

Remote Sensing for Detection and Monitoring of Coconut Rhinoceros Beetle Damage

Prepared by Aubrey Moore PhD, University of Guam (retired)

December 26, 2023

Contents

1. Objective	2
2. Background	2
2.1. CRB damage survey methods	3
2.2. Automation of CRB damage surveys	3
2.3. Images of CRB damage on the world-wide-web	3
2.4. Previous work on automated CRB damage surveys	3
3. Approach	4
4. Schedule	5
5. Cost	6
6. Research Team	6
A. Abbreviated Curriculum Vitae	7
A.1. Roland Quitugua	7
A.2. Dr. Aubrey Moore	7
A.3. Dr. Romina King	9
A.4. Dr. Kenneth Puliafico	9
A.5. Dr. Mark Ero	11
A.6. Dr. Sulav Paudel	11
A.7. Dr. Sean Marshall	11
B. List of Acronyms	12
C. Literature Citations	13
D. Supporting Technical Data	14
E. Existing Support	17

Note to reader: Paragraphs in italics will be removed when the proposal is complete.

PRE-PROPOSAL LENGTH AND FORMAT: Pre-proposals shall be no longer than five (5) pages, type face not less than 11-point, and margins not less than one inch on all sides.

Proposal Number: *Generated by SEMS when proposal details are entered and saved in the system.*

Proposal Title: Remote Sensing for Detection and Monitoring of Coconut Rhinoceros Beetle Damage

Lead Principal Investigator: Roland Quitugua

Lead Organization: University of Guam, College of Natural and Applied Sciences, Mangilao, Guam

Compare cost of roadside surveys with pheromone trapping.

Data from aerial surveys can be used for precise pesticide application.

Standardization

Infestation of Majuro puts Kwajele in at risk

eDNA

1. Objective

The proposed objectives and how the project is responsive to the objectives articulated in the SON.

Our objective is to develop an automated remote sensing system that detects, quantifies and monitors coconut rhinoceros beetle (CRB) damage on isolated Pacific islands using artificial intelligence (AI) to scan georeferenced digital images. This system will use images acquired from several sources, including roadside surveys, aerial drone surveys and the worldwide web.

This proposal addresses the statement of need (SON) entitled *Advancing Non-Indigenous Invasive Species Surveillance, Mitigation, or Biosecurity Measures Affecting Military Readiness in the Indo-Pacific Region*. The objective of this SON "is to solicit proposals that develop and mature the science to detect, survey, mitigate, characterize impacts, and minimize the establishment or spread of invasive species in the Indo-Pacific region".

Our goal is to provide a flexible toolkit of standardized, cost-effective CRB surveillance methods which can be used on any Pacific island for CRB surveillance to provide early detection, delimitation of new populations, and routine monitoring as part of eradication and control programs.

2. Background

Sufficient technical background to demonstrate a thorough understanding of the problem and frame the proposed research in the context of the current state of the science or technology.

Coconut rhinoceros beetle (CRB), *Oryctes rhinoceros*, is one of the most problematic invasive species in the Indo-Pacific region. This beetle is endemic to the tropical Asia region (including South East Asia). CRB damages both coconut and oil palm, and is capable of killing palms when adults bore into crowns to feed on sap [4] (Bedford, 2013a, 2013b). The beetle was inadvertently introduced into the Pacific in 1909 when infested rubber tree plants were transported to Samoa from Sri Lanka (previously known as Ceylon) (Catley, 1969). The pest rapidly multiplied in Samoa and subsequently spread to several nearby Polynesian islands. Separate invasions further distributed CRB through Palau, parts of Papua New Guinea, and other Pacific nations through disruptions and uncontrolled movements during World War II (Catley, 1969; Gressitt, 1953). The invasive phase of the beetle was brought under control by the discovery and distribution of a viral biocontrol agent, *Oryctes rhinoceros* nudivirus (OrNV). OrNV is currently present and causes persistent population suppression on many of the CRB infested Pacific Islands (Bedford, 2013b; Huger, 2005). Virus introduction into affected Pacific Island countries and territories suppressed and weakened the CRB populations such that its spread into the Pacific islands ceased and for 30 years there was no further range expansion of CRB (Secretariat of the Pacific Community, 2015).

