

Summary Table of Mobile Behavioral Biometric Databases.

Acronyms: A = Accelerometer, Au = Audio, B = Bluetooth, Ba = Battery Level, C = Camera, °C = Temperature, CL = Call Logs, CT = Call Tower IDs, Gr = Gravity Sensor, Gy = Gyroscope, H = Handwriting, Hu = Humidity, K = Keystroke, L = Light, LA = Linear Accelerometer, Mi = Microphone, N = Network Logs, P = Pressure, Pr = Proximity, Sy = System Stats, T = Touchscreen, W = Wi-Fi.

Dataset	Year	Available ¹	Unconstrained Env. ²	# of Users	# of Devices	Data Modality	Impostor Case
MIT Reality Mining [1]	2006	✓	✓	100	100	CL, B, CT, Ap	Different Device
Saevanee <i>et al.</i> [2]	2008	✗	✗	10	1	T	Same Device
Zahid <i>et al.</i> [3]	2009	✗	✗	25	13	T	Not Considered
Rice LiveLab Dataset [4]	2011	✓	✓	34	18	Ap, W	Not Considered
Frank <i>et al.</i> [5]	2012	✗	✓	41	4	T	Not Considered
Servadda <i>et al.</i> [6]	2013	✓	✗	190	1	T	Same Device
Zhang <i>et al.</i> [7]	2015	✗	✗	50	1	T, C	Same Device
Feng <i>et al.</i> [8]	2014	✗	✓	123	3	T	Not Considered
Xu <i>et al.</i> [9]	2014	✗	✗	28	1	T, K, H	Same Device
Saevanee <i>et al.</i> [10]	2015	✗	✓	30	~30	K, Ap, LP	Different Device
Hoang <i>et al.</i> [11]	2015	✗	✓	34	1	A	Same Device
Neal <i>et al.</i> [12]	2015	✗	✓	200	~200	Ap, W, B	Different Device
Wu <i>et al.</i> [13]	2015	✗	✓	100	~100	K, P, A, G	Different Device
Nader <i>et al.</i> [14]	2015	✗	✗	20	1	T	Same Device
Murmuria <i>et al.</i> [15]	2015	✗	✓	73	1	A, Gy, T, Ap, Ba	Same Device
Sitova <i>et al.</i> (HMOG) [16]	2015	✗	✗	100	10	T, A	Not Considered
Zaliva <i>et al.</i> [17]	2015	✗	✗	14	1	T	Same Device
Lu et Lio [18]	2015	✗	✓	60	3	T	Not Considered
Coakley <i>et al.</i> [19]	2016	✓	✗	51	5	K, A, G	Not Considered
Putri <i>et al.</i> [20]	2016	✓	✗	29	1	T	Same Device
Kumar <i>et al.</i> [21]	2016	✗	✗	28	-	T, K, A, G	Not Considered
Shen <i>et al.</i> [22]	2016	✗	✗	71	3	T	Not Considered
Google Abacus Dataset [23]	2016	✗	✓	1500	~1500	C, T, A, Gy, M, W	Different Device
Antal <i>et al.</i> [24]	2016	✗	✗	71	8	T, A	Not Considered
Nixon <i>et al.</i> [25]	2016	✗	✓	20	~20	T, A, Gy	Different Device
Buriro <i>et al.</i> [26]	2016	✗	✗	30	1	T, A, M, Gy	Same Device
Mahbub <i>et al.</i> [27] (UMDAA-02)	2016	✓	✓	48	-	T, C, A, GPS, B, W, L, P, °C, Pr	Not Considered
Lee and Lee [28]	2017	✗	✓	35	2	A, Gy	Not Considered
Zhu <i>et al.</i> [29]	2017	✗	✗	20	-	A, Gy	Not Considered
Al Kork <i>et al.</i> [30]	2017	✗	✓	50	2	A, Gy	Not Considered
Li and Bours [31]	2018	✗	✓	312	~312	W, A	Different Device
Amini <i>et al.</i> [32] (TargetAuth Dataset)	2018	✗	✗	47	-	A, Gy	Not Considered
Cilia <i>et al.</i> [33]	2018	✗	✗	24	2	K	Not Considered
Aalto University Dataset [34]	2019	✓	✓	~260k	-	K	Not Considered
Zhu <i>et al.</i> [35]	2019	✗	Mixed	1513	4	A, Gy, Gr	Not Considered
Garbuz <i>et al.</i> [36]	2019	✗	✗	36	1	T, A, Gy	Same Device
Vajdi <i>et al.</i> [37]	2019	✓	✗	93	2	A	Not Considered
Deb <i>et al.</i> [38]	2019	✗	✓	37	30	K, GPS, A, Gy, M, LA, Gr, Gy	Not Considered
Acien <i>et al.</i> [39] (HuMldb)	2020	✓	✓	600	600	A, Gr, Gy, L, LA, M, O, Pr, L, GPS, W, B, Mi	Different Device
Current Work (BehavePassDB)	2022	✓	✓	81	81	A, Gr, Gy, L, LA, M, O, P Pr, L, GPS, W, B, °C, Ba, Hu	Different and Same Device (Skilled)

¹ Publicly Available.

² Unconstrained Environment, i.e., the subjects participating in the study did not receive instructions on how to perform the data collection process.

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