarity. For most interferometric observations, the intensity of the source is constant over the observer plane:  $\tilde{\alpha}_X = \tilde{\alpha}_Y$ . The difference between  $\sigma_{||}$  and  $\sigma_{\perp}$  then produces an elliptical distribution of noise, with major axis aligned with the average phase  $\phi$ . Usually, background noise contributes a constant offset to  $\alpha$ , and the source contributes the rest. This form is quite general: it holds for any interferometric observations of a noiselike source, not just observations of a scintillating pulsar.

#### 2.3. Noise for a Scintillating Source

### 2.3.1. Distribution of Noise

A strong, scintillating source provides a good laboratory for the study of self-noise because it provides many independent observations of visibility, with different flux densities and (if the baseline is long) phases, under identical conditions. For a scintillating, pointlike source, with flux densities  $I_X$  and  $I_Y$ at stations X and Y, and background noise equivalent to flux densities  $n_X$  and  $n_Y$ , the signal and noise are (Gwinn et al. 2011, Equations (5)–(7))

$$\tilde{\rho} = \sqrt{I_X I_Y} e^{i\phi_s}$$

$$\sigma_{||}^2 = \frac{1}{N_{\text{obs}}} \left\{ \frac{n_X n_Y}{2} + \frac{1}{2} (n_Y I_X + n_X I_Y) + I_X I_Y \right\}$$

$$\sigma_{\perp}^2 = \frac{1}{N_{\text{obs}}} \left\{ \frac{n_X n_Y}{2} + \frac{1}{2} (n_Y I_X + n_X I_Y) \right\}.$$
(6)

The visibility phase,  $\phi_s$ , arises from phase differences between the pair of scintillation elements in the observer plane. The variance of measurements of  $\tilde{r}$  at that phase is  $\sigma_{||}^2$ ; the variance at quadrature is  $\sigma_{\perp}^2$ . The subscript for channel k is omitted; all quantities are for one spectral channel. Note that in this expression, the autocorrelation spectra at the two antennas  $\tilde{\alpha}_{Xk}, \tilde{\alpha}_{Yk}$  differ both because the intensity of the source at the two antennas may differ  $(I_X \neq I_Y)$  and because of different noise at the two antennas  $(n_X \neq n_Y)$ .

# 2.3.2. Short-baseline Limit

For a short baseline, both antennas will lie within the same scintillation element. In this case,  $\phi_s \rightarrow 0$ , and  $I_A = I_B \equiv I$ . However, the variance of the noise at the two antennas may still be different. We can then express the distribution of noise in the form (Gwinn et al. 2011, Equation (8))

$$\sigma_{||}^{2} = b_{0} + b_{1}I + b_{2}I^{2}$$
  

$$\sigma_{\perp}^{2} = b_{0} + b_{1}I$$
  

$$I \equiv |\tilde{\rho}|.$$
(7)

In this expression,  $b_2 = 1/N_{obs}$ . This expression holds even if the source is mildly resolved by the scattering disk, because the normalized, ensemble-averaged visibility remains nearly 1 (Gwinn 2001).

#### 2.3.3. Long-baseline Effects

If the baseline is long compared with the scale of the scintillation pattern in the observer plane, then the scintillations differ at the two stations. Thus,  $I_X \neq I_Y$ . Nonetheless, inspection shows that the constant term,  $b_0$ , and the quadratic term,  $b_2$ , in Equation (7) still describe the behavior of noise correctly. The linear term,  $b_1$ , does not. However, it converges to the same form in an average over many scintillation elements with the same visibility  $\tilde{\rho}$ , for a point source. This is seen by extending the calculation of visibility in Gwinn (2001) to include the intensities at the two antennas, most easily by numerical calculation. However, this average over realizations of scintillations of the noise.

If the baseline is long and the source is resolved by the scattering disk, then  $|\tilde{\rho}|^2 < \tilde{\alpha}_X \tilde{\alpha}_Y$ , so that  $|\langle \tilde{r} \rangle_n|^2 < I_X I_Y$ . Consequently,  $\sigma_{\perp}$  will acquire some of the quadratic behavior of  $\sigma_{\parallel}$  in Equation (6). For a small source size, the effect is second order in the size parameter and will become apparent only when the distribution of visibility is already significantly distorted (Gwinn 2001).

#### 2.3.4. Effects of Variability, Quantization, and Correlation

The flux densities of pulsars in general, and the Vela pulsar in particular, vary intrinsically from one pulse to the next and within pulses (Krishnamohan & Downs 1983; Johnston et al. 2001; Kramer et al. 2002). Variations on timescales shorter than the time to accumulate one sample of the spectrum, the "accumulation time," lead to correlations of noise between spectral channels and increase the source noise contribution to  $\sigma_{\parallel}^2$  (Gwinn & Johnson 2011). If we parameterize these variations by  $\delta I/I$ , with  $\langle \delta I \rangle = 0$ , then the quadratic coefficient,  $b_2$ , in Equation (7) becomes

$$b_2 = \left(\frac{\delta I}{I}\right)^2 + \frac{1}{N_{\text{obs}}}.$$
(8)

The other coefficients,  $b_0$  and  $b_1$ , are unchanged. This calculation follows Section 3.3.2 of Gwinn & Johnson (2011), but with  $\beta - 1 = \delta I/I$  averaging to zero over the suite of observations rather than over the accumulation time for a single spectrum.

Digitization, or more precisely quantization during digitization, also affects the noise. If the correlation is not extremely strong,  $\rho < 0.5$ , and if the data are viewed in the spectral domain, then the effects of quantization can be represented as a change in gain and a spectrally constant offset. This offset is often termed "digitization noise" and contributes to the values of  $b_0$  and  $b_1$ , as one would expect. The expressions for noise take the same forms as in Equations (4)–(6) above, but with corrections to station gains and noise levels (see Equations (56) and (57) of Gwinn 2006).

Correlations among spectral channels also characterize noise. For sources of constant intensity, noise is uncorrelated between spectral channels, under the "wrap" approximation (Gwinn 2006). Relaxation of that assumption can lead to an observable correlation of noise between channels, as we discuss further in Section 5.2.3. Variation of flux density within the accumulation time for a single spectrum can also lead to significant correlations of noise (Gwinn & Johnson 2011).