replace following with table

However, the situation changed following invasion of Guam by CRB in 2007 by an OrNV resistant biotype [5]. Since 2007, CRB has invaded the Hawaiian Islands (Oahu in 2013, Kauai in 2023, Big Island in 2023), Commonwealth of the Northern Mariana Islands (Rota ???), Republic of the Marshall Islands (Port Moresby area in ???), Solomon Islands (Guadalcanal in ???, Savo in ???, Malaita in ???; and Rota (Commonwealth of the Northern Mariana Islands). Beetles in the third wave of invasions are genetically different from those in the earlier waves and these are being referred to as the Guam biotype or CRB-G.

However, the situation changed following discovery of an OrNV resistant CRB population on Guam in 2007 [5], this pest has resumed its spread throughout the Pacific. Recently invaded islands include Guam (2007) ... Majuro, RMI (2023), Kauai, HI (2023), Hawaii, HI (2023).

2.1. CRB damage survey methods

V-shaped cuts to palm fronds (Fig.2) and other symptoms of CRB adult feeding activity are highly distinctive and visible from up to a few hundred meters.

A review of CRB damage survey methods is provided by Mansfield et al. 2023 [3]. Originally, surveyors recorded direct visual observations but recent surveys almost always use georeferenced digital images. Severity of damage to palms in these images is later classified by human experts using a standardized 3-level scale (undamaged, damaged, dead) or a 5-level scale (undamaged, low damage, medium damage, high damage, dead). Results are then displayed on maps.

2.2. Automation of CRB damage surveys

On Guam, CRB damage surveys have been automated in three ways: Images are not taken by a human, but are taken by a smart phone camera which snaps photos at a rate of one per second and records GPS coordinates; Coconut palms in each image are located, assigned a damage level, and are scanned for v-shaped cuts by AI object detectors; Location of coconut palms and damage levels are automatically added to an interactive web map. This allows us to complete a damage survey of Guam within the few hours it takes to drive all the major roads on the island in both directions.

2.3. Images of CRB damage on the world-wide-web

Images of coconut palms with probable CRB damage are publicly available on the world-wide-web. Some of these are the result of citizen science projects initiated specifically to detect CRB damage, such as an iNaturalist project entitled *FA 15 UOG CRB Damage Survey* and a Project Noah mission entitled *Help Save Hawaii's Coconut Trees*.

In addition, there are many unlabeled images of coconut palms available as incidental images within social media and elsewhere on the world-wide-web and new images are being added daily. Paudel and Jackson have been tracking potential biosecurity incursions using publicly available images on the web [2] and have discovered strong evidence that CRB has invaded Mexico [1].

We intend to apply our object detectors to automate searches for CRB damage in publicly available images on the web.

2.4. Previous work on automated CRB damage surveys

The proposed project builds on an existing system which maps CRB damage using automated analysis of ground-based imagery which uses a smart phone mounted on a road vehicle for data acquisition. Currently, images are taken at a rate of one per second by a free cell phone app named OpenCamera. Each image is 1920 x 1080 pixels in size and GPS coordinates are embedded within the image file. Note that the phone does not require a SIM card or internet connection during data acquisition.

After transferring image files to a laptop computer, each is examined by a pair of object detectors trained by an artificial intelligence technique called deep learning. One detector puts a bounding box around all coconut palms within each image and assigns a standardized 5-scale damage index to each palm [REF]. The damage index is based on a standard methodology developed by CRB experts working on islands in the south Pacific [REF]. A second object detector counts v-shaped cuts to coconut palm in fronds which are distinctive signs of CRB feeding damage. Results are visualized using interactive web maps. This ground-based system has been used for routine roadside surveys on Guam and has also been used for early

detection of CRB damage on Rota in the Commonwealth of the Northern Mariana Islands and on Majuro in the Republic of the Marshall Islands [REFS].

