Checklist

- 1. For all authors...
 - (a) Do the main claims made in the abstract and introduction accurately reflect the paper's contributions and scope? [Yes]
 - (b) Did you describe the limitations of your work? [Yes] See Section 6
 - (c) Did you discuss any potential negative societal impacts of your work? [Yes] See Section 6
 - (d) Have you read the ethics review guidelines and ensured that your paper conforms to them? [Yes]
- 2. If you are including theoretical results...
 - (a) Did you state the full set of assumptions of all theoretical results? [N/A]
 - (b) Did you include complete proofs of all theoretical results? [N/A]
- 3. If you ran experiments (e.g. for benchmarks)...
 - (a) Did you include the code, data, and instructions needed to reproduce the main experimental results (either in the supplemental material or as a URL)? [Yes] See section 6
 - (b) Did you specify all the training details (e.g., data splits, hyperparameters, how they were chosen)? [Yes] See section 4
 - (c) Did you report error bars (e.g., with respect to the random seed after running experiments multiple times)? [Yes] See Tables 3
 - (d) Did you include the total amount of compute and the type of resources used (e.g., type of GPUs, internal cluster, or cloud provider)? [Yes] See end of first paragraph of Section 4.2
- 4. If you are using existing assets (e.g., code, data, models) or curating/releasing new assets...
 - (a) If your work uses existing assets, did you cite the creators? [N/A]
 - (b) Did you mention the license of the assets? [N/A]
 - (c) Did you include any new assets either in the supplemental material or as a URL? [Yes] See Sections 6 and A.2
 - (d) Did you discuss whether and how consent was obtained from people whose data you're using/curating? [Yes] See Sections 3.1 and 3.2 as well as and Figure 1
 - (e) Did you discuss whether the data you are using/curating contains personally identifiable information or offensive content? [Yes] See Sections 3.3 and 6
- 5. If you used crowdsourcing or conducted research with human subjects...
 - (a) Did you include the full text of instructions given to participants and screenshots, if applicable? [Yes] See first screenshot in Figure 1
 - (b) Did you describe any potential participant risks, with links to Institutional Review Board (IRB) approvals, if applicable? [Yes] See our IRB approved participant instructions which include risk in first screenshot in Figure 1
 - (c) Did you include the estimated hourly wage paid to participants and the total amount spent on participant compensation? [Yes] See Section 3.2

520 A Appendix

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A.1 StudentSADD data description

The Student Suicidal Ideation and Depression Detection (StudentSADD) dataset includes 345 sessions of data from 302 unique student participants with modalities including participant demographics, PHQ-9 scores, responses to a text prompt, unscripted audio recordings, scripted audio recordings, and willingness to share passive modalities (Twitter, calendar, call logs, text logs, contacts, and GPS). Participants were given access to an Android and Website App. They could choose which version of the app to take. All questions were the same, however, Twitter was only passive modality assessed for willingness to share by the web app. All publicly available data is stored in CSV files.

Responses to the text prompt, demographic questions, and phq-9 questions as well as willingness to share information and timestamps of submission by participants can be found in summaryStudentSADD.csv. Participants were asked to share their favorite place (text prompt); demographic info, specifically, age, gender, student status, race/ethnicity, whether or not they have had prior depression treatment, whether they were remote, and whether or not they had covid; responses to 9 depression screening questions with four point Likert scales; and GPS data (if shared). Participant willingness to share each active prompt, each smartphone log modality, GPS, and Twitter was also included in this file. The sessions from the same student are marked as copies in this CSV file.

As the raw audio poses privacy concerns, we instead share features and embedding representations of the audio data. For example, the files scriptedSMILE.csv and unscriptedSMILE.csv contain examples of extracted openSmile audio features. These CSV files also have the PHQ-9 and item-9 scores of the corresponding participants. The VGGish embeddings for each audio recording are in the zipped folders named VGGishEmbeddingsUnscriptedStudentSADD and VGGishEmbeddingsScriptedStudentSADD. Further feature and embedding representations of the audio data will be included as part of the dataset in the future. Additionally, the file scriptedTranscript.csv contains scripted audio transcripts and the file unscriptedTranscript.csv contains unscripted audio transcripts.

For the unscriptedTranscripts and text prompt replies, proper nouns that posed privacy risks have been manually redacted. This was particularly important in cases where students named family members or friends. In no cases does this change the meaning of the reply and therefore would not impact the screening potential of the data.

Lastly, we release CSV files with results for the parameter search and baseline machine learning models in this paper. The naming convention for these files is [parameter][data][label] for the parameter search and [data][features][label] for the baseline screening results. Further, detailed results for machine learning models that use the StudentSADD data will also be released.