#### 3. OBSERVATIONS, CORRELATION, AND CALIBRATION

We observed the Vela pulsar on 1997 December 10 using a network comprising antennas at Tidbinbilla (70 m diameter), Mopra (22 m), Hartebeesthoek (26 m), and the *VSOP* spacecraft (8 m). The observations began at 14:15 UT and ended at 22:40 UT, for a time span of 8:25. The observing wavelength was 18 cm. We observed left-circular polarized radiation. We recorded two 16 MHz frequency bands (IFs) at each antenna, both as upper sidebands. The bands spanned 1634–1650 MHz (IF1) and 1650–1666 MHz (IF2). The data were digitized (quantized and sampled) at recording time, thereby characterizing the electric field with a sign bit and an amplitude bit. The data are thus four-level, or two-bit, quantized.

During the observations, the interferometer baseline from Mopra to Tidbinbilla had a projected length of approximately 400 km. The baseline from Hartebeesthoek to Tidbinbilla had a projected length of approximately 9400 km. The baseline from the *VSOP* spacecraft to Tidbinbilla had a length of approximately 27,000 km during the first period of data, from 14:00:56 UT to 15:55:56 UT, when the spacecraft was near apogee, and of approximately 22,000 km during the second period of data, from 20:45:25 UT to 21:13:00 UT, near the following apogee. The first period spanned a longer time period and showed more homogeneous statistics.

We correlated the data with the Canadian S2 VLB correlator (Carlson et al. 1999). This correlator is a reduced-table four-level correlator; in other words, the lowest-level products are ignored (Hagen & Farley 1973). We correlated each IF separately with 8192 lags to form a cross-correlation function.

We correlated the signal from the pulsar in six gates, synchronized with the pulsar's period of approximately 89 ms. Each gate

**Table 1** Ouantizer Levels:  $+y_0$ 

Station	On Pulse: Gate 1, IF1		Off Pulse: Gate 6, IF1	
	Average	Std. Dev.	Average	Std. Dev.
Hartebeesthoek	0.928	0.007	0.944	0.007
Mopra	0.933	0.005	0.944	0.005
Tidbinbilla	0.843	0.017 <sup>a</sup>	0.947	0.004
VSOP spacecraft	0.923	0.014 <sup>b</sup>	0.923	0.014 <sup>b</sup>

Notes.

<sup>a</sup> Standard deviation reflects pulse-to-pulse variations in intensity.

<sup>b</sup> Standard deviation reflects primarily a slow drift over the time span of observations.

was 1 ms wide. The first five gates covered the pulse. The sixth gate was located far from the pulse, where the pulsar was "off." Because of interstellar dispersion, each gate covered a range of pulse phases. Individual pulses also vary in intensity. We averaged each spectrum over a number of pulses, which reduced, but did not completely eliminate, this variation. We averaged the results of the correlation for 2 s, or approximately 22.4 pulsar periods, except on the baselines to the spacecraft, which we averaged for 0.5 s, or approximately 5.6 pulsar periods. The pulsar was strong enough to contribute to the system temperature at the antennas; this contribution affected the noise through settings for the digitizers at the antennas, particularly at the most sensitive antenna.

For a reduced-table four-level correlator, the optimal level settings are  $v_0 = \pm 0.90$  standard deviations, with weighting n = 3 (Cooper 1970). Because the intensity of the pulsar varies greatly during the pulse, and because the quantizer levels were adjusted every 10 s to optimal values for the previous 10 s period, the quantizer levels  $\pm v_0$  were not at this optimal setting in each gate. Table 1 gives the levels in Gate 1 (where the most variation occurred) and in the empty gate (which provides the most contrast). For Tidbinbilla, the largest and most sensitive antenna, the levels changed dramatically and the standard deviation was much greater when the pulsar was "on" because the pulsar made a large, variable contribution to system temperature. The variations are particularly large in Gate 1, at the leading edge of the pulse (see Krishnamohan & Downs 1983). In contrast, for the VSOP spacecraft, the smallest antenna, the levels were the same on and off pulse, because the contribution of the pulsar was insignificant; the large standard deviation of  $v_0$  arose from a trend over the time span of the observations. For the medium-sized antennas, Hartebeesthoek and Mopra, the levels changed between "on" and "off" gates, but the standard deviations remained approximately the same. The correlator corrected for these changes in  $v_0$  when estimating the cross-power spectrum  $\tilde{\rho}$ ; however, differences of  $v_0$  among gates change the properties of the noise in those gates (see Gwinn 2004, 2006). We discuss these effects in Section 5.

The pulsar gates were so narrow that different lags accumulated different numbers of samples. The 8192 calculated lags spanned a time comparable to the width of a pulse gate:  $(1 \text{ ms}) \times (16 \text{ MHz}) = 16,000 \text{ complex samples}$ ; therefore, large lags accumulated fewer samples than small lags. The correlation function,  $r_{\ell}$ , was correctly normalized by the number of samples contributing at each lag (Equation (1)); thus, the average of the correlation function  $\langle r_{\ell} \rangle$  was the same as would have been measured with uniform sampling. However, the noise varied with lag. We Fourier-transformed the cross-correlation functions to form cross-power spectra. Because the data were recorded in single sidebands, the cross-power spectra contained 8192 channels with signal, each with bandwidth 1.95 kHz. The phase of the cross-power spectrum included instrumental effects, primarily observational and instrumental delays and rates, varying slowly with time and frequency (Thompson et al. 1986), and effects of scintillation, varying more rapidly, over the timescale and bandwidth of scintillation (Desai et al. 1992).

The noise in a particular measurement of the correlation function was diluted by the integration time but increased by the number of spectral channels. We accumulated  $16 \times 10^6$ statistically independent complex samples per second. On Earthbased baselines, over a time of 2 s, we sampled 22.4 pulse periods, for an average net integration time of 22.4 ms in one of our pulsar gates. Our 8192 channel spectra then contained 44 independent complex samples per spectral channel for each integration period. However, because of the truncation of the correlation function by the pulse gate discussed in Sections 2.1 and 5.2, higher lags accumulated approximately only half as many samples; thus, the average number of samples per spectral channel was approximately 33. On baselines to the VSOP spacecraft, the shorter integration time yielded 11 samples per channel and integration time for central lags and approximately 8 samples per spectral channel.

Tones were injected into the signal, for calibration, at Hartebeesthoek. These tones were separated by 511 channels (998 kHz) and were 1 or 2 channels wide. In cross-power spectra, they had the effect of increasing the noise in these spectral regions. We removed the narrow spectral regions containing these spikes from the spectra before continuing with analysis.