For details on this ground-based CRB damage survey methodology see the attached file [roadside.pdf](#).

We will improve the existing ground-based system and adapt this system to use aerial drone imagery to facilitate:

- CRB damage detection over large areas of remote, otherwise inaccessible, terrain
- early detection and delimiting surveys in rapid response projects on islands where CRB has not yet established, increasing chances of eradication
- monitoring temporal and spatial changes in CRB damage on islands where CRB has established
- measuring changes in CRB damage in response to biological control, sanitation, and other mitigation tactics

3. Approach

The technical approach and methods, preferably structured in hypothesis-driven tasks that clearly identify how the objectives of the proposed project will be addressed. This section should be the primary focus of the pre-proposal.

Design features. All code will be developed using free open-source software (FOSS) and all code, data and documentation generated by the project will be made available via public GitHub repositories. Methods will be designed to be appropriate for use on Pacific islands which have limited technical and financial resources.



















Object detectors. Existing object detectors, which have been used in roadside CRB damage surveys on Guam since 2020, will be retrained to minimize false positives and false negatives. Performance before and after retraining will be evaluated using standard metrics and reported in a technical report. A user manual for the object detectors will be provided.

Roadside surveys. Improved object detectors will be tested in ongoing quarterly CRB damage surveys on Guam using [methods detailed above](#). Combined roadside and drone surveys will be performed on Majuro.

Aerial drone surveys. Object detectors will be retrained to detect CRB from the air. A high quality dataset of drone imagery acquired on Guam specifically for this purpose is available in a public GitHub repository at <https://github.com/aubreymoore/crb-vc>. An initial field trial of the drone survey methodology will be conducted on Guam. Technical documentation and a user guide for the aerial drone survey methodology will be written. Operational testing be performed on Majuro.

World wide web surveys. Our object detectors can process images acquired from any source, including world-wide-web. In an automated scan of iNaturalist observations from Mexico, our v-shaped cut detector found coconut palms with CRB damage symptoms (Fig. 3), corroborating evidence of a CRB population in Mexico from manual searches of social media images by Jackson and Paudel [1]. We will develop automatic workflows which scan the web continually scan the web to detect images of coconut palms with CRB feeding damage symptoms.

The duration of the project, along with a milestone chart that delineates the timeline for each task and major deliverables.

	Year			
	1	2	3	4
Improve ground-based system				
Retrain object detectors to improve accuracy				
Evaluate performance using standard metrics				
Publish technical documentation				
Publish user manual				
Develop aerial-based system				
Retrain object detectors to detect CRB damage from aerial images using the existing VDC orthomosaic				
Evaluate performance using standard metrics				
Publish technical documentation				
Publish user manual				
Initial field trial of the aerial-based system on Guam				
Operational field trials				
Quarterly ground-based roadside surveys on Guam				
Majuro: ground-based system for roadside survey; aerial-based survey for islets in the northern part of the atoll				
Technology transfer and outreach				
Create workflow for automated detection of CRB damage in iNat database				
Create iNaturalist project				
User manual for iNat proj				
CRB damage detection and monitoring workshops on Guam	  			
Technical support and systems maintenance				

5

5. Cost

The estimated total costs, including labor, materials, travel, burdens, and profit (fixed fee, if any, for eligible organizations) by year. A detailed breakout of costs is not required or desired in the pre-proposal.

Estimated total costs for this project component are provided in Table ??.

Table 1: Summary of project cost estimates. Indirect rates are 26% for CEMML, 27.6% for NCSU, and 15% for UOG. These rates are applied to Labor + Materials + Travel. In addition, NCSU charges 27.6% on the first \$25k of each subcontract awarded to CEMML and UOG. For details see Appendix ??.

6. Research Team

Identify the Principal Investigator(s), the key co-performers, and their respective organizations. If multiple co-performers are proposed, indicate their responsibilities within the project.

The members of the research team for this project component and their roles are listed in Table 2.

Table 2: Research team and roles.

