Dear Dr. Schöngart,

We are very pleased to have the opportunity to revise our manuscript for publication in *Biogeosciences*. To our knowledge, we have made all the changes you and the reviewers have specified. Below we list point-by-point the location of each revision to the manuscript, and we have attached a revised manuscript and a PDF with markups.

Thank you again for all your consideration during the review process. We are happy to make any further revisions upon request.

Sincerely,

Katherine Heineman, on behalf of all the co-authors.

"Please provide the requested information pointed out by both reviewers on the drilling methodology (point 1 of your interactive comment) as far as this information is available."

We reported the diameter of the drill bit on section 2.2 p. 8 line 23, and we have added the depth to which the trees were cored on section 2.2 p. 8 line 25.

"Points 2 & 8 of interactive comment: I agree with reviewer 1 that a table providing data on species-specific wood rot frequency and severity would be an important information and I support that this will be added in form of a table in the supplementary material together with Table R1 which provides information on the level of taxonomic identification of the tree species in the different data sets which addresses the comment of reviewer 1."

We provided in the supplement Table S1, which lists the stem rot frequency and severity for each species in the study. This table is referenced in the text on section 2.2 p. 8 line 3-4. Table R1 is now included the supplement as Table S4 and is referenced in text on section 2.6 p. 12 line 13. To further emphasize the taxonomic resolution of our data, we have modified the title of our paper to read "Evaluation of stem rot in 339 Bornean tree species: implications of size, taxonomy, and soil-related variation for aboveground biomass estimates"

"Further I support your suggestion to emphasize more on the species-specific effects as suggested by reviewer 1 at point 3 and to include further analysis of variance considering the relative importance of different taxonomic levels on wood rot frequency and severity. Further I agree with your suggested modification indicated in your response to point 3 on page C3944 of your interactive comment."

To partition variance among taxonomic levels, we created a linear mixed effect model with DBH as fixed effect and Family/Genus/Species as nested random effects. We used a normal rather than a binomial error distribution for models of stem rot frequency so we could calculate the variance partitioning coefficient (VPC) for each random effect and the residual error term, as has been suggested by Goldstein et al. (2002) for variance partitioning in models with discrete response variables. VPC for a model with one random effect is calculated as:

$$VPC = \sigma_{\mu 0}^{2} / (\sigma_{\mu 0}^{2} + \sigma_{e0}^{2})$$

where $\sigma^2_{\mu 0}$ is the variance explained by the random effect and σ^2_{e0} is the residual variance.

We used manual stepwise removal of terms with comparison of Akaike's Information Criterion to decide which fixed and random effects should be retained in each model (AIC, Burnham and Anderson, 2002). We retained the random effect if its removal increased model AIC by > 2. We fit models separately for the drilling, felling, and coring datasets, and present the VPC for each significant taxonomic random effect in Table S5. We have added these methods to section 2.6 p. 11 line 20, and the results of the analysis are presented in section 3.1 page 14 line 26 and reference Table S5, which has been added to the supplement. We have deleted the methods (section 2.6 p. 11 line 24) and results (section 3.1 p. 14 line 26) referring to models analyzing the effect of genus as a fixed effect because that analysis is now redundant

We interpret these results in the discussion on section 4.3 p. 23 line 2. We suggest a number of possible species-level traits that may generate taxonomic variation in stem rot susceptibility including interspecific variation wood chemical properties and anatomical properties and differences among species in induced defenses. In addition, the lack of significant differences at the family level indicates that Dipterocarp taxa do not differ systematically in susceptibility to rot from non-Dipterocarp taxa in MDF forests, despite showing broad differences in other traits from some families, such as mycorrhizal association.

"Points 4, 9 and 31: The information included in the revised table 1 addresses sufficiently the comments raised by both reviewers showing the number of selected tree species and individuals from each dataset for analyses. You should explicitly mention in the corresponding material and method section of the revised version that trees without species-level covariates (wood density or soil habitat association) and species-level identification were not included in the GLMMs."

This information has been included to the material and methods on section 2.6 p. 12 line 7.

"Point 5: I agree to provide more information in the revised manuscript on the comment raised by reviewer 1 on species selection for logging as this may influence the results. This was also a major concern of reviewer 2 which is now well addressed in your response (page C3946 of your interactive comment)."

The additional details regarding the selection of stems for logging mentioned in the author response has been added to the methods on section 2.2 p. 9 line 3.

"Points 6 & 29: Both reviewers claim that your data only evaluate stem biomass. Therefore it is important that you clearly state that the estimates refer to stem biomass and not to the whole tree or aboveground biomass since data on wood rot of roots and branches are not available and extrapolation to the aboveground wood biomass are complicated due to varying crown architectures."

To emphasize this point, we have added the following sentence to section 2.7 p. 13 line 18: "Because stem rot in coarse roots and tree crowns was not within the scope of our study, $Loss_{max}$ represents only the proportion of stem biomass lost to stem rot in a given cluster." In the revised version of the manuscript, we have changed the term "heart rot" to "stem rot" to describe more precisely what was measured in our study. "Points 7 & 24: I think that your modification of the sampling description in section 2.2 now sufficiently responds the critics raised by both reviewers."

We have added this sampling information to section 2.2 p. 9 line 10.

"Point 9: Please clearly state in this section that in the three datasets only trees from identified species were included in the GLMMs."

This point is now clearly stated as follows in section 2.6 page 12 line 8.

"Points 10 & 26: Maybe it would be appropriate to cite some relevant studies of P. Ashton (listed in the interactive comment) and Baillie et al. (1987) (page 10, lines 5-6) when saying "for species not included in these studies, natural history data and personal observations (by P. S. Ashton) were used."

We now list citations by P.S. Ashton related to tree species distributions in Borneo on section 2.4 p. 10 line 5. "For species not included in these studies, classifications were assigned by P.S. Ashton from his extensive studies of tree species distributions in the region (Ashton, 1964, 1973, 2015)."

"Point 11: Adding the information on soils in both study regions (Table R2) in the supplements will improve the understanding of soil classification (see also comments of reviewer 2). You should discuss that due to under-representation of large trees in the upper diameter classes probably no significant difference in stem rot frequency was observed between soil types in the Lambir region. "

Table R2 has now been added to the supplement as Table S3. It is referenced in the text in section 2.5 p.10 line 23. As follows: "Soil properties of the two most distinct soil types (clay and sandy loam) are listed for both Lambir and Central Sarawak in Table S3."

We also have added the following sentence to the discussion on section 4.2 p. 21 line 22. "We suspect that the Lambir dataset lacked power to detect a difference between soil types due to under-sampling of the large trees that are more likely to contain sections of rot."

"Point 12: The selected sequence to present information on analysis of individuals (section 2.6) before analysis on the stand-level (section 2.7) makes sense for me."

"Point 13: ok."

"Point 14: You should indicate more clearly in section 2.2 describing the methodology of coring that sampling was done only at one point, while drilling was performed at two points on the stem (the reader might miss this information). Further you should include in the discussion that the discrepancy in estimating the frequency stem rot, despite the methodological problems, might be also related to the diameter distribution of the trees from the two datasets. Therefore I suggest to include Figure R2 as supplementary information highlighting the diameter distribution of trees from the three sample sets."

We have more clearly indicated the difference in the number of observations per tree between

the coring and drilling methods on Section 2.2 p. 9 line 10 "The stem rot data from Lambir were collected from 365 trees (116 species in 35 families; Table 1, Table S1) with a 5-mm increment hand borer, bored to half of the DBH at one point on the stem, in contrast to the drilling method which tested for rot at two points on each stem." We emphasize the methodological importance of sampling large trees in section 4.2 p. 20 line 20, "Future studies should ensure that large trees are not under-sampled, especially considering that large, dominant canopy trees predominantly structure carbon dynamics in tropical forests (Slik et al., 2013; Bastin et al., 2015)."

Figure R2 has been added to the supplement as Fig S4, and is now referenced in the results in section 3.1 page 14 line 16.

"Point 15: Also this point should be clearly addressed in the discussion referring to figure R2."

We have added the following sentence to the discussion on section 4.2 p. 21 line 22. "We suspect that the Lambir dataset lacked power to detect a difference between soil types due to undersampling of the large trees that are more likely to contain sections of rot."

"Points 16 & 21: As pointed out earlier, the selection criteria are now much better described and documented. The diameter distribution of the trees used for felling and drilling is quite similar and includes even more trees in the upper diameter classes selected for drilling compared to those for felling (Figure R2). The methodological problems of detecting small amounts of rot between felling and drilling should be mentioned in the discussion to explain part of the differences on wood density's impact on the presence of stem rot. This might be also due to methodological differences to observe stem rot which was done on both ends of the stem of felled trees, but only at height of DBH on drilled trees (see point 21 raised by reviewer 2)."

The sentences referencing the wood density x DBH interaction has been removed because when we used model selection methods suggested by reviewer #2, this term was not included in the final model for any dataset.

We now emphasize the potential causes discrepancies in results among datasets with respect to soil habitat association, which interacts with DBH in the felling dataset but is not significant in the coring or drilling dataset. This discussion is on section 4.2 p. 22 line 4.

"Points 17-20: ok."

"Point 22 & 23: sufficient information is now provided."

"Point 25: I agree with your comment."

"Point 27: Please report in the revised version the year of collection of the drilling and felling data."

The years of the central Sarawak data collection are now included in section 2.2 p. 8 line 4.

"Point 28: I think you answered sufficiently the critics of reviewer 2, but I feel it is necessary to discuss in a revised version biases of overestimates which can be caused by plot designs or oversampling large trees (see figure R2)"

We now highlighted the difference in the sampling of large tree in our study relative to previous studies and discuss how these difference influence forest estimates of biomass lost to rot in section 4.1 p. 19 line 7.

"Point 30: This information should be presented in the supplement of the revised version."

A table of linear model coefficients has been added to supplement as Table S6.

"Point 32: These analyses should be included in the revised version and in the corresponding figures and tables."

We now present the mixed effect models that include only covariates included in the "best model" as determined by AIC model selection as described on section 2.6 p. 11 line 19. For the revised analyses, we did not filter out species that had fewer than 5 individuals, so the number of trees, species, and families for each analysis has changed (Table 1). The revised analysis did not substantially alter the main points of emphasis in the paper: species identity, tree size, and soil PC axes were all significantly associated with the probability of stem rot in the central Sarawak datasets. However, model selection did alter the significance of some species level covariates in one test, as habitat association and the wood density x DBH interaction were not included in the final model of the drilling dataset. Because habitat association is not significant in the drilling dataset, we have deleted Figure 4, which showed the probability of rot in each habitat group. We have retained Fig. S7, which depicts the stem rot probability vs DBH relationship for each habitat group in the felling dataset. For the stem rot severity analyses, soil PC3 was no longer retained in the final model #1, and the final model #2 for stem rot severity now includes the twoway interaction between soil habitation association and wood density rather than the three-way interaction between soil association x wood density x DBH. Furthermore, because final models did not include all covariates, we deleted the methods, results, and figures related to the hierarchical variance partitioning of model predictors explained in section 2.6 p. 12 line 16.