We removed the average delay and rate by fringe fitting (see Thompson et al. 1986). The fit included a fringe rate in time, a delay or slope of phase with frequency, and an overall phase offset. For baselines between terrestrial antennas, we fringe fit to (the central 7168 channels in frequency)  $\times$  (8 samples in time, or 16 s), in the strongest gate, Gate 2. We applied the fringe rate and delay to the other gates but calculated the overall phase offset independently. The results appeared to be nearly the same as fitting such a model to other gates that contained strong signal, such as Gate 1; however, we prefer to use precisely the same model in weak and strong gates. For this paper, the primary purpose of fringe fitting was to remove all instrumental effects, leaving only the effects of scintillation and those of statistical noise in the data.

### 3.1. Typical Data

Figure 1 shows some sample data, along with the scheme of pulse gates. To produce this figure, we averaged the real part of a segment of data for IF1 on the short Mopra-Tidbinbilla baseline, from 14:15:05 UT to 14:20:00 UT. This averaging reduced the depth of scintillation. We display the resulting average in the five gates as a function of pulse phase, including pulse gate and spectral dispersion. Each gate sampled the IF bandwidth over a short range of pulse phase; however, because of pulse dispersion, the low-frequency end of the gate sampled earlier parts of the pulse than the high-frequency end. The plot gives a rough idea of the pulse profile, although the effects of scintillation are still quite large and each sample is averaged over the 1 ms gate. As the figure shows, each phase in the pulse profile is represented twice, at two different frequencies. Each frequency is represented five times, in each of the gates (as well as in the empty sixth gate, outside the plot).



**Figure 1.** Gates across the pulse. Lower panel: averaged cross-power spectrum for the Mopra–Tidbinbilla baseline, in IF1, displayed as a function of pulse phase. Upper panel: gates displayed with pulsar phase and frequency. Gates are defined in frequency and time and appear as parallelograms in this plot because of dispersion. Each point in the lower plot shows one spectral channel, at the center of 1 ms of pulse phase. Spikes show scintillations during the 5 minute observing period. Dips in the pulse profile show rolloff of gain at the edges of the frequency band, in each gate.

Figure 2 shows cross-power scintillation spectra. It compares the same 1 MHz spectral range for a single 2 s integration, in Gates 1, 2, and 6 (off-pulse). The scintillation appears as dramatic variations in amplitude, with large amplitudes concentrated in a few spectral regions. As measured from all of the Mopra-Tidbinbilla interferometric data, the typical scintillation bandwidth was 15 kHz (half-width at half-maximum of the autocorrelation function, in frequency; Gwinn et al. 2012). This frequency scale is apparent in the spectra. Note, however, that noise modulates the scintillation peaks on finer scales and introduces differences in detailed shapes of the peaks between gates. The typical scintillation timescale was 9 s (1/e point ofautocorrelation function, in time). This timescale is longer than the integration time of the spectra. These scintillation scales are in good agreement with results extrapolated from singledish measurements by other observers at other frequencies (see, for example, Roberts & Ables 1982; Cordes et al. 1985). The spectrum in Gate 6 appears completely noiselike: indeed, the samples are drawn from a circular Gaussian distribution in the complex plane, as discussed in Section 5.1 below.

# 4. OBSERVATIONS OF THE NOISE DISTRIBUTION

### 4.1. Strategy: Noise Estimates from Differences

## 4.1.1. Noise Estimates

Differences between samples separated by much less than the scales of scintillation reflect noise and intrinsic variability; these differences can therefore be used to estimate properties



**Figure 2.** One frequency range of cross-power spectrum for the Mopra–Tidbinbilla baseline in Gates 1, 2, and 6. Spectra are averaged over 2 s starting at 15:43:00 UT. The first two gates show nearly the same spectrum, to within an overall factor, because they sample the same time and frequency interval of the scintillation pattern. Gate 6 contains only noise.

of the noise. For example, consecutive samples in time can estimate both the signal (as their average) and the noise (as  $\sqrt{2}$  times their difference). More generally, we can estimate the signal and noise as averages over, and differences among, groups of nearby samples. These estimates are unaffected by the scintillation if all of the samples are contained well within the characteristic frequency and timescales of the scintillation.

Specifically, if we assume that the statistically averaged signal  $s_k$  is identical in N samples  $r_k(t_\ell)$  and that the noise  $n_{k,\ell}$  is uncorrelated, then we can estimate both the signal and the noise as

$$s_k = \frac{1}{N} \sum_{\ell} r_k(t_\ell)$$
$$n_{k,\ell} = \sqrt{\frac{N}{N-1}} (r_k(t_\ell) - s_k), \tag{9}$$

where the index  $\ell$  runs over the *N* samples compared. By binning the estimated noise,  $n_{k,\ell}$ , according to the estimated signal,  $s_k$ , and then estimating the variance in each bin, we can identify the changes of the distribution of noise as a function of signal and so identify the three coefficients { $b_0$ ,  $b_1$ ,  $b_2$ } in Equation (7).

### 4.1.2. Effects of Scintillation, Variability, Correlation, and Binning on Noise Estimates

The estimate of noise in Equation (9) does not include four effects that can contribute to noise: scintillation, amplitude vari-

ations, correlation of noise, and binning. Scintillation changes the spectrum over the scintillation bandwidth and timescale, so that differenced samples do not have identical averages. This change will increase the estimated variance by an amount proportional to the square of the signal and so will affect estimates of the coefficient of the quadratic term,  $b_2$ . We limit the span of averages to less than the scintillation time to minimize this effect.

Scintillation also introduces differences between the autocorrelation functions at the two antennas, as discussed in Section 2.3.3 above. The difference grows as the square of baseline length, divided by the scale of the diffraction pattern for short baselines. As discussed in Section 2.3.3, an average over many scintillation elements recovers the behavior given by Equation (7). However, this average over scintillation elements converges much more slowly than the average over realizations of the electric field used for short baselines.

Amplitude variations of the Vela pulsar are significant (Krishnamohan & Downs 1983; Johnston et al. 2001; Kramer et al. 2002). Amplitude variations of the pulsar produce differences between spectra and thus mimic effects of noise. If the amplitude can be estimated from individual spectra, the effects can be removed (Gwinn et al. 2011). In the observations reported here, rapid variations in time appear as spectral variations because of dispersion, and the S/N within a narrow region of the spectrum is too low to estimate amplitude reliably. However, the intrinsic variability of the pulsar is reduced by our averaging over 22 or 23 pulses.