Research team members	Roles
Roland Quitugua (PI), University of Guam	Project management
Dr. Aubrey Moore, University of Guam (retired)	Systems design and coding
Dr. Romina King, University of Guam	Drone imagery and GIS
Dr. Ken Puliafico, Center for Environmental Management of Military Lands, Colorado State University	Liaison with DOD and CRB damage surveys on DOD lands in Guam.
Dr. Mark Ero, Secretariat of the Pacific Community, Fiji	
Dr. Sulav Paudel, AgResearch New Zealand	
Dr. Sean Marshall, AgResearch, New Zealand, Fiji	

Table 3: List of additional collaborators, not directly funded by this project. TO BE POPULATED.

Collaborator(s)	Roles
Name(s) and affiliation	Roles

A. Abbreviated Curriculum Vitae

Required: One (1) page each for the Principal Investigator and other significant performers involved with the project that provide relevant research experience. Include the full mailing addresses, phone numbers, and email addresses for each person listed.

A.1. Roland Quitugua

COMING SOON.

A.2. Dr. Aubrey Moore

Please see next page.

Aubrey Moore Ph.D.

College of Natural and Applied Sciences, University of Guam

Rm. 105, Agriculture and Life Sciences Bldg., 303 Campus Dr., Mangilao, Guam 96923, USA

Email: [aubreyymoore@triton.uog.edu](mailto:aubreymoore@triton.uog.edu) Cell phone: +1 671 686-5664

Education

Ph.D. 1988 Entomology; University of Hawaii, Honolulu, HI
M.S. 1984 Entomology; Michigan State University, East Lansing, MI
B.Sc. 1979 Integrated Science Studies; Carleton University, Ottawa, Canada

Employment

2008-Pres. Professor of Entomology, University of Guam, Guam
2003-2008 Research Associate, College of Natural & Applied Sciences, University of Guam, Guam
1999-2003 Pesticide Evaluator, Pest Management Regulatory Agency, Health Canada, Ottawa, ON
1998-1999 Entomologist, Land Grant Program, Northern Marianas College, Saipan
1992-1997 Research Director, Land Grant Program, Northern Marianas College, Saipan
1991-1992 Entomologist, Northern Mariana Islands Department of Natural Resources, Saipan
1990-1991 Entomologist, Ag. Development in the American Pacific Project, Guam & Maui
1989-1990 Research Associate, University of Hawaii Ag. Expt. Stn., Maui, Hawaii
1988 Post-doctoral Fellow, Hawaiian Evolutionary Biology Program, Honolulu, Hawaii
1985-1988 Graduate Assistant, Department of Entomology, University of Hawaii, Honolulu, Hawaii
1985-1986 Programmer/consultant, University of Hawaii Computing Center, Honolulu, Hawaii
1984 Research Associate, Dept. of Entomology, Michigan State University, East Lansing, MI
1984 Entomologist, Insect and Rodent Control Sect., MI Dept. of Public Health, Lansing, MI
1981-1984 Graduate Assistant, Dept. of Entomology, Michigan State University, East Lansing, MI
1979-1981 Res. Tech., Forest Pest Management Inst., Environment Canada, Sault Ste. Marie, ON
1975-1979 Res. Tech., Chemical Control Research Institute, Environment Canada, Ottawa, ON