Other minor changes to the analyses that have been noted in the manuscript: -We used the lme4 package in R instead of PROC GLIMMIX in SAS for mixed effect models (section 2.6 p. 11 line 8), which remedied previous problems with convergence. - Because AIC-based model selection was used to identify the best-supported models, we present only the best models in the results (Table 2; Table 3; Table S6) we calculated the change in AIC with single-factor removals to analyze each factor's influence on the response variable (Table 2; Table 3).

"Point 33: The fitted relationships for probability of stem rot vs. diameter in the three datasets should be presented as supplementary information."

The probability of stem rot vs. diameter relationships for each dataset is now included in the supplement as Fig. S5.

"Points 34-36: are sufficiently responded."

"Point 37: Comparisons between your datasets and those from other tropical regions, especially the Neotropics, should be made with caution. So far only very few data sets are available and it

is important to emphasize that more studies in the different tropical forests are needed."

We removed from the conclusion our assertion that stem rot is greater in the Borneo than the neotropics, and emphasize instead the need for more widespread and consistent studies across regions.

"Point 38: suggest to drop the sentence focusing on LIDAR-based estimates in the revised version."

References to LIDAR have been dropped from the introduction and discussion.

"Point 39: your comment sufficiently address the critic of reviewer 2.

"Point 40: ok."

Please consider also the minor concerns and comment of reviewer 2 in the revised version.

In your revision, please make sure that you take full account of the comments of the referees and editor.

Thank you for submitting to Biogeosciences. We look forward to receiving the revision.

Best regards,

Jochen Schöngart

Biogeosciences Discuss., 12, 1–41, 2015 www.biogeosciences-discuss.net/12/1/2015/ doi:10.5194/bgd-12-1-2015 © Author(s) 2015. CC Attribution 3.0 License.



This discussion paper is/has been under review for the journal Biogeosciences (BG). Please refer to the corresponding final paper in BG if available.

Holuence of tree size, taxonomy, and edaphic conditions on heart rot in mixed-dipterocarp Bornean rainforests: implications for aboveground biomass estimates

K. D. Heineman¹, S. E. Russo², I. C. Baillie^{3,4}, J. D. Mamit^{4,5}, P. P.-K. Chai⁴, L. Chai⁴, E. W. Hindley⁶, B.-T. Lau⁴, S. Tan⁷, and P. S. Ashton⁸

¹Program for Ecology, Evolution, and Conservation Biology, University of Illinois-Urbana Champaign, USA

²School of Biological Sciences, University of Nebraska – Lincoln, USA

³National Soil Resources Institute, Cranfield University, UK

⁴formerly Forest Department, Kuching, Sarawak, Malaysia

⁵Datuk Menteri Yang Berhormat, Federal Parliament of Malaysia, Kuala Lumpur, Malaysia

⁶502 591 57th W Avenue, Vancouver, British Columbia, Canada

⁷Center for Tropical Forest Science, Smithsonian Institution, Washington DC, 20013-7012, USA



⁸Organismic and Evolutionary Biology, Harvard University, USA and Royal Botanic Gardens, Kew, UK

Received: 3 April 2015 - Accepted: 17 April 2015 - Published:

Correspondence to: K. D. Heineman (kheineman@life.illinois.edu)

Published by Copernicus Publications on behalf of the European Geosciences Union.



Abstract

Fungal decay of heartwood creates belows and areas of reduced wood density within the stems of living trees known as the stems of liv source of error in forest aboveground biomass estimates, there are few datasets avail-

- able to evaluate the environmental controls over heart ret infection and severity in tropical forests. Using legacy and recent data from drilled, felled, and cored stems in mixed dipterocarp forests in Sarawak, Malaysian Borneo, we guantified the frequency and severity of heart rot, and used generalized linear mixed effect models to characterize the association of heart rot with tree size, wood density, taxonomy, and edaphic condi-
- tions. Heart rot was detected in 55% of felled stems > 30 cm DBH, while the detection 10 frequency was lower for stems of the same size evaluated by non-destructive drilling (45%) and coring (23%) methods. Heart rot severity, defined as the percent stem volume lost in infected stems, ranged widely from 0.1 82.8%. Tree taxonomy explained the greatest proportion of variance in heart rot frequency and severity among the fixed
- and random effects evaluated in our models. Heart rot frequency, but not severity, in-15 creased sharply with tree diameter, ranging from 56% infection across all datasets in stems > 50 cm DBH to 11% in trees 10 30 cm DBH. The frequency and severity of heart rot increased significantly in soils with low pH and cation concentrations in topsoil, and heart rot was more common in tree species associated with dystrophic sandy
- soils than with nutrient-rich clays. When scaled to forest stands, the percent of stem 20 biomass lost to heart ret varied significantly with soil properties, and we estimate that 7% of the forest biomass is in some stage of heart rot decay. This study demonstrates not only that heart rot is a significant source of error in forest carbon estimates, but also that it strongly covaries with soil resources, underscoring the need to account for
- edaphic variation in estimating carbon storage in tropical forests. 25



1 Introduction

Fungal rot of secondary xylem causes hollows and regions of reduced wood density in tree stems. This type of fungal infection, commonly referred to as heart rot, stem rot, or butt rot, is important for the structure, dynamics, and functioning of forests, given that it

- may increase tree mortality (Franklin et al., 1987; Ruxton, 2015), facilitates the creation of cavity habitats for a diversity of wood-inhabiting and decaying species (Cockle et al., 2012; Stokland et al., 2012), and may act as a reservoir of nutrients sequestered in heart rot biomass (Swift, 1973; Janzen, 1976; Boddy and Watkinson, 1995), Moreover, the effect of heart rot on aboveground biomass is of particular importance for efforts
 to map carbon storage in tropical regions as part of global conservation and climate change mitigation strategies (Saatchi et al., 2011). However, because heart rot is dif-
- ficult to detect by non-destructive means, we understand little about what controls its frequency and severity in tropical forests.

Most information available on heart rot in tropical forests comes from forestry studies
exploring its influence on the volume and quality of timber. Among species commonly logged in old world dipterocarp forests, heart rot occurs up to 75% of large *Shorea robusta* (Dipterocarpaceae), reducing stem volumes by 9–13% (Bakshi, 1960; Bagchee, 1961). The majority of large mono-dominant *Shorea albida* (Dipterocarpaceae) individuals in Sarawak peat swamp forests have been extensively hollowed by fungi and termites (Anderson, 1964). In subalpine silver fir (*Abies densa*; Pinaceae) forests of

- the Eastern Himalayas, heart rot reduced timber yields < 33 % of those predicted from external stem volumes (Burgi et al., 1992; Gratzer et al., 1997). The influence of heart rot appears to be less in the Brazilian Amazon, where the average frequency of heart rot was 30 % in six commercial timber species in the eastern Amazon (Eleuterio, 2011),
- and estimation of stem volume hollowed by heart rot in the western Amazon was just 0.7 % (Noguiera et al., 2006). Together these studies provide evidence that the frequency and severity of heart rot influence AGB estimates, particularly those obtained using LiDAR and other remote sensing methods (Zhao et al., 2009). However, there



have been few systematic analyses of the interspecific variation in heart rot with intrinsie tree properties or extrinsic environmental factors that might mediate susceptibility and engender spatial variation in forest biomass lost to heart rot.

- Understanding how patterns of heart rot infection vary with tree size is critical to assessing its influence over forest AGB and its estimation because big trees > 70 cm in diameter at breast height (DBH) explain 70 % of variation in pantropical AGB (Slik et al., 2013). Tree size may be among the best predictors of heart rot in tropical forests because old trees have lived long enough to incur butt, branch, and stem wounds that lead to fungal infection, and trees may become less resistant to infection as they senesce (Boddy, 2001). In temperate forests, where tree age can be estimated precisely through dendrochronology, heart rot frequency increases with age in longleaf pine (*Pinus palustris*; Hooper et al., 1988), and pedunculate oak (*Quercus robur*, Ranius et al., 2009). While tree size is an imperfect proxy of tree age (Ng, 2013), heart rot frequency increases with tree diameter in neotropical forests (Nogueria et al., 2006;
- Gibbons et al., 2008; Eleuterio, 2011). However, variation in the frequency of heart rot in a given size class among sites indicates that there may be interactions between tree size with the taxonomic and environmental factors.

Wood anatomical properties may also explain variation among trees in susceptibility to heart rot. Trees with dense wood may be less likely to experience branch and stem

- ²⁰ breakage due to wind disturbance (Putz et al., 1983) and are considered more durable to termite and fungal infection than trees with softer wood (Bultman and Southwell, 1976). Additionally, dense wood is associated with pathogen resistance in tropical tree species (Augspurger and Kelly, 1984) and slower fungal growth (Romero and Bolker, 2008), perhaps because the reduced permeability of dense wood impedes fungal hy-
- 25 phac (Merrill and Cowling, 1966). Within species, fast-grown trees with lower wood density are associated with faster decay rates by saproxylic fungi (Edman et al., 2006), although this pattern does not hold across all fungi (Yu et al., 2003). In an Amazonian forest, little or no covariation was found between species' wood density and frequency



of heart rot, although the probability of rot was significantly correlated with other wood traits, such as vessel lumen diameter and vessel density (Eleuterio, 2011).

The frequency and severity of heart rot may also vary with the availability with edaphic resources. For instance, low soil fertility and nutrient or water stress may pre-

- dispose tissues to fungal infection (Shigo, 1984). There is also a potential indirect age effect, as trees tend to grow slower and live longer on infertile soils (Russo et al., 2005, 2008), and are therefore exposed to chance infection for longer. Conversely, forests on more fertile soils tend to grow faster, have less dense and softer wood and lower contents of defensive, mycostatic secondary metabolites, and such wood may be more
- ¹⁰ prone to heart rot (Boddy, 2001). Variation in heart rot along edaphic gradients would enhance the importance of including soil parameters in models estimating forest storage and fluxes, especially in Southeast Asian forests where aboveground biomass varies with soil nutrient availability (Lee et al., 2002; Paoli et al., 2008).

We used legacy and modern data sets to quantify the covariation of taxonomy, tree size, wood density, and soil resource availability with the frequency and severity of heart rot in two Bornean mixed dipterocarp forests. We quantified the impact of heart rot on forest standing biomass, and evaluated the implications of soil-related variation in heart rot for stand-level variation in biomass. Efforts to quantify heart rot in tropical trees are hampered by the difficulty of evaluating rot without compromising the health of trees

in long term monitoring plots. We therefore also compared methods for quantifying heart rot frequency, including the direct assessment of heart rot frequency based on destructive harvesting, with two non-destructive methods (coring and drilling).

