#### U. C. BERKELEY - SPACE SCIENCES LAB

Berkeley, California, USA, March 5th, 2009



# HOW TO EAVESDROP ON ALIEN CHAT

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## How to Eavesdrop on Alien Chat Summary - 1/3



ET, phone... each other? If aliens really are conversing, ware not picking up what they are saying. Now on researcher claims to have a way of tuning in to alie cellphone chatter.

On Earth, the signal used to send information vincellphones has evolved from a single carrier wave to "spread spectrum" method of transmission. It's more efficient, because chunks of information are essentiall carried on multiple low-powered carrier waves, and more secure because the waves continually change frequences to the signal is harder to intercept.

It follows that an advanced alien civilization would hav made this change too, but the search for extraterrestricalife (SETI) is not listening for such signals, says Claudi Maccone, co-chair of the IAA SETI Permanent Study Groubased in Paris, France.

# How to Eavesdrop on Alien Chat Summary - 2/3



An algorithm known as the Fast Fourier Transform (FFT) is the method of choice for extracting an alien signal from cosmic background noise. However, the technique cannot extract a spread spectrum signal. Maccone argues the SETI should use an algorithm known as the Karhuner Loève Transform (KLT), which could find a buried conversation with a signal-to-noise ratio 1000 times lower than the FFT.

A few people have been "preaching the KLT" since the early 1980s but until now it has been impractical as involves computing millions of simultaneous equations something even today's supercomputers would strugglie with.

# How to Eavesdrop on Alien Chat Summary - 3/3



At a recent meeting in Paris called "Searching for Lif Signatures", Maccone presented a mathematical method t get around this burden and suggested that the KLT shoul be programmed into computers at the new Low Frequenc Array telescope in the Netherlands and the Squar Kilometer Array telescope, due for completion in 2012.

Seth Shostak at the SETI Institute in California agrees that the KLT might be the way to go but thinks we shouldn abandon existing efforts yet. "It is likely that for their ow conversation they use a spread-spectrum method but it i not terribly crazy to assume that to get our attention the might use a 'ping' signal that has a lot of energy in narrow band - the kind of thing the FFT could find."

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# The KLT (Karhunen-Loève Transform) to extend SETI searches to BROAD-BAND and EXTREMELY FEEBLE SIGNALS

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### Beyond the FFT:

Extraction of Weak Signals from Noise plus Data Compression by the KLT.

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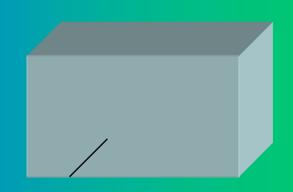
Home page: http://www.maccone.com/

### What is the KLT?



Example (a Newtonian analogy): onsider a solid object, like a BOOK, escribed by its INERT A MATRIX.

Then there exist only one special eference frame where the Inertia latrix is DIAGONAL. This is the eference frame spanned by the IGENVECTORS of the Inertia natrix.



$$I' = \begin{pmatrix} I_{x}^{x} & I_{x}^{y} & I_{x}^{z} \\ I_{x}^{y} & I_{x}^{y} & I_{x}^{y} \\ I_{z}^{y} & I_{x}^{y} & I_{xz}^{y} \end{pmatrix}$$

#### KLT mathematics



• If X(t) is a stochastic process (= input to the radio telescope) it can be expanded into an infinite series

$$X(t) = \sum_{n=0}^{\infty} Z_n \, \phi_n(t) \qquad 0 \le t \le T$$

• then

 $\triangleright \phi_n(t)$  are orthonormalized functions of the time:

$$\int_{0}^{T} \phi_{m}(t) \phi_{n}(t) dt = \delta_{mn}$$

 $Z_n$  are random variables, not changing in time, with the property

$$\langle Z_m \ Z_n \rangle = \lambda_n \ \delta_{mn}$$

➤In conclusion, the KLT separates the radiotelescope input (= noise + signal(s)) into *UNCORRELATED* components.

### KLT mathematics



$$\int_{0}^{T} \langle X(t_1) X(t_2) \rangle \phi_n(t_1) dt_1 = \lambda_n \phi_n(t_2)$$

This is the integral equation yielding the Karhunen-Loève's eigenfunctions  $\phi_n(t)$  and corresponding eigenvalues  $\lambda_n$ .