Correlation of noise in nearby spectral channels can arise from pulse gating, as discussed in Section 5.2.3 below. Larger correlations arise from variations of intensity on timescales shorter than the time to accumulate a single sample of the spectrum (Gwinn & Johnson 2011; Gwinn et al. 2011). For these observations, this timescale is 8192/16 MHz = 0.512 ms. The Vela pulsar shows significant variations on shorter timescales (Krishnamohan & Downs 1983; Johnston et al. 2001; Kramer et al. 2002), so we expect these correlations to be significant. Therefore, we do not use differences among spectral channels to estimate noise, but only differences among times. (An exception is the *VSOP*–Tidbinbilla baseline discussed in Section 4.5, where low S/N demands differencing in frequency as well as time.)

Binning of the noise estimates by signal requires an accurate estimate of signal  $s_k$ . Even if the noise estimate is correct, it may be assigned to the wrong bin, altering the form of the estimated distribution. This problem is most severe when the distribution of signal varies within the span of the error in  $s_k$ . In this case, the noise can "leak" into the wrong bin. Consequently, low S/N drives the analysis to few, large bins. The problem can be lessened by integrating over a longer time interval, so that the average is better determined. These intervals must be smaller than the scales of variations from scintillation, which can mimic noise.

Alternative analyses, involving a model for the distribution of flux density of the scintillating source, avoid use of bins completely and so eliminate "noise leakage." Such analyses can estimate all parameters, including noise parameters, simultaneously (as in Gwinn et al. 2012; Johnson et al. 2012). These methods are also insensitive to correlations between spectral channels. However, the differencing and binning analysis presented here allows straightforward visualization of the noise distribution, as presented in Sections 4.2 through 4.5 below, without any assumption about the underlying distributions of visibility or noise.



Figure 3. Distributions of noise, in bins of signal in the cross-power spectrum, in IF 2 Gate 2 channels 2048–3072 on the Hartebeesthoek–Tidbinbilla baseline. For each bin in real and imaginary part of average signal, the ellipse shows one-half the standard deviations of noise within that bin. Ellipses are plotted for bins that contain N > 100 noise values. Labels are  $\log_{10} N$ .

#### 4.2. Observations: Noise in the Complex Plane

The interferometric visibility is complex, and the distribution of noise varies with it over the complex plane. Figure 3 shows estimated noise as a function of average visibility in the complex plane, for the Hartebeesthoek–Tidbinbilla baseline. This baseline was long enough to span much of one scintillation element, so that the interferometric phase varies over  $2\pi$ . Moreover, the antennas are large, so the resulting moderate S/N allows the complex plane to be divided into many bins. Note that although the distribution extends over  $2\pi$  in phase, it is concentrated toward the right: the average visibility lies on the positive real axis.

We used data from IF2, Gate 2, channels 2048–3072, for the entire time span of the observation on that baseline. We formed spectra, and fringed the data, as described in Section 3 above, to align the average visibility with the positive real axis. We then differenced pairs of consecutive time samples to find the estimated noise  $n_k$  and signal  $s_k$ . The data were binned by real and imaginary parts of the average signal  $s_k$ , with bin increments of 0.015 correlator units. For bins containing more than 100 samples, we found error ellipses from the standard deviation of our estimates of the complex noise  $n_k$  in that bin. The figure shows these ellipses. The displayed ellipses extend to one-half standard deviation of the noise in each bin, to reduce confusing overlap.

The error ellipses have the form that Equation (7) suggests, with size increasing with distance from the origin, indicating increasing noise with increasing signal amplitude. Ellipses close to the origin are nearly circular, as they must be: the noise is independent of signal phase, when signal amplitude is near zero. Both dimensions of the error ellipses grow with increasing signal; however, the noise in phase with the signal grows faster, so that the ellipses become elongated farther from the origin. Of course, amplitude variations in time, between pulses, would produce the same effect. However, the contribution of such amplitude variations is small for our 2 s averages.

# 4.3. Observations: Noise on a Short Baseline

Figure 3 and the form of Equation (7) suggest that we find noise parallel with and perpendicular to the signal. Thus, as long as we consider perpendicular and parallel components separately, we can group together noise estimates with the same magnitude of visibility. Figure 4 shows this analysis for IF2, Gate 1 channels 5120–6144 on the Mopra–Tidbinbilla baseline. This short baseline provided a long observation, yielding many individual measurements of noise. The chosen gate and channel range are near the pulse peak, where the source was strong and S/N is high, providing for many, relatively narrow bins. As in Equation (9), we averaged the signal over four samples, or 8 s. We then found noise by differencing individual samples from the average. For each bin in signal amplitude, we present histograms of noise in phase with the signal and at quadrature.

As the figure shows, noise was equal in the two directions at zero signal, at lower left, and increased with signal amplitude to the right and upward. Moreover, noise increased more in phase with the signal than in quadrature with it, so that the widths of the two distributions in each panel diverge as signal increases. The number of points decreased with increasing signal as well, representing the effect of the underlying distribution of visibility. The vertical scales are logarithmic, so that a parabolic shape indicates a Gaussian distribution. We do not display fits of Gaussian distributions to the histograms in the figure because these are nearly indistinguishable from the histograms.



Figure 4. Distribution of noise in phase with the signal (solid) and in quadrature (dotted), for bins in amplitude of the signal, in IF 2 Gate 1 channels 5120–6144 on the Mopra–Tidbinbilla baseline. Noise was found by finding differences from the averages of four samples in time. Numbers at the top right of each panel show the amplitude of the signal at the center of the bin. Units are correlator units.

Figure 5 shows the variances of the best-fitting Gaussian distributions to noise, for the data shown in Figure 4. The noise in phase with the signal (shown by circles in the figure) increases quadratically with signal amplitude, whereas noise in quadrature with the signal (shown by crosses) increases linearly. This is precisely the behavior expected, as discussed in Section 2.2 above. We fit these two curves with polynomials of the form given by Equation (7). We assume that the coefficients (except the quadratic coefficient  $b_2$ ) are the same for  $\sigma_{\parallel}^2$  and  $\sigma_{\parallel}^2$ . The fit is to points in the range 0.006 < I < 0.056. Points at larger I are based on a small number of samples. In the lowest bin, noise is slightly higher than expected in both components, compared with extrapolation from larger bins and the fit. The noise increases in all directions away from this bin, so that every point "leaked" from an adjacent bin tends to increase the noise, as discussed in Section 4.1.2 above. The y-intercept of the fit is close to the noise level estimated for the empty spectral range of this gate, discussed in Section 5.1 below. The figure also shows, as a dotted line, results for noise in a fit to the global distribution of visibility discussed in Gwinn et al. (2012). The two techniques usually agree well, for gates and spectral ranges with high amplitude, so that leakage of noise into adjacent bins is small, and the distribution can be characterized well.