2 Methods

2.1 Study sites

²⁵ The data were collected in two locations in Borneo: Central Sarawak and Lambir Hills National Park, Sarawak (hereafter, Lambir) (Fig. 1). The Central Sarawak tree drilling



and felling data were collected during a timber inventory of lowland mixed dipterocarp rain forest $(1^{\circ}30'-2^{\circ}50' \text{ N}, 112^{\circ}20'-113^{\circ}50' \text{ E})$ (FIDP, 1974a). Annual rainfall averages 3000–3500 mm yr⁻¹ in this region with no distinct dry season. The topography consists of long, steep-sided ridges on Tertiary sandstones and narrow valleys in softer shales.

- ⁵ The soils are colluvial/residual Acrisols (Udults) and associated Cambisols (Udepts) (FAO, 2006). The coarse loams on sandstone ridges tend to be more stable and deeper than the shale-derived fine loams and clays of the lower slopes and valleys. All of the soils are acidic and leached, and exchangeable base saturations are usually < 10 %. Reserves of K and Mg are moderate, but those of P and especially of Ca are low.</p>
- ¹⁰ Mineral nutrient fertility increases with clay content, and the slope and valley clays are less dystrophic than the coarse loams on the ridges (Baillie et al., 1987). The mixeddipterocarp forest at this site was among most diverse forests in the Paleotropics. The distributions of many tree species are associated with soil conditions, producing considerable changes in floristic composition on different soil types (Baillie et al., 1987;
- ¹⁵ Ashton and Hall, 1992; Potts et al., 2002; Paoli et al., 2006). Average canopy height is 30–50 m, with emergent trees reaching 70 m, taller than many other tropical forests (Banin et al., 2014).

The Lambir tree coring data were collected in 2009 in Lambir Hills National Park (4°11′ N, 114°01′ E) in northern Sarawak. The physical environment is similar to that of the central Sarawak study area, with acid leached Acrisols and associated Cambisols (Baillie et al., 2006; Tan et al., 2009) on a sandstone cuesta (Yamakura et al., 1996), with shale below the scarp and on the lower dip-slope. Sampling was conducted on two contrasting soil types: clay/fine loam soil, which is more fertile for most nutrients and has greater cation exchange and water-holding capacity, and sandy loam soil,

²⁵ which has lower concentrations for most nutrients, lower cation exchange capacity, and is better drained (Baillie et al., 2006; Tan et al., 2009). The distribution of individual species, and the overall floristic composition, structure, and dynamics of the mixed-dipterocarp forest at Lambir are associated with differences in topography and soils (Lee et al., 2002; Davies et al., 2005; Russo et al., 2005, 2008; Heineman et al., 2011).



2.2 Heart rot data

The Central Sarawak felling (1035 trees in 240 species in 32 families) and drilling (1780 trees in 242 species in 33 families) data were collected in 422 plots grouped in 80 clusters located (Fig. 1; Table 1). Nine plots were 3×3 square arrayed in each cluster at

- ⁵ 80 m spacing (Fig. S1 in the Supplement). Plots were defined using a BAF 10 prism, so that all the stems with an angular diameter > 1.74° when viewed from the center point were included in the plot. This standard forest inventory method (Avery and Burkhart, 2001) includes larger stems located relatively farther away from the center point, whereas small stems are only included if they are close. The plots were there-
- fore irregularly shaped, and sizes ranged from ca. 200 to > 2000 m² (Fig. S1). On a random subset of 44 clusters, all trees-that would produce at least one commercial log (i.e., 3.65 m long with minimum diameter at breast height (DBH) of 30 cm) were felled at breast height (1.3 m) (Fig. S2). Presence or absence of heart rot was recorded based on visual inspection of the log ends, and heart rot was scored as present when
- the wood contained voids or areas of darkened, soft, or brittle wood (Fig. S2). Logs that were sound at one end but rotten at the other were sawn in half to better quantify rot severity. For each cross-section, the total area and the area eff rot were measured by grid counts on transparent overlays (Panzer, 1975). The volumes of the whole log and of the heart rot were computed based on tapering cylinders. The percent of heart rot
- for the tree was estimated as the sum of the rot volumes for each log as a percentage of the total stem volume. Early felling results revealed more frequent and severe heart rot than anticipated, so rot sampling was augmented with a drilling program. On 25% clusters chosen randomly, all trees with at least one commercial log were drilled at 1.3 m perpendicular to the stem axis, with two drill holes at right angles to each other
- (Fig. S2). Presence or absence of heart rot was identified by visual inspection of the drilled debris using the above criteria. The accuracy of drilling was cross-validated on 419 stems, which were drilled prior to felling.



Safety was a primary consideration, and felling crews had complete on-site autonomy to exclude trees with visible rot, asymmetric crowns or other features indicative of increased risk of the stem splitting during felling. The disproportionate exclusion of very large or obviously rotten stems, and species with very hard, heavy wood means that the felling data are probably conservative in their representation of rot in the forest as a whole. Safety was less of an issue for drilling, and the drilling data contain more very large trees, although species with very hard wood blunted drill bits, and were often

excluded.

The heart rot data from Lambir were collected from 220 trees (22 species in 9-families; Table 1) with a 5 mm increment hand borer, bored to half of the DBH. Secondary xylem from extracted cores was examined for heart rot as above, and presence or absence of heart rot was recorded. Trees were sampled on two soil types, clay/fine loam and sandy loam, defined in previous research at the site based on elevation and soil properties (Davies et al., 2005; Russo et al., 2005).

15 2.3 Tree properties

20

DBH was recorded for all individuals in the drilling, felling, and coring datasets. Wood density (oven dry mass/fresh volume; g cm⁻³) was estimated for each tree in the coring data. Wood cores were broken into segments no greater than 5 cm in length prior to analysis to account for radial variation in wood density. The fresh volume of each segment was estimated by water displacement (Archimedes' principle) for each tree in the coring data set. Mass was recorded for wood segments after drying at 60 °C for 72 h. The density for each core was calculated as the mean of segment densities weighted based on the proportion of the basal area occupied by that annulus.

2.4 Tree species properties

²⁵ Each tree species in the three data sets was categorized according to its soil association. Generalists were species that are similarly abundant on all soil types. Species



with distinct soil associations were categorized as specialists of clay/fine loam, fine loam/loam, loam/sandy loam, in order of decreasing fertility and water retention. Assignments were based on analyses of species' distributions within the 52 ha forest dynamics plot at Lambir (Davies et al., 2005) and across a network of plots in Sarawak

⁵ (Potts et al., 2002). For species not included in these studies, natural history data and personal observations (by P. S. Ashton) were used. The density of sound wood was assigned to stems in the felling and drilling datasets from timber group values (FIDP, 1974b) and from species average densities in the coring data.

2.5 Soil properties

- Edaphic data (Table S1 in the Supplement) were collected for each plot in the Central Sarawak data. Soil morphology was described in shallow profile pits at plot centres (Baillie et al., 1987; Fig. S2). The profiles and augerings, located 2.5 m from the centre, were sampled at 0–10 and 45–55 cm, bulked by depth (topsoil and subsoil, respectively), and the soils analysed for pH electrometrically, organic carbon by Walkley Black
- acid dichromate oxidation, and total nitrogen by micro-Kjeldahl distillation. Exchangeable cations were extracted with 1 M NH₄OOCH₃. Reserve nutrients and free Fe and Al sesquioxides were extracted with hot concentrated HCI. Extracted cations were assayed by atomic adsorption spectrometry, Fe and Al by titration, and P by molybdenum blue colourimetry. Particle size distribution was analysed by pipette sampling after ox-
- idation with H₂O₂ and dispersion with sodium hexametaphosphate (Chin, 2002). For the coring data, the soil type of each tree was assigned to sandy loam or clay/fine loam (140 and 80 trees, respectively) based on the soil survey of the adjacent 52 ha forest dynamics plot (Baillie et al., 2006; Tan et al., 2009).

For the central Sarawak data, we used principal component analysis (PCA) to create a reduced number of orthogonal axes of soil variation, using the function *prcomp* in the statistical software, R (R Core Team, 2014). Prior to PCA, we used multiple imputation to replace sparse missing values in the soil data matrix using the function *aregImpute* in R because PCA cannot be performed on a matrix with missing values, and we sought



to maximize sample size for statistical power. We included the first four PC axes in analyses, which together explained 58% of the variance in soil properties (Table S2).

2.6 Data Analysis

Linear mixed effect models with type III tests of fixed effects were used to evaluate: (1) if the detection of heart rot presence/absence differed among datasets (2) if genera differed in the frequency and severity heart rot and (3) if heart rot frequency and severity varied significantly with species, tree, and edaphic covariates. Mixed-effect models were necessary because variable numbers of individuals and species were included in each dataset. All datasets were filtered to include only species with > 5 individuals after absorvations with missing values in the acelerical equation (Table 1)

observations with missing values in the ecological covariates were deleted (Table 1).
 In models testing variation in the frequency of heart rot, we employed generalized linear mixed models (GLMM) with a binomial probability distribution and logit link function using the Laplace method and Cholesky root algorithm for parameter estimation (Bolker et al., 2009). Linear mixed models (LMM) with restricted maximum likelihood

 parameter estimation and degrees of freedom estimated using the Kenward-Roger method were used to evaluate variation in heart rot severity (percent stem volume lost to heart rot), which was log transformed to meet the assumption of normality of residuals. GLMM and LMM models were fit using PROC GLIMMIX and PROC MIXED in SAS version 9.3 (SAS Institute, Carry NC).

²⁰ We included DBH as a fixed effect in the GLMM testing for differences among datasets in heart rot detection on the aggregated data to account for differences among datasets in size range of trees measured. Because the effect of dataset on heart rot frequency was significant, we fit models for all subsequent tests separately for each dataset. Differences among genera in the frequency of heart rot (drilling, felling, and

²⁵ coring data separately) and heart rot severity (felling data) were tested with GLMMs and LMMs, respectively, with genus and DBH as a fixed effects and species as a random effect.



We fit two models testing the effects of ecological covariates on heart rot frequency and severity, depending on the availability of fixed-effect covariates and their collinearity: (1) main effects: DBH, wood density, soil PC1, soil PC2, soil PC3, soil PC4; 2-way interactions: wood density \times DBH; (2) main effects: DBH, wood density, soil associa-

- tion; 2-way interactions: DBH × wood density, soil association × DBH, soil association × wood density; 3-way interaction: DBH × wood density × soil association. For the coring data, soil type (clay or sandy loam) replaced the soil PCs. To decide which fixed-effect interactions should be retained, we used manual stepwise removal of interaction terms with comparison of model Akaike's Information Criterion between models with
- and without interaction effects (AIC, Burnham and Anderson, 2002). We retained an interaction term if its removal increased model AIC by > 2. We used post hoc analysis of GLMM and LMM fits to determine the statistical significance of differences among levels of categorical predictors.

