Characterizing the Radio Transient Sky with MeerKAT

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A New Era in Radio Astronomy: MeerKAT Radio Telescope

- Started operations in summer 2018
- Operates in 3 bands spanning 544
 MHz and 3499 MHz with excellent sensitivity
 - L-band (856-1711 MHz)
- Field of view of almost 2 square degrees
- Excellent for transient searches



Observations of Short GRB fields with ThunderKAT

- ThunderKAT
 - Large Survey Project
 using MeerKAT
 - Studying radio
 transients
 - SGRB follow-up
 - Commensal searches
- 43 Observations of 10 different fields
- Deep limits





Commensal Searches



Commensal Searches

0

- 8 Short GRB Fields, 30 observations
 - Multiple timescales
 - 4 hour
 - 15 minute
 - 8 seconds
- Supernovae and Short GRB Fields
 - 30 Minutes
 - Ongoing searches at shorter timescales

An Immense Amount of Data!

- MeerKAT Images
 - ~1 Degree radius FOV
- First dataset:

0

- 43,964 8 second images
 - Shown in background
 - 150 to 200 μ Jy noise for good examples
 - High positional error, reimaged for corrected position
- 406 15 minute images
 - High correlated noise
 - 20 to 30 μ Jy noise for good examples
 - 30 ~4 hour images
 - 1 single field only
 - 6 to 7 μ Jy noise for good examples

Search Strategy

- LOFAR Transients Pipeline (TraP)¹
 - Light curves
 - V and η , variability statistics
 - Large search radius
 - Low threshold
- Further restrictions
 - Threshold
 - Source Density
 - \circ η cuts
- Make animations



MKT J170456.2-482100 found in the GX-339 field by L. Driessen [1]























Dataset 761, Date: 59100.05359926494









Transients and Variables

- 120 variables in the first search on the longest timescales
 - 52 are likely scintillating known AGN
 - 66 likely scintillating, likely AGN
 - 2 cannot be explained by interstellar scintillation, might be stellar flares
- Excellent limits on transient rates
 - \circ 8 SGRB fields: 2 \times 10⁻⁴ transients per day per sq degree at ~200 days

Calculating Transient Rates: Why Simulate Transients?

- Need to accurately determine transient rates [1]
 - Traditional methods do not account for multiple timescales or gaps in observations
 - Limited by the worst observation sensitivity
- Monte-Carlo Simulations allow for making these corrections [2]



Filled circles are with applying correction for gaps, open are without

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Inputs

- Observing times
- Observation duration
- Image sensitivity
- Pointings on the sky
- Radius of the field of view
- Gaps in observations

In addition, this information can be generated using a provided script and extracted from the metadata

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How Transients are Simulated

- 1. Config and observation files are read in
- 2. Source info generated via numpy random number generator (log10)
- 3. Iterate over observations, testing integrated flux for detection
- 4. Aggregate number of detections / simulations, generate probabilities

Output: Probability Contours



Tophat

- Shows probability of detection
- Variety of light curves included
- Easily extendable to new light curves





Fast Rise Exponential Decay



Exponential Rise Exponential Decay

Outputs: Transient Rate Contour Plot



From probability contours, a transient rate can be calculated

Assumes transients follow Poisson distribution

If there are detections, plots lower (left) and upper (right) limits, if no detections upper limits only

Outputs: Transient Rate Contour Plot





Gaps in Observations

- Real radio observations contain gaps
- Results in different transient rates
- Calibration loop of 5 minutes on calibrator and 15 minutes on target







- Overlap between two tiles
- Now multiple timescales
- Can probe various timescales with calibrator field searches as in Bower & Saul 2011



Characteristic Duration (Days)



 10^{0}

 10^{-1}

 10^{-2}

10

10-

 10^{1}

 10^{2}

Characteristic Duration (Davs)

 10^{3}

Overview

- Commensally searching for transients
 - Upper limits on transient rates
 - 133 variables on longest timescale
 - 130 scintillating, 3 possibly intrinsic variability
 - Efficient short timescale searches may start detecting coherent emitters
- Characterizing transient rates
 - Accurate and flexible transient rate calculations
 - Many realistic effects accounted for
 - New features can make this even more accurate
 - Chastain, S. I., van der Horst, A. J., & Carbone, D. 2022, Astrophysics Source Code Library. ascl:2204.007. https://github.com/dentalfloss1/transients-simulations

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Additional Materials

Characterizing the Radio Sky

- Following up on transients
 - Deep upper limits
 - Marginal detection: Similar astrophysical parameters to long GRBs
 - Non-detections: Low density environments, similar efficiencies
 - New instruments (SKA) should be able to distinguish between scenarios
- Commensally searching for transients
 - Upper limits on transient rates
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Further Reduction

- 214 sources on 8 second timescale
 - 3 sources after visual examination
- 306 sources on 15 minute timescale
 - 19 sources after visual examination
- 278 sources on 4 hour timescale
 - 227 sources after visual examination

Testing Sources

- Force fit
- Position corrected
- Primary beam
- Recalculate variability
- Only 4 hour image remained
 - 122 sources, all variables
 - Variable on timescales from weeks to months

Variable Sources

- Match catalogs in Vizier
 - 99 sources with a catalog match
 - No x-ray or gamma-ray matches
- Scintillation
 - Ionized ISM
 - Refractive and Diffractive
 - 2 sources not explained



Examining Variables

- Transient rate limits
 - Min fluence: 10 Jy ms
 - 0.03 transients day⁻¹
 sq. deg⁻¹
 - \circ Fluence: 9×10³ Jy ms
 - 2×10⁻⁴ transients
 day⁻¹ sq. deg⁻¹