The kernel of this integral equation is the autocorrelation.

This is the best basis in the Hilbert space describing the signal+noise). The KLT adapts itself to the shape of the adiotelescope input (signal+noise) by adopting, as a reference rame, the one spanned by the eigenfunctions of the

utocorrelation. And this is turns out to be just a LINEAR ransformation of coordinates in the Hilbert space. Thus, the

### KLT filtering



- There is no degeneracy (i.e. each eigenvalue corresponds to just one eigenfuction only).
- The eigenvalues turn out to be the variances of the random variables  $Z_n$ , that is  $\sigma_{Z_n}^2 = \lambda_n = \langle Z_n^2 \rangle > 0$ .
- Since  $\langle Z_n \rangle = 0$  we can SORT in descending order of magnitude both the eigenvalues and the corresponding eigenfunctions. Then, if we decide to consider only the first few eigenfunctions as the "bulk" of the signal, and to apply the inverse KLT, that's what KLT filtering is: we just declare the taken-off part as "noise"!
- The Galileo mission by NASA-JPL used the KLT...

### "Classic" KLT vs. FFT



KLT		FFT	
1	Works well for both wide and narrow band signals	Rigorously true for narrow band signals only	<b>↓</b>
1	Works for both stationary and non-stationary input stochastic processes	Works OK for stationary input stochastic processes only	<b>↓</b>
1	Is defined for any finite time interval	Is plagued by the "windowing" problems	<b>1</b>
<b>↓</b>	Needs high computational burden: no "fast" KLT	Fast algorithm FFT	

#### NO Classic KLT in the 1990s



- If N is the size of the autocorrelation matrix (N may equal millions ore more in real SETI), the number of calculations requested to find the KLT is of the order of N square, while the same number for the FFT is much less: just N ln(N).
- This *COMPUTATIONAL BURDEN* prevented all SETI scientists from replacing the FFT by the KLT until 2007:
- 1) François Biraud et al. at Nançay in the years after 1983.
- 2) Bob Dixon et al. the Ohio State SETI Program after 1985.
- 3) Stelio Montebugnoli et al. at Medicina, Italy, after 1990.



BAM is acronym for "BORDERED Autocorrelation Method".

• The new key idea is to regard the autocorrelation as a NEW

- FUNCTION OF KLT FINAL INSTANT, T. That is, to add one more row and one more column (= bordering) to the autocorrelation matrix for each new positive, increasing T.
- For STATIONARY processes, this amounts to the matrix:

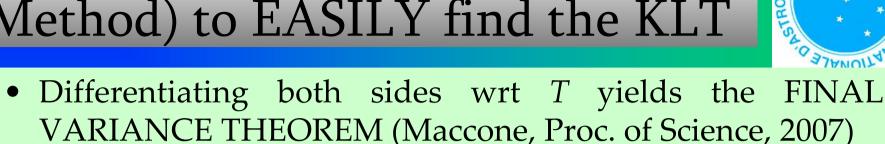
$$R_{Toeplitz} = \begin{bmatrix} R_{XX}(0) & R_{XX}(1) & R_{XX}(2) & \dots & \dots & R_{XX}(N) \\ R_{XX}(1) & R_{XX}(0) & R_{XX}(1) & \dots & \dots & R_{XX}(N-1) \\ R_{XX}(2) & R_{XX}(1) & R_{XX}(0) & \dots & \dots & R_{XX}(N-2) \\ \dots & \dots & \dots & R_{XX}(0) & \dots & \dots \\ R_{XX}(N) & R_{XX}(N-1) & \dots & \dots & R_{XX}(1) & R_{XX}(0) \end{bmatrix}$$

### 2007 Breakthrough in the KLT



- In the winter of 2006-7, the SETI-Italia Group at Medicina, (Stelio Montebugnoli, Francesco Schillirò, Salvo Pluchino and Claudio Maccone) discovered a way to CIRCUMVENT that big obstacle of the KLT  $N^2$  computational burden.
- The idea is to use the BAM to exploit the <u>dependence on</u> <u>the final instant</u> *T* in both sides of the relationship, firstly proved in 1994 by Maccone in his KLT book, p.12, eq. (1.13):

$$\sum_{n=1}^{\infty} \lambda_n(T) = \int_{0}^{T} \sigma_{X(t)}^2 dt$$



$$\sum_{n=1}^{\infty} \frac{\partial \lambda_n(T)}{\partial T} = \sigma_{X(T)}^2$$

• Confining ourselves to the FIRST EIGENVALUE (the

"dominant one" = the largest) & STATIONARY X(t) ONLY:  $\sum_{n=0}^{\infty} \frac{\partial \lambda_n(T)}{\partial T} \approx \frac{\partial \lambda_1(T)}{\partial T} = \sigma_X^2 = \text{a\_CONSTANT\_wrt\_T}$ 

the FREQUENCY of the ET-SIGNAL!!! As we now prove...



• Consider a pure tone buried into unitary White Noise W(t):

$$S(t) = W(t) + a \sin(\omega t) \quad (\mu << 1) \quad (0 \le t \le T)$$

• Write down the autocorrelation of this stationary process *S*(a assuming that the sinusoid and white noise are uncorrelated:

$$\langle S(t_1) S(t_2) \rangle = \langle W(t_1) W(t_2) \rangle + a^2 \sin(\omega t_1) \sin(\omega t_2)$$

• Now go over to the KLT of these two stationary processes:

$$S(t) = \sum_{n=1}^{\infty} rvS_n S_n(t) \quad W(t) = \sum_{n=1}^{\infty} rvW_n W_n(t)$$

### BAM (Bordered Autocorrelation Method) to EASILY find the KLT



• The KLT expansion of both autocorrelations yields:

Method) to EASILY find the KLT

• The KLT expansion of both autocorrelations yields:
$$\sum_{n=0}^{\infty} \lambda_{Sn} S_n(t_1) S_n(t_2) = \sum_{n=0}^{\infty} \lambda_{Wn} W_n(t_1) W_n(t_2) + a^2 \sin(\omega t_1) \sin(\omega t_2)$$

• Where we introduced the KLT eigenvalues of both processes.

• In addition, the White Noise autocorrelation simply is the Dirac's delta function, and so the White Noise KL7 eigenfunctions may be ANY basis of orthonormalized time functions in the Hilbert space. For instance, they can be the simplest possible basis... the classical Fourier basis...

$$W_n(t) = \sqrt{\frac{2}{T}} \sin\left(n\frac{2\pi}{T}t\right) \quad (n = 1, 2, ...) \quad (0 \le t \le T)$$



- Replacing the last basis into the two KLT expansions above
  yields a new form of these KLT expansions from which we
  can easily let both to sub 1 and to sub 2 DISAPPEAR by two
  simple integrations over from zero to T. We skip these steps...
- The result after the two integrations is the RELATIONSHI AMONG THE EIGENVALUES

$$\lambda_{Sn} = \lambda_{Wn} + \frac{8 \pi^2 a^2 n^2 T}{\left(\omega^2 T^2 - 4 \pi^2 n^2\right)^2} \sin^2(\omega T)$$

• This is the MOST IMPORTANT RESULT in the BAM-KLT!



- It shows that for increasing *n* the two eigenvalues coincide.
- It shows that for increasing *T* the two eigenvalues coincide.
- But it also shows that the PERIODIC PART of the fraction goes like the sine SQUARE of omega, i.e. with a period of TWICE omega, i.e. TWICE the ET-FREQUENCY !!!

$$\lambda_{Sn} = \lambda_{Wn} + \frac{8 \pi^2 a^2 n^2 T}{\left(\omega^2 T^2 - 4 \pi^2 n^2\right)^2} \cdot \left[\frac{1}{2} - \frac{1}{2}\cos(2 \omega T)\right]$$

• This is the MOST IMPORTANT RESULT in the KLT ever!!!

BAM (Bordered Autocorrelation



 In other words still, we have found that the KLT eigenvalues of the PURE SIGNAL as a function of T are given by:

$$\lambda_n(T) = \frac{8 \pi^2 a^2 n^2 T}{\left(\omega^2 T^2 - 4 \pi^2 n^2\right)^2} \cdot \left[\frac{1}{2} - \frac{1}{2}\cos(2 \omega T)\right].$$

- What if we take the partial derivative of this wrt *T*?
  Well since *T* appears in three different places, the partial
- Well, since *T* appears in three different places, the partial derivative will be the SUM of THREE terms:
- 1) a term in sin (2 omega T)
- 2) a term in cos (2 omega T)
- 3) a non-periodic term in T



• Isn't this the FOURIER SERIES of the above partial derivative Of course it is! So we Fourier-invert that. And so...

- And so we have proved our KEY RESULT:
- The ET-FREQUENCY equals half of the frequency of the inverse Fourier transform of the derivative wrt to T of the dominant KLT eigenvalue.
- This is the BAM-KLT METHOD, that allows for the ET frequency even for SNR very very low.
- SNR may be even 10 to the minus 5 or worse !!!

#### SNR for BAM-KLT - 1/5



For zero-mean-value (=centered) White Noise

$$\lambda_{Wn} = \left\langle Z_{Wn}^2 \right\rangle$$

SNR definition for ET sinusoid in White Noise

$$SNR = \frac{power\_of\_the\_signal}{power\_of\_the\_noise} = \frac{a^2}{\langle Z_{Wn}^2 \rangle} = \frac{a^2}{\lambda_{Wn}}.$$

### SNR for BAM-KLT - 2/5



Re-write the relationship among eigenvalues

$$\lambda_{Sn}(T) = \lambda_{Wn} + \frac{8 \pi^2 a^2 n^2 T \sin^2(\omega T)}{(\omega^2 T^2 - 4 \pi^2 n^2)^2}$$

upon dividing both sides by the noise eigenvalues and then rearranging

$$\frac{\lambda_{Sn}(T)}{\lambda_{Wn}} = 1 + \frac{a^2}{\lambda_{Wn}} \cdot \frac{8 \pi^2 n^2 T \sin^2(\omega T)}{\left(\omega^2 T^2 - 4 \pi^2 n^2\right)^2}$$

#### SNR for BAM-KLT - 3/5



#### The SNR definition changes this into

$$\frac{\lambda_{Sn}(T)}{\lambda_{Wn}} = 1 + SNR \cdot \frac{8 \pi^2 n^2 T \sin^2(\omega T)}{\left(\omega^2 T^2 - 4 \pi^2 n^2\right)^2}$$

#### Solving for SNR, this yields

$$SNR(T, n, \omega) = \left(\frac{\lambda_{Sn}(T)}{\lambda_{Wn}} - 1\right) \cdot \frac{\left(\omega^2 T^2 - 4 \pi^2 n^2\right)^2}{8 \pi^2 n^2 T \sin^2(\omega T)}.$$

### SNR for BAM-KLT - 4/5



The first factor on the right-hand side is SLIGHTLY POSITIVE if an ET signal is embedded into the white noise. But it equals ZERO if no ET signal is there:

$$\left(\frac{\lambda_{Sn}(T)}{\lambda_{Wn}} - 1\right) \ge 0$$

The first KLT eigenvalue, n=1, is usually much larger then the other ones (**dominant eigenvalue**). Thus, we may simplify things by setting n=1 into the SNR:

### SNR for BAM-KLT - 5/5



$$SNR(T,1,\omega) = \left(\frac{\lambda_{S1}(T)}{\lambda_{W1}} - 1\right) \cdot \frac{\left(\omega^2 T^2 - 4\pi^2\right)^2}{8\pi^2 T \sin^2(\omega T)}.$$

Letting  $T \rightarrow \infty$ , we see that SNR(T,1, $\omega$ ) <u>GROWS</u> <u>LIKE T CUBE</u>. Thus, INCREASING *T* is the way to INCREASE the SNR to any desired value!!

### The Next Steps...



This is as far as we could get!

Now it's up to YOU GUYS to:

- .) Write down the BAM-KLT computer CODE
- Test it on large radiotelescopes
- Search for BROAD-BAND Alien Chat!



### Thanks very much!