As a measure of the quality of these fits, we note that in the absence of self-noise, all 16 points in Figure 4 would have a

single value  $b_0$ . The mean square residual about the best-fitting single value is  $6.5 \times 10^{-1}$ . Our model included two additional parameters,  $b_1$  and  $b_2$ , and reduced the mean square residual to  $2.4 \times 10^{-3}$ , or by a factor of 268. The F-ratio test gives the likelihood of this improvement occurring by chance of less than  $10^{-12}$  (Bevington & Robinson 2003). Thus, the three-parameter model is excellent. If we adopt the parameters from Gwinn et al. (2012) shown by the dashed lines in Figure 4, the mean square residual is  $3.3 \times 10^{-3}$ .

The difference between  $\sigma_{||}$  and  $\sigma_{\perp}$  reflects self-noise and effects of amplitude variations. The contribution of self-noise was  $1/N_{obs} = 1/33$ , as discussed in Section 3. As Equation (8) shows, amplitude variations on timescales longer than the accumulation time, approximately 1 ms, and shorter than the 2 s integration time contributed to  $b_2$ . For the data in the figure, we found  $b_2 = 0.12$ . This value indicates that  $(\delta I/I)^2 = 0.09$ , as would be expected after integrating over 22 or 23 pulses (Krishnamohan & Downs 1983; Johnston et al. 2001; Kramer et al. 2002).

#### 4.4. Observations: Noise on an Intermediate Baseline

Figure 6 shows the behavior of noise on the Hartebeesthoek– Tidbinbilla baseline. This baseline had projected length of over 9000 km during the observation; however, it is intermediate in length in the sense that it is comparable to the length scale of the



**Figure 5.** Variances of noise in phase with the signal (circles) and at quadrature (crosses) estimated from differences of channels from the average of four consecutive samples in time. Data are from IF 2 Gate 1 channels 5120–6144 on the Mopra–Tidbinbilla baseline. Solid curves show best-fitting line and parabola to the points, with the fit demanding the same linear terms for both. Leftmost and rightmost points were excluded from the fit. The dashed curve shows the curve from a fit to the full distribution (Gwinn et al. 2012). The heavy tick on the y-axis shows noise in the spectral region of Gate 1 empty of signal (see Figure 8). Units are correlator units.

scintillation pattern. Moreover, the baseline was short compared with the baseline to the *VSOP* spacecraft. We included data from the entire time span recorded, in IF2, Gate 1, channels 5120–6144. This is the same gate and frequency range as shown for the Mopra–Tidbinbilla baseline in Figure 5. This range was chosen for comparison, and because Gate 1 allows comparison with an empty region of the gate. We fit these two curves with polynomials of the form given by Equation (7), to points in the range 0.006 < I < 0.056. Our three-parameter noise model reduced the mean square residual over the 10 points in the fit, relative to a single variance, by a factor of 1112. The F-ratio test gives probability of this occurring by chance of less than  $5 \times 10^{-12}$ .

Comparison of Figures 5 and 6 shows interesting consequences of the longer baseline length. The maximum amplitude was smaller, because as the baseline length approaches the scale of the scintillation, occurrences of high intensity at both stations become less likely. The contribution of background noise  $b_0$  was smaller and the self-noise was greater, perhaps because Hartebeesthoek has larger area than Mopra (26 m rather than 22 m diameter).

The points at high amplitude show scatter about the fitted curves; for this intermediate baseline, the average for  $b_1$  converges over some timescale intermediate between the many samples of electric field for a short baseline and the many scintillations required for a long baseline. The first bin is elevated relative to the extrapolated, fitted curves, and the *y*-intercept of the fitted curves lies above the noise found in the empty part of the gate. This may result from leakage of noise into adjacent bins and the different convergence statistics.



**Figure 6.** Same as Figure 5, but for the Hartebeesthoek–Tidbinbilla baseline, for IF 2 Gate 1 channels 5120–6144. Again, the heavy tick on the *y*-axis shows noise in the spectral region of Gate 1 empty of signal.

### 4.5. Observations: Noise on a Long Baseline

As an example of noise on a long baseline, we analyze the long baseline from the *VSOP* spacecraft to Tidbinbilla, using procedures similar to those for the short Mopra–Tidbinbilla baseline. On this long baseline the phase of the cross-power spectrum varied through many turns because of scintillation. Instrumental phase variations were larger and more rapid than on the Mopra–Tidbinbilla baseline discussed above, and of course the 8 m spacecraft antenna is smaller than Mopra. Fringe fitting the data, as described in Section 3, was challenging because of the rapid variation of phase and rate from spacecraft motion, the large variations of phase with scintillation, and the low average visibility.

For analysis of noise, we used fewer, larger bins in visibility so that the noise in a bin does not greatly exceed bin width. For our tests, we used data from the first orbit, from IF1. We used Gate 2, which is near the peak of the pulse and has high flux density across the observing band, to maximize signal and so ease fringe fitting. To improve the quality of the noise measurement, and to reduce leakage into adjacent bins, we found averages for the real and imaginary parts of the visibility for spans of four channels in frequency and eight samples in time (7.8 kHz × 4 s). The frequency span lies well within the scintillation bandwidth of 15 kHz, and the time span within the scintillation timescale of 9 s and the fringing time of 16 s.

The noise is different in phase and in quadrature with the signal. Figure 7 shows the variances  $\sigma_{||}$  and  $\sigma_{\perp}$  plotted with the averaged magnitude of the visibility  $|s_k|$ . We fit to the range  $0.005 < |s_k| < 0.020$ . Again, quadratic and linear models, with linear terms identical, fit the data well for small signal amplitude. The three-parameter model reduces the mean square residual by a factor of 31, relative to a single-parameter model. The *F*-test gives probability of chance occurrence of less than  $6 \times 10^{-5}$ .

The quadratic term is small compared with the linear term, in comparison with the other baselines, as expected for the lower



**Figure 7.** Same as Figure 5, but the *VSOP*–Tidbinbilla baseline, and in IF1 Gate 2 in channels 1024–3079, for Orbit 1 near apogee, for 14:52:16 to 15:19:49 UT. Averaged signals from (4 channels in frequency)  $\times$  (8 samples in time).