84 IDs were designated as a test set to evaluate the machine learning models trained on this data. The Test and Train IDs can be found below. In addition to the training IDs from unique students, we have also included the IDs from duplicated entries. Note, not all IDs shared every modality.

Test IDs: [1607712777, 292, 2613, 1610640355, 1607494599, 1607040811, 1608492986, 6390, 396, 1607734901, 1607350992, 1608992344, 1609903202, 74, 7159, 4698, 7547, 4441, 1607097951, 8479, 8170, 4707, 7516, 1609174124, 1608853150, 8516, 1611424664, 2843, 1607040596, 1953, 1607772081, 1608564004, 2627, 1607217921, 1607118643, 1607314413, 1609887404, 1608335387, 4098, 1607046006, 1608242917, 8918, 1607131299, 9754, 1607262842, 1607273026, 2478, 560 1607536408, 1607291545, 1608707232, 1609941585, 1608200497, 1610630377, 7711, 1607810287, 561 9934, 1608850448, 4041, 1609166629, 1608168856, 1607572897, 6831, 1608586814, 1608588581, 562 2837, 8180, 1608631410, 1607051003, 3830, 4879, 1608920128, 1607019351, 8181, 3473, 563 1608335906, 1607738757, 1608770486, 7564, 1607495239, 1609983150, 1607397061, 1607696074, 564 565 103, 22221

Unique Train IDs: [4769, 1607928177, 1607269923, 7755, 4598, 1607807806, 1608741452, 3323, 1610110670, 1607133044, 9745, 1607291670, 5245, 4442, 319, 1607133218, 1607010270, 1608587203, 1609256130, 1608582258, 5028, 1609771771, 5229, 3517, 1608595561, 1608048050, 1607410780, 528, 1607134906, 3102, 1607555727, 1609887167, 3985, 7256, 3523, 1607289708, 1609890222, 850, 1608917024, 5047, 1608061691, 4782, 1608062276, 1056, 1611517276, 1607636681, 1607891972, 5571, 1609052616, 1607927243, 2525, 4353, 1610818662, 8640, 1607559849, 6706, 1608624428, 1607968838, 1608672132, 552, 1608537399, 1610381937, 1608607986, 381, 1608589576, 3920, 1608059746, 1609027319, 1607357022, 1607691623,

1609899907, 1608470962, 8791, 1610380419, 3064, 1609473849, 1607712704, 1609887249, 1609888813, 1608588103, 1244, 7279, 1607339125, 1607712682, 8472, 1269, 1607045076, 575 1607365865, 1846, 191, 1811, 1608702785, 1609049435, 5330, 1607257348, 1609890530. 576 3278, 1608586899, 1607939718, 2430, 1609893292, 60, 1607270186, 6336, 8650, 1608495626, 577 1608586953, 2121, 1607295286, 896, 1609889389, 1607560754, 6548, 6580, 1607440988, 578 1609111416, 1607807159, 8663, 1607129044, 6658, 1607799213, 3933, 1608596696, 1608663032, 579 1610791060, 1607135820, 1607413039, 1607659758, 1608487726, 4859, 1609142183, 1607276888, 580 7452, 1607368510, 1607266081, 2623, 1608416516, 2128, 3227, 5881, 6510, 1609166843, 581 7569, 1607712793, 1608850996, 3273, 1607939838, 9986, 3302, 1607206195, 1609082904, 582 1607510222, 7612, 1607022963, 1607051040, 1607719324, 1608849324, 1607642639, 1607104225, 583 705, 1608506424, 1608188073, 8018, 8085, 4755, 1611704179, 1607193886, 7007, 3041, 4001, 584 1552, 1716, 1608053349, 1608572299, 1608051417, 1607712784, 836, 1607929944, 1607795480, 585 1608200317, 415, 3662, 1610109929, 2496, 8550, 6868, 1608587385, 1608591490, 7370, 4549, 586 7505, 1879, 1876, 1608003341] 587

Duplicated Train IDs: [1607315588, 1607087749, 518, 6280, 1607315467, 1607497867, 589 1608359052, 8468, 1607124379, 6941, 1607510942, 1607921053, 1611575587, 1608201126, 1607639591, 4521, 1607315498, 1607639340, 1607785646, 1609353141, 1607453496, 1607293881, 1607674683, 5948, 1608683584, 1608087234, 3267, 1607802179, 7109, 838, 9034, 1868, 1608683738, 8284, 95, 1609154655, 1607159523, 1607124838, 1607088999, 7912, 1607802347, 1607764720, 1607785968]

