Agenda Universal Functions (ufunc) on 2D np.unique() np.where() Use Case: Fitness Data analysis ✓ Loading data set and EDA using numpy np.argmax() Vectorization np.vectorize() 3D arrays ✓ Use Case: Image Manipulation using Numpy Opening an Image Details of an image Visualizing Channels Rotating an Image (Transposing a Numpy Array) Trim image Broadcasting Array splitting and Merging Splitting arrays - split(), hsplit(), vsplit() Merging Arrays - hstack(), vstack() **Universal Functions (ufunc) on 2D** np.unique() In [1]: data=np.loadtxt("/Users/nikhilsanghi/Downloads/01\_dsml-course-main-live/batches/2\_Sept\_Beg\_Tue\_Oct\_Beg\_Tue/04\_Numpy\_4/survey.txt") array([ 7., 10., 5., ..., 5., 9., 10.]) In [2]: np.unique(data) array([ 1., 4., 5., 7., 8., 9., 10.]) In [3]: np.unique(data,return\_counts=True) (array([ 1., 4., 5., 7., 8., 9., 10.]), array([117, 112, 103, 123, 103, 394, 215])) np.where() In [4]: a=np.array([ 2, 1, 6, 4, 7, 3, 8, 9, 11]) array([ 2, 1, 6, 4, 7, 3, 8, 9, 11]) In [5]: array([ True, True, False, True, False, True, False, False, False]) In [6]: a[a<6] array([2, 1, 4, 3]) np.where(a<6)(array([0, 1, 3, 5]),) In [8]: np.where(a<6,-1,+1)array([-1, -1, 1, -1, 1, -1, 1, 1]) In [9]: np.where(a<6,-1,a)array([-1, -1, 6, -1, 7, -1, 8, 9, 11]) Out[9]: **Use Case: Fitness Data analysis** In [89]: data=np.loadtxt("/Users/nikhilsanghi/Downloads/01\_dsml-course-main-live/batches/2\_Sept\_Beg\_Tue\_Oct\_Beg\_Tue/04\_Numpy\_4/fit.txt",dtype="str") array([['06-10-2017', '5464', 'Neutral', '181', '5', 'Inactive'], '07-10-2017', '6041', 'Sad', '197', '8', 'Inactive'], ['08-10-2017', '25', 'Sad', '0', '5', 'Inactive'], ['09-10-2017', '5461', 'Sad', '174', '4', 'Inactive'], ['10-10-2017', '6915', 'Neutral', '223', '5', 'Active'], ['11-10-2017', '4545', 'Sad', '149', '6', 'Inactive'], ['12-10-2017', '4340', 'Sad', '140', '6', 'Inactive'], ['13-10-2017', '1230', 'Sad', '38', '7', 'Inactive'], ['14-10-2017', '61', 'Sad', '1', '5', 'Inactive'], ['15-10-2017', '1258', 'Sad', '40', '6', 'Inactive'], ['16-10-2017', '3148', 'Sad', '101', '8', 'Inactive'], ['17-10-2017', '4687', 'Sad', '152', '5', 'Inactive'], ['18-10-2017', '4732', 'Happy', '150', '6', 'Active'], ['19-10-2017', '3519', 'Sad', '113', '7', 'Inactive'], ['20-10-2017', '1580', 'Sad', '49', '5', 'Inactive'], '2822', 'Sad', '86', '6', 'Inactive'], ['21-10-2017', '181', 'Sad', '6', '8', 'Inactive'], ['22-10-2017', '3158', 'Neutral', '99', '5', 'Inactive'], ['23-10-2017', 'Neutral', '143', '4', 'Inactive'], 'Neutral', '125', '5', 'Inactive'], 'Neutral', '129', '6', 'Inactive'], '4383', '24-10-2017', '25-10-2017', '3881', '4037', ['26-10-2017', 'Neutral', '6', '8', 'Inactive'], 'Neutral', '9', '5', 'Inactive'], '27-10-2017', '202', '28-10-2017', '292', 'Happy', '10', '6', 'Inactive'], '29-10-2017', '330', '2209', ['30-10-2017', 'Neutral', '72', '5', 'Inactive'], Γ'31-10-2017', '4550', 