S/N for this less-sensitive baseline. The point at smallest amplitude shows considerably higher noise than that extrapolated from larger amplitudes, again most likely from "leakage" of noise from other bins into this bin. As discussed in Section 2.3.3, the noise converges to the expected form only in an average over many scintillation elements. This slow convergence and the relatively small number of samples at large visibility contribute to the variation of the points about the expected form.

#### 5. ANALYSIS: CORRELATOR EFFECTS

#### 5.1. Statistics of Noise in an Empty Gate

#### 5.1.1. Variance: Short Baseline

In spectral regions empty of signal, the average value of the cross-power spectrum is zero, and the noise closely approximates a Gaussian distribution. Figure 8 shows two examples for the Mopra–Tidbinbilla (MT) baseline: the distribution of the real and imaginary part of  $\tilde{r}_k$  for IF1 channels 1024–2048 during the period 19:08:17 UT to 21:12:52 UT, in Gates 1 and 6. Gate 6 was correlated only for IF1. The statistics of the real and imaginary parts are nearly identical, as expected for the noise, as the figure shows. The noise is clearly smaller in Gate 1, when the pulsar is "on" in another part of the gate. The variances are  $58.3 \times 10^{-6}$  correlator units<sup>2</sup> for Gate 1 and 96.5  $\times 10^{-6}$  correlator units<sup>2</sup> for Gate 6.

The change in noise is an artifact of digitization (Gwinn 2006). The reduction is the consequence both of the change in autocorrelation spectrum  $\tilde{\alpha}$  and of the different levels of the quantizer relative to the standard deviation of the signal (Table 1). Equation (56) of Gwinn (2006) gives the noise in the absence of signal:

$$b_0 = \Gamma_C \frac{2N}{N_{\text{obs}}} \left( A_{X2} + B_X(\tilde{\alpha}_k - 1) \right) \left( A_{Y2} + B_Y(\tilde{\alpha}_k - 1) \right).$$
(10)



**Figure 8.** Distribution of noise with zero signal for the MT baseline in Gate 6 and Gate 1 in IF1, channels 1024–2048. Solid lines show real parts of cross-power  $\tilde{r}_k$ ; dotted lines show imaginary parts. Gate 6 is empty: the pulsar is "off." Gate 1 contains pulsar emission at higher frequencies but is nearly empty in this spectral range. Solid curve shows the fit for a Gaussian distribution to the histogram, for Gate 6.

This expression relates the notation of this paper on the left side of the equation with that of Gwinn (2006) on the right. Evaluation requires the autocorrelation spectrum  $\tilde{\alpha}_k$ , subject to the normalization condition:  $\sum \tilde{\alpha}_k = 1$ , where the sum runs over the 2*N* spectral channels (Gwinn 2006, Equation (1)). Effects of the change in the threshold for the quantizer  $v_0$  are contained in the constants  $A_{X2}$ ,  $B_X$  for station X and  $A_{Y2}$ ,  $B_Y$  for Y. These quantities can be calculated from the statistics of the reducedtable two-bit correlator with n = 3 and the values for  $v_0$  given in Table 1. The correlator-dependent gain  $\Gamma_C$  parameterizes instrumental effects. The number of spectral channels is 2*N*, and the number of observations is  $N_{obs}$ . For our observations, on a short baseline,  $2N/N_{obs} \approx 33$  as discussed in Section 3.

For Gate 6, empty of any pulsar flux, the autocorrelation function was flat, and  $\tilde{\alpha}_k \equiv 1$ . When the pulsar turns on in part of the spectrum, the autocorrelation function in the offpulse portion must fall, because  $\tilde{\alpha}_k$  is normalized. This accounts qualitatively for the reduced noise level in the empty portion of Gate 1 relative to the completely empty Gate 6, although changes in  $v_0$  also play a role.

A quantitative calculation of the autocorrelation spectrum when the pulsar is "on" is necessarily indirect. We estimated the relative background noise of the antennas from tabulated system-equivalent flux densities and used the average crosspower spectrum in Gate 1 (a smoothed, larger average similar to that shown in Figure 1) to estimate the contribution of the source to the spectrum. Using the normalization condition, we estimated  $\tilde{\alpha}_k$  in regions of the spectrum without pulsar flux. We used the tabulated average values of  $v_0$  and the correlator parameter n = 3 to determine the constants  $A_{X2}$ ,  $B_X$ ,  $A_{Y2}$ , and



**Figure 9.** Distribution of variance of noise in the empty Gate 6, averaged over the spectrum, plotted as a histogram. The vertical lines show the expected horizontal locations of peaks given by the numbers of pulses within an integration time: 22 and 23 for the upper panel (Mopra–Tidbinbilla baseline) and 5 and 6 for the lower panel (*VSOP*–Tidbinbilla baseline). Vertical extents of the lines show the expected relative populations of the vo peaks. The dotted lines show a fit for the superposition of two Gaussian distributions to the histograms.

 $B_Y$ , for Gates 1 and 6. Equation (10) then provided the noise in the two cases; their ratio is independent of  $\Gamma_C$ . We found an expected ratio of 1.23 of the standard deviation of noise in Gate 6 to that in Gate 1. This is in approximate agreement with the measured ratio of 1.29, from fits to the histograms shown in Figure 8. A more sophisticated calculation might include use of the autocorrelation spectra for the two antennas and quantizer populations measured synchronously with them; it might also include a spectral model for noise with frequency at each antenna.

### 5.1.2. Noise and Number of Pulses

The observed distributions of noise are superpositions of underlying distributions. For example, not all integration times contained the same number of samples. On the MT baseline, the signal was integrated for 2 s, or 22.4 pulse periods; more precisely, 61% of the integrations contained 22 pulses, and 39% contained 23. Although the data are normalized to the integration time, the variance of the noise, parameterized by  $b_0$ , will be 4% greater for the integrations with fewer pulses.

Of course, the number of pulses was the same for all channels within a given sample of the spectrum. A spectral average provides an estimate of variance. We demonstrate the effect of integrating over different numbers of pulses in Figure 9. We plot a histogram of the variances over channels 1024–2048, for samples from the time span of the data in Section 4.3, in IF1. The histogram shows two clear peaks. The centroids of the peaks lie at horizontal positions close to the expected ratio of 61:39.

