

# G OPEN ACCESS

**Citation:** Kong S-R, Yamamoto M, Shaari H, Hayashi R, Seki O, Mohd Tahir N, et al. (2021) The significance of pyrogenic polycyclic aromatic hydrocarbons in Borneo peat core for the reconstruction of fire history. PLoS ONE 16(9): e0256853. https://doi.org/10.1371/journal. pone.0256853

**Editor:** Fung-Chi Ko, National Dong Hwa University, TAIWAN

Received: November 13, 2020

Accepted: August 18, 2021

Published: September 8, 2021

**Copyright:** © 2021 Kong et al. This is an open access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Data Availability Statement: All relevant data are within the manuscript and its Supporting Information files.

**Funding:** This work was funded by the Fundamental Research Grant Scheme (UMT/RMIC/ FRGS/2/14/59356) from Universiti Malaysia Terengganu (UMT) and a grant from Japan Society for the Promotion of Science (nos. 15H05210 and JPMXS05R2900001 to MY). The funders had no role in study design, data collection and analysis, RESEARCH ARTICLE

# The significance of pyrogenic polycyclic aromatic hydrocarbons in Borneo peat core for the reconstruction of fire history

Sher-Rine Kong<sup>1,2\*</sup>, Masanobu Yamamoto<sup>2,3\*</sup>, Hasrizal Shaari<sup>1\*</sup>, Ryoma Hayashi<sup>4</sup>, Osamu Seki<sup>2,5°</sup>, Norhayati Mohd Tahir<sup>6‡</sup>, Muhammad Fais Fadzil<sup>6‡</sup>, Abdullah Sulaiman<sup>7°</sup>

 Faculty of Science and Marine Environment, Universiti Malaysia Terengganu, Kuala Terengganu, Malaysia, 2 Faculty of Environmental Earth Science, Hokkaido University, Sapporo, Japan, 3 Graduate School of Environmental Earth Science, Hokkaido University, Sapporo, Japan, 4 Lake Biwa Museum, Kusatsu, Japan, 5 Institute of Low Temperature Science, Hokkaido University, Sapporo, Japan, 6 Institute of Oceanography and Environment, Universiti Malaysia Terengganu, Kuala Terengganu, Malaysia, 7 Department of Mineral and Geoscience, Kedah, Kuala Terengganu, Malaysia

• These authors contributed equally to this work.

<sup>‡</sup> These authors also contributed equally to this work

\* riz@umt.edu.my (HS); kong.sher.rine@gmail.com (SRK); myama@ees.hokudai.ac.jp (MY)

# Abstract

The reconstruction of fire history is essential to understand the palaeoclimate and human history. Polycyclic aromatic hydrocarbons (PAHs) have been extensively used as a fire marker. In this work, the distribution of PAHs in Borneo peat archives was investigated to understand how PAHs reflect the palaeo-fire activity. In total, 52 peat samples were analysed from a Borneo peat core for the PAH analysis. Pyrogenic PAHs consist of 2–7 aromatic rings, some of which have methyl and ethyl groups. The results reveal that the concentration of pyrogenic PAHs fluctuated with the core depth. Compared to low-molecular-weight (LMW) PAHs, the high-molecular-weight (HMW) PAHs had a more similar depth variation to the charcoal abundance. This finding also suggests that the HMW PAHs were mainly formed at a local fire near the study area, while the LMW PAHs could be transported from remote locations.

# Introduction

Polycyclic aromatic hydrocarbons (PAHs) are commonly found in the atmosphere, marine, and terrestrial areas, including peats, sediments, ancient sedimentary rocks, and petroleum [1-4]. The parent PAHs (PAH molecules with no alkyl substitutes) and some alkylated PAHs are produced from the incomplete combustion of organic matter in the environment [5-7], while alkylated PAHs are formed mainly from the sedimentary organic matter in sedimentary rocks and petroleum during thermal maturation [8] and petrogenic [9] processes.

The reconstruction of past fire events is critical to understand the carbon cycle, climatic regime [10, 11], fire source [12], and vegetation change [13]. The records of PAHs in sedimentary archives have been used as tracers for past fire events [14]. The chemical composition of

decision to publish, or preparation of the manuscript.

**Competing interests:** The authors have declared that no competing interests exist.

pyrogenic PAHs is generally varied and depends on their sources (combustion materials) such as grass and fossil fuels [15, 16] and combustion temperature [17, 18]. PAHs can be long-range transported as aerosols in the atmosphere [19]. Low-molecular-weight PAHs are more volatile and water-soluble than high-molecular-weight PAHs [20, 21]. Therefore, the chemical composition of the PAHs in sedimentary archives can offer useful information on the material source, combustion temperature, and transportation process [22, 23]. However, the way of interpretation of PAH compositions is not established in the practical use of reconstruction of fire events in sedimentary (peat) archives.

Generally, many factors can affect the concentration and composition of PAHs, and most factors are complex to analyse in modern samples because there are contributions of additional anthropogenic sources such as petroleum-derived PAHs and the combustion of fossil fuels. Thus, the chemical composition of PAHs should be investigated and analysed in a simple environmental setting to understand the contributing factors that determine the characteristics of PAHs.

In this paper, we investigated the PAHs in the peat samples obtained from the summit of the Baram peat dome in northern Borneo. The Baram peatland was covered with natural vegetation until the end of the 20<sup>th</sup> century, and human activity was minimal in the peat dome. By comparing with the charcoal abundance record [24], we also discussed the factors that controlled the PAH distribution.

Borneo is an island within the Western Pacific Warm Pool (WPWP) with a tropical climate and high year-round temperature and precipitation. The precipitation is influenced by both the East Asian Winter Monsoon (EAWM) and El Niño-Southern Oscillation (ENSO). Today, the ENSO regulates the frequency of forest fires in Borneo [25]. In El Niño years, the frequency of forest fires is significantly high due to low precipitation (<100 mm per month in dry seasons) and dry environments [25–27]. The monthly precipitation reduction by >80 mm during August-October significantly increased the fire activity in southern Borneo in El Niño years during 1997–2015 (Fig 1D) [27]. Thus, fire history provides a precipitation record in Borneo [24], which is influenced by the EAWM and ENSO.