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Another, more detailed example. This time with a Gaussian light curve

Overlapping Pointings

- Calculates double and triple overlapping regions
- Fully accurate area calculations accounting for spherical geometry



pos.eq.ra An example of three overlapping pointings with probability contours







2

- 1.0

0.9

0.8

0.7

0.6

0.5

0.4

0.3

0.2

0.1

0.0



Source 715880 RA: 88.854 DEC: 7.023



Source 713705 RA: 89.674 DEC: 7.128



Summary of Simulations

- Accounts for real world conditions
 - Overlapping pointings
 - Variety of observation sensitivity
 - Multiple light curves
- Fairly easy to adapt and extend to other uses
- Now publicly available: https://github.com/dentalfloss1/transients-simulations

A Review of Radio Transients

- Zoo of Transients
- Wide span of brightness and timescales





MeerKAT

- Started operations in summer 2018
- Better sensitivity than VLA between 1 and 2 GHz
- FOV > 1 sq. deg.
- Excellent for transient searches



Made from 4 MeerKAT images, angular resolution of VLA is at most 0.5 deg

I. Heywood, F. Camilo, W.D. Cotton, et al. "Inflation of 430-parsec bipolar radio bubbles in the Galactic Centre by anenergetic event". Nature 573 (Sept. 2019), pp. 235–237 with Moon overlaid

Why Simulate Transients?

- Already found multiple transients in MeerKAT data
 - GX-339 field
 - MAXI J1820 field [2]
- Abundance of Data



MKT J170456.2-482100 found in the GX-339 field by L. Driessen [1]

Driessen, L. N.; McDonald, I.; Buckley, D. A. H.; Caleb, M. et al. "MKT J170456.2–482100: the first transient discovered by MeerKAT". MNRAS, Volume 491, Issue 1, p.560-575 (2020)
 Rowlinson, A.; Meijn J.; van der Horst, A. J.; Chastain, S.; et al. "Search and identification of transient and variable radio sources using MeerKAT observations: a case study on the MAXI J1820+070 field"

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Fast Rise Exponential Decay



Exponential Rise Exponential Decay

From Probabilities to Realistic Transient Rates

$$\begin{split} P(k,N_{det}) &= \frac{N_{det}^k}{k!} e^{-N_{det}} & \text{Model transients with} \\ a \text{ Poisson distribution} & \rho_{all}(F,T) = \frac{\rho_{det}}{Prob(F,T)} \\ \rho_{sim}(F,T) &= \frac{N_{sim}(F,T)}{N_{sim}(F,T)} = \frac{N_{det}(F,T)}{N_{all}(F,T)} & \text{We simulated this} \\ \frac{\rho_{sim,det}(F,T)}{N_{sim}(F,T)} &= \frac{N_{det}(F,T)}{N_{all}(F,T)} & \text{Assume the} \\ \frac{\rho_{sim,det}(F,T)}{\rho_{sim}(F,T)} &= \frac{\rho_{det}}{\rho_{all}(F,T)} & \text{Assume the} \\ \frac{\rho_{sim,det}(F,T)}{\rho_{sim}(F,T)} &= \frac{\rho_{det}}{\rho_{all}(F,T)} & \text{Model transients with} \\ \frac{\rho_{sim,det}(F,T)}{\rho_{sim}(F,T)} &= \frac{\rho_{det}}{\rho_{all}(F,T)} & \text{We simulated this} \\ \frac{\rho_{sim,det}(F,T)}{\rho_{sim}(F,T)} &= \frac{\rho_{det}}{\rho_{all}(F,T)} & \text{Model transients with} \\ \frac{\rho_{sim}(F,T)}{\rho_{sim}(F,T)} &= \frac{\rho_{sim}(F,T)}{\rho_{sim}(F,T)} & \text{Model transients with} \\ \frac{\rho_{sim$$

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From Probabilities to Realistic Transient Rates

$$P(k, N_{det}) = \frac{N_{det}^k}{k!} e^{-N_{det}}$$

Model transients with a Poisson distribution

$$F^{-1}(\alpha/2;k,1) \leq \mu \leq F^{-1}(1-\alpha/2;k+1,1) \qquad \text{But } \mu = \lambda \text{ and } \lambda = \mathsf{N}_{\mathsf{det}}$$

$$F^{-1}(\alpha/2; k, 1) \le N_{det} \le F^{-1}(1 - \alpha/2; k + 1, 1)$$

$$\rho_{all}(F,T) = \frac{N_{det}}{Prob(F,T) \times (T_{surv} + T) \times \Omega}$$
Sub for N_{det}

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Another, more detailed example. This time with a Gaussian light curve

Accounting for Realistic Scenarios

- Varying observation sensitivity
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Gaps in Observations

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- Results in different transient rates
- Calibration loop of 5 minutes on calibrator and 15 minutes on target



Commensal Searches in MeerKAT

- Short GRB fields
- Some overlap with VLASS
- Also multiple timescales
 - 4 hour images
 - 15 minute images
 - 8 second images
- Interesting variables on long timescales
- One of many commensal search efforts





Application to VLASS: Calibrator Field Transients



Outputs: False Detections Plot

- False detections show up as a tail in surface plots
- Occur due to simulated measurement error
- Mitigating with an analytic solution is impractical
- False detections depend on a large number of variables, not a simple distribution
- Solution is to simulate constant sources and set a limit in peak flux below which transients cannot be reliably detected





Other Outputs

- Observations histogram
- Numpy arrays for investigation

Design Notes

- Written in python3
- Runs on a laptop
- Easy to add new light curves
- Will be made public



Overview

- Several transient detections
- Accounts for real world conditions
 - Overlapping pointings
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