The vertical lines show these positions, constrained to match the overall variance of the data set. The dotted line shows a simple fit of a model for the sum of two Gaussian distributions to the two peaks, with the normalizations and locations of the peaks set as for the lines, with net normalization equal to the number of samples and the widths of the peaks equal.

### 5.1.3. Variance: Long Baseline to Spacecraft

We analyzed noise for the long baseline from the VSOP spacecraft to Tidbinbilla, by examining the distribution of noise in individual channels and time samples. The much smaller number of pulses per 0.5 s integration on the VSOP-Tidbinbilla baseline had a much greater effect on the noise, as Figure 9 shows. For this figure, we used IF1, in the empty Gate 6, for the data for Orbit 1. Comparison of the pulsar period with the integration time indicated that 40% of samples contain five pulses and 60% contain six pulses. Again, the vertical lines under the two peaks show their expected locations, constrained to match the overall variance of the data set. Locations are in the expected 5:6 ratio, and populations 40:60. We again show a fit of a model for the sum of two Gaussian distributions to the two peaks. In this case, the widths of the peaks are proportional to the squares of the variances, as expected for purely statistical contributions to the widths of the peaks.

We found that noise in Gate 6 from the long baseline was nearly Gaussian, using an analysis similar to that in Section 5.1. We separated the noise samples into two groups, according to the variance. The variances of the two groups are  $3.44 \times 10^{-4}$ and  $4.12 \times 10^{-4}$  (correlator units)<sup>2</sup>, respectively. The variance of the resultant distribution is a weighted sum of the two:  $3.71 \times 10^{-4}$  (correlator units)<sup>2</sup>. In the empty portion of Gate 1, the statistics are similar, but with smaller resultant variance:  $3.10 \times 10^{-4}$  (correlator units)<sup>2</sup>, for channels 1024–2048. As for the Mopra–Tidbinbilla baseline, the decrease in noise arises from the presence of signal elsewhere in the band. Using the method discussed in Section 5.1.1, we estimated the expected ratio of the standard deviations of noise in Gate 6 to that in Gate 1 to be 1.19, for the *VSOP*–Tidbinbilla baseline. This expectation is in reasonable agreement with the measured ratio of 1.20.

#### 5.2. Distribution of Noise with Correlator Lag

Variances and covariances completely characterize Gaussian noise. Covariance of noise in different spectral channels can arise from quantization (Gwinn 2006), from source variability on short timescales (Gwinn & Johnson 2011; Gwinn et al. 2011), and from pulsar gating, as described in the following section. In this section, we calculate the covariance for noise in an empty gate and compare with observations. We then discuss how, for gates containing signal, the covariance introduced by source variability masks that from pulsar gating.

### 5.2.1. Pulsar Gate without Wrap

Pulsar gating can introduce spectral correlations. Indeed, any temporal modulation is predicted to introduce spectral correlation (Gwinn & Johnson 2011). For our observations, the maximum lag correlated approaches the width of a pulse gate. Therefore, at large lag, we obtain fewer measurements of the correlation function than at small lag. The covariance of noise between two spectral channels is given by Fourier transform of the product of elements of the correlation function. The Fourier transform of two copies of Equation (1) leads to an expression



**Figure 10.** Correlation function of noise in empty Gate 6 on the MT baseline, plotted with lag  $\tau$ . Points show measured mean-square correlation function. Solid line shows theoretical curve for effects of pulse gating. A single parameter, the overall scale, has been fit to match theory to observation.

similar to Equation (22) of Gwinn (2006):

$$\langle \tilde{r}_{k} \tilde{r}_{k+\ell}^{*} \rangle - \langle \tilde{r}_{k} \rangle \langle \tilde{r}_{k+\ell}^{*} \rangle = \sum_{\upsilon,\mu=-N}^{N-1} \frac{1}{(N_{\text{obs}} - |\upsilon + \mu|)(N_{\text{obs}} - |\upsilon|)} \times \sum_{n,m} e^{\left[i\frac{2\pi}{2N}(k\mu + (k-\ell)\upsilon)\right]} \alpha_{n-m} \alpha_{-(n-m)+\mu}.$$

$$(11)$$

Note that, in our case, the limits of the sums over *n* and *m* depend on both v and  $\mu$ . This is because the correlation functions  $r_{\tau}, r_{v}^{*}$  are not averaged over all of the samples at both stations. The correlation of noise between spectral channels given by Equation (11) depends on the specific form of the autocorrelation function,  $\alpha_{\tau}$ . However, the autocorrelation function is always maximum at  $\alpha_{0} = 1$  for lag  $\tau = 0$  and usually falls rapidly to zero for larger lags  $\tau$ .

### 5.2.2. Correlation of Noise: White Signal and White Noise

We suppose in this section that the original time series is spectrally flat or "white" noise (Papoulis 1991). Consequently, the correlation function is zero except at the central lag:  $\alpha_0 = 1$ , and  $\alpha_v = 0$  for  $v \neq 1$ . We then find

$$\langle r_{\upsilon}r_{\upsilon}^{*}\rangle - \langle r_{\upsilon}\rangle\langle r_{\upsilon}^{*}\rangle = \frac{1}{N_{\rm obs} - |\upsilon|}.$$
 (12)

Because we have normalized the correlation function and the signal is white, the mean square noise is just the reciprocal of the number of samples.

In the spectral domain, this variation of the number of samples leads to correlation. In Equation (11), the product of  $\alpha$  values is

zero unless m = n and  $\mu = 0$ . Performing the remaining sums, we find for the correlation between channels

$$\langle \tilde{r}_k \tilde{r}_{k+\ell}^* \rangle - \langle \tilde{r}_k \rangle \langle \tilde{r}_{k+\ell}^* \rangle = \sum_{\upsilon=-N}^{N-1} e^{\left[i\frac{2\pi}{2N}(k-\ell)\upsilon\right]} \frac{1}{N_{\rm obs} - |\upsilon|}.$$
 (13)

This correlation is largest for close spectral channels ( $\ell \ll 2N$ ) because the noise in the correlation function is largest for large lag ( $\upsilon \rightarrow N$ ).

### 5.2.3. Observed Correlation of Noise in an Empty Gate

We compared observations on the Mopra–Tidbinbilla baseline with the theoretical prediction of Equation (12) and find quantitative agreement. Figure 10 shows the results. To make the figure, we re-transformed the spectrum for each time interval and found the mean-square correlation function  $\langle r_{\tau}r_{\tau}^* \rangle$ . The data used to make Figure 10 are from Gate 6, IF2, of the Tidbinbilla–Mopra baseline, from 14:15 to 15:41 UT. We used the full recorded bandwidth. The downward-pointing spike at  $\tau = 5000$  apparently results from interference. The solid curve shows the form predicted by Equation (12), as expected for  $N_{obs} = 16,000$  complex samples, for the 1 ms length of the pulsar gate and our 16 MHz bandwidth.