Relevant Publications

- [1] Sean D. G. Marshall, Aubrey Moore, Maclean Vaqalo, Alasdair Noble, and Trevor A. Jackson(2017). **A new haplotype of the coconut rhinoceros beetle, *Oryctes rhinoceros*, has escaped biological control by *Oryctes rhinoceros* nudivirus and is invading Pacific islands.** Journal of Invertebrate Pathology 149, p. 127-134. <http://www.sciencedirect.com/science/article/pii/S0022201117300289>
- [2] Aubrey Moore(2018). **The Guam Coconut Rhinoceros Beetle Problem: Past, Present and Future.** Zenodo. <https://zenodo.org/record/1185371#.W4Dolh9fhE>
- [3] Aubrey Moore, Roland Quitugua, Ian Iriarte, Michael Melzer, Shizu Watanabe, Zhiqiang Cheng, and Jathan Muna Barnes(2016). **Movement of Packaged Soil Products as a Dispersal Pathway for Coconut Rhinoceros Beetle, *Oryctes rhinoceros* (Coleoptera: Scarabaeidae) and Other Invasive Species.** Proceedings of the Hawaiian Entomological Society 48: pp. 21-22. <http://scholarspace.manoa.hawaii.edu/handle/10125/42743>
- [4] Aubrey Moore, Diego C. Barahona, Katherine A. Lehman, Dominick A. Skabeikis, Ian R. Iriarte, Eric B. Jang, and Matthew S. Siderhurst(2017). **Judas Beetles: Discovering Cryptic Breeding Sites by Radio-Tracking Coconut Rhinoceros Beetles, *Oryctes rhinoceros* (Coleoptera: Scarabaeidae).** Journal of Environmental Entomology 46(1), pp. 92-99. <https://doi.org/10.1093/ee/nvw152>
- [5] Aubrey Moore, Trevor Jackson, Roland Quitugua, Paul Bassler, and Russell Campbell(2015). **Coconut Rhinoceros Beetles (Coleoptera : Scarabaeidae) Develop in Arboreal Breeding Sites in Guam.** Florida Entomologist 98(3), pp. 1012-1014. <http://journals.fcla.edu/flaent/article/download/84794/84044>
- [6] R W Mankin and Aubrey Moore(2010). **Acoustic Detection of *Oryctes rhinoceros* (Coleoptera: Scarabaeidae: Dynastinae) and *Nasutitermes luzonicus* (Isoptera: Termitidae) in Palm Trees in Urban Guam.** Journal of Economic Entomology 103(4) pp. 1135-1143. <http://www.ingentaconnect.com/content/esa/jee/2010/00000103/00000004/art00014>

Relevant Grants

USDA-APHIS Farm Bill 2013 through 2019: Biological Control of Coconut Rhinoceros Beetle

DOI, Office of Insular Affairs: 2018-2019: Funding to Hire an Insect Pathologist Post-Doc

CESU 2013 Federal Candidate Species Surveys on Guam

NAVFAC Pacific 2011 Peer Review of the Micronesia Biosecurity Plan and Development of a Strategic Implementation Plan

A.3. Dr. Romina King

COMING SOON.

A.4. Dr. Kenneth Puliafico

Please see next page.

Kenneth Puliafico, Ph.D.
Entomologist

Center for Environmental Management of Military Lands
PO Box 3226, Hagatna GU 96932
671-929-7510
ken.puliafico@colostate.edu

Doctor of Philosophy, Entomology (2008)

Plant Soils & Entomological Science, University of Idaho. Moscow, ID 83843.

Master of Science, Entomology (2003)

Entomology Department, Montana State University. Bozeman, MT 59717

Bachelor of Science, Biological Science, with honors (1992)

Biology Department, Montana State University. Bozeman, MT 59717

2018 – present **Supervisory Entomologist –Center for Environmental Management of Military Lands, Colorado State University, based in Asan, Guam, USA**

- Organized monitoring program for Coconut Rhinoceros Beetle (CRB) populations and assessed damage across Andersen Air Force Base and Naval Base Guam
- Supervised baseline and long term monitoring for terrestrial arthropods for improved biosecurity in transport networks and training areas
- Implemented treatment program for invasive Little Fire Ants on military lands
- Scientific and taxonomic support of vehicle and cargo inspections for military exercises in Guam, Commonwealth of the Northern Marianas and partner nations

2018 **Research Entomologist** – Research Corporation of the University of Hawaii, Pacific Cooperative Studies Unit UH-Manoa, Institute of Pacific Islands Forestry, Hilo, Hawaii

2017 – 2018 **Volunteer Research Entomologist** – USDA Forest Service, Institute of Pacific Islands Forestry, Pacific Southwest Research Station, Hilo, Hawaii

2012 – 2017 **Research Entomologist – Postdoctoral Researcher** – USDA Forest Service, Institute of Pacific Islands Forestry, Pacific Southwest Research Station, Volcano, Hawaii