'Happy', '150', '8', 'Active'], ['01-11-2017', 'Happy', '141', '5', 'Inactive'], '4435', '02-11-2017', '4779', 'Happy', '156', '4', 'Inactive'], ['03-11-2017', '1831', 'Happy', '57', '5', 'Inactive'], 'Happy', '72', '4', 'Inactive'], ['04-11-2017', '2255', -Γ'05-11-2017', '539', 'Happy', '17', '5', 'Active'], -Γ'06-11-2017', '5464', 'Happy', '181', '4', 'Inactive'], ['07-11-2017', '6041', 'Neutral', '197', '3', 'Inactive'], ['08-11-2017', '4068', 'Happy', '131', '2', 'Inactive'], ['09-11-2017', '4683', 'Happy', '154', '9', 'Inactive'], ['10-11-2017', '4033', 'Happy', '137', '5', 'Inactive'], ['11-11-2017', '6314', 'Happy', '193', '6', 'Active'], ['12-11-2017', '614', 'Happy', '19', '4', 'Active'], ['13-11-2017', '3149', 'Happy', '101', '5', 'Active'], 'Happy', '139', '8', 'Active'], ['14-11-2017', '4005', ['15-11-2017', '4880', 'Happy', '164', '4', 'Active'], ['16-11-2017', '4136', 'Happy', '137', '5', 'Active'], 'Happy', '22', '6', ['18-11-2017', '570', 'Neutral', '17', '5', 'Active'], ['19-11-2017', '269', 'Happy', '9', '6', 'Active'], ['20-11-2017', '4275', 'Happy', '145', '5', 'Inactive'], ['21-11-2017', '5999', 'Happy', '192', '6', 'Inactive'], ['22-11-2017', '4421', 'Happy', '146', '5', 'Inactive'], ['23-11-2017', '6930', 'Happy', '234', '6', 'Inactive'], ['24-11-2017', '5195', 'Happy', '167', '5', 'Inactive'], ['25-11-2017', '546', 'Happy', '16', '6', 'Inactive'], ['26-11-2017', '493', 'Happy', '17', '7', 'Active'], ['27-11-2017', '995', 'Happy', '32', '6', 'Active'], ['28-11-2017', '1163', 'Neutral', '35', '7', 'Active'], ['29-11-2017', '6676', 'Sad', '220', '6', 'Active'], ['30-11-2017', '3608', 'Happy', '116', '5', 'Active'], ['01-12-2017', '774', 'Happy', '23', '6', 'Active'], ['02-12-2017', '1421', 'Happy', '44', '7', 'Active'], ['03-12-2017', '4064', 'Happy', '131', '8', 'Active'], ['04-12-2017', '2725', 'Happy', '86', '8', 'Active'], ['05-12-2017', '5934', 'Happy', '194', '7', 'Active'], ['06-12-2017', '1867', 'Happy', '60', '8', 'Active'], ['07-12-2017', '3721', 'Sad', '121', '5', 'Active'], ['08-12-2017', '2374', 'Neutral', '76', '4', 'Inactive'], ['09-12-2017', '2909', 'Neutral', '93', '3', 'Active'], ['10-12-2017', '1648', 'Sad', '53', '3', 'Active'], ['11-12-2017', '799', 'Sad', '25', '4', 'Inactive'], ['12-12-2017', '7102', 'Neutral', '227', '5', 'Active'], ['13-12-2017', '3941', 'Neutral', '125', '5', 'Active'], ['14-12-2017', '7422', 'Happy', '243', '5', 'Active'], ['15-12-2017', '437', 'Neutral', '14', '3', 'Active'], ['16-12-2017', '1231', 'Neutral', '39', '4', 'Active'], ['17-12-2017', '1696', 'Sad', '55', '4', 'Inactive'], ['18-12-2017', '4921', 'Neutral', '158', '5', 'Active'], ['19-12-2017', '221', 'Sad', '7', '5', 'Active'], ['20-12-2017', '6500', 'Neutral', '213', '5', 'Active'], ['21-12-2017', '3575', 'Neutral', '116', '5', 'Active'], ['22-12-2017', '4061', 'Sad', '129', '5', 'Inactive'], ['23-12-2017', '651', 