We examined the variance in heart rot probability and severity explained by variables in the GLMM and LMMs using two approaches. We determined the proportion of variance explained by random and fixed effects using pseudo-R squared (pR^2) metrics (Nakagawa and Schielzeth, 2013). The marginal pR^2 is the proportion explained by the fixed effects alone, and the conditional pR^2 is the total proportion explained by the model when fixed effects are conditioned on the random effects. We used hier-

- archical variance partitioning in the *hier.part* package in R (Olea et al., 2010; Walsh and MacNally, 2013) to rank the importance each factor in explaining variance in heart rot frequency and severity. Hierarchical partitioning reduces collinearity by determining the independent contribution of each explanatory variable to the response variable and separating it from the joint contributions, allowing an evaluation of the relative impor-
- tance of species soil association and soil properties, which were modeled separately in mixed-effect models. Variance partitioning analyses included all species, individual, and soil factors evaluated for each heart rot frequency and severity dataset. Log likelihood was used as the goodness of fit metric.



2.7 Biomass lost to rot

assumption of normality.

To evaluate how the patterns of heart rot frequency and severity among individual stems influenced stand level carbon stocks, we estimated maximum percent of stem biomass lost to heart rot (Loss_{max}) and correlated it with soil habitat variables for each cluster of plots sampled in the felling dataset. Loss_{max} for each cluster was calculated as:

 $Loss_{max} = \frac{\sum_{i=1}^{n} TSV \cdot Wood Density \cdot Percent Rot}{\sum_{i=1}^{n} TSV \cdot Wood Density}$

(1)

Discussion Paper

for each of n trees sampled in each cluster of the drilling and felling data, where TSV is the total stem volume from the base of the tree to the first branch. We included only clusters with > 10 felled trees > 30 cm DBH. Cluster-level soil parameters were aver-10 ages of the plot-level soil measurements in each cluster. Because plots were variable in size and shape, it was impossible to calculate stem biomass lost per unit ground area. Loss_{max}, will not generate the same value as the average percent stem volume lost across individual tree stems because Lossmax accounts for differences among species in wood density and weights the contribution of individual trees to stand biomass loss 15 by tree size. Loss_{max} is the maximum amount of biomass lost to heart rot because our calculations assume rotted areas were hollow, as no data was collected on how much wood density was reduced in these areas. Pearson correlation tests were used to determine if Loss_{max} correlated with the first four soil PC axes and the six soil chemical variables in the topsoil (pH, total N, reserve P, and exchangeable Ca, K, and Mg) that 20 were used in the PCA. Soil cations (Ca, K, and Mg) were log transformed to meet the

taxonomy, and edaphic conditions Discussion Paper on heart rot K. D. Heineman et al. **Title Page** Introduction Abstract Discussion Paper Conclusions References Tables **Figures** Close Back **Discussion** Paper Full Screen / Esc **Printer-friendly Version** Interactive Discussion

BGD

12, 1-41, 2015

Influence of tree size.

3 Results

3.1 Frequency of heart rot

There was substantial variation between datasets in the frequency of heart rot (Fig. 2a), which occurred in 11% of cored, 46% of drilled, and 55% of felled stems. The classification error of the drilling method was 18% for the 419 trees scored for rot by first drilling and then felling, where felling observations were taken to be correct. Of the stems misclassified by the drilling method, 58 of the 77 errors were false negatives, in which drilled stems were scored as having no rot, but rot was later observed when the stem was felled. The average percent rot was substantially less severe in rotted stems misclassified by the drilling method (5%) than in rotted stems trees correctly categorized by drilling (19%), indicating that the drilling method was effective for scoring stems with extensive rot.

The discrepancy in prevalence of rot between the central Sarawak and Lambir datasets may be caused in part by differences in the tree sizes sampled: at Lambir 80% of the cored trees were < 30 cm DBH, whereas 98% of trees drilled or felled 15 in Central Sarawak were > 30 cm DBH (Fig. 2b), We investigated these possibilities by sub-setting the data to include the same DBH range across all datasets and testing for differences between datasets in the probability of a tree having heart rot, while accounting for DBH. After sub-setting, heart rot probability increased with DBH in all datasets, and there was no difference in the slope of this relationship across data sets 20 (DBH, $F_{1.1270} = 21.33$, p < 0.001; DBH × dataset interaction, $F_{2.1270} = 1.2$, p = 0.305). However, datasets differed in the mean probability of heart rot at a given diameter $(F_{2,1270} = 13.40, p < 0.001)$. For a tree 50 cm at breast height, the probability of finding rot in the coring dataset was 25% in the coring dataset, compared to 45% in the drilling and 55 % in the felling datasets. 25

After accounting for DBH, genera varied in the probability of heart rot in the felling ($F_{7,641} = 3.71$, p = 0.006) and drilling ($F_{6,578} = 4.77$, p < 0.001) datasets, but not in the coring dataset ($F_{3,140} = 9.55$, p = 0.164, Table S3). Among the three most well sampled



genera (all Dipterocarpaceae) in the felling dataset, heart rot occurred significantly more frequently in *Dryobalanops* (66 % of stems) and the red meranti section of *Shorea* (61% of stems) than in *Dipterocarpus* (26% of stems; Fig. 3a).

Heart rot increased in probability with tree diameter in all three datasets (Fig. 2). Indeed, DBH was the only significant predictor in any of the coring data models (Table S4). Across all datasets, the frequency of rot shifted drastically among size classes: stem rot was present in 11% of stems 10–30 cm DBH, 37% of stems 30–50 cm DBH, and 56% of stems > 50 cm DBH.

The probability of finding heart rot covaried significantly with species wood density
 in the drilling (Table 2; Fig. S4), but not in the felling or coring datasets (Tables 2, S4).
 In the drilling data, the probability of heart rot increased with wood density, but the strength of this effect diminished with increasing DBH. In other words, for species with low wood density, smaller trees had a lower probability of being infected than larger trees, but at high wood density, the differences in heart rot incidence with tree size diminished (Fig. S4).

Heart rot incidence varied significantly with edaphic variables. In the drilling data, heart rot decreased in probability with increasing values of soil PC2, which were associated with high pH and high exchangeable Mg in both topsoil and subsoil (Table 2; Fig. S5a). In felling data, the probability of rot increased significantly with soil PC3 (Ta-

²⁰ ble 3; Fig. S5b), which had a strong negative association with reserve and exchangeable Ca in the topsoil and varied in the same direction with respect to Mg and pH in topsoil as soil PC2. Overall, these results suggest that the incidence of heart rot in Central Sarawak was more frequent on lower fertility soils with reduced cation availability. In the Lambir coring dataset, the probability of heart rot did not differ between sandstone and shale soil types (Table S4).

Species soil associations showed significant covariation with the presence of heart rot in both the drilling and felling (Table 2), but not the coring (Table S4) data. The rank order of mean heart rot probability among habitat association groups was similar in the drilling and felling data, but the significance of these differences varied. Heart rot proba



ability was lowest in stems of species associated with more fertile, finer textured soil, intermediate for generalists, and highest in specialists of dystrophic coarser textured soils (Fig. 4). In the felling dataset, the effect of DBH on the incidence of stem rot varied significantly among soil associations (DBH × soil association $F_{3,615} = 3.69$, p = 0.012):

 in species associated with high fertility clay and fine loam soil, the probability of rot did not increase with DBH, whereas the probability of rot significantly increased with DBH in all other soil association groups (Fig. S6).

Overall, the amount of variation in the probability of a tree having heart rot that was explained by the fixed effects in our models differed among the data sets, ranging from the lowest marginal pR^2 values of 8,% in the felling data to the highest of 33,% in

- the lowest marginal pR^2 values of 8% in the felling data to the highest of 33% in the coring data (Table S5). The variance explained increased with the inclusion of the species random effect by 12-45% (conditional pR^2 ; Table S5), indicating that species differed in heart rot probability even after accounting for variation due to the fixed effect predictors.
- In variance partitioning analyses, species identity had the highest independent contribution to model variance in all three datasets (Table 4), ranging from 58% in the coring to 73% in the felling datasets. DBH was the second most important variable in all datasets, and had a much larger contribution in the coring relative to the drilling and felling datasets (Table 4). Among soil variables significantly associated with heart rot
- frequency in the drilling and felling datasets, the independent effect of species soil association (12%) was much greater than soil PC2 (6%) in the drilling dataset, whereas the soil association (4%) and soil PC3 (3%) had smaller and more similar independent contributions in the felling dataset.

3.2 Severity of heart rot

For the 57% of felled trees showing heart rot, the percent of stem volume lost to heart rot (severity) averaged 17%, but ranged widely, from 0.1–82%, Genera varied significantly in heart rot severity (Fig. 3b; Genus: $F_{1,7} = 4.43$, p = 0.002). Unlike the probability of rot, heart rot severity did not significantly covary with DBH directly ($F_{1.358} = 0.04$).



p = 0.847), but DBH did influence the severity of rot in a three-way interaction with species wood density and soil association ($F_{3.355} = 3.92$, p = 0.009; Table 3). This effect was driven primarily by soil generalist species, for which the severity of rot decreased with DBH and increased with species wood density relative to the other soil babitat groups (Fig. S7).

habitat groups (Fig. S7),

10

25

Heart rot severity increased with larger values of soil PC3 (Table 3), indicating that, as with frequency, heart rot was more severe on soils with low exchangeable and reserve Ca. Alone, the fixed effects explained a very small proportion of variance in heart rot severity (range of marginal $pR^2 = 0.02-0.11$). A larger proportion of variance was explained when fixed effects were conditioned on the random effect of species identity (range of conditional $pR^2 = 0.18-0.24$; Table S5), suggesting that heart rot severity dif-

fered among species due largely to characteristics not measured in this study, and the majority of overall variation in heart rot severity remained unexplained by the tree and environmental properties measured.

Similar to variance partitioning results for heart rot frequency, species identity was by far the largest independent contributor to model variance in heart rot severity (85%; Table 4). However, soil PC3 (6%) explained slightly more variance than soil association (4%), and no other covariate independently contributed more than 1% of model variance.

20 3.3 Biomass lost to heart rot

Our estimate of the maximum percent of forest stem biomass lost to heart rot, Loss_{max}, ranged substantially among spatial clusters of trees $(0.03-20.9\%)_1$ and a significant proportion of this variation was explained by soil variables. Loss_{max} was significantly correlated with two soil principal component axes, soil PC2 (r = -0.40, P = 0.016) and soil PC3 (r = 0.38, p = 0.022), although the correlation with soil PC3 was strongly influenced by one cluster and was no longer significant without it (r = 0.21, p = 0.113).