# Samples and methods

#### Study cores

The peat cores were retrieved from three holes at the Tinbarap site near Marudi Town, Sarawak, Malaysia (N 04°03'01.47" E 114°15'02.45", Fig 1). The permit for collection of Tinbarap peat core was required and obtained from the Sarawak Forestry Corporation and the Sarawak Biodiversity Centre. Hole 8 was drilled using a Russian peat sampler, whereas Holes 9 and 10 were drilled using a thin-wall sampler (Fig 2). Holes 8, 9, and 10 were drilled at about the same point. Each hole was located far from the other hole within one meter. The peats are thus correlative based on the depth. The site was located at the summit of the Baram peat dome [28]. Anderson [29] described six phasic vegetation communities that formed between the marginal and central areas of the peat dome: mixed swamp forest, Alan Forest, Alan Bunga Forest, Padang Alan (Padang Medang), Padang Paya, and Padang Keruntum. The Padang Paya and Padang Keruntum communities were reported as the most significant biodiversity-ecosystems, which can only be found between the midst of the Baram dome to the upriver of Marudi [30]. The Baram peat dome started to develop more than 5,300 years ago. There were approximately 18,920 ha of undisturbed peatlands. The natural vegetation at the study site was oligotrophic low trees [29] and recently cleared by the development of oil palm plantation [30]. The core sediments consist of weathered peat (0-0.4 m), brown to dark brown peat (0.4-9.5 m), and dark grey mud (9.5–9.8 m). The peat contained undecomposed roots and fragments of woods,



**Fig 1. Map of the studied site of Borneo tropical peatland.** A peat core was collected at the Tinbarap site (N 04° 03'01.47" E 114°15'02.45"), which was marked as ☆. A previous study was conducted by Anderson [29] (marked by →) on the vegetation composition of the Borneo peat dome. The map was made using QG is software (version 3.6.2).

https://doi.org/10.1371/journal.pone.0256853.g001

leaves, and charcoals. Microscopic observation showed that plant tissues are not degraded throughout the holes of the site. This suggests that the preservation of organic matter was unchanged remarkably. Charcoals can be found throughout the entire hole, and the charcoal abundance markedly varied every approximately 2 metres.

Eight samples from Holes 9 and 10 were dated at the Tinbarap site (S8 Fig in S1 File). The remains of leaves in the peats were picked out and prepared using the acid-alkali-acid (AAA) treatment [31]. The samples were combusted with CuO at 850°C for 3 hours in a sealed quartz glass tube to produce CO<sub>2</sub>, which was then purified in liquid N<sub>2</sub> and EtOH-liquid N<sub>2</sub> traps [32]. The purified CO<sub>2</sub> was reduced to graphite with an iron powder catalyst. The graphite was analysed at the accelerator mass spectrometry facility at the Museum of the University of Tokyo. Conventional ages were converted to calendar ages using the OxCal program (version 4.4) [33] and the IntCal20 dataset [34]. The age of the bottom peat layer was 5,321 years BP. The average sedimentation rate was ~0.17 cm year<sup>-1</sup>. The age of the core-top sample was obtained by extrapolation of the age-depth relationship for the first and second top dates.



**Fig 2. The lithology of Borneo peat core with a total length of 10 m.** The selected intervals for analysis are indicated by black triangles (4), and charcoals were measured in every 2 cm-interval, indicated by dash lines (-). The difference between brown and dark brown colours is gradual and not significant.

# Lipid extraction and fractionation

The samples were freeze-dried and homogenised. The PAHs were extracted and fractionated according to the following method. Approximately 1 g of sample was extracted thrice with 100 mL of dichloromethane/methanol (3:1 v/v) for 45 minutes using an ultrasonic agitation approach. The extract was condensed to 3 mL and saponified by adding 1 mL of 6% potassium hydroxide in methanol-water (4:1) and 1 mL of clean Mili-Q water. The extract was heated at 80 °C in a water bath for an hour. The saponified lipid was extracted with *n*-hexane three times before it was fractionated by column chromatography with silica gel. Before usage, the silica gel was heated at 200 °C for 4 hours and cleaned Mili-Q water was added (5% weight of silica gel). The column consisted of 12 mL of slurry silica gel (Gel 60 40–60  $\mu$ m mesh) with a little sodium sulfate powder added to the top. The lipid was separated into three fractions: *n*-hexane (1:1 v/v) 8 mL (*n*-alkane); *n*-hexane/dichloromethane (9:1, v/v) 8 mL; *n*-hexane/dichloromethane (1:1, v/v) 7 mL (PAH) and dichloromethane/methanol (9:1, v/v) (sterol). The *n*-hexane/dichloromethane (1:1, v/v) fractions were combined and analysed using a gas chromatography-mass spectrometer (GC-MS).

#### **PAH** analysis

PAHs were measured using a GC-MS (Shimadzu-QP2010 Ultra) fitted with a DB-5MS fused silica capillary column (30.0 m length x 0.25 mm i.d; 0.25  $\mu$ m film thickness). The mass spectrometer was operated at a full scan in the electron impact mode (70 eV) with a mass range of m/z 45–600 at a scan speed of 1.25 s. Helium (>99.9% purity) was used as a carrier gas with a constant pressure of 67.0 kPa. The splitless injector, ion source, and interface temperatures were set at 300°C, 200°C, and 300°C, respectively. The column temperature was programmed as follows: Hold for 1 min at 50°C; apply a temperature ramp from 50 to 300°C at 5°C/min; maintain at 300°C for 20 minutes. This process resulted in a total run time of 74 minutes.

As listed in Tables 1 and 2, the PAH compounds were identified by comparing their mass spectra and retention times with those of available compounds in the standard. Those compounds (Table 1) that are available in the standard were obtained from Supleco, USA and dissolved with dichloromethane/hexane solvent mixture. To measure the reproducibility of the analysis, the signal-to-noise (S/N) ratio for each available compounds were measured by integrating the signal of the compound to the noise approximately 1 minute before and after of the compound peak area appeared in the mass chromatogram and multiply the signal by 3. Table 3 shows the detection limit and reproducibility of the available compounds in the standard. The unavailable alkylated compounds were identified by comparing the mass spectra and retention times in Mita and Shimoyama [35], Marynowski et al. [36], Mita [37], Romero-Sarmiento et al. [38], and Romero-Sarmiento et al. [39].