'Sad', '21', '5', 'Inactive'], ['24-12-2017', '753', 'Sad', '28', '4', 'Inactive'], ['25-12-2017', '518', 'Sad', '16', '3', 'Inactive'], '5537', 'Happy', '180', '4', 'Active'], ['26-12-2017', '4108', 'Neutral', '138', '5', 'Active'], '5376', 'Happy', '176', '5', 'Active'], ['27-12-2017', ['28-12-2017', ['29-12-2017', '3066', 'Neutral', '99', '4', 'Active'], ['30-12-2017', '177', 'Sad', '5', '5', 'Inactive'], ['31-12-2017', '36', 'Sad', '1', '3', 'Inactive'], ['01-01-2018', '299', 'Sad', '10', '3', 'Inactive'], ['02-01-2018', '1447', 'Neutral', '47', '3', 'Inactive'], . | '01-01-2018', Γ'03-01-2018', '2599', 'Neutral', '84', '2', 'Inactive'], Γ'04-01-2018', '702', 'Sad', '23', '3', 'Inactive'], '133', 'Sad', '4', '2', 'Inactive'], ['05-01-2018', ['06-01-2018', '153', 'Happy', '0', '8', 'Inactive'], ['07-01-2018', '500', 'Neutral', '0', '5', 'Active'], ['08-01-2018', '2127', 'Neutral', '0', '5', 'Inactive'], ['09-01-2018', '2203', 'Happy', '0', '5', 'Active']], dtype='<U10') In [11]: date=data[::,0] step\_counts=data[::,1] mood=data[::,2] calories\_burnt=data[::,3] hours\_of\_sleep=data[::,4] activity=data[::,5] In [12]: array(['06-10-2017', '07-10-2017', '08-10-2017', '09-10-2017', '10-10-2017', '11-10-2017', '12-10-2017', '13-10-2017', '14-10-2017', '15-10-2017', '16-10-2017', '17-10-2017', '18-10-2017', '19-10-2017', '20-10-2017', '21-10-2017' '22-10-2017', '23-10-2017', '24-10-2017', '25-10-2017' '26-10-2017', '27-10-2017', '28-10-2017', '29-10-2017', '30-10-2017', '31-10-2017', '01-11-2017', '02-11-2017', '03-11-2017', '04-11-2017', '05-11-2017', '06-11-2017' '07-11-2017', '08-11-2017', '09-11-2017', '10-11-2017' '11-11-2017', '12-11-2017', '13-11-2017', '14-11-2017', '15-11-2017', '16-11-2017', '17-11-2017', '18-11-2017' '19-11-2017', '20-11-2017', '21-11-2017', '22-11-2017' '23-11-2017', '24-11-2017', '25-11-2017', '26-11-2017', '27-11-2017', '28-11-2017', '29-11-2017', '30-11-2017', '01-12-2017', '02-12-2017', '03-12-2017', '04-12-2017', '05-12-2017', '06-12-2017', '07-12-2017', '08-12-2017', '09-12-2017', '10-12-2017', '11-12-2017', '12-12-2017', '13-12-2017', '14-12-2017', '15-12-2017', '16-12-2017', '17-12-2017', '18-12-2017', '19-12-2017', '20-12-2017', '21-12-2017', '22-12-2017', '23-12-2017', '24-12-2017', '25-12-2017', '26-12-2017', '27-12-2017', '28-12-2017', '29-12-2017', '30-12-2017', '31-12-2017', '01-01-2018', '02-01-2018', '03-01-2018', '04-01-2018', '05-01-2018', '06-01-2018', '07-01-2018', '08-01-2018', '09-01-2018'], dtype='<U10') In [13]: step\_counts