Loss_{max} was also marginally associated with soil PC4 (r = -0.31, p = 0.060) (Fig. 5). With respect to specific aspects of soil chemistry, the estimated amount of stem



biomass lost to rot declined with topsoil exchangeable Ca (r = -0.59, p < 0.001) and Mg (r = -0.50, p = 0.002), but there was no relationship between Loss_{max} with topsoil measures of soil pH, reserve P, or exchangeable K (Fig. 6).

4 Discussion

- Our understanding of the ecology of heart rot in tropical forests is limited primarily by the scarcity of both heart rot observations and associated explanatory ecological data. The extensive legacy and recently collected data analysed here allow examination of the influence of tree characteristics and locally-measured edaphic properties on heart rot frequency and severity in taxonomically resolved tropical trees. Our study is the
- first to highlight the importance of edaphic properties, along with tree size and taxonomy, in explaining the frequency and severity of heart rot among trees. Together, these factors generated spatial variation among forest stands in the estimated proportion of biomass lost to heart rot, and this variation was correlated with soil resource availability. Moreover, our finding that 9 % of stem volume is in some stage of wood decay in
- this mixed-dipterocarp forest justifies greater consideration of heart rot in tropical forest biomass estimates, and underscores the need for standardized methods of heart rot detection to be applied across forest types.

4.1 Methodological variation in heart rot detection

While our results affirm previous findings that heart rot infection is frequent and often
 severe in dipterocarp forests (Bakshi, 1960; Bagchee, 1961), regional comparisons are complicated by discrepancies in methods among studies. Heart rot occurred in 50% of drilled, 57% of felled stems > 30 cm DBH, and encompassed 9% of stem volume on average in central Sarawak, which greatly exceeds observed volume losses to heart rot (0.7 4%) reported in neotropical forests (Brown et al., 1995; Clark and Clark, 2000; Noguiera et al., 2006), However, these studies measured only the hollow frac-



tion of stems, whereas our study quantified the volume of wood in any stage of decay visible in the field. Therefore, our methods would inherently generate larger estimates of volume loss. Additionally, approaches that quantify heart rot in decomposing stems, such as stumps cut along access roads (Brown et al., 1995) or in naturally fallen logs

- in coarse woody debris censuses (Clark and Clark, 2000), may quantify rotting that occurs *post mortem* or, conversely, may be biased toward logs that are resistant to decomposition. Noguiera et al. (2006), measured the hollow area in cross-sectional discs of freshly felled stems, but included only five individuals > 80 cm DBH compared to the 100 included in our study. While there is no equivalent measure of heart rot severity
- in the literature, our measure of heart rot frequency via drilling was similar to Eleuterio (2011), which evaluated wood decay in the debris created by plunging a chainsaw into the stem of trees to be logged in the eastern Brazilian Amazon. This study found wood decay in only 30 % of stems > 45 cm DBH for the six most common timber species, providing evidence that heart rot may be more prevalent in Sarawak that other trop
- ical forests. Because of the great number of large stems examined destructively for both heart rot presence and severity, our study presents robust and well-constrained estimates of heart rot frequency and severity compared with others in tropical forest literature to date.

While logging concessions may be opportunistically exploited for detailed evaluation of heart rot, accurate non-destructive measures are needed to estimate heart rot where destructive harvest is impossible. Drilling proved to be an accurate means of scoring trees for heart rot, correctly characterizing heart rot in 80 % of trees. The majority of misclassifications likely occurred because drilling tested for areas of wood softness only at breast height, missing rot occurring higher up in the stem. However, classifi-

cation error diminished to 8 % for stems that had lost more than 10 % of their volume to rot, indicating that drilling at breast height is a reliable means of identifying trees containing large sections of rot. Combined with the under-sampling of very large trees in the felling data, results of felling and drilling analyses require subtly different interpretations, with the felling dataset exploring the controls over heart rot infection overall,



and the drilling dataset exploring the controls over severe heart rot infection. There was no way to validate the accuracy of the coring method; however, the probability of detecting rot was lower at a given stem diameter in the coring dataset relative to the drilling dataset. Assuming that the true dependence of heart rot frequency on DBH

- ⁵ was the same in Lambir and the Central Sarawak sites, then we suspect the drilling method may have been more effective at detecting rot because it was conducted in two perpendicular directions at breast height, whereas trees in the coring dataset were bored only once. Despite inconsistencies among methodologies, inclusion of all three datasets not only allowed assessment of non-destructive methodologies for estimation
- of heart rot, but also improved inference of the controls over heart rot by increasing the size range to include the small and large trees included in the coring drilling datasets, respectively. Sonic tomography has been applied to non-destructively evaluate both the frequency and severity of hollows in tree stems (Nicolotti et al., 2003; Wunder et al., 2013). In the absence of access to this costly equipment, drilling may be a viable, less expensive alternative for assessing the presence of heart rot in remote tropical forests.

expensive alternative for assessing the presence of heart rot in remote tropical forests.

4.2 Controls over heart rot in individual stems

Understanding the environmental and intrinsic tree correlates of heart rot provides a window into the mechanisms that govern heart rot and its implications for forest ecosystem processes. Tree size was the only factor significantly associated with rot in

- all three datasets, and was the only significant predictor in the coring dataset. These findings support previous observations of stark increases in heart rot frequency with diameter in tropical forests (Noguiera et al., 2006; Eleuterio, 2011). It is unclear what role heart rot plays in tree senescence, although rot has been implicated as an important impetus for tree mortality (Franklin et al., 1987). However, given that tree size was
- not a significant predictor of the percent stem volume lost to rot in infected trees, the advancement of stem rot infection may depend less on tree age than on the identity of the pathogen and the physical and chemical properties of the heart wood (Rayner and Boddy, 1983).



Species wood density was not a significant predictor of stem rot frequency or severity in the felling or coring datasets, consistent with findings from an Amazonian forest (Eleuterio, 2011). However, there was a significant interaction between wood density and DBH in the drilling dataset, in which the probability of heart rot increased with wood

- density in smaller trees with the effect levelling off with increasing tree size. This result is somewhat surprising, as high wood density has been associated with pathogen protection in tropical tree species (Augspurger and Kelly, 1984). However, wood density is inversely correlated with mortality and growth rates (King et al., 2006), and so trees with higher wood density may be older than trees of the same size with low wood density,
- and so an increase in heart rot frequency is detected among smaller stems. At large diameters, however, variation in wood density may have little effect on the probability of heart rot, as most trees have likely had enough time to develop rot. The detection of this interaction may have been limited to the drilling dataset because it included more trees > 80 cm DBH than the others. Wood anatomical features related to wood density may also be influential, such as lumps diameter and vascal density which are significantly.
- ⁴⁵ also be influential, such as lumen diameter and vessel density, which are significantly correlated heart rot frequency in Amazonian tree species (Eleuterio, 2011).

Heart rot was significantly more frequent and severe in trees on low fertility soils in central Sarawak, but heart rot frequency did not differ between edaphic habitats in the smaller trees cored at Lambir. Our results do not identify which soil nutrients directly

- ²⁰ correlate with heart rot, but they appear to include Ca and Mg, which have been found to correlate strongly with Bornean species distributions (Baillie et al., 1987) and explained significant variation in fine root growth at Lambir (Kochsiek et al., 2013), This result is initially counter-intuitive, as the forest processes on high fertility sites are generally more dynamic (Coomes and Grubb, 2000), and generate more frequent canopy
- disturbance, causing wounds and opportunities for infection (Boddy and Rayner, 1983). Furthermore, stem tissues under nutrient stress may be more prone to infection, as resources to produce secondary compounds may be limited. Lower nitrogen concentrations in wood and soil may also cause wood-decay fungi on low fertility soils to excavate greater volume of wood to satisfy nutrient requirements (Boddy, 2001). However, vari-



ation among soil habitats in heart rot may also be driven by the change in species composition of the tree community combined with differences among taxa in susceptibility to heart rot. Although our observational datasets cannot definitively distinguish direct and indirect effects of soil fertility, variance partitioning analysis indicated that

- soil properties and tree species soil associations explain similar independent proportions of variance in stem rot frequency and severity in the felling dataset, whereas soil association contributed twice as much to variance compared to soil properties in the drilling dataset. The significant three-way interaction between soil association, DBH, and wood density explaining the severity of heart rot remained difficult to parse, aside
- ⁴⁰ from the indication that the influence of habitat on heart rot is variable across size classes and woods of different properties. The frequency of heart rot differed significantly among soil associations in both the felling and drilling datasets. Because drilling was less effective at detecting heart rot in partially rotted stems, these results may suggest that overall heart rot infection may be more frequent in species associated
- ⁴⁵ with low/intermediate fertility soils and that extensive stem rot is much less likely to be observed in species associated high fertility soils. As with wood density, the fertility effect may be acting as a proxy for tree age, as growth and mortality rates are low on the more dystrophic and drought prone sandstone soils (Russo et al., 2005), and, therefore, may have more frequent heart rot by virtue of longer exposure time
- to stochastic infection risk. Regardless of whether soil-related variation in heart rot is driven by species differences or nutrient availability, it has important implications for spatial variation in biomass in tropical forests,

4.3 Taxonomic variation in heart rot

While tree size, wood density, and edaphic factors were all significantly associated with the heart rot infection, these factors together explained a relatively small fraction of the variance in the frequency of heart rot, and even less for heart rot severity. Variance partitioning indicated that species identity was by far the most important predictor of stem rot frequency and severity, meaning that the occurrence of heart rot had



a strong taxonomic component due to species properties other than wood density and soil association. Some of the taxonomy-related variation in the susceptibility to heart rot may be due to differences in induced and constitutive defences against fungal or insect pathogens (Taylor et al., 2002). When wounding allows exposure to pathogens,

- anatomical modification of xylem in the living sapwood, including compartmentalization, limits the spread of infection (Shigo, 1984), and the extent and effectiveness of this response likely differs among species. Interspecific variation in defense may also occur in the heart wood, which is suffused with secondary metabolites considered inimical to fungal growth. Some dipterocarps are known for copious resin exudation from wounds
- 40 (Mantel et al., 1942), and differ widely in the composition and probably also effectiveness of these compounds (Bisset et al., 1971; Norhayati et al., 2013). The high heart rot frequency and severity among these Bornean species is surprising in this light, and yet their great longevity (Whitmore, 1975) suggests the capacity to tolerate heart rot. Even after accounting for species identity, most variation in heart rot frequency and
- ¹⁵ severity remained unexplained. Heart rot infection may be highly stochastic because it appears to require both wounding and subsequent colonization by fungal spores or insects, which have varying dispersal capacities (Peay and Bruns, 2014) and host requirements (Gilbert et al., 2002). Density-dependent population dynamics caused by the differential susceptibility of tree species to pathogens has been hypothesized to ex-
- ²⁰ plain the relative abundance of tree species in forest communities (Comita et al., 2010; Mangan et al., 2010). This, and the possibility that interactions between host trees and heart rot fungi are neutral or even mutualistic, are topics that merit more investigation in tropical forests.

4.4 Implications of tree level variation for forest biomass

²⁵ When the tree-level influence of heart rot was scaled to the stand-level, we found large spatial variation in the potential ecosystem biomass lost to heart rot in central Sarawak that was partially explained by stem diameter, edaphic variables, and tree species properties. Stems of trees > 30 cm DBH account for ~ 70 % of the standing AGB in mature



mixed-dipterocarp forests (Yamakura et al., 1986), and the trees > 70 cm DBH make up 40% of the AGB in southeast Asian forests (Slik et al., 2013). From these regional estimates of AGB in large stems, we conservatively predict that approximately 7% of woody biomass in the central Sarawak site is in some stage of stem decay. More-

- over, Bornean dipterocarp forests are taller, with more large-diameter trees, thus having larger AGB than many other tropical forests (Yamakura et al., 1986; Slik et al., 2013; Banin et al., 2014). These differences may be reduced by heart rot in mixed-dipterocarp forests, as considerably lower estimates of biomass lost to heart rot have been reported in neotropical forests. The effect of heart rot on standing biomass showed strong spatial
- variation, and was significantly greater for stands growing on less fertile soil. An analysis in a lowland Bornean rainforest found that AGB positively correlated with surface soil nutrient concentrations, including P, K, and Mg, due to the increased stem density of trees > 120 cm DBH on high fertility soils (Paoli et al., 2008). Our results suggest that the discrepancy in AGB between soils low and high fertility may in fact be even larger because large stems on low fertility sites are more likely to contain hollow sections of
- extensive rot.

It is difficult to determine if current methods of biomass estimation adequately account for heart rot in tropical trees. Heart rot is implicitly incorporated into allometric equations used to estimate AGB from forest inventories (e.g., Chave et al., 2005), which

- are empirically derived from datasets likely to include trees with heart rot. However, the largest trees are often under-represented in these datasets. The potential for heart rot-induced underestimation of AGB may be worse for LIDAR-based estimates, depending on how estimates are calibrated with site-specific biomass data. Moreover, the strong variability in biomass loss among edaphic habitats in this study and the possible dis-
- parity in rot losses between the Paleotropics vs. Neotropics indicate that site-specific corrections for heart rot may be needed. Thus, greater consideration of local-scale soil conditions and broader-scale quantification of heart rot using standardized methods are critical to improving the estimation of carbon sequestration in tropical forests.



5 Conclusions

Heart rot is a poorly quantified source of error in aboveground biomass estimation throughout the tropics. Our study of heart rot frequency and severity in mixeddipterocarp forests in Sarawak Borneo, indicates that considerable spatial variation in

biomass losses to heart rot exists at local scales due to soil-related factors, as well as tree and species-level properties. Moreover, comparison with similar studies in other tropical regions suggests that aboveground biomass estimation of Bornean forests, which have been considered to have large carbon sequestration capacity, may be particularly affected by heart rot. Using standardized, nondestructive methods to quantify heart rot across environmental gradients and compare its frequency and severity across tropical regions would help better constrain the contribution of heart rot to error in estimation of carbon stored in tropical forests.

The Supplement related to this article is available online at doi:10.5194/bgd-12-1-2015-supplement.

Acknowledgements. We thank Sarawak Conservator of Forests for permission to use Central Sarawak inventory and soils data and photographs for research, and the Sarawak Forest Department and the Protected Areas and Biodiversity Conservation unit of Sarawak Forestry Corporation for permission to conduct research in Lambir Hills National Park. We are grateful to many colleagues in the FIDP inventory, which was a substantial team effort involving scores of people working for several field seasons in difficult conditions and to Mr. Sylvester Tan and his colleagues at the Lambir National Park for field assistance. We thank also James Dalling for providing insightful comments that improved this manuscript. Data collection at Lambir was funded by the Center for Tropical Forest Science, NSF DUE-0531920, the University of Nebraska – Lincoln (UNL) UCARE undergraduate research program, and the UNL School of
 Biological Sciences.



References

5

10

15

25

- Anderson, J. A. R.: The structure and development of the peat swamps of Sarawak, J. Trop. Geogr., 18, 7–16, 1964.
- Ashton, P. S. and Hall, P.: Comparisons of structure among mixed dipterocarp forests of northwestern Borneo, J. Ecol., 80, 459–481, 1992.
- Augspurger, C. K. and Kelly, C. K.: Pathogen mortality of tropical tree seedlings: experimental studies of the effects of dispersal distance, seedling density, and light conditions, Oecologia, 61, 211–217, 1984.
- Avery, T. E. and Burkhart, H. E. (eds.): Forest Measurements, 5th Edn., McGraw-Hill Book Company, New York, 2001.
- Bagchee, K.: Fungal diseases of sal (*Shores robusta* Gaertn.) IV *Fomes caraphylli* (Rac.) Bres. A destructive heartrot of sal. Indian Forest Records, Mycology, 2, 25–59, 1961.
- Baillie, I. C., Ashton, P. S., Anderson, J. A. R., Fitzpatrick, E. A., and Tinsley, J.: Site characteristics and the distribution of tree species in mixed dipterocarp forest on tertiary sediments in central Sarawak, Malaysia, J. Trop. Ecol., 3, 201–220, 1987.
- Baillie, I. C., Ashton, P. S., Chin, S. P., Davies, S. J., Palmiotto, P. A., Russo, S. E., and Tan, S.: Spatial associations of humus, nutrients and soils in mixed dipterocarp forest at Lambir, Sarawak, Malaysian Borneo, J. Trop. Ecol., 22, 543–553, 2006.

Bakshi, B. K.: Heart rot of Sal in India, Commonw. Phytopathol. News, 6, 45–46, 1960.

Banin, L., Lewis, S. L., Lopez-Gonzalez, G., Baker, T. R., Quesada, C. A., Chao, K.-J., Burslem, D. F., Nilus, R., Abu Salim, K., Keeling, H. C., Tan, S., Davies, S. J., Mendoza, A. M., Vasquez, R., Lloyd, J., Neill, D. A., Pitman, N., and Phillips, O. L.: Tropical forest wood production: a cross-continental comparison, J. Ecol., 102, 1025–1037, 2014.

Bisset, N. G., Chavanel, V., Lantz, J.-P., and Wolff, R. E.: Constituents sesquiterpeniques et triterpeniqes des resins du genre Shorea, Phytochemistry, 10, 2451–2463, 1971.

- Boddy, L.: Fungal community ecology and wood decomposition processes in angiosperms: from standing tree to complete decay of coarse woody debris, Ecol. Bull., 49, 43–56, 2001.
 Boddy, L. and Rayner, A. D. M.: Origins of decay in living deciduous trees: the role of moisture content and a re-appraisal of the expanded ocnept of tree decay, New Phytol., 94, 623–641, 1983.
 - Boddy, L. and Watkinson, S. C.: Wood decomposition, higher fungi, and their role in nutrient redistribution, Can. J. Bot., 73, 1377–1383, 1995.



- Bolker, B. M., Brooks, M. E., Clark, C. J., Geange, S. W., Poulsen, J. R., Stevens, M. H. H., and White, J.-S. S.: Generalized linear mixed models: a practical guide for ecology and evolution, Trends Ecol. Evol., 24, 127–135, 2009.
- Brown, I. F., Martinelli, L. A., Thomas, W. W., Moreira, M. Z., Ferreira, C. C., and Victoria, R. A.:
- ⁵ Uncertainty in the biomass of Amazonian forests: an example from Rondonia, Brazil, Forest Ecol. Manag., 75, 175–189, 1995.
 - Bürgi, A., Rinchen, G. F., and Dorji, T.: Structure, productivity, regeneration and possible utilisation of the Fir (*Abies densa* Griff.) forests in central Chumi Valley, Central Bhutan, Integrated Forest Development Project, Washington, D.C.: World Bank Group, 1992.
- ¹⁰ Burnham, K. P. and Anderson, D. R.: Model Selection and Multimodel Inference: a Practical Information-Theoretic Approach, Springer Science & Business Media, New York, 2002.
- Chave, J., Andalo, C., Brown, S., Cairns, M. A., Chambers, J. Q., Eamus, D., Fölster, H., Fromard, F., Higuchi, N., Kira, T., Lescure, J.-P., Nelson, B. W., Ogawa, H., Puig, H., Riera, B., and Yamakura, T.: Tree allometry and improved estimation of carbon stocks and balance in tropical forests, Oecologia, 145, 87–99, 2005.
- Chin, S. P.: Soil Test Methods, Agriculture Research Centre, Department of Agriculture, Semongok, Kuching, Malaysia, 73 pp., 2002.
 - Clark, D. B. and Clark, D. A.: Landscape-scale variation in forest structure and biomass in a tropical rain forest, Forest Ecol. Manag., 137, 185–198, 2000.
- ²⁰ Cockle, K. L., Martin, K., and Robledo, G.: Linking fungi, trees, and hole-using birds in a Neotropical tree-cavity network: pathways of cavity production and implications for conservation, Forest Ecol. Manag., 264, 210–219, 2012.
 - Comita, L. S., Muller-Landau, H. C., Aguilar, S., and Hubbell, S. P. Asymmetric density dependence shapes species abundances in a tropical tree community, Science, 329, 330–332, 2010.
 - Coomes, D. A. and Grubb, P. J.: Impacts of root competition in forests and woodlands: a theoretical framework and review of experiments, Ecol. Monogr., 70, 171–207, 2000.
 - Davies, S. J., Tan, S., LaFrankie, J. V., and Potts, M. D.: Soil-related floristic variation in a hyperdiverse dipterocarp forest, in: Pollination Ecology and the Rain Forest, Springer, New York, 22–34, 2005.
- 30

25

Edman, M., Möller, R., and Ericson, L.: Effects of enhanced tree growth rate on the decay capacities of three saprotrophic wood-fungi, Forest Ecol. Manag., 232, 12–18, 2006.



Discussion 12, 1-41, 2015 Paper Influence of tree size. taxonomy, and edaphic conditions Discussion Paper on heart rot K. D. Heineman et al. **Title Page** Introduction Abstract **Discussion** Paper Conclusions References Tables **Figures** Close Back Discussion Full Screen / Esc **Printer-friendly Version** Paper Interactive Discussion

BGD



- Eleutério, A. A.: Wood decay in living trees in eastern Amazonia, Brazil, Ph. D. thesis, University of Florida, Gainsville, FL, 2011.
- Feeley, K. J., Davies, S. J., Ashton, P. S., Bunyavejchewin, S., Nur Supardi, M. N., Kassim, A. R., Tan, S., and Chavé, J.: The role of gap phase processes in the biomass dynamics of tropical forest. P. R. Soc. B., 274, 2857-2864, 2007.
- F. A. O.: World reference base for soil resources. World Soil Resources Report 103, Food & Agriculture Organisation of United Nations, Rome, 2006.
- FIDP: An inventory of the Mixed Dipterocarp Forest of Sarawak 1969–1972, Technical Report 2, Forest Industries Development Project, Kuala Lumpur, 1974a.
- FIDP: A description of methodology and techniques used in the inventory of selected areas 10 of Mixed Dipterocarp Forest in Sarawak, Working Paper 24, Forest Industries Development Project, Kuala Lumpur, 1974b.

Franklin, J. F., Shugart, H. H., and Harmon, M. E.: Tree death as an ecological process, Bio-Science, 37, 550-556, 1987.

- 15 Gibbons, P., Cunningham, R. B., and Lindenmayer, D. B.; What factors influence the collapse of trees retained on logged sites?: a case-control study, Forest Ecol. Manag., 255, 62-67, 2008.
 - Gratzer, G., Rai, P. B., and Glatzel, G.: Ecology of Abies densa forests of the IFMP, Integrated Forest Management Plot, Ura, Bhutan, 1997.
- 20 Harmon, M. E., Franklin, J. F., Swanson, F. J., Sollins, P., Gregory, S. V., Lattin, J. D., Anderson, N. H., Cline, S. P., Aumen, N. G., Sedell, J. R., Lienkaemper, G. W., Cromack Jr., K., and Cummins, K. W.: Ecology of coarse woody debris in temperate ecosystems, Adv. Ecol. Res., 15, 133-302, 1986.

Heineman, K. D., Jensen, E., Shapland, A., Bogenrief, B., Tan, S., Rebarber, R., and

- Russo, S. E.: The effects of belowground resources on aboveground allometric growth in 25 Bornean tree species, Forest Ecol. Manag., 261, 1820-1832, 2011.
 - Hooper, R. G.: Longleaf pines used for cavities by red-cockaded woodpeckers, J. Wildlife Manage., 52, 392-398, 1988.

Janzen, D. H.: Tropical blackwater rivers, animals, and mast fruiting by the Dipterocarpaceae,

Biotropica. 6. 69-103. 1974. 30

5

Janzen, D. H.: Why tropical trees have rotten cores, Biotropica, 8, 110–110, 1976.

King, D. A., Davies, S. J., Tan, S., and Noor, N. S.: The role of wood density and stem support costs in the growth and mortality of tropical trees, J. Ecol., 94, 670-680, 2006.

- 29
- Bundesforsch., 109, 117-128, 1975. Paoli, G. D., Curran, L. M., and Zak, D. R.: Soil nutrients and beta diversity in the Bornean Dipterocarpaceae: evidence for niche partitioning by tropical rain forest trees, J. Ecol., 94, 157-170, 2006.
- oils of Shorea acuminata (Dipterocarpaceae), J. Essent. Oil Bear. Pl., 14, 708-716, 2013. Olea, P. P., Mateo-Tomás, P., and De Frutos, A.: Estimating and modelling bias of the hierarchical partitioning public-domain software: implications in environmental management and conservation, PLoS One, 5, e11698, doi:10.1371/journal.pone.0011698, 2010. ²⁵ Panzer, K. F.: Quantification of decay and related volume loss in tropical forest inventories, Mitt.
- 21, 2006. Norhayati, M., Nazlima, N., Nor-Azah, A., Laily, D., Zuraiati, Z., Wan-Ahmad, J., and Noramly, M.: Chemical composition, antioxidant and antibacterial properties of the essential
- Nicolotti, G., Socco, L., Martinis, R., Godio, A., and Sambuelli, L.: Application and comparison of three tomographic techniques for detection of decay in trees. J. Arboricult., 29, 66-78. 2003. Nogueira, E. M., Nelson, B. W., and Fearnside, P. M.: Volume and biomass of trees in central
- 15

299.2008.

20

5

- Ng, F. S. P.: Age of trees in tropical rainforests estimated by timing of wood, J. Trop. For. Sci., 25, 437-441, 2013.
- a tropical forest, Nature, 466, 752-755, 2010. Merrill, W. and Cowling, E. B.: Role of nitrogen in wood deterioration: amounts and distribution of nitrogen in tree stems, Can. J. Bot., 44, 1555-1580, 1966. 10
- Bornean rain forest soils, Plant Ecol., 214, 869-882, 2013. Lee, H. S., Davies, S. J., LaFrankie, J. V., Tan, S., Yamakura, T., Itoh, A., Ohkubo, T., and Ashton, P. S.: Floristic and structural diversity of mixed dipterocarp forest in Lambir Hills National Park, Sarawak, Malaysia, J. Trop. For. Sci., 14, 379–400, 2002.

Kochsiek, A., Tan, S., and Russo, S. E.: Fine root dynamics in relation to nutrients in oligotrophic





12, 1-41, 2015

Peay, K. G. and Bruns, T. D.: Spore dispersal of basidiomycete fungi at the landscape scale is driven by stochastic and deterministic processes and generates variability in plant–fungal interactions, New Phytol., 204, 180–191, 2014.

Potts, M. D., Ashton, P. S., Kaufman, L. S., and Plotkin, J. B.: Habitat patterns in tropical rain forests: a comparison of 105 plots in northwest Borneo, Ecology, 83, 2782–2797, 2002.

forests: a comparison of 105 plots in northwest Borneo, Ecology, 83, 2782–2797, 2002. Putz, F. E., Coley, P. D., Lu, K., Montalvo, A., and Aiello, A.: Uprooting and snapping of trees: structural determinants and ecological consequences, Can. J. Forest Res., 13, 1011–1020, 1983.

Romero, C. and Bolker, B. M.: Effects of stem anatomical and structural traits on responses

- to stem damage: an experimental study in the Bolivian Amazon, Can. J. Forest Res., 38, 611–618, 2008.
 - R Core Team: R: a language and environment for statistical computing, Vienna, Austria, available at: http://www.R-project.org/ (last access: 1 April 2015), 2014.

Russo, S. E., Davies, S. J., King, D. A., and Tan, S.: Soil-related performance variation and distributions of tree species in a Bornean rain forest, J. Ecol., 93, 879–889, 2005.

15

20

Russo, S. E., Brown, P., Tan, S., and Davies, S. J.: Interspecific demographic trade-offs and soilrelated habitat associations of tree species along resource gradients, J. Ecol., 96, 192–203, 2008.

Ruxton, G. D.: Why are so many trees hollow?, Biol. Letters, 10, 20140555, doi:10.1098/rsbl.2014.0555, 2014.

- Saatchi, S. S., Harris, N. L., Brown, S., Lefsky, M., Mitchard, E. T., Salas, W., Zutta, B. R., Buermann, W., Lewis, S. L., Hagen, S., Petrova, S., White, L, Silman, M., and Morel, A: Benchmark map of forest carbon stocks in tropical regions across three continents, P. Natl. Acad. Sci. USA, 108, 9899–9904, 2011.
- ²⁵ Shigo, A. L.: Compartmentalization: a conceptual framework for understanding how trees grow and defend themselves, Annu. Rev. Phytopathol., 22, 189–214, 1984.
 - Slik, J. W. F., Paoli, G., McGuire, K., Amaral, I., Barroso, J., Bastian, M., Blanc, L., Bongers, F., Boundja, P., Clark, C., Collins, M., Dauby, G., Ding, Y., Doucet, J. L., Eler, E., Ferreira, L., Forshed, O., Fredriksson, G., Gillet, J.-F., Harris, D., Leal, M., Laumonier, Y., Malhi, Y.,
- Mansor, A., Martin, E., Miyamoto, K., Araujo-Murakami, A., Nagamasu, H., Nilus, R., Nurtjahya, E., Oliveira, A., Onrizal, O., Parada-Gutierrez, A., Permana, A., Poorter, L., Poulsen, J., Ramirez-Angulo, H., Reitsma, J., Rovero, F., Rozak, A., Sheil, D., Silva-Espejo, J., Silveira, M., Spironelo, W., ter Steege, H., Stevart, T., Navarro-Aguilar, G. E., Sunderland, T.,

| Discussion Pa | BC 12, 1–4 | 3D 1, 2015 |
|------------------|---|--|
| aper Discu | Influence o taxonor edaphic c on hea | of tree size, my, and onditions art rot |
| ssion Paper | K. D. Heine Title | eman et al. Page |
| Discussion Paper | Conclusions Tables | References Figures |
| - Discussion P | Back Full Scre Printer-frien | Close en / Esc dly Version |
| aper | | |

BY

Suzuki, E., Tang, J., Theilade, I., van der Heijden, G., van Valkenburg, J., Van Do, T., Vilanova, E., Vos, V., Wich, S., Wöll, H., Tsuyoshi, Y., Zang, R., Zhang, M.-G., and Zweifel, N.: Large trees drive forest aboveground biomass variation in moist lowland forests across the tropics, Global Ecol. Biogeogr., 22, 1261–1271, 2013.

Stokland, J. N., Siitonen, J., and Jonsson, B. G.: Biodiversity in Dead Wood, Cambridge University Press, New York, 2012.

Swift, M. J.: The estimation of mycelial biomass by determination of the hexosamine content of wood tissue decayed by fungi, Soil Biol. Biochem., 5, 321–332, 1973.

Tan, S., Yamakura, T., Tani, M., Palmiotto, P., Mamit, J. D., Davies, S., Chin, S.-P., Ashton, P. S.,

and Baillie, I.: Review of edaphic conditions on the 52 ha Long Term Ecological Research Plot in mixed dipterocarp forest at Lambir, Sarawak, Malaysian Borneo, Tropics, 18, 61–86, 2009.

Taylor, A. M., Gartner, B. L., and Morrell, J. J.: Heartwood formation and natural durability – a review, Wood Fiber Sci., 34, 587–611, 2002.

¹⁵ Walsh, C. and MacNally, R.: Hier.part: hierarchical partitioning, R package version 1.0-4, available at: http://CRAN.R-project.org/package=hier.part (last access: 1 April 2015), 2013.

Wagener, W. W. and Davidson, R. W.: Heart rots in living trees, Bot. Rev., 20, 61–134, 1954. Whitmore, T. C.: Tropical Rain Forests of the Far East, Clarendon Press, Oxford, 1975.

Wunder, J., Manusch, C., Queloz, V., Brang, P., Ringwald, V., and Bugmann, H.: Does increment coring enhance tree decay? New insights from tomography assessments, Can. J. Forest Res., 43, 711–718, 2013.

20

Yamakura, T., Hagihara, A., Sukardjo, S., and Ogawa, H.: Aboveground biomass of tropical rain forest stands in Indonesian Borneo, Vegetatio, 68, 71–82, 1986.