2010 – 2012 **Research Associate: Entomology** – Natural History Museum of Denmark, Zoological Museum, Copenhagen, Denmark

2010 **Contract Entomologist** – Landcare Research – Biosystematics Team, Auckland, New Zealand

2009 – 2010 **Volunteer Curator** – Entomology Auckland War Memorial Museum, Entomology Department, Auckland, New Zealand

2009 **Entomologist** – Montana Department of Agriculture – Pest Management Bureau, Helena, MT, USA

1994 – 1996 **U.S. Peace Corps Volunteer** – National University of Samoa, Apia, Samoa

Publications and Presentations available on request

A.5. Dr. Mark Ero

COMING SOON.

A.6. Dr. Sulav Paudel

COMING SOON.

A.7. Dr. Sean Marshall

COMING SOON.

B. List of Acronyms

Required: Provide a complete list of acronyms used in your preproposal and their definitions. List the proposal number at the top of the page.

Proposal Number: *Proposal Number: Generated by the SERDP and ESTCP Management System (SEMS) when the proposal details are entered and saved in the system.*

CEMML Center for Environmental Management of Military Lands, Colorado State University

CRB Coconut rhinoceros beetle, *Oryctes rhinoceros*

CRB-G Coconut rhinoceros beetle, Guam biotype

CRB-S Coconut rhinoceros beetle, not Guam biotype

DOD United States Department of Defense

IATS Invasive, alien terrestrial species

LD50 Dose which causes 50% mortality

LT50 For a fixed dose, this is time between treatment and 50% mortality

NCSU North Carolina State University

OrNV *Oryctes rhinoceros* nudivirus, a biological control agent for coconut rhinoceros beetle

SON Statement of need

USDA-APHIS United States Department of Agriculture, Animal & Plant Health Inspection Service

C. Literature Citations

Required, if literature is cited: Literature Citations: Provide literature citations for any material cited in the technical section or the supporting technical data.

- [1] Jackson TA, Rincon M, Villamizar L, Paudel S (2022). Social media posts suggest that coconut rhinoceros beetle has established in the Western Hemisphere. <https://doi.org/10.22541/au.165828152.28371110/v1>
- [2] Paudel S, Jackson TA (2023). Tracking potential biosecurity incursions using publicly available images: A case of coconut rhinoceros beetle. *Journal of Applied Entomology*, 147(8), 661?666. <https://doi.org/10.1111/jen.13155>
- [3] Mansfield S, Balanama A, van Koten C, Paudel S, Bowie M, Jackson TA, Marshall SDG (2023). Assessment of coconut palm damage caused by coconut rhinoceros beetle, *Oryctes rhinoceros* (Coleoptera: Scarabaeidae), New Zealand Journal of Crop and Horticultural Science <https://doi.org/10.1080/01140671.2023.2278791>
- [4] Bedford, G. O.(2013). Long-term reduction in damage by rhinoceros beetle *Oryctes rhinoceros* (L.) (Coleoptera: Scarabaeidae: Dynastinae) to coconut palms at *Oryctes* nudivirus release sites on Viti Levu, Fiji. *African J Agricultural Research*. 8(49):6422-5.
- [5] Marshall SDG, Moore A, Vaqalo M, Noble A, Jackson TA (2017). A new haplotype of the coconut rhinoceros beetle, *Oryctes rhinoceros*, has escaped biological control by *Oryctes rhinoceros* nudivirus and is invading Pacific Islands. *Journal of Invertebrate Pathology* 149:127-34. <http://www.sciencedirect.com/science/article/pii/S0022201117300289>
- [6] SERDP (2021) A Terrestrial Environmental DNA Survey for Coconut Rhinoceros Beetle Surveillance and Mitigation <https://demo.serdp-estcp.mil/projects/details/7f27cd20-f1bc-4ae2-a46a-c8b8d0f30c11/rc21-1137-project-overview>

D. Supporting Technical Data

Optional: Supporting Technical Data (limited to 3 pages): Data sheets, charts, referenced research extracts.