array(['5464', '6041', '25', '5461', '6915', '4545', '4340', '1230', '61', '4687', '4732', '3519', '1580', '2822', '181', '1258', '3148', '3881', '4037', '202', '292', '330', '2209', '3158', '4383', '4550', '4435', '4779', '1831', '2255', '539', '5464', '6041' '4033', '6314', '614', '3149', '4005', '4880', '4068', '4683', '4136', '705', '570', '269', '4275', '5999', '4421', '6930', '5195', '546', '493', '995', '1163', '6676', '3608', '774', '1421', '4136', '705', '4064', '2725', '5934', '1867', '3721', '2374', '2909', '1648', '799', '7102', '3941', '7422', '437', '1231', '1696', '4921', '221', '6500', '3575', '4061', '651', '753', '518', '5537', '4108', '5376', '3066', '177', '36', '299', '1447', '2599', '702', '133', '153', '500', '2127', '2203'], dtype='<U10') In [16]: step\_counts=np.array(step\_counts,dtype="int") step\_counts Out[16]: array([5464, 6041, 25, 5461, 6915, 4545, 4340, 1230, 61, 1258, 3148, 4687, 4732, 3519, 1580, 2822, 181, 3158, 4383, 3881, 4037, 202, 292, 330, 2209, 4550, 4435, 4779, 1831, 2255, 539, 5464, 6041, 4068, 4683, 4033, 6314, 614, 3149, 4005, 4880, 4136, 705, 570, 269, 4275, 5999, 4421, 6930, 5195, 546, 493, 995, 1163, 6676, 3608, 774, 1421, 4064, 2725, 5934, 1867, 3721, 2374, 2909, 1648, 799, 7102, 3941, 7422, 437, 1231, 1696, 4921, 221, 6500, 3575, 753, 518, 5537, 4108, 5376, 3066, 177, 36, 299, 4061, 651, 1447, 2599, 702, 133, 153, 500, 2127, 2203]) In [17]: calories\_burnt=np.array(calories\_burnt,dtype="int") calories\_burnt array([181, 197, 0, 174, 223, 149, 140, 38, 1, 40, 101, 152, 150, Out[17]: 113, 49, 86, 6, 99, 143, 125, 129, 9, 10, 72, 150, 6, 141, 156, 57, 72, 17, 181, 197, 131, 154, 137, 193, 19, 101, 9, 145, 192, 146, 234, 167, 16, 17, 139, 164, 137, 22, 17, 32, 35, 220, 116, 23, 44, 131, 86, 194, 60, 121, 76, 93, 53, 25, 227, 125, 243, 14, 39, 55, 158, 7, 213, 116, 129, 21, 28, 16, 180, 138, 176, 99, 5, 1, 10, 47, 84, 23, Ο, Θ, 0]) In [18]: hours\_of\_sleep=np.array(hours\_of\_sleep,dtype="int") hours\_of\_sleep array([5, 8, 5, 4, 5, 6, 6, 7, 5, 6, 8, 5, 6, 7, 5, 6, 8, 5, 4, 5, 6, 8, Out[18]: 5, 6, 5, 8, 5, 4, 5, 4, 5, 4, 3, 2, 9, 5, 6, 4, 5, 8, 4, 5, 6, 5, 6, 5, 6, 5, 6, 5, 6, 7, 6, 7, 6, 5, 6, 7, 8, 8, 7, 8, 5, 4, 3, 3, 4, 5, 5, 5, 3, 4, 4, 5, 5, 5, 5, 5, 5, 4, 3, 4, 5, 5, 4, 5, 3, 3, 3, 2, 3, 2, 8, 5, 5, 5]) In [19]: mood array(['Neutral', 'Sad', 'Sad', 'Neutral', 'Sad', 'Sad', 'Sad', 'Sad', 'Sad', 'Sad', 'Happy', 'Sad', 'Sad', 'Sad', 'Sad' 'Neutral', 'Happy', 'Neutral', 'Neutral', 'Sad', 'Sad', 'Neutral', 'Neutral', 'Neutral', 'Sad', 'Happy', 'Neutral', 'Sad', 'Neutral', 'Neutra 'Neutral', 'Neutral', 'Sad', 'Happy', 'Neutral', 'Neutral', 'Happy'], dtype='<U10') In [20]: activity array(['Inactive', 'Inactive', 'Inactive', 'Active', 'Inactive', 'Inactive', 'Inactive', 'Inactive', 'Inactive', 'Inactive', 'Active', 'Inactive', 'Active', 'Inactive', 'Inactive', 'Inactive', 'Active', 'Inactive', 'Inactive', 'Inactive', 'Inactive', 'Active', 'Active', 'Active', 'Active', 'Active', 'Active', 'Active', 'Inactive', 'Inactive', 'Inactive', 'Inactive', 'Inactive', 'Active', 'Inactive', 'Active', 'Act 'Active', 'Inactive', 'Inactive', 'Inactive', 'Inactive', 'Inactive', 'Inactive', 'Active', 'Inactive', 'Active'], dtype='<U10') np.mean(step\_counts) 