Yamakura, T., Kanzaki, M., Itoh, A, Okhubo, T., Ogino, K., Chai, E. O. K., Lee, H. S., and Ash-

- ton, P. S.: Forest structure of a tropical rain forest at Lambir, Sarawak, with special reference of its physiognomic dimensions on topography, Tropics, 6, 1–18, 1996.
 - Yu, Q., Yang, D.-Q., Zhang, S. Y., Beaulieu, J., and Duchesne, I.: Genetic variation in decay resistance and its correlation to wood density and growth in white spruce, Can. J. Forest Res., 33, 2177–2183, 2003.
- ³⁰ Zhao, K., Popescu, S., and Nelson, R.: Lidar remote sensing of forest biomass: a scale-invariant estimation approach using airborne lasers, Remote Sens. Environ., 113, 182–196, 2009.



| <mark>P</mark> | е | 1. F | Rang | jes | and | sample | sizes | for | predictor | variables | for | felling, | drilling, | and | coring | data |
|----------------|----|-------------|-------|------|-------|--------|-------|-----|-----------|-----------|-----|----------|-----------|-----|--------|------|
| sets | by | / sp | oecie | s ai | nd tr | ees. | | | | | | | | | | |

| | Fell | ing | Drill | ing | Coring | | |
|------------------------------|-------------|------------|-------------|------------|---------|-------------|--|
| | Species | Trees | Species | Trees | Species | Trees | |
| Soil association | | | | | | | |
| Loam/sandy loam | 7 | 66 | 7 | 54 | 9 | 90 | |
| Fine loam/loam | 15 | 260 | 11 | 284 | 3 | 31 | |
| Clay/fine loam | 13 | 206 | 12 | 196 | 6 | 61 | |
| Generalist | 7 | 129 | 7 | 82 | 4 | 38 | |
| DBH (cm) | - | 27.5–105.8 | - | 26.2–157.3 | - | 1.3-89.0 | |
| Wood density ($g cm^{-3}$) | 0.450-1.120 | _ | 0.530-0.940 | - | - | 0.204-1.020 | |
| Soil type | | | | | | | |
| Sandy loam | - | - | - | - | 17 | 140 | |
| Clay/fine loam | _ | - | - | - | 12 | 80 | |
| Total | 42 | 661 | 37 | 616 | 22 | 220 | |



T 2. Type III tests of generalized linear mixed model fixed effects for associations of the probability of heart rot in trees of mixed dipterocarp rain forest, Central Sarawak, Borneo, in the drilling and felling datasets. If they are not listed in the table, then two- or three-way interactions were not statistically significant.

| Predictor variable | Dataset | Num. df | Den. df | F value | P value |
|----------------------------|----------|---------|---------|---------|---------|
| Model 1 | Drilling | | | | |
| DBH | | 1 | 572 | 8.34 | 0.004 |
| Species wood density | | 1 | 572 | 2.17 | 0.142 |
| Soil PC1 | | 1 | 572 | 1.22 | 0.269 |
| Soil PC2 | | 1 | 572 | 10.49 | 0.001 |
| Soil PC3 | | 1 | 572 | 2.57 | 0.11 |
| Soil PC4 | | 1 | 572 | 0.99 | 0.321 |
| DBH × Species wood density | | 1 | 572 | 4.05 | 0.045 |
| Model 2 | Drilling | | | | |
| DBH | | 1 | 576 | 7.94 | 0.005 |
| Species wood density | | 1 | 576 | 4.08 | 0.081 |
| Soil association | | 3 | 576 | 3.05 | 0.007 |
| DBH × Species wood density | | 1 | 576 | 3.82 | 0.051 |
| Model 1 | Felling | | | | |
| DBH | • | 1 | 614 | 31.09 | < 0.001 |
| Species wood density | | 1 | 614 | 0.06 | 0.81 |
| Soil PC1 | | 1 | 614 | 0.1 | 0.751 |
| Soil PC2 | | 1 | 614 | 1.05 | 0.307 |
| Soil PC3 | | 1 | 614 | 6.32 | 0.012 |
| Soil PC4 | | 1 | 614 | 0.16 | 0.687 |
| Model 2 | Felling | | | | |
| DBH | | 1 | 615 | 28.12 | < 0.001 |
| Species wood density | | 1 | 615 | 0.4 | 0.526 |
| Soil association | | 3 | 615 | 1.81 | 0.144 |
| DBH × Soil association | | 3 | 615 | 3.69 | 0.012 |

Discussion Paper BGD 12, 1-41, 2015 Influence of tree size, taxonomy, and edaphic conditions **Discussion** Paper on heart rot K. D. Heineman et al. Title Page Introduction Abstract **Discussion Paper** Conclusions References Tables Figures Back Close **Discussion** Paper Full Screen / Esc **Printer-friendly Version** Interactive Discussion

Tat Type III tests of LMM fixed effects for associations of heart rot severity in the Central Salawak felling dataset. If they are not listed in the table, then two- or three-way interactions were not statistically significant.

| Predictor variable | Num. df | Den. df | F value | Prob. |
|---------------------------------------|---------|---------|---------|-------|
| Model 1 | | | | |
| DBH | 1 | 364 | 0.54 | 0.461 |
| Species wood density | 1 | 29.2 | 0.02 | 0.901 |
| Soil PC1 | 1 | 363 | 0.01 | 0.941 |
| Soil PC2 | 1 | 363 | 0.78 | 0.378 |
| Soil PC3 | 1 | 363 | 7.45 | 0.06 |
| Soil PC4 | 1 | 363 | 0.44 | 0.509 |
| Model 2 | | | | |
| DBH | 1 | 358 | 0.4 | 0.847 |
| Species wood density | 1 | 274 | 0.04 | 0.843 |
| Soil association | 3 | 250 | 2.70 | 0.046 |
| DBH × Wood density | 1 | 360 | 0.18 | 0.672 |
| DBH × Soil association | 3 | 357 | 3.93 | 0.009 |
| Wood density × Soil association | 3 | 246 | 2.55 | 0.056 |
| DBH × Wood density × Soil association | 3 | 355 | 3.92 | 0.009 |

| Discussion Pap | BC 12, 1–4 | GD 1, 2015 | | | | |
|-----------------------|----------------------|----------------------|--|--|--|--|
| θŗ | Influence o | of tree size, | | | | |
| — | taxonoi | my, and | | | | |
| ⊡. | edaphic c | art rot | | | | |
| SCU | On ne | | | | | |
| SSic | K. D. Heine | eman et al. | | | | |
| л Р | | | | | | |
| aper | Title | e Page | | | | |
| — | Abstract | Introduction | | | | |
| Dis | Conclusions | References | | | | |
| SUC | Tables | Figures | | | | |
| sion | | | | | | |
| Pa | 14 | ►I | | | | |
| per | • | | | | | |
| — | Back | Close | | | | |
| Discu | Full Scre | een / Esc | | | | |
| Jssion | Printer-frier | ndly Version | | | | |
| Pa | Interactive | Discussion | | | | |
| per | | O BY | | | | |

Table 4. The percent independent contribution of taxonomic, tree, species, and soil covariates to variance explained in heart rot frequency and severity. Variance partitioning of the covariates of heart rot frequency was conducted separately for the drilling, felling, and coring datasets.

| | Heart | Rot Fre | equency | |
|------------------|----------------------------|----------------------------|--------------------|----------------------------|
| | Drill | Fell | Core | Heart Rot Severity |
| Species | 63.1 | 72.5 | 58.0 | 85.8 |
| DBH | 14.7 | 18.6 | 39.4 | 0.9 |
| Wood Density | 0.9^a | 0.0^a | 1.1 ^b | 1.1^a |
| Soil Association | 12.0 | 4.3 | 0.9 | 4.4 |
| Soil PC1 | 1.0 | 0.1 | - | 1.0 |
| Soil PC2 | 5.7 | 0.8 | - | 0.2 |
| Soil PC3 | 2.0 | 3.1 | - | 6.2 |
| Soil PC4 | 0.5 | 0.5 | - | 0.3 |
| Soil Type | - | - | 0.7 | - |

^a Species wood density.

^b Individual tree wood density.





re 1. Location of study sites in Sarawak, Malaysian Borneo. Shaded areas are the Central Sarawak inventory units for heart rot felling and drilling data, with clusters of plots indicated by black dots. The black rectangle indicates the location of the Lambir Hills National park study site for the heart rot coring data.







Discussion Paper **BGD** 12, 1-41, 2015 Influence of tree size, taxonomy, and edaphic conditions **Discussion** Paper on heart rot K. D. Heineman et al. **Title Page** Introduction Abstract **Discussion** Paper Conclusions References Tables Figures Back Close **Discussion** Paper Full Screen / Esc **Printer-friendly Version** Interactive Discussion

Figure 2. Variation in the frequency of heart rot found in trees in mixed dipterocarp rain forest of Central Sarawak, Borneo. Pie charts show the percentage of individuals with heart rot (shaded), with pies sized according to the total number of sampled stems (n), in each DBH size class and dataset.



Discussion Paper **BGD** 12, 1-41, 2015 Influence of tree size. taxonomy, and edaphic conditions **Discussion** Paper on heart rot K. D. Heineman et al. **Title Page** Introduction Abstract **Discussion Paper** Conclusions References Tables **Figures** Close Back **Discussion** Paper Full Screen / Esc **Printer-friendly Version** Interactive Discussion

Fi 23. Variation in the frequency and severity of heart rot among important dipterocarp genera in rain forest of Central Sarawak, Borneo, based on the felling data. Local names for genera are in parentheses. Mean diameter at breast height (DBH; cm) is below, and mean stem length (m) is to the left, with cylinders sized accordingly. The shaded portions represent frequency, the percent of felled trees with heart rot, listed to the right in (a), and severity, the mean percent volume lost to heart rot, listed to the right in (b).











Figure 5. The relationship between the percent stand biomass lost to heart rot (Loss_{max}) among trees sampled in a cluster and mean values of the first four soil principle component (PC) axes for 36 tree clusters containing at least 10 trees > 30 cm DBH. The Pearson correlation coefficient (*r*) and associated probability of each relationship is in its respective panel. Soil concentrations are expressed in units of milliequivalents per 100 g of soil (me%), parts per million (ppm), or percent dry weight (%).





Figure 6. The relationship between the percent stem biomass lost to heart rot ($Loss_{max}$) among trees sampled in a cluster ($Loss_{max}$) and mean soil chemical properties for 36 tree clusters containing at least 10 trees > 30 cm DBH. The Pearson correlation coefficient (*r*) and associated probability of each relationship is in its respective panel. Soil concentrations are expressed in units of milliequivalents per 100 g of soil (me%), parts per million (ppm), or percent dry weight (%).