Figure 10 shows less noise at small lag, as Equation (12) suggests. From Fourier transform of the theoretical curve shown in the figure, we find that noise in the spectrum  $\tilde{r}_k$  is anticorrelated in adjacent channels by approximately -6%, expressed as normalized correlation. This correlation falls off rapidly, however: it is only +0.4% in the second channel, -0.7% in the third, and so on.

### 5.2.4. Correlation of Noise: Signal Present

If the spectrum is not "white," then Equation (11) still holds, and  $\alpha_0 = 1$ . For typical spectra, we expect that correlations away from the zero lag will be small:  $|\alpha_{\tau}| \ll 1$ , for  $\tau \neq 0$ .

If all of the features of the spectrum are fully spectrally resolved, then any nonzero values of  $\alpha_{\tau}$  will be concentrated in a range close to  $\tau = 0$ , and the effect of the reduced denominator on the right-hand side of Equation (11) will tend to increase the noise at large lag  $\tau$ . On the other hand, if the spectrum is not fully resolved, some nonzero values of  $\alpha_{\tau}$ will be missing from the sum, which will tend to decrease the noise at large lags. Both effects are larger for higher lags  $\tau$ and thus will tend to introduce small-lag correlations in the conjugate spectral domain. The first will introduce negative correlations, the second positive correlations. For well-resolved spectra, the first effect will predominate and will likely produce anticorrelations comparable to those estimated for white spectra and noise.

# 6. CONCLUSIONS

### 6.1. Summary of Results

We compare theoretical predictions for the distribution of noise for cross-power spectra with observations of a scintillating pulsar, the Vela pulsar. We describe observations made with Earth-based very long baseline interferometry baselines and with baselines from an orbiting spacecraft to Earth. These observations extend previous studies (Gwinn & Johnson 2011) to the regime of high S/N and large variations in interferometric phase.

In Section 2, we argue that, in the presence of signal, noise on a short baseline should be drawn from an elliptical Gaussian distribution in the complex plane. The theory was previously presented in Gwinn (2006) and Gwinn & Johnson (2011). The major axis of the distribution is aligned with the direction of the signal. The variance along the minor axis depends linearly on signal strength; the variance along the major axis has the same linear dependence, plus a quadratic term. At zero signal, the major and minor axes are equal and the distribution of noise is a circular Gaussian, as for a gate or spectral region empty of signal.

We test this theory with observations on the baselines from Mopra, Hartebeesthoek, and the VSOP spacecraft to Tidbinbilla in Section 4. We estimate noise by comparing samples within the characteristic scales of the scintillation and binning their differences by average interferometric visibility. We find that the distribution of noise closely follows the expected elliptical Gaussian form for each visibility, and the scaling with visibility of the major and minor axes corresponds to the quadratic and linear noise polynomials, respectively. The quadratic coefficient accurately reflects the number of samples and the contribution of intrinsic amplitude variations; the constant coefficient agrees with that estimated from empty portions of the spectrum for the Mopra–Tidbinbilla and Hartebeesthoek–Tidbinbilla baselines.

In Section 5, we demonstrate that quantization, gating, and integration each affect the properties of the noise. One interesting consequence is that the noise in the presence of signal is less than that in a completely empty spectrum-a result of the combination of quantization and spectral variations. Also, pulsar gating leaves fewer samples, thus larger noise, at larger lags; this effect incurs correlations in the spectral noise. In principle, complete knowledge of the quantizer levels for each integration period, and of the autocorrelation functions at the two antennas, allows calibration of these effects. Alternatively, recording the signal with many quantizer levels increases the dynamic range and reduces effects of variation in quantizer levels. Flexible software correlators, such as the DiFX correlator (Deller et al. 2007), can control these artifacts, while Nyquistsampled spectra of individual pulses obviate the difficulties in characterizing inhomogeneities within the integration (Johnson & Gwinn 2012).

### 6.2. Self-noise for an Interferometer

We present observations for a scintillating pulsar, but the effects of self-noise hold for any interferometric observation. A careful evaluation of these effects is essential for a priori estimates of the accuracy of pulse timing and spectroscopy using single-dish observations and for scintillation studies and astrometry using interferometry.

Many telescopes now under construction or being planned, such as LOFAR, ASKAP, and SKA, will operate as interferometers, with many baselines among many antennas of a particular design. Each baseline will have the distribution of noise we describe above in Section 2 and as we observe for the Vela pulsar. Because each telescope in a large array receives precisely the same noiselike signal from the source, increases in the number of antennas and averaging of many baselines do not change self-noise, when expressed in terms of flux density. However, averages over many baselines do decrease the background noise. Stated in terms of the notation introduced in Section 2, increasing the number of identical antennas  $N_A$  reduces  $b_0$  as  $N_A^{-2}$ and  $b_1$  as  $N_A^{-1}$  but does not change  $b_2$ . For true "tied-array" operation, where electric fields from all antennas are phased and summed before correlation, statistics are those of a single dish (Gwinn & Johnson 2011, Equation (11)). As the number of antennas becomes larger, self-noise becomes more important. When the source dominates the system temperature, further improvements demand more samples  $N_{obs}$ , as produced by wider bandwidth or longer integration time: a greater aperture does not provide more accuracy. Our expression Equation (5) generalizes this result to interferometry.

Astrometry depends on measurements of interferometric phase. Equations (5) and (7) show that the maximum attainable phase accuracy is  $\delta \phi \approx \sigma_{\perp}/s \approx \sqrt{n/(N_{obs}s)}$ , or the inverse square root of the S/N, divided by  $\sqrt{N_{obs}}$ . Similarly, the maximum attainable accuracy in measurement of flux density by an interferometer, or a large single dish, is approximately the flux density of the source divided by  $\sqrt{N_{obs}}$ . Likewise, the maximum attainable accuracy in pulsar timing is approximately the width of the narrowest feature in the profile, divided by the S/N and by  $\sqrt{N_{obs}}$ . However, when self-noise is the limiting factor, the maximum attainable accuracy is simply the width of that feature, divided by  $\sqrt{N_{obs}}$ .

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