Quantification was done by the comparison between samples and a standard mixture in different runs. The concentration of the PAH compound (Eq 1) was calculated according to the peak area of the compound, response factor, and sample weight as follows:

Concentration in 
$$\mu g/g$$
 = Response factor x Peak area of sample x  $\frac{\left(\frac{\text{Final fraction volume}}{\text{Injection volume}}\right)}{\text{Sample weight (g)}}$  (1)

The response factor was obtained by the analysis of known amounts of the PAH mixture (Table 1). The unavailable compounds were assumed to have identical response factors to the compounds with a similar molecular weight because the response factor strongly depends on the molecular weight (Table 2).

Peak	Compounds	Code	Molecular weight (m/z)	Response factor
1	Naphthalene	Naph	128	9.73E-06
2	Fluorene	Flu	166	1.86E-05
3	Phenanthrene	Phe	178	1.30E-05
4	Anthracene	Ant	178	1.37E-05
5	Fluoranthene	Fla	202	1.57E-05
6	Pyrene	Ру	202	1.54E-05
7	Benzo[a]anthracene	BaA	228	3.57E-05
8	Chrysene	Chr	228	3.17E-05
9	Retene	Ret	234	1.01E-04
10	Perylene	Per	252	7.24E-05
11	Indeno[1,2,3-c,d]pyrene	IPy	276	1.93E-04
12	Benzo[g,h,i]perylene	BPer	276	1.29E-04
13	Dibenzo[a,h]anthracene	DiA	278	3.72E-04

Table 1. Measured polycyclic aromatic hydrocarbons (PAHs) identified based on the authentic reference compounds.

https://doi.org/10.1371/journal.pone.0256853.t001

#### Principal component analysis

A principal component analysis (PCA) was performed for the dataset of PAH concentrations using a PRIMER-E (PRIMER 6 version 6.1.12) software. The PAH concentration was normalised based on the mean and standard deviation and converted to the z-score before the PCA was performed [40].

# Results

In total, 61 individual compounds, including parent and alkylated compounds, were identified in Tinbarap peat samples (Tables 1 and 2 and Fig 3). Their chemical structures are shown in S1 Appendix in S1 File. The identified PAHs ranged from two (naphthalene) to seven (coronene) condensed aromatic rings: naphthalene (m/z 128), fluorene (m/z 166), phenanthrene (m/z 178), anthracene (m/z 178), fluoranthene (m/z 202), pyrene (m/z 202), benzo[a]anthracene (m/z 228), chrysene (m/z 228), indeno[1,2,3-c,d]pyrene (m/z 276), benzo[g,h,i]perylene (m/z 276), dibenzo[a,h]anthracene (m/z 278), and coronene (m/z 300). Our careful investigation of ion chromatograms indicates that there were alkylated homologs (Fig 4) in naphthalene, phenanthrene, pyrene, and chrysene structures, but they were absent in fluorene, fluoranthene, benzo[a]anthracene, indeno[1,2,3-c,d]pyrene, benzo[g,h,i]pyrene, perylene, dibenzo[a,h]anthracene, and coronene. Among these compounds, retene (m/z 234), perylene (m/z 252), cadalene (m/z 198), and simonellite (m/z 237) (Fig 5) are generally interpreted as "diagenetic" compounds [41-44]. Other compounds are considered the PAHs of pyrogenic origin [15, 45, 46]. Major pyrogenic PAHs are naphthalene, fluorene, phenanthrene, anthracene, fluoranthene, pyrene, benzo[a]anthracene, chrysene, retene, perylene, indeno-[1,2,3-c,d] pyrene, and dibenzo[a,h]anthracene (S1 Fig in S1 File).

Retene, perylene, cadalene, and simonellite are generally considered as "diagenetic" compounds. The concentrations of "diagenetic" compounds were 0.04–67.33  $\mu$ g/g with an average of 13.25  $\mu$ g/g (Fig 5). Perylene was the most abundant compound among the "diagenetic" compounds. The relative abundance of perylene to the total PAHs markedly increased with increasing core depth (Fig 5). Other "diagenetic" compounds show a cyclic variation.

The total concentrations of "pyrogenic" compounds in the Tinbarap peat core significantly fluctuated in the range of 0.17–30.55  $\mu$ g/g with an average of 7.19  $\mu$ g/g (Fig 6). The variation in