A.2 Data and code access for reviewers

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- To access the StudentSADD data, reviewers can use the login information (provided in the submission system) at our project website: https://emutivo.wpi.edu/data/
- Upon publication, we will grant similar access to other researchers who request our data and agree to the terms of the data licence in Section A.3. This approach is standard for datasets in this domain [31; 33]. Data access will be managed by the Academic and Research Computing team at WPI.
- This is not a static dataset, as we will continue to add more data features and embedding representations. We have inquired about obtaining a DOI for StudentSADD through our institutional library, and will obtain a DOI prior to publication.
- To access the code used to generate the results in this paper (including the parameter search), reviewers can navigate to our public github repository: https://github.com/mltlachac/StudentSADD

605	A.3 StudentSADD Dataset - End User License Agreement
606	(https://emutivo.wpi.edu)
607 608	The person in request may download and use this database only after signing and returning this agreement form. By signing this document, the user agrees to the following terms:
609	Commercial and academic use
610 611	The database is made available for research purposes only. Any commercial use of this data is forbidden.
612	Redistribution
613	The user may not distribute the database or parts of it to any third party.
614	Publications
615 616 617	The use of data for illustrative purposes in publications is allowed. Publications include both scientific papers and presentations for scientific/educational purposes. In this case, the identity of the subjects should be protected (no release of identifiable information for subjects).
618	Citation
619 620	All publications reporting on research using this database have to acknowledge this by citing the following article:
621 622 623 624 625	ML Tlachac, Ricardo Flores, Miranda Reisch, Rimsha Kayastha, Nina Taurich, Veronica Melican, Connor Bruneau, Hunter Caouette, Ermal Toto, Elke Rundensteiner, "StudentSADD: Mobile Depression and Suicidal Ideation Screening of College Students during the Coronavirus Pandemic", in Submission at Neural Information Processing System (NeurIPS) 2021 Datasets and Benchmarks Track
626 627	For specific software output that is shared as part of this data, the user agrees to respect the individual software licenses and use the appropriate citations as mentioned in the documentation of the data.
628	EULA changes
629 630 631	Worcester Polytechnic Institute is allowed to change these terms of use at any time. In this case, users will be informed of the changes and will have to sign a new agreement form to keep using the database.
632	Warranty

The database comes without any warranty. In no event shall the provider be held responsible for any loss or damage caused by the use of this data. 633 634 635

636 Signature Date Name 637 638 639 Organization Address

641 A.4 Data management plan

Data description and formats

The Student Suicidal Ideation and Depression Detection (StudentSADD) dataset contains 245 sessions submitted through a mobile app by 302 students over between August 2020 and January 2021. The data includes PHQ-9, demographics, retrospective phone data, text prompt, audio recordings, location history, and tweets. The audio is stored as WAV files. The remaining data is stored as text in CSV files.

Data archiving, access and sharing, and data preservation

Data will be stored in the file systems of Worcester Polytechnic Institute (WPI). The stored data will 649 be protected with disk mirroring, daily backups and other means. Full-time system administrators will 650 monitor the security and availability of these systems. Appropriate access control and other security 651 policies and mechanisms will be put in place to protect the integrity, security, privacy, confidentiality 652 and other rights or requirements. For access by and sharing with the greater research community 653 and general public, research group websites will be used, and personally identifiable information 654 (PII) will be appropriately removed or anonymized from the essential data used for our research. To 655 protect privacy, confidentiality or other rights/requirements, while at the same time ensuring scientific reproducibility and verifiability, the data will be summarized in the forms of intermediate statistics, and made publicly available, or when requested from other researchers. 658

659 Data privacy

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Data will be shared only under rules specified by our IRBs, and only when properly anonymized.
The systems on which the data will be stored will have access restricted to the project members via standard filesystem permissions management. The server on which the data is stored is within the University's restricted access datacenter. Files that will be made publicly available will not contain any identifiable location information.

Policies and provisions for re-use, re-distribution

Any data collected will be in compliance with the IRB protocols of Worcester Polytechnic Institute.
Data gathered for this project may be reused in other, related, research projects conducted by the PIs or graduate students. It is expected that other researchers in machine learning in mental health would be interested in our dataset. Requests for the data would be handled as per Section III. These datasets cannot be used for commercial applications or purposes, or changed and resubmitted without the PIs' permission and are subject to the intellectual property policies of WPI.

672 Rights and Obligations

The Principal Investigators (PIs) will be responsible for the implementation of the Data Management Plan. WPI owns the technology developed at each individual university by each university's employees.