

# **A MULTI-PARAMETER STATISTICAL ANALYSIS OF THE CONNECTION BETWEEN H<sub>2</sub>O MASER EMISSION AND NUCLEAR GALACTIC ACTIVITY**

Abstract Water mega-maser disks currently provide the most accurate and direct method for calculating distances to galaxies and for weighing super massive black holes (SMBHs) Moreover, high spatial resolution radio mapping of these systems provide the most direct view of the process of accretion of matter onto SMBHs. It is thus of great importance to understand how the maser-emission and the masing conditions relate to their host properties, and in particular, with their nuclear nebular activity. We present here the results of a comprehensive multiparameter analysis of high-quality photometric and spectroscopic measurements of the largest sample of galaxies surveyed for water maser emission. We use both individual parameter correlation analyses and a Principal Component Analysis to constrain the type and range of optical characteristics that best associate with various morphologies and strengths of water maser activity. We present these results in the frame of current proposed models of galactic evolution processes suggesting that the mega-maser phenomenon could be related to a certain brief phase in the active galactic nucleus life-time. This analysis provides new sophisticated yet feasible criteria for targeting these systems with a projected 4-fold increase in the detection rate.



Measurements of the host and nuclear nebular emission of the SDSS galaxies are drawn from the MPA/JHU catalogue (Brinchmann et al. 2004). For all of the spectral measurements employed in this study, the emission-line component is measured after it is separated from the host stellar emission. Black Hole masses (M<sub>BH</sub>) and corresponding accretion rates (measured via the Eddington ratio) are obtained based on estimates of the stellar velocity dispersion ( $\sigma$ \*). For the SDSS objects only, we also relate the maser and the central BH accretion activity to the host properties by employing stellar masses and the D<sub>n</sub>4000 break, as calculated and presented by Kauffman et al. (2003, 2004).

**Emitting Gas** 

Parameters

(λλ 6716/6731 Å)

Ηα / Ηβ

mer Decremen

[O I]

Source	Control	Masers	Mega-masers	Disks
SDSS	1181	46	34	7
Palomar	183	26	11	4
Palomar & $SDSS^{a}$	25	7	2	1
$Other^{b}$	0	27	22	5
Total	1339	92	65	15

<sup>a</sup> Galaxies with both Palomar and SDSS spectra; in these cases, we adopt the Palomar spectra and measurements.

<sup>b</sup> Bennert et al. (2004); Dahari & De Robertis (1988); Kim et al. (1995); Whittle (1992); Neugebauer et al. (1976); Adams & Weedman (1975); Phillips et al. (1983); Osterbrock & De Robertis (1985); Goodrich & Österbrock (1983); De Robertis & Österbrock (1986); Moustakas & Kennicutt (2006); Buttiglione et al. (2009)

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comparison in  $\sigma$ \*).

σ / (km s⁻')

2.0 5

Ηα / Ηβ

[SII] λλ6716/6731

2. There is a potential "goldilocks range" in quite a few maser galaxy parameters:



Log L/L<sub>Edd</sub>

### **Optical Spectral Types and Maser Activity**



Line diagnostic diagrams are useful for identifying the dominant ionization mechanisms in galactic nuclei. Star forming galaxies (H II's), where ionization is produced by hot young stars, have low [O III], [N II], [S II] and [O I] emission while Seyferts show strong emissions in these features. Transition Objects (Ts) and the Low Ionization Nuclear Emission Regions (LINERs, Ls) show an intermediate behavior, and thus, probably a mix of these two ionization types. We adopt the criteria of Kewley et al. (2006). These diagrams reveal that maser emission is not exclusively associated with Seyfert type activity as previously believed. The maser detection rate is clearly non-zero for non-accreting sources. It is also apparent that maser galaxies tend to have a higher [O III]/Hβ flux ratios, a property that can be exploited

Kolmogorov-Smirnov (K-S) Statistics The K-S statistic is a method of quantifying the probability that two distributions share the same parent population. K-S probabilities are consistently low for the control/mega-maser comparison, showing that they do not share the same parent set of characteristics, even if they sample similar cosmological volumes (i.e., similar redshift distributions). L[O III] is consistently a trait that distinguishes the mega-masers from the non-masers (control), as in Zhu et al. (2011).

K-S STATISTICS FOR MASER/NON-MASER PARAMETER COMPARISONS

Variable	Masers/Control	Maser/Megamasers	Control/Megamasers
$\mathbf{Z}$	0.72	0.91	0.91
$\log(SFR)$	0.0018	0.85	$< 1 \times 10^{-4}$
og L[OIII]	$< 1 \times 10^{-4}$	1.00	$< 1 \times 10^{-4}$
Log L[OI]	0.00065	0.98	$< 1 \times 10^{-4}$
[II] Ratio	0.091	0.91	0.00030
$H\alpha/H\beta$	0.52	0.43	$< 1 \times 10^{-4}$
$\sigma^*$	0.0026	0.73	$< 1 \times 10^{-4}$
$L/L_{edd}$	0.10	0.90	$< 1 \times 10^{-4}$

## **Principal Component Analysis (PCA)**

PCA is a dimension reduction technique that eliminates any redundancies in the data. This idea is demonstrated to the right: by analytically picking appropriate linear combinations of parameters we can create a more accurate measure of the variability in a data set. The PCA is an exploratory analysis in that it reveals otherwise hidden trends and correlations.

EIGENVECTORS FOR COMBINED MASERS AND CONTROL					
Variable	EV-1 31.6%	EV-2 47.2%	EV-3 59.0%	EV-4 69.4%	EV-5 78.2%
z	0.218	-0.448	-0.164	-0.404	-0.320
$\sigma^*$	0.276	0.182	0.254	-0.008	0.062
$H\alpha/H\beta$	0.002	0.111	0.664	-0.238	-0.625
$\lambda\lambda 6716/6731$	-0.090	0.146	-0.357	-0.792	0.043
Log L [OIII]	0.275	-0.620	0.025	0.021	-0.012
$Log [OIII]/H\beta$	0.389	-0.337	-0.001	0.147	0.044
$Log [NII]/H\alpha$	0.450	0.282	0.057	-0.022	-0.083
$Log [SII]/H\alpha$	0.442	0.309	-0.178	-0.037	0.034
$Log OI / H\alpha$	0.489	0.217	-0.119	0.013	0.036
L H <sub>2</sub> O	0.070	-0.113	0.540	-0.358	0.700

PCA statistics of the combined maser and control samples: The eigenvectors are linear combinations of the parameters shown and each corresponding value is the weight of the parameter. Values in **bold** indicate significant correlations. EV1 confirms that the spectral type (as defined by the 4 flux ratios) is the most significant contributor to the variance in the data, consistent to what the BPT diagram shows. EV2 is dominated by the correlation of redshift z and L[OIII], generally expected for any sample. EV3 is dominated by the correlation of the H $\alpha$ /H $\beta$  and the maser luminosity  $L(H_2O)$ , suggesting that the maser activity depends on the obscuration of the nuclear region.

DA is a multidimensional statistical analysis similar to PCA, with the important distinction that it is predictive and not exploratory. DA maximizes the separation of two or more groups in their variable space, and provide a quantitative combination of parameters that contribute the most to this separation. In our case the two groups are the non-masers and the masers (or mega-masers or disks) and the variables are the optical spectral and photometric data. The table above shows the performance of the analysis on our known masers and non-masers (i.e. the training set); the predictions and their associated errors represent the optimistic maximum. The model based on the training set can then be applied to any other object with the same set of measurements. We are currently doing this to a set of 300,000 galaxies from the MPA-JHU SDSS DR7 spectroscopic data catalogue (see table for preliminary results), and will test the proposed target set with future observations at Green Bank Telescope.

Type		Mas
	Masers	Control
Total	1725	202251
HII	1735	298831
Transition	126	52848
Seyfert	389	12142
LINER	129	22978

### **Table of Discriminant Analysis Predictions** Mega-Mase $\mathbf{Disk}$ Control % of Total Masers Masers Control % of Total Maser of Total Masers Masers 100%1191299395 5732113966122113575286122%383 1214832%7%22988 119 23086 **Detection Rate Inside: 14.0% Constraining The Detection Rate** ● Masers Non-masers Disks Because of its multidimensionality, the DA is more of Mega-Masers a numerical tool than a visual aid, so here is a visual **Detection Rate Outside: 2.6%** example of how a 2-parameter constraint can increase the mega-maser detection rate by a factor of ~3. Suppose the survey for maser emission is conducted only for galaxies with a [S II] ratio between 1 and 1.4, and an [O III] luminosity >~ 10<sup>40</sup> ergs/s, the detection rate jumps from <3% outside the region to 14% inside the region. This is essentially what the DA does but for the entire N-parameter space. [SII] 6716/6731 [SII] Ratio

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**Plots** of EV1 vs. the line ratios employed in optical classifications show that the masers, and especially the megamasers or the disks, are well clustered within a certain parameter space. This indicates that the mega-masers are indeed quantifiably different from the non-masers. Various PCA tests for sets of measures separated by maser/non-maser based on a priori known correlations among parameters show significantly different weights, supporting a dissimilarity in properties between maser and non-maser systems.



### **Discriminant Analysis (DA)**

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