Peak	Compounds	Code	Molecular weight (m/z)	Response factor
14	2-Methylnaphthalene	2-MN	142	9.73E-06
15	1-Methylnaphthalene	1-MN	142	9.73E-06
16	Biphenyl	Bip	154	9.73E-06
17	1,3-Dimethylnaphthalene	1,3-DMN	156	9.73E-06
18	1,6-Dimethylnaphthalene	1,6-DMN	156	9.73E-06
19	1,4- + 2,3-Dimethylnaphthalene	1,4- + 2,3-DMN	156	9.73E-06
20	1,5-Dimethylnaphthalene	1,5-DMN	156	9.73E-06
21	1,2-Dimethylnaphthalene	1,2-DMN	156	9.73E-06
22	1,8-Dimethylnaphthalene	1,8-DMN	156	9.73E-06
23	2,6 + 2,7-Dimethylnaphthalene	2,6- + 2,7-DMN	157	9.73E-06
24	2-Methylbiphenyl	2-MBip	168	9.73E-06
25	Diphenylmethane	DMe	168	9.73E-06
26	3- + 4-Methylbiphenyl	3- + 4-MBip	168	9.73E-06
27	1,3,7-Trimethylnaphthalene	1,3,7-TMN	170	9.73E-06
28	1,3,6-Trimethylnaphthalene	1,3,6-TMN	170	9.73E-06
29	1,4,6- + 1,3,5-Trimethylnaphthalene	1,4,6- + 1,3,5-TMN	170	9.73E-06
30	2,3,6-Trimethylnaphthalene	2,3,6-TMN	170	9.73E-06
31	1,2,7-Trimethylnaphthalene	1,2,7-TMN	170	9.73E-06
32	1,6,7-Trimethylnaphthalene	1,6,7-TMN	170	9.73E-06
33	1,2,6-Trimethylnaphthalene	1,2,6-TMN	170	9.73E-06
34	1,2,4-Trimethylnaphthalene	1,2,4-TMN	170	9.73E-06
35	1,2,5-Trimethylnaphthalene	1,2,5-TMN	170	9.73E-06
36	1,4,5-Trimethylnaphthalene	1,4,5-TMN	170	9.73E-06
37	2-Butylnaphthalene	2-BN	170	9.73E-06
38	Tetramethylnaphthalene	TeMN	184	9.73E-06
39	3-Methylphenanthrene	3-MP	192	1.30E-05
40	2-Methylphenanthrene	2-MP	192	1.30E-05
41	2-Methylanthracene	2-MA	192	1.37E-05
42	4- + 9-Methylphenanthrene	4-+9-MP	192	1.30E-05
43	1-Methylphenanthrene	1-MP	192	1.30E-05
44	Cadalene	Cad	192	9.73E-06
45	3-Ethylphenanthrene	3-EP	206	1.30E-05
46	2- + 9-Ethylphenanthrene	2- + 9-EP	200	1.30E-05
47	1-Ethylphenanthrene	1-EP	200	1.30E-05
48	3,5- + 2,6-Dimethylphenanthrene	3,5- + 2,6-DMP	206	1.30E-05
49	2,6- + 2,7-Dimethylphenanthrene	2,6- + 2,7-DMP	200	1.30E-05
50	1,3- + 2,10- + 3,9- + 3,10-Dimethylphenanthrene	1,3-+2,10-+3,9-+3,10-DMP	206	1.30E-05
51	1,5- + 2,10- + 3,5- + 3,10-Dimetrylphenanthrene	1,5- + 2,10- + 3,9- + 3,10-DMP	208	1.30E-05
51	1,7-Dimethylphenanthrene	1,6- + 2,9- + 2,5-DMP 1,7-DMP	206	1.30E-05
52	2,3- + 1,9-Dimethylphenanthrene	2,3- + 1,9-DMP	206	1.30E-05
				1
54	1,8-Dimethylphenanthrene         1,2,3-Trimethyl-4-propenylnaphthalene	1,8-DMP	206	1.30E-05
55		1,2,3-TMPN	210	9.73E-06
56	2-Methylpyrene	2-MPy	216	1.54E-05
57	4-Methylpyrene	4-MPy	216	1.54E-05
58	1-Methylpyrene	1-MPy	216	1.54E-05
59	Simonellite	Sim	237	1.37E-05
60	Methylchrysene	MChr	242	3.17E-05

 Table 2. List of the measured polycyclic aromatic hydrocarbons (PAHs) identified based on the retention times and mass spectra published by Mita and Shimoyama

 [35], Marynowski et al. [36], Mita [37], Romero-Sarmiento et al. [38], and Romero-Sarmiento et al. [39].

Compounds	Detection limit (µg/g)	Standard deviation	
Naphthalene	1.76	3.96E-01	
Fluorene	1.66	3.34E-01	
Phenanthrene	11.93	3.86E+00	
Anthracene	3.39	7.34E-01	
Fluoranthene	5.72	1.40E+00	
Pyrene	4.53	1.08E+00	
Benzo[a]anthracene	3.42	1.49E+00	
Chrysene	15.22	9.30E+00	
Retene	1.12	7.01E-01	
Perylene	2.52	1.07E+00	
Indeno[1,2,3-cd]pyrene	0.75	1.89E-01	
Benzo[g,h,i]perylene	1.40	3.62E-01	
Dibenzo[a,h]anthracene	1.37	7.12E-01	

Table 3. The detection limits and reproducibility (standard deviation) of the available PAHs in the standard.

https://doi.org/10.1371/journal.pone.0256853.t003

the total concentration of alkylated PAHs mirrors the total concentration of "pyrogenic" PAHs (Fig 6). Depth variations in all "pyrogenic" PAHs are shown in S1 Fig in S1 File.

The PCA analysis (Figs 7 and 8) extracts two major factors that determine the concentrations of "pyrogenic" PAHs; PC 1 (65.0% of the total variance) and PC 2 (7.5% of the total variance). PC 1 explained the synchronous variations of pyrogenic PAHs, which implies that the variation of all pyrogenic PAHs was identical to the first-order approximation. PC 2 explained the difference in depth distributions between high- and low-molecular-weight PAHs. Methylated and ethylated PAHs were accompanied by their parent molecules.

# Discussion

## Diagenetic formation of perylene

Perylene was found to be a major PAH in Tinbarap peat samples. The relative abundance of perylene in total PAHs markedly increased with increasing depth (Fig 5). Perylene is assumed to be formed from the biological pigment 4,9-dihydroxiperylene-3,10-quinone, biosynthesised by fungi, insects, and marine organisms that formed by the reduction in anaerobic sediments [18, 47–49], soils [47, 50, 51], and termite nests [52]. The downward-increasing trend of perylene abundance in the Tinbarap peat core can be attributed to the diagenetic formation of perylene with increasing burial depth.

## Molecular weight of pyrogenic PAHs

The difference in depth variation between compounds with 2–3 ring (LMW) and those with 5–6 ring (HMW) (Fig 9) suggests that the pyrogenic PAHs in Tinbarap peat core has two different groups, indicated by the PC 2 variation (Fig 8). McGrath et al. [53] showed that LMW PAHs (fluorene, phenanthrene, and anthracene) were usually generated in a broader temperature range than HMW PAHs (indeno[1,2,3-c,d]pyrene, dibenzo[a,h]anthracene, and benzo[g, h,i]perylene) by the pyrolysis of cellulose. Thus, the difference in pyrolysis temperature can affect the variation of PAHs in the peat archives.

Alternatively, the difference in transportation among PAHs can affect the change in PAH composition in the peat archives. The LMW PAHs are more volatile than HMW PAHs [20, 54]. In comparison to LMW PAHs, the depth variation of HMW PAHs was more similar to the variation of charcoal abundance (Fig 9). The HMW PAHs variation show a statistically significant



Fig 3. Total ion chromatogram (TIC) and the mass chromatograms of the molecular ions of the PAHs in sample Hole 8, 361–366 cm. The numbered spectral peaks are the compounds listed in Tables 1 and 2.

https://doi.org/10.1371/journal.pone.0256853.g003

correlation with charcoal abundance (r = 0.40 and p = 0.006 for both >125  $\mu$ m and 250  $\mu$ m charcoal fractions). In contrast, LMW PAH variation show a much lower correlation with charcoal abundance (r = 0.15 and 0.13; p = 0.30 and 0.40 for >125  $\mu$ m and 250  $\mu$ m fractions, respectively). Charcoals are residues of combusted plant tissues [55]. Macroscopic charcoals with particle sizes of >125  $\mu$ m and 250  $\mu$ m were prominent local fire tracers [56, 57]. In-situ or local fires produced more charcoal than the ex-situ or distal fire [58–60]. Previous studies have shown that larger macroscopic charcoals were formed at and near the burnt areas [57, 58, 61]. The dispersion distance of char particles (<200  $\mu$ m) is at a maximum of 10 km [12]. Hence, charcoal cannot be transported far. Therefore, HMW PAHs reflect the local fire, while the







Fig 5. Depth variations in retene (Ret), perylene (Per), cadalene (Cad), and simonellite (Sim) concentrations. https://doi.org/10.1371/journal.pone.0256853.q005

LMW PAHs capture fire events from remote locations. Karp et al. [23] showed that LMW PAHs are significantly enriched in smokes (<2.5  $\mu$ m) than in char residues [23], suggesting that the LMW/Total pyrogenic PAHs ratio is an indicative of the transportation of PAHs. The LMW/Total pyrogenic PAHs ratio varied reversely with charcoal abundance (Fig 9). Our result of the close relationship between charcoal and HMW PAHs strongly supports the fidelity of their proposed index. This implies that the HMW PAHs can be used as a proxy of local fire activity as charcoal is. PAHs are generally analysed together with other biomarkers, potentially providing more data for fire activity to reconstruct more robust fire history. On the other hand, the usage of LMW PAHs for the reconstruction of proximal fires needs caution, although these compounds can be potentially used for the reconstruction of regional fire history.



Fig 6. Depth variations in charcoal abundance with the total concentrations of pyrogenic parent and alkylated PAHs.



Fig 7. Factor loadings of PC1 and PC2 of PAH compounds.

Our PAH record indicates that fire activity was intensified at several hundred years interval (Fig 9). Usually, natural tropical rainforest is highly resistant to fire because of low dry fuel availability and high humidity, even during drought [25]. Thus, the repeated occurrence of wildfires implies that the megadroughts have occurred repeatedly in Borneo peatlands in the past. The preliminary data of charcoal at five different sites were discussed in the context of climate variability [24], showing the influence of solar cycles affecting the occurrence of droughts in Borneo. Further PAH studies will be useful to test the hypothesis.

#### Thermal origin of retene, simonellite, and cadalene

Generally, retene and simonellite are considered as "diagenetic" compounds, since they are formed from diterpenoids of higher plant resins in gymnosperms during diagenesis of sediment burial [62, 63]. However, the peat samples did not have sufficient time to thermally mature before forming "diagenetic" compounds. There is no increasing downward trend of retene concentration, not supporting the diagenetic formation of retene. The depth variations of these compounds are similar to those of some pyrogenic PAHs such as pyrene, benzo[a] anthracene, and fluoranthene (Fig 5 and S1 Fig in S1 File). The pyrolysis of peat yield retene transformed from diterpenoids by heating of fires [64]. The retene in ice cores [65, 66], air [67], and lake sediments [68] were often attributed to the combustion of plants. Retene in the Tinbarap peat core showed similar variation patterns to that of charcoal abundance (Figs 5 and 6). Thus, these compounds were formed by the pyrolysis of plants and considered as thermally transformed compounds.

Cadalene is also well-known for its "diagenetic" characteristics. Cadalene belongs to a sesquiterpenoid derived from angiosperm plants [69]. Cadalene is formed from the degradation



Fig 8. Depth plots of factor scores for PC 1 and PC 2.

https://doi.org/10.1371/journal.pone.0256853.g007



Fig 9. Variations of low-molecular-weight and total pyrogenic PAHs (LMW/Total pyrogenic PAHs), highmolecular-weight (HMW), and low-molecular-weight (LMW) PAHs with comparison to the charcoal abundance (5-point moving mean).

https://doi.org/10.1371/journal.pone.0256853.g009

of cadinene and cadinol during diagenesis [41]. However, the peat samples did not have sufficient time to thermally mature before forming "diagenetic" compounds. There is no increasing downward trend of cadalene concentration, not supporting the diagenetic formation of cadalene. Thus, like retene, cadalene can also be a thermally-transformed compound formed by the combustion of angiosperm plants. Cadalene in Tinbarap peat core showed a unique depth variation, which probably reflects the contribution of angiosperm to fuel materials for wildfires.

#### Conclusion

The pyrogenic PAHs in Tinbarap peats had 2–7 rings, where some compounds had methyl and ethyl groups. Pyrogenic PAHs showed large fluctuations with the core depth. Compared to low-molecular-weight (LMW) PAHs, the depth variation of high-molecular-weight (HMW) PAHs was more similar to that of charcoal abundance. Thus, the HMW PAHs were mainly formed from a local fire near the study area, while the LMW PAHs were likely originated from remote locations. Our results suggest that the concentration and composition of PAHs are useful to understand the frequency of fire activity in both local and remote areas.

#### Supporting information

**S1 File.** (DOCX)

S2 File. Dataset concentration of diagenetic PAHs with depth of Hole 8, Tinbarap peat core.

(ZIP)

S3 File. Dataset concentration of pyrogenic PAHs with depth of Hole 8, Tinbarap peat core.

(ZIP)

**S4** File. Dataset concentration of alkylated PAHs with depth of Hole 8, Tinbarap peat core. (ZIP)

# **Acknowledgments**

The peat cores were retrieved during the expedition conducted by the Department of Mineral and Geoscience (JMG), Sarawak and Tropical Peat Research Laboratory of Sarawak. We would like to thank Dr. Lulie Melling for her supportive collaboration with this project. We would also like to thank Mr. Wan Laeng for suggesting the location of coring and Mr. Mohd Firdaus Noor Azman, Mr. Ruddey John Maclay, and Mr. Aluwi Jamri of JMG for their help during the sampling.

#### **Author Contributions**

Conceptualization: Masanobu Yamamoto.

Formal analysis: Sher-Rine Kong.

Funding acquisition: Hasrizal Shaari.

Investigation: Sher-Rine Kong.

Methodology: Norhayati Mohd Tahir, Muhammad Fais Fadzil.

Project administration: Masanobu Yamamoto, Hasrizal Shaari.

Resources: Ryoma Hayashi, Osamu Seki, Abdullah Sulaiman.

Software: Sher-Rine Kong.

Supervision: Masanobu Yamamoto, Hasrizal Shaari.

Validation: Sher-Rine Kong.

Visualization: Sher-Rine Kong, Masanobu Yamamoto.

Writing – original draft: Sher-Rine Kong.

Writing – review & editing: Sher-Rine Kong, Masanobu Yamamoto, Hasrizal Shaari, Osamu Seki, Norhayati Mohd Tahir.

#### References

- 1. Edwards NT. Polycyclic aromatic hydrocarbons (PAH's) in the terrestrial environment- A review. J Environ Qual. 1983; 12: 427–441. https://doi.org/10.2134/jeq1983.00472425001200040001x
- Viras LG, Siskos PA, Stephanou E. Determination of polycyclic aromatic hydrocarbons in Athens atmosphere. Int J Environ An Ch. 1987; 28: 71–85. https://doi.org/10.1080/03067318708078400 PMID: 3557795
- Jiang C, Alexander R, Kagi RI, Murray AP. Polycyclic aromatic hydrocarbons in ancient sediments and their relationships to palaeoclimate. Org Geochem. 1998; 29: 1721–1735. https://doi.org/10.1016/ S0146-6380(98)00083-7

- 4. Malawska M, Ekonomiuk A, Wiłkomirski B. Polycyclic aromatic hydrocarbons in peat cores from southern Poland: Distribution in stratigraphic profiles as an indicator of PAH sources. Mires Peat. 2006; 1: 1–14.
- 5. Boehm PD. Polycyclic aromatic hydrocarbons (PAHs). In Environmental forensics. 1964; pp. 313–337. Academic Press.
- Yu H. Environmental carcinogenic polycyclic aromatic hydrocarbons: Photochemistry and phototoxicity. J Environ Sci Heal C. 2002; 20: 149–183. https://doi.org/10.1081/GNC-120016203 PMID: 12515673
- 7. Srogi K. Monitoring of environmental exposure to polycyclic aromatic hydrocarbons: A review. Environ Chem Lett. 2007; 5: 169–195. https://doi.org/10.1007/s10311-007-0095-0 PMID: 29033701
- Killops SD, Massoud MS. Polycyclic aromatic hydrocarbons of pyrolytic origin in ancient sediments: Evidence for Jurassic vegetation fires. Org Geochem. 1992; 18: 1–7. <u>https://doi.org/10.1016/0146-6380</u> (92)90137-M
- Abdel-Shafy HI, Mansour MS. A review on polycyclic aromatic hydrocarbons: source, environmental impact, effect on human health and remediation. Egypt J Petrol. 2016; 25: 107–123. <u>https://doi.org/10.1016/j.ejpe.2015.03.011</u>
- Seiler W, Crutzen PJ. Estimates of gross and net fluxes of carbon between the biosphere and the atmosphere from biomass burning. Climatic Change. 1980; 2: 207–247. <u>https://doi.org/10.1007/</u> BF00137988
- Crutzen PJ, Andreae MO. Biomass burning in the tropics: Impact on atmospheric chemistry and biogeochemical cycles. Science. 1990; 250: 1669–1678. <u>https://doi.org/10.1126/science.250.4988.1669</u> PMID: 17734705
- 12. Clark JS. Particle motion and the theory of charcoal analysis: Source area, transport, deposition, and sampling. Quaternary Res. 1988; 30: 67–80.
- Whitlock C, Shafer SL, Marlon J. The role of climate and vegetation change in shaping past and future fire regimes in the Northwestern US and the implications for ecosystem management. Forest Ecol and Manag. 2003; 178: 5–21. https://doi.org/10.1016/S0378-1127(03)00051-3
- Denis EH, Toney JL, Tarozo R, Anderson RS, Roach LD, Huang Y. Polycyclic aromatic hydrocarbons (PAHs) in lake sediments record historic fire events: Validation using HPLC-fluorescence detection. Org Geochem. 2012; 45: 7–17. https://doi.org/10.1016/j.orggeochem.2012.01.005
- Lima ALC, Farrington JW, Reddy CM. Combustion-derived polycyclic aromatic hydrocarbons in the environment- A review. Environ Forensics. 2005; 6: 109–131. <u>https://doi.org/10.1080/</u> 15275920590952739
- 16. Simcik MF, Offenberg JH. Polycyclic aromatic hydrocarbons in the Great Lakes. In Persistent Organic Pollutants in the Great Lakes. 2006; (pp. 307–353). Springer, Berlin, Heidelberg.
- Blumer M. Polycyclic aromatic compounds in nature. Sci Am. 1976; 234: 34–45. <u>https://doi.org/10.1038/scientificamerican0376-34 PMID: 1251182</u>
- Laflamme RE, Hites RA. The global distribution of polycyclic aromatic hydrocarbons in recent sediments. Geochim Cosmochim Ac. 1978; 42: 289–303. https://doi.org/10.1016/0016-7037(78)90182-5
- Primbs T, Simonich S, Schmedding D, Wilson G, Jaffe D, Takami A, et al. Atmospheric outflow of anthropogenic semivolatile organic compounds from East Asia in spring 2004. Environ Sci Technol. 2007; 41: 3551–3558. https://doi.org/10.1021/es062256w PMID: 17547177
- Wild SR, Jones KC. Polynuclear aromatic hydrocarbons in the United Kingdom environment: A preliminary source inventory and budget. Environ Pollut. 1995; 88: 91–108. https://doi.org/10.1016/0269-7491(95)91052-m PMID: 15091573
- Wania F, Mackay D. Peer reviewed: Tracking the distribution of persistent organic pollutants. Environ Sci Technol. 1996; 30: 390A–396A. https://doi.org/10.1021/es962399q PMID: 21649427
- 22. Yunker MB, Macdonald RW, Vingarzan R, Mitchell RH, Goyette D, Sylvestre S. PAHs in the Fraser River basin: a critical appraisal of PAH ratios as indicators of PAH source and composition. Org Geochem. 2002; 33: 489–515.
- Karp AT, Holman AI, Hopper P, Grice K, Freeman KH. Fire distinguishers: Refined interpretations of polycyclic aromatic hydrocarbons for paleo-applications. Geochim Cosmochim Ac. 2020; 289: 93–113.
- Yamamoto M, Kikuchi T, Sakurai H, Hayashi R, Seki O, Omori T, et al. Tropical Western Pacific hydrology during the last 6,000 years based on wildlife charcoal records from Borneo. Geophys Res Lett. Forthcoming 2021.
- Siegert F, Ruecker G, Hinrichs A, Hoffman AA. Increased damage from fires in logged forests during droughts caused by El Niño. Nature. 2001; 414: 437–440. https://doi.org/10.1038/35106547 PMID: 11719802
- Langner A, Siegert F. Spatiotemporal fire occurrence in Borneo over a period of 10 years. Glob. Chang. Biol. 2009; 15: 48–62.

- Chen CC, Lin HW, Yu JY, Lo MH. The 2015 Borneo fires: What have we learned from the 1997 and 2006 El Niños? Environ. Res. Lett. 2016; 11: 104003.
- Anderson JAR, Muller J. Palynological study of a Holocene peat and a Miocene coal deposit from NW Borneo. Rev Palaeobot Palyno. 1975; 19: 291–351. https://doi.org/10.1016/0034-6667(75)90049-4
- **29.** Anderson JAR. The flora of the peat swamp forests of Sarawak and Brunei, including a catalogue of all recorded species of flowering plants, ferns and fern allies. Gardens' Bulletin. 1963; 20: 131–228.
- Kong SR, Shaari H, Mohd Tahir N, Pang SY, Fadzil MF, Sulaiman A. Sources and distribution of *n*alkanes in Borneo peat core, Sarawak, Malaysia. Asian J Chem. 2020; 32(9). 2243–2250. <u>https://doi.org/10.14233/ajchem.2020.22753</u>
- Okuno M, Nagaoka S, Hase Y, Mori Y, Konomatsu M, Takahashi T, et al. 5.2–5.8 ka BP Paleoenvironment of the Southern Slope of Mount Raizan, Japan. Radiocarbon. 2001; 43: 703–710.
- 32. Kitagawa H, Masuzawa T, Makamura T, Matsumoto E. A batch preparation method for graphite targets with low background for AMS 14C measurements. Radiocarbon. 1993; 35(2): 295–300.
- Ramsey CB, Schulting RJ, Bazaliiskii VI, Goriunova OI, Weber AW. Spatio-temporal patterns of cemetery use among Middle Holocene hunter-gatherers of Cis-Baikal, Eastern Siberia. Archaeol. Res. Asia. 2021; 25: 100253.
- Reimer PJ, Austin WEN, Bard E, Bayliss A, Blackwell PG, Ramsey CB, et al. The IntCal20 Northern Hemisphere radiocarbon age calibration curve (0–55 cal kBP). Radiocarbon. 2020; 62(4): 725–757.
- Mita H, Shimoyama A. Distribution of polycyclic aromatic hydrocarbons in the K/T boundary sediments at Kawaruppu, Hokkaido, Japan. Geochem Journal. 1999; 33: 305–315. <u>https://doi.org/10.2343/geochemj.33.305</u>
- Marynowski L, Pięta M, Janeczek J. Composition and source of polycyclic aromatic compounds in deposited dust from selected sites around the Upper Silesia, Poland. Geol Q. 2004; 48: 169–180.
- Mita H. GC/MS analysis of polycyclic aromatic hydrocarbons in the Cretaccous-Tertiary boundary sediments. Res Org Geochem. 2005; 20: 49–64.
- Romero-Sarmiento MF, Riboulleau A, Vecoli M, Versteegh GJM. Aliphatic and aromatic biomarkers from Gondwanan sediments of Late Ordovician to Early Devonian age: An early terrestrialization approach. Org Geochem. 2011a; 42: 605–617. https://doi.org/10.1016/j.orggeochem.2011.04.005
- Romero-Sarmiento MF, Riboulleau A, Vecoli M, Laggoun-Défarge F, Versteegh GJ. Aliphatic and aromatic biomarkers from Carboniferous coal deposits at Dunbar (East Lothian, Scotland): Palaeobotanical and palaeoenvironmental significance. Palaeogeography, Palaeoclimatology, Palaeoecology. 2011b; 309: 309–326. https://doi.org/10.1016/j.palaeo.2011.06.015
- 40. Clarke KR, Gorley RN. Primer v6: User Manual/Tutorial (Plymouth Routines in Multivariate Ecological Research). 2006; PRIMER-e, Plymouth, United Kingdom.
- 41. Simoneit BRT. Cyclic terpenoids of the geosphere. Meth Geoch. 1986; 24: 43-99.
- Hites RA, Laflamme RE, Farrington JW. (1997). Sedimentary polycyclic aromatic hydrocarbons: The historical record. Science. 1997; 4319: 829–831. https://doi.org/10.1126/science.198.4319.829 PMID: 17843406
- Baumard P, Budzinski H, Michon Q, Garrigues P, Burgeot T, Bellocq J. Origin and bioavailability of PAHs in the Mediterranean Sea from mussel and sediment records. Estuar Coast Shelf S. 1998; 47: 77–90. https://doi.org/10.1006/ecss.1998.0337
- Simoneit BRT. Molecular indicators (biomarkers) of past life. The Anatomical Record. 2002; 268: 186– 195. https://doi.org/10.1002/ar.10153 PMID: 12382317
- Page DS, Boehm PD, Douglas GS, Bence AE, Burns WA, Mankiewicz PJ. Pyrogenic polycyclic aromatic hydrocarbons in sediments record past human activity: A case study in Prince William Sound, Alaska. Mar Pollut Bull. 1999; 38: 247–260. https://doi.org/10.1016/S0025-326X(98)00142-8
- Zaccone C, Gallipoli A, Cocozza C, Trevisan M, Miano TM. Distribution patterns of selected PAHs in bulk peat and corresponding humic acids from a Swiss ombrotrophic bog profile. Plant Soil. 2009; 315: 35–45. https://doi.org/10.1007/s11104-008-9775-1
- Aizenshtat Z. Perylene and its geochemical significance. Geochim Cosmochim Ac. 1973; 37: 559–567. https://doi.org/10.1016/0016-7037(73)90218-4
- Venkatesan MI. Occurrence and possible sources of perylene in marine sediments- A review. Mar Chem. 1988; 25: 1–27.
- Grice K, Lu H, Atahan P, Asif M, Hallmann C, Greenwood P, et al. New insights into the origin of perylene in geological samples. Geochim Cosmochim Ac. 2009; 73: 6531–6543. https://doi.org/10.1016/j. gca.2009.07.029
- Gilliland MR, Howard AJ, Hamer D. Polycyclic hydrocarbons in crude peat wax. Chemistry Industry. 1960; 1: 1357–1358.

- Wilcke W. Synopsis polycyclic aromatic hydrocarbons (PAHs) in soil- A review. Journal of Plant Nutrition and Soil Science, 2000; 163: 229–248. https://doi.org/10.1002/1522-2624(200006)163:3%3C229:: AID-JPLN229%3E3.0.CO;2–6
- Wilcke W. Global patterns of polycyclic aromatic hydrocarbons (PAHs) in soil. Geoderma. 2007; 141: 157–166. https://doi.org/10.1016/j.geoderma.2007.07.007
- McGrath TE, Chan WG, Hajaligol MR. Low temperature mechanism for the formation of polycyclic aromatic hydrocarbons from the pyrolysis of cellulose. J Anal Appl Pyrol. 2003; 66: 51–70. https://doi.org/ 10.1016/S0165-2370(02)00105-5
- Edokpayi JN, Odiyo JO, Popoola OE, Msagati TA. Determination and distribution of polycyclic aromatic hydrocarbons in rivers, sediments and wastewater effluents in Vhembe District, South Africa. Int J Env Res Pub He. 2016; 13: 1–12. https://doi.org/10.3390/ijerph13040387 PMID: 27043597
- Li Y, Xu X, Zhao P. Post-fire dispersal characteristics of charcoal particles in the Daxing'an Mountains of north-east China and their implications for reconstructing past fire activities. Int J Wildland Fire. 2017; 26: 46–57. https://doi.org/10.1071/WF16115
- Clark JS. Fire and climate change during the last 750 yr in northwestern Minnesota. Ecol Monogr. 1990; 60: 135–159. https://doi.org/10.2307/1943042
- Whitlock C, Millspaugh SH. Testing the assumptions of fire-history studies: An examination of modern charcoal accumulation in Yellowstone National Park, USA. The Holocene. 1996; 6: 7–15. <u>https://doi.org/10.1177/095968369600600102</u>
- Clark JS, Lynch J, Stocks BJ, Goldammer JG. Relationships between charcoal particles in air and sediments in West-central Siberia. The Holocene. 1998; 8: 19–29. <u>https://doi.org/10.1191/</u> 095968398672501165
- Ohlson M, Tryterud E. Interpretation of the charcoal record in forest soils: Forest fires and their production and deposition of macroscopic charcoal. The Holocene. 2001; 10: 519–525. <u>https://doi.org/10. 1191/095968300667442551</u>
- Lynch JA, Clark JS, Stocks BJ. Charcoal production, dispersal, and deposition from the Fort Providence experimental fire: Interpreting fire regimes from charcoal records in boreal forests. Can J Forest Res. 2004; 34: 1642–1656.
- Gavin DG, Brubaker LB, Lertzman KP. An 1800-year record of the spatial and temporal distribution of fire from the west coast of Vancouver Island, Canada. Can J Forest Res. 2003; 33: 573–586.
- Simoneit BRT, Grimalt JO, Wang TG, Cox RE, Hatcher PG, Nissenbaum A. Cyclic terpenoids of contemporary resinous plant detritus and of fossil woods, ambers and coals. Org Geochem. 1986; 10: 877–889. https://doi.org/10.1016/S0146-6380(86)80025-0
- Simoneit BRT. Biomarker PAHs in the environment. In PAHs and related compounds. 1998; (pp. 175–221). Springer, Berlin, Heidelberg. https://doi.org/10.1007/978-3-540-49697-7\_5
- Schellekens J, Bradley JA, Kuyper TW, Fraga I, Pontevedra-Pombal X, Vidal-Torrado P, et al. The use of plant-specific pyrolysis products as biomarkers in peat deposits. Quaternary Sci Rev. 2015; 123, 254–264. https://doi.org/10.1016/j.quascirev.2015.06.028
- 65. Kawamura K, Izawa Y, Mochida M, Shiraiwa T. Ice core records of biomass burning tracers (levoglucosan and dehydroabietic, vanillic and p-hydroxybenzoic acids) and total organic carbon for past 300 years in the Kamchatka Peninsula, Northeast Asia. Geochim Cosmochim Ac. 2012; 99, 317–329. https://doi.org/10.1016/j.gca.2012.08.006
- Parvin F, Seki O, Fujita K, Iizuka Y, Matoba S, Ando T, et al. Assessment for paleoclimatic utility of biomass burning tracers in SE-Dome ice core, Greenland. Atmos Environ. 2019; 196, 86–94. https://doi. org/10.1016/j.atmosenv.2018.10.012
- Ramdahl T. Retene- A molecular marker of wood combustion in ambient air. Nature. 1983; 306: 580– 582. https://doi.org/10.1038/306580a0
- Miller DR, Castañeda IS, Bradley RS, MacDonald D. Local and regional wildfire activity in central Maine (USA) during the past 900 years. J Paleolimnol. 2017; 58: 455–466. <u>https://doi.org/10.1007/s10933-017-0002-z</u>
- **69.** Bastow TP, Alexander R, Kagi RI. Identification and analysis of dihydro-ar-curcumene enantiomers and related compounds in petroleum. Org Geochem. 1997; 26: 79–83. https://doi.org/10.1016/S0146-6380 (96)00155-6