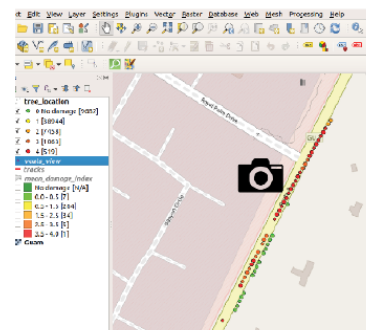
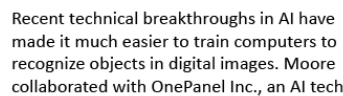


Figure 2: Image downloaded from www.crbhawaii.org.



Figure 3: Coconut palm in Mexico with CRB damage symptoms. This image was discovered by an automated search of web images using an object detector developed for CRB damage monitoring on Guam. Image source: <https://www.inaturalist.org/observations/76810823>.

Dr. Trevor Jackson, an entomologist working for AgResearch New Zealand, has developed a survey method based on a five-level scale for classifying CRB damage to individual coconut palms. Jackson's method is being used extensively on CRB-infested islands in the South Pacific. Moore decided to develop an island-wide roadside CRB damage survey for Guam based on an automated version of Jackson's method.



8

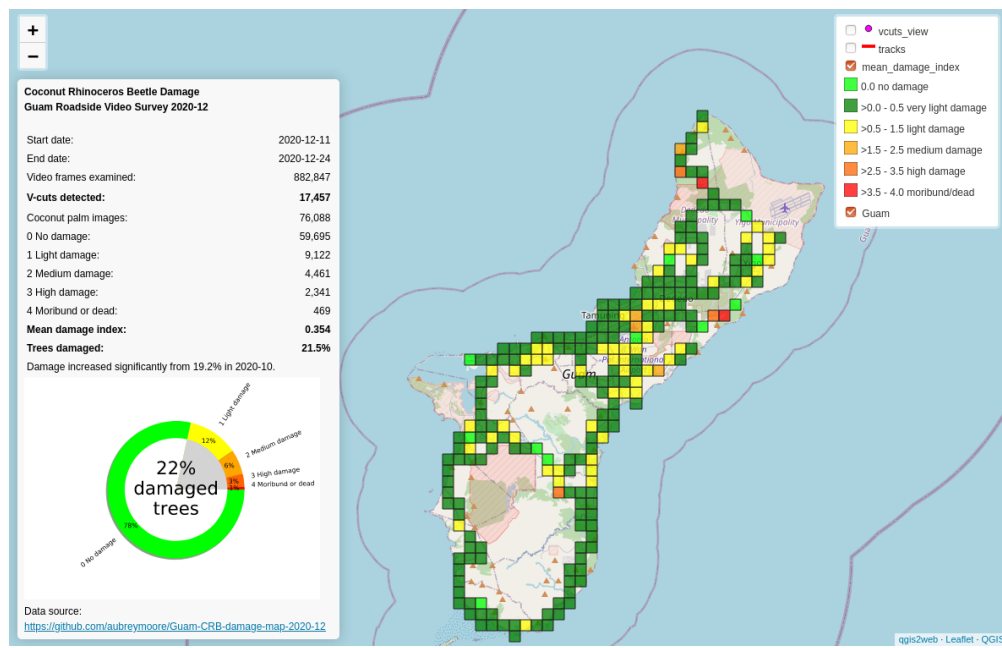


Figure 5: Screenshot of an [interactive web map](#) showing results from a roadside video survey of CRB damage on Guam in December 2020.



Figure 6: Screenshot of an [interactive web map](#) showing results of a CRB roadside survey on Majuro. 13,488 roadside images were taken during a 4 hours islandwide survey. Only 3 images contained v-shaped cuts. As indicated by the green circle, these images were in a very tight cluster located just east of the airport.

E. Existing Support

Optional: Existing Support: If the Principal Investigator is funded by other programs to conduct research that overlaps or parallels the current proposal, provide a brief description of that support (1-2 page per relevant effort).

COMING SOON.