2935.9375 Out[21]: In [23]: np.unique(mood, return\_counts=True) (array(['Happy', 'Neutral', 'Sad'], dtype='<U10'), array([40, 27, 29]))</pre> In [24]: np.unique(activity, return\_counts=True) (array(['Active', 'Inactive'], dtype='<U10'), array([42, 54]))</pre> Out[24]: np.max(step\_counts) Out[25]: np.argmax(step\_counts) Out[26]: date[69] '14-12-2017' date[np.argmax(step\_counts)] '14-12-2017' mood=="Sad" Out[29]: array([False, True, True, True, False, True, True, True, True, True, True, False, True, True, True, False, True, False, False, False, False, False, False, True, False, False, True, True, False, False, False, False, False, True, False, True, False, False, True, True, True, True, False, False, False, True, True, True, False, False, True, True, False, False, False, False]) In [30]: step\_counts[mood=="Sad"] array([6041, 25, 5461, 4545, 4340, 1230, 61, 1258, 3148, 4687, 3519, 1580, 2822, 181, 6676, 3721, 1648, 799, 1696, 221, 4061, 651, 753, 518, 177, 36, 299, 702, 133]) In [31]: np.mean(step\_counts[mood=="Sad"]) 2103.0689655172414 Out[31]: In [32]: np.mean(step\_counts[mood=="Neutral"]) 3153.77777777778 Out[32]: In [34]: np.mean(step\_counts[mood=="Happy"]) 3392.725 Out[34]: In [35] step\_counts>4000 array([ True, True, False, True, True, True, False, False, False, False, True, True, False, False, False, False, True, False, True, False, False, False, True, True, True, False, False, True, True, True, True, True, True, False, False, True, True, False, False, False, True, True, True, True, False, False, False, False, True, False, False, True, False, True, False, False, False, False, False, True, False, True, False, False, False, True, False, True, False, False, False, True, True, False, False]) In [36]: mood[step\_counts>4000] array(['Neutral', 'Sad', 'Sad', 'Sad', 'Sad', 'Sad', 'Happy', 'Neutral', 'Neutral', 'Happy', 'Happy', 'Happy', 'Neutral', 'Happy', 'Sad', 'Happy', 'Happy', 'Neutral', 'Sad', 'Happy', 'Neutral', 'Happy'], dtype='<U10') In [38]: np.unique(mood[step\_counts>4000], return\_counts=True) (array(['Happy', 'Neutral', 'Sad'], dtype='<U10'), array([22, 9, 7]))</pre> Out[38] In [39]: np.unique(mood[step\_counts<2000], return\_counts=True)</pre> (array(['Happy', 'Neutral', 'Sad'], dtype='<U10'), array([13, 8, 18]))</pre> Out[39]: np.unique(mood[hours\_of\_sleep<4], return\_counts=True)</pre> (array(['Happy', 'Neutral', 'Sad'], dtype='<U10'), array([1, 5, 6]))</pre> np.unique(mood[hours\_of\_sleep>5], return\_counts=True) (array(['Happy', 'Neutral', 'Sad'], dtype='<U10'), array([20, 3, 10])) Out[42]: In [45]: np.unique(mood[activity=="Inactive"], return\_counts=True) (array(['Happy', 'Neutral', 'Sad'], dtype='<U10'), array([16, 13, 25]))</pre> In [46]: np.unique(mood[activity=="Active"], return\_counts=True) (array(['Happy', 'Neutral', 'Sad'], dtype='<U10'), array([24, 14, 4]))</pre> Out[46]: np.mean(hours\_of\_sleep[mood=="Happy"]) np.mean(hours\_of\_sleep[mood=="Sad"]) 5.0344827586206895 Out[49]: In [ ]: **Vectorization** In [53]: a=np.arange(1,11)array([ 1, 2, 3, 4, 5, 6, 7, 8, 9, 10]) Out[53]: In [54]: import math math.log <function math.log> Out[54]: In [55]: l=[ 1, 2, 3, 4, 5, 6, 7, 8, 9, 10] 1\_e=[] for i in 1: l\_e.append(math.log(i)) [0.0, Out[55]: 0.6931471805599453, 1.0986122886681098, 1.3862943611198906, 1.6094379124341003, 1.791759469228055, 1.9459101490553132, 2.0794415416798357, 2.1972245773362196, 2.302585092994046] np.log(a) , 0.69314718, 1.09861229, 1.38629436, 1.60943791, 1.79175947, 1.94591015, 2.07944154, 2.19722458, 2.30258509]) y=np.vectorize(math.log) y(a) , 0.69314718, 1.09861229, 1.38629436, 1.60943791, array([0. Out[58]: 1.79175947, 1.94591015, 2.07944154, 2.19722458, 2.30258509]) In [59]: math.log(a) Traceback (most recent call last) /var/folders/hd/9z4dczb56dj54lb7q8w7s4zw0000gn/T/ipykernel\_40565/1428990103.py in <module> ----> 1 math.log(a) TypeError: only size-1 arrays can be converted to Python scalars In [66]: def custom\_function(x): **if(i%2==0)**: return x\*\*2 else: return x\*\*3 In [60]: array([ 1, 2, 3, 4, 5, 6, 7, 8, 9, 10]) In [63]: l=[ 1, 2, 3, 4, 5, 6, 7, 8, 9, 10] l\_e=[] for i in 1: l\_e.append(custom\_function(i)) l\_e [1, 4, 27, 16, 125, 36, 343, 64, 729, 100] In [72]: array([ 1, 2, 3, 4, 5, 6, 7, 8, 9, 10]) In [69]: def custom\_function(x): **if(**x**%2**==0): return x\*\*2 return x\*\*3 In [70]: y=np.vectorize(custom\_function) <numpy.vectorize at 0x7fdb40ae62b0> In [71]: y(a) array([ 1, 4, 27, 16, 125, 36, 343, 64, 729, 100]) In [ ]: 3D arrays # 1 Dimensional Arrays --> Vectors # 2 Dimensional Arrays --> Matrix # 3 Dimensional Arrays --> Tensors a=np.arange(1,25).reshape((2,3,4))array([[[ 1, 2, 3, 4], [ 5, 6, 7, 8], [ 9, 10, 11, 12]], [[13, 14, 15, 16], [17, 18, 19, 20], [21, 22, 23, 24]]]) In [74]: a.ndim Out[74]: a.shape Out[75]: (2, 3, 4) In [76]: a.size Out[76]: In [77]: len(a) Out[77]: 2 a=np.array([[[ 100, 15, 25, 36],[ 1, 51, 62, 77],[ 81, 9,101, 11]],[[12, 130,144, 155],[196, 17,8, 19],[2, 21,225, 23]]]) array([[[100, 15, 25, [ 1, 51, 62, 77], [ 81, 9, 101, 11]], [[ 12, 130, 144, 155], [196, 17, 8, 19], [ 2, 21, 225, 23]]]) np.max(a,axis=0)array([[100, 130, 144, 155], [196, 51, 62, 77], [ 81, 21, 225, 23]]) In [80]: np.max(a,axis=-3)array([[100, 130, 144, 155], [196, 51, 62, 77], [ 81, 21, 225, 23]]) In [82]: np.min(a,axis=1) array([[ 1, 9, 25, 11], [ 2, 17, 8, 19]]) np.min(a,axis=-2)array([[ 1, 9, 25, 11], [ 2, 17, 8, 19]]) np.sort(a,axis=2) array([[[ 15, 25, 36, 100], [ 1, 51, 62, 77], [ 9, 11, 81, 101]], [[ 12, 130, 144, 155], [ 8, 17, 19, 196], [ 2, 21, 23, 225]]]) In [86]: np.sort(a,axis=-1) array([[[ 15, 25, 36, 100], [ 1, 51, 62, 77], [ 9, 11, 81, 101]], [[ 12, 130, 144, 155], [ 8, 17, 19, 196], [ 2, 21, 23, 225]]]) **Use Case: Image Manipulation using Numpy** In [ ]: In [ ]: