

Loading and Saving Data with Pandas

The pygmentize command-line tool can be used to display a text file in IPython or Jupyter. It can be installed with `conda install -c conda-forge pygments` or with pip. We can take a look at the CSV with this tool:

```
In [4]: !pygmentize -l text itunes_data.csv
```

Track,Composer,Milliseconds,Bytes,UnitPrice,Genre,Album,Artist
 All the Best Cowboys Have Daddy Issues,,2555492,211743651,1.99,TV Shows,"Lost
 t, Season 1",Lost
 Beira Mar,Gilberto Gil,295444,9597994,0.99,Latin,Unplugged,Eric Clapton
 Brasil,"Milton Nascimento, Fernando Brant",155428,5252560,0.99,Latin,Milton N
 ascimento Ao Vivo,Milton Nascimento
 Ben Franklin,,1271938,264168080,1.99,Comedy,"The Office, Season 3",The Office
 O Último Romântico (Ao Vivo),,231993,7692697,0.99,Latin,Lulu Santos - RCA 100
 Anos De Música - Álbum 02,Lulu Santos
 Freewheel Burning,,265952,8713599,0.99,Metal,Living After Midnight,Judas Prie
 st
 That's The Way,Robert Plant,343431,11248455,0.99,Rock,BBC Sessions [Disc 2]
 [Live],Led Zeppelin
 Mellowship Slinky In B Major,Anthony Kiedis/Chad Smith/Flea/John Frusciante,2
 40091,7971384,0.99,Alternative & Punk,Blood Sugar Sex Magik,Red Hot Chili Pep
 pers
 "Diga Lá, Coração",,255921,8280636,0.99,Latin,Meus Momentos,Gonzaguinha
 Come As You Are,Kurt Cobain,219219,7123357,0.99,Rock,Nevermind,Nirvana
 The Spirit Of Radio,Geddy Lee And Alex Lifeson/Geddy Lee And Neil Peart/Rush,
 299154,9862012,0.99,Rock,Retrospective I (1974-1980),Rush
 Midnight Blue,David Coverdale/Earl Slick,298631,9750990,0.99,Rock,Into The Li
 ght,David Coverdale
 Se Liga,,410409,13559173,0.99,Hip Hop/Rap,Os Cães Ladram Mas A Caravana Não P
 ára,Planet Hemp
 Carnival Of Sorts,R.E.M.,233482,7669658,0.99,Alternative & Punk,The Best Of
 R.E.M.: The IRS Years,R.E.M.
 Paranoid,"A. F. Iommi, W. Ward, T. Butler, J. Osbourne",176352,5729813,0.99,M
 etal,Tribute,Ozzy Osbourne
 Got That Feeling,Mike Patton,140852,4643227,0.99,Alternative & Punk,Album Of
 The Year,Faith No More
 What Is And What Should Never Be,"Jimmy Page, Robert Plant",287973,9369385,0.
 99,Rock,Led Zeppelin II,Led Zeppelin
 The Zephyr Song,"Anthony Kiedis, Flea, John Frusciante, and Chad Smith",23296
 0,7690312,0.99,Rock,By The Way,Red Hot Chili Peppers
 Run Silent Run Deep,Bruce Dickinson/Steve Harris,275408,4407296,0.99,Metal,No
 Prayer For The Dying,Iron Maiden
 Realidade Virtual,Bino Farias/Da Gama/Lazão/Toni Garrido,195239,6503533,0.99,
 Reggae,Acústico MTV [Live],Cidade Negra
 Há Quanto Tempo,,270027,9004470,0.99,Latin,Jota Quest-1995,Jota Quest
 Oprah,,6635,224313,0.99,Alternative & Punk,Body Count,Body Count
 As Aparências Enganam,,247379,8014346,0.99,Latin,Elis Regina-Minha História,E
 lis Regina
 Confidence Man,,2615244,223756475,1.99,TV Shows,"Lost, Season 1",Lost
 Os Alquimistas Estão Chegando,,367281,12304520,0.99,Latin,Jorge Ben Jor 25 An
 os,Jorge Ben
 Springsville,J. Carisi,207725,6776219,0.99,Jazz,Miles Ahead,Miles Davis
 Wake Up,Alanis Morissette & Glenn Ballard,293485,9703359,0.99,Rock,Jagged Lit
 tle Pill,Alanis Morissette
 Ave Maria,Franz Schubert,338243,5605648,0.99,Classical,A Soprano Inspired,"Br
 itten Sinfonia, Ivor Bolton & Lesley Garrett"
 A Banda,,132493,4349539,0.99,Latin,Minha Historia,Chico Buarque
 Fight Fire With Fire,Metallica,285753,9420856,0.99,Metal,Ride The Lightning,M
 etallica
 Sound of a Gun,,260154,4234990,0.99,Alternative,Revelations,Audioslave
 RV,,223242,7288162,0.99,Alternative & Punk,Angel Dust,Faith No More
 É que Nessa Encarnação Eu Nasci Manga,Lucina/Luli,196519,6568081,0.99,Pop,Axé

Bahia 2001, Various Artists
 Do The Evolution, Eddie Vedder & Stone Gossard, 225462, 7377286, 0.99, Rock, Live On Two Legs [Live], Pearl Jam
 Prowler, Steve Harris, 255634, 4091904, 0.99, Metal, A Real Dead One, Iron Maiden
 They Can't Take That Away From Me, George Gershwin/Ira Gershwin, 161227, 5240043, 0.99, Easy Listening, My Way: The Best Of Frank Sinatra [Disc 1], Frank Sinatra
 The Real Problem, , 11650, 387360, 0.99, Alternative & Punk, Body Count, Body Count
 Tempus Fugit, Miles Davis, 231784, 7548434, 0.99, Jazz, The Essential Miles Davis [Disc 1], Miles Davis
 Diwali, , 1279904, 252726644, 1.99, TV Shows, "The Office, Season 3", The Office
 Bring'em Back Alive, Audioslave/Chris Cornell, 329534, 7911634, 0.99, Rock, Audioslave, Audioslave
 Time Is On My Side, Jerry Ragavoy, 179983, 5855836, 0.99, Rock, "Hot Rocks, 1964-1971 (Disc 1)", The Rolling Stones
 The Ocean, John Bonham/John Paul Jones, 271098, 8846469, 0.99, Rock, Houses Of The Holy, Led Zeppelin
 Minority, Billie Joe Armstrong -Words Green Day -Music, 168803, 5535061, 0.99, Alternative & Punk, International Superhits, Green Day
 The Messenger, Daniel Lanois, 212062, 6975437, 0.99, Alternative & Punk, Tangents, The Tea Party
 Quanta (Live), , 357485, 11774865, 0.99, Latin, Quanta Gente Veio Ver (Live), Gilberto Gil
 Ironic, Alanis Morissette & Glenn Ballard, 229825, 7598866, 0.99, Rock, Jagged Little Pill, Alanis Morissette
 Faraó Divindade Do Egito, , 228571, 7523278, 0.99, Latin, Olodum, Olodum
 "Nabucco: Chorus, ""Va, Pensiero, Sull'ali Dorate""", Giuseppe Verdi, 274504, 4498583, 0.99, Classical, Great Opera Choruses, "Chicago Symphony Chorus, Chicago Symphony Orchestra & Sir Georg Solti"
 Redundant, Billie Joe Armstrong -Words Green Day -Music, 198164, 6481753, 0.99, Alternative & Punk, International Superhits, Green Day
 Leave Us Leap, , 182726, 5898810, 0.99, Jazz, Up An' Atom, Gene Krupa
 Flight Of The Icarus, Adrian Smith/Bruce Dickinson, 230269, 3686400, 0.99, Metal, Piece Of Mind, Iron Maiden
 Adoled (Ocean), , 185103, 6009946, 0.99, Hip Hop/Rap, Os Cães Ladram Mas A Caravana Não Pára, Planet Hemp
 Let's See Action, Pete Townshend, 243513, 8078418, 0.99, Rock, My Generation - The Very Best Of The Who, The Who
 "Toccatà and Fugue in D Minor, BWV 565: I. Toccata", Johann Sebastian Bach, 153901, 2649938, 0.99, Classical, Bach: Toccata & Fugue in D Minor, Ton Koopman
 Blind Curve: Vocal Under A Bloodlight / Passing Strangers / Mylo / Perimeter Walk / Threshold, "Kelly, Mosley, Rothery, Trewaves", 569704, 18578995, 0.99, Rock, Misplaced Childhood, Marillion
 Dirty Little Thing, "Dave Kushner, Duff, Keith Nelson, Matt Sorum, Scott Weiland & Slash", 237844, 7732982, 0.99, Rock, Contraband, Velvet Revolver
 Só Tinha De Ser Com Você, Vários, 389642, 13085596, 0.99, Latin, Chill: Brazil (Disc 2), Antônio Carlos Jobim
 Slug, "Brian Eno, Bono, Adam Clayton, The Edge & Larry Mullen Jr.", 281469, 9295950, 0.99, Soundtrack, Original Soundtracks 1, Passengers
 Black Mountain Side, Jimmy Page, 132702, 4440602, 0.99, Rock, Led Zeppelin I, Led Zeppelin
 Pensamento, Bino/Da Gama/Ras Bernardo, 192391, 6399761, 0.99, Reggae, Cidade Negra - Hits, Cidade Negra
 Even Better Than The Real Thing, U2, 221361, 7279392, 0.99, Rock, Achtung Baby, U2
 Powerslave, Dickinson, 407823, 9791106, 0.99, Metal, Powerslave, Iron Maiden
 Loud Love, Chris Cornell, 297456, 9660953, 0.99, Rock, A-Sides, Soundgarden

2 Minutes To Midnight,Smith/Dickinson,366550,8799380,0.99,Metal,Live After De
 ath,Iron Maiden
 Out Of Exile,"Cornell, Commerford, Morello, Wilk",291291,9506571,0.99,Alterna
 tive & Punk,Out Of Exile,Audioslave
 Spank Thru,Kurt Cobain,190354,6186487,0.99,Rock,From The Muddy Banks Of The W
 ishkah [Live],Nirvana
 London Calling,Joe Strummer/Mick Jones,199706,6569007,0.99,Alternative & Pun
 k,The Singles,The Clash
 Break on Through,"Robby Krieger, Ray Manzarek, John Densmore, Jim Morrison",1
 49342,4943144,0.99,Rock,The Doors,The Doors
 We Are The Champions,Mercury,182883,5939794,0.99,Rock,News Of The World,Queen
 Hard Lovin' Man,"Blackmore, Gillan, Glover, Lord, Paice",431203,13931179,0.9
 9,Rock,Deep Purple In Rock,Deep Purple
 Jingo,M.Babatunde Olantunji,592953,19736495,0.99,Rock,Santana - As Years Go B
 y,Santana
 200 Years Old,Frank Zappa,272561,8912465,0.99,Rock,Bongo Fury,Frank Zappa & C
 aptain Beefheart
 Santa Clara Clareou,,380081,12524725,0.99,Latin,Jorge Ben Jor 25 Anos,Jorge B
 en
 Juventude Transviada (Ao Vivo),,278622,9183808,0.99,Latin,Cássia Eller - Cole
 ção Sem Limite [Disc 2],Cássia Eller
 Rollover D.J.,C. Cester/N. Cester,196702,6406517,0.99,Alternative & Punk,Get
 Born,JET
 Leave,Bill Berry-Peter Buck-Mike Mills-Michael Stipe,437968,14433365,0.99,Roc
 k,New Adventures In Hi-Fi,R.E.M.
 God Part II,"Bono/Clayton, Adam/Mullen Jr., Larry/The Edge",195604,6497570,0.
 99,Rock,Rattle And Hum,U2
 Cold Gin,Ace Frehley,262243,8609783,0.99,Rock,Greatest Kiss,Kiss
 Sister Morphine,Faithfull/Jagger/Richards,376215,12345289,0.99,Rock,No Securi
 ty,The Rolling Stones
 Nefertiti,Miles Davis,473495,15478450,0.99,Jazz,The Essential Miles Davis [Di
 sc 2],Miles Davis
 Take the Box,Luke Smith,199160,3281526,0.99,Pop,Frank,Amy Winehouse
 Good Riddance (Time Of Your Life),Billie Joe Armstrong -Words Green Day -Musi
 c,153600,5075241,0.99,Alternative & Punk,International Superhits,Green Day
 Can't Keep,Eddie Vedder,219428,7215713,0.99,Rock,Riot Act,Pearl Jam
 Wall Of Denial,Doyle Bramhall/Stevie Ray Vaughan,336927,11085915,0.99,Blues,I
 n Step,Stevie Ray Vaughan & Double Trouble
 If God Will Send His Angels,"Bono, The Edge, Adam Clayton, and Larry Mullen",
 322533,10563329,0.99,Rock,Pop,U2
 Viradouro,Dadinho/Gilbreto Gomes/Gustavo/P.C. Portugal/R. Mocoto,344320,11484
 362,0.99,Latin,Sambas De Enredo 2001,Various Artists
 Surrender,U2,333505,11221406,0.99,Rock,War,U2
 Funky Monks,Anthony Kiedis/Chad Smith/Flea/John Frusciante,323395,10708168,0.
 99,Alternative & Punk,Blood Sugar Sex Magik,Red Hot Chili Peppers
 Back in the Village,Dickinson/Smith,320548,7696518,0.99,Metal,Powerslave,Iron
 Maiden
 Freedom For My People,"Mabins, Macie/Magee, Sterling/Robinson, Bobby",38164,1
 249764,0.99,Rock,Rattle And Hum,U2
 Um Jantar Pra Dois,,244009,8021589,0.99,Latin,The Best of Ed Motta,Ed Motta
 Hang 'Em High,Alex Van Halen/David Lee Roth/Edward Van Halen/Michael Anthony,
 210259,6872314,0.99,Rock,Diver Down,Van Halen
 Spirit's in the Material World,G M Sumner,181133,5986622,0.99,Rock,The Police
 Greatest Hits,The Police
 Maquinarama,Chico Amaral/Samuel Rosa,245629,8213710,0.99,Rock,Maquinarama,Ska
 nk

Believe,,310778,10317185,0.99,Jazz,Heart of the Night,Spyro Gyra
 The Wait,Killing Joke,295418,9688418,0.99,Metal,Garage Inc. (Disc 2),Metallic
 a
 Near Wild Heaven,Bill Berry/Michael Stipe/Mike Mills/Peter Buck,199862,661000
 9,0.99,Alternative & Punk,Out Of Time,R.E.M. Feat. Kate Pearson
 Desordem,Charles Gavin/Marcelo Fromer/Sérgio Britto,213289,7067340,0.99,Alter
 native & Punk,Volume Dois,Titãs
 Canário Do Reino,,139337,4552858,0.99,Latin,Serie Sem Limite (Disc 2),Tim Mai
 a
 O Pulso,Titãs,199131,6566998,0.99,Alternative & Punk,Acústico,Titãs
 Fear Of The Dark,Steve Harris,431333,6906078,0.99,Metal,A Real Live One,Iron
 Maiden
 Every Little Thing She Does is Magic,G M Sumner,261120,8646853,0.99,Rock,The
 Police Greatest Hits,The Police
 O Livro Dos Dias,Renato Russo,257253,8570929,0.99,Latin,A TempestadeTempestad
 e Ou O Livro Dos Dias,Legião Urbana
 Arc,Pearl Jam,65593,2099421,0.99,Rock,Riot Act,Pearl Jam
 All My Life,Foo Fighters,263653,8665545,0.99,Alternative & Punk,One By One,Fo
 o Fighters
 Put You Down,Jerry Cantrell,196231,6420530,0.99,Rock,Facelift,Alice In Chains
 Já Foi,Mônica Marianno,245681,8094872,0.99,World,Demorou...,Mônica Marianno
 Gatas Extraordinárias,,212506,7095702,0.99,Latin,Cássia Eller - Coleção Sem L
 imite [Disc 2],Cássia Eller
 Carta Ao Tom 74,,162560,5382354,0.99,Bossa Nova,Vinícius De Moraes - Sem Limi
 te,Toquinho & Vinícius
 Babyface,U2; Bono,241998,7942573,0.99,Rock,Zooropa,U2
 Light My Way,Audioslave/Chris Cornell,303595,7289084,0.99,Rock,Audioslave,Aud
 ioslave
 Solar,"Milton Nascimento, Fernando Brant",156212,5098288,0.99,Latin,Milton Na
 scimento Ao Vivo,Milton Nascimento
 Something Nice Back Home,,2612779,484711353,1.99,Drama,"LOST, Season 4",Lost
 Murder On the Rising Star,,2935894,551759986,1.99,Sci Fi & Fantasy,"Battlesta
 r Galactica (Classic), Season 1",Battlestar Galactica (Classic)
 Think,Lowman Pauling,166739,5513208,0.99,R&B/Soul,Sex Machine,James Brown
 Ando Meio Desligado,Caetano Veloso,195813,6547648,0.99,Latin,Chill: Brazil (D
 isc 1),Marcos Valle
 Trac Trac,Fito Paez/Herbert Vianna,231653,7638256,0.99,Latin,Arquivo II,Os Pa
 ralamas Do Sucesso
 Whiplash,"James Hetfield, Lars Ulrich",249208,8102839,0.99,Metal,Kill 'Em Al
 l,Metallica
 Brave New World,Bruce Dickinson/David Murray/Steve Harris,378984,15161472,0.9
 9,Rock,Brave New World,Iron Maiden
 A Statistic,,6373,211997,0.99,Alternative & Punk,Body Count,Body Count
 Manifest Destiny,Toby Smith,382197,12676962,0.99,Electronica/Dance,The Return
 Of The Space Cowboy,Jamiroquai
 Falamansa Song,,237165,7921313,0.99,Latin,Deixa Entrar,Falamansa
 Song For Lorraine,Jay Beckenstein,240091,8101723,0.99,Jazz,Morning Dance,Spyr
 o Gyra
 Diamante De Mendigo,,206053,6775101,0.99,Rock,Raul Seixas,Raul Seixas
 Corcovado (Quiet Nights Of Quiet Stars),,205662,6687994,0.99,Jazz,Warner 25 A
 nos,Antônio Carlos Jobim
 KKK Bitch,,173008,5709631,0.99,Alternative & Punk,Body Count,Body Count
 União Da Ilha,"Dito/Djalma Falcao/Ilha, Almir Da/Márcio André",330945,1110094
 5,0.99,Latin,Sambas De Enredo 2001,Various Artists
 Your Mirror,Mick Hucknall,240666,7893821,0.99,Rock,Greatest Hits,Lenny Kravit
 z

Maybe I'm A Leo,Ian Gillan/Ian Paice/Jon Lord/Ritchie Blackmore/Roger Glover,2
 90455,9502646,0.99,Rock,Machine Head,Deep Purple
 Not The Doctor,Alanis Morissette & Glenn Ballard,227631,7604601,0.99,Rock,Jag
 ged Little Pill,Alanis Morissette
 Suck My Kiss,Anthony Kiedis/Chad Smith/Flea/John Frusciante,217234,7129137,0.
 99,Alternative & Punk,Blood Sugar Sex Magik,Red Hot Chili Peppers
 The Unforgettable Fire,U2,295183,9684664,0.99,Rock,The Best Of 1980-1990,U2
 You Learn,Alanis Morissette & Glenn Ballard,239699,7824837,0.99,Rock,Jagged L
 ittle Pill,Alanis Morissette
 Losing My Religion,Bill Berry/Michael Stipe/Mike Mills/Peter Buck,269035,8885
 672,0.99,Alternative & Punk,Out Of Time,R.E.M. Feat. Kate Pearson
 "Concert pour 4 Parties de V**les, H. 545: I. Prelude",Marc-Antoine Charpentier,
 110266,1973559,0.99,Classical,"Charpentier: Divertissements, Airs & Concer
 ts",Les Arts Florissants & William Christie
 Flip The Switch,Jagger/Richards,252421,8336591,0.99,Rock,No Security,The Roll
 ing Stones
 Enquanto O Mundo Explode,Chico Science,88764,2968650,0.99,Latin,Afrociberdeli
 a,Chico Science & Nação Zumbi
 So Central Rain,R.E.M.,194768,6414550,0.99,Alternative & Punk,The Best Of R.
 E.M.: The IRS Years,R.E.M.
 Riviera Paradise,Stevie Ray Vaughan,528692,17232776,0.99,Blues,In Step,Stevie
 Ray Vaughan & Double Trouble
 Caffeine,,267937,8747367,0.99,Alternative & Punk,Angel Dust,Faith No More
 Palco (Live),,238315,8026622,0.99,Latin,Quanta Gente Veio Ver (Live),Gilberto
 Gil
 Walk On,"Adam Clayton, Bono, Larry Mullen, The Edge",296280,9800861,0.99,Roc
 k,All That You Can't Leave Behind,U2
 Layla,Clapton/Gordon,430733,14115792,0.99,Blues,The Cream Of Clapton,Eric Cla
 pton
 End Of The Night,"Robby Krieger, Ray Manzarek, John Densmore, Jim Morrison",1
 72695,5589732,0.99,Rock,The Doors,The Doors
 Revolution,,256026,8371254,0.99,Rock,"Pure Cult: The Best Of The Cult (For Ro
 ckers, Ravers, Lovers & Sinners) [UK]",The Cult
 Sweet Child O' Mine,,356424,5879347,0.99,Rock,Appetite for Destruction,Guns
 N' Roses
 Heaven Can Wait,,440555,10577743,0.99,Rock,Live At Donington 1992 (Disc 2),Ir
 on Maiden
 Love Comes,"Darius ""Take One"" Minwalla/Jon Auer/Ken Stringfellow/Matt Harri
 s",199923,3240609,0.99,Rock,Every Kind of Light,The Posies
 The 23rd Psalm,,2610416,487401604,1.99,TV Shows,"Lost, Season 2",Lost
 Dude (Looks Like A Lady),"Steven Tyler, Joe Perry, Desmond Child",264855,8679
 940,0.99,Rock,Big Ones,Aerosmith
 Minas,"Milton Nascimento, Caetano Veloso",152293,4921056,0.99,Latin,Minas,Mil
 ton Nascimento
 Pride (In The Name Of Love),U2,230243,7549085,0.99,Rock,The Best Of 1980-199
 0,U2
 Put The Finger On You,"Angus Young, Malcolm Young, Brian Johnson",205662,6713
 451,0.99,Rock,For Those About To Rock We Salute You,AC/DC
 Get On The Snake,Chris Cornell/Kim Thayil,225123,7313744,0.99,Rock,A-Sides,So
 undgarden
 A Festa Do Santo Reis,,159791,5204995,0.99,Latin,Serie Sem Limite (Disc 2),Ti
 m Maia
 Wanted Dread And Alive,,260310,8670933,0.99,Reggae,Greatest Hits,Lenny Kravit
 z
 Tanto Tempo,Vários,170292,5572240,0.99,Latin,Chill: Brazil (Disc 2),Antônio C
 arlos Jobim

Infinite Dreams, Steve Harris, 369005, 8858669, 0.99, Metal, Seventh Son of a Seventh Son, Iron Maiden

Feirinha da Pavuna/Luz do Repente/Bagaço da Laranja, "Arlindo Cruz/Franco/Marquinhos PQD/Negro, Jovelina Pérolo/Zeca Pagodinho", 107206, 3593684, 0.99, Latin, Ao Vivo [IMPORT], Zeca Pagodinho

Motéis, 213498, 7041077, 0.99, Latin, Roda De Funk, Funk Como Le Gusta

Corduroy, Pearl Jam & Eddie Vedder, 305293, 9991106, 0.99, Rock, Live On Two Legs [Live], Pearl Jam

Why Go, Jeff Ament, 200254, 6539287, 0.99, Rock, Ten, Pearl Jam

"Hail, Hail", Stone Gossard & Eddie Vedder & Jeff Ament & Mike McCready, 223764, 7364206, 0.99, Rock, Live On Two Legs [Live], Pearl Jam

Flight Of The Rat, "Blackmore, Gillan, Glover, Lord, Paice", 478302, 15563967, 0.99, Rock, Deep Purple In Rock, Deep Purple

Groovus Interruptus, Jim Beard, 319373, 10602166, 0.99, Jazz, Outbreak, Dennis Chambers

Wrathchild, Steve Harris, 185808, 7434368, 0.99, Metal, Rock In Rio [CD1], Iron Maiden

Nene 2001, 284969, 9694508, 0.99, Soundtrack, Carnaval 2001, Various Artists

Nightrain, 268537, 4457283, 0.99, Rock, Appetite for Destruction, Guns N' Roses

Elderly Woman Behind The Counter In A Small Town, Dave Abbruzzese & Jeff Ament & Stone Gossard & Mike McCready & Eddie Vedder, 229328, 7509304, 0.99, Rock, Live On Two Legs [Live], Pearl Jam

The Outlaw Torn, "James Hetfield, Lars Ulrich", 588721, 19286261, 0.99, Metal, Load, Metallica

Battery, J. Hetfield/L. Ulrich, 312424, 10229577, 0.99, Metal, Master Of Puppets, Metallica

Lords Of The Backstage, "Kelly, Mosley, Rothery, Trewaves", 112875, 3741319, 0.99, Rock, Misplaced Childhood, Marillion

The River (Remix), The Tea Party, 343170, 11193268, 0.99, Alternative & Punk, Tangle

Bowels Of The Devil, 223216, 7324125, 0.99, Alternative & Punk, Body Count, Body Count

Don't Go Back To Rockville, R.E.M., 272352, 9010715, 0.99, Alternative & Punk, The Best Of R.E.M.: The IRS Years, R.E.M.

Macô, Chico Science, 249600, 8253934, 0.99, Latin, Afrociberdelia, Chico Science & Nação Zumbi

Love Is The Colour, R. Carless, 251585, 8419165, 0.99, Jazz, Blue Moods, Incognito

Without You, Van Halen, 390295, 12619558, 0.99, Rock, Van Halen III, Van Halen

Phantom Lord, "James Hetfield, Lars Ulrich, Dave Mustaine", 302053, 9817143, 0.99, Metal, Kill 'Em All, Metallica

Don't Take Your Love From Me, 282331, 9244238, 0.99, Jazz, Up An' Atom, Gene Krupa

On The Run, "Gilmour, Waters", 214595, 7206300, 0.99, Rock, Dark Side Of The Moon, Pink Floyd

Set It Off, Audioslave/Chris Cornell, 263262, 6321091, 0.99, Rock, Audioslave, Audioslave

Get Me Outta Here, C. Cester/N. Cester, 176274, 5729098, 0.99, Alternative & Punk, Get Born, JET

Surprise! You're Dead!, Faith No More, 147226, 4823036, 0.99, Alternative & Punk, The Real Thing, Faith No More

Linha Do Horizonte, Vários, 279484, 9275929, 0.99, Latin, Chill: Brazil (Disc 2), Antônio Carlos Jobim

Cigano, 304692, 10037362, 0.99, Latin, Djavan Ao Vivo - Vol. 02, Djavan

She Wears Black, G Harvey/R Hope-Taylor, 528666, 17617944, 0.99, Jazz, Blue Moods, Incognito

Losfer Words, Steve Harris, 252891, 6074756, 0.99, Metal, Powerslave, Iron Maiden

Blood Brothers, Steve Harris, 434442, 17379456, 0.99, Rock, Brave New World, Iron Maiden

iden

"War of the Gods, Pt. 2",,2923381,487899692,1.99,Sci Fi & Fantasy,"Battlestar Galactica (Classic), Season 1",Battlestar Galactica (Classic)
 Let There Be Rock,AC/DC,366654,12021261,0.99,Rock,Let There Be Rock,AC/DC
 The Negotiation,,1767851,371663719,1.99,Comedy,"The Office, Season 3",The Office
 Vida Boa,Fausto Nilo - Armandinho,281730,9411272,0.99,Latin,Prenda Minha,Caetano Veloso
 Fast And Loose,Clarke/Kilmister/Taylor,203337,6643350,0.99,Metal,Ace Of Spades,Motörhead
 They're Red Hot,Robert Johnson,71941,2382220,0.99,Alternative & Punk,Blood Sugar Sex Magik,Red Hot Chili Peppers
 Dr. Heckyll & Mr. Jive,,278465,9110403,0.99,Rock,The Best Of Men At Work,Men At Work
 Territorial Pissings,Kurt Cobain,143281,4613880,0.99,Rock,Nevermind,Nirvana
 The Pan Piper,Miles Davis,233769,7593713,0.99,Jazz,The Essential Miles Davis [Disc 1],Miles Davis
 Ali,Nando Reis/Samuel Rosa,306390,10110351,0.99,Rock,Maquinarama,Skank
 Sangue De Bairro,Chico Science,132231,4415557,0.99,Latin,Afrociberdelia,Chico Science & Nação Zumbi
 Beijo do Olhar,Mônica Marianno,252682,8369029,0.99,World,Demorou...,Mônica Marianno
 Pretinha,,265273,8914579,0.99,Jazz,Quanta Gente Veio ver--Bônus De Carnaval,Gilberto Gil
 Fortuneteller,"Blackmore, Glover, Turner, Lord, Paice",349335,11369671,0.99,Rock,Slaves And Masters,Deep Purple
 Surrender,,287634,9422926,0.99,Jazz,Heart of the Night,Spyro Gyra
 Killers,Paul Di'Anno/Steve Harris,309995,10009697,0.99,Rock,The Beast Live,Paul D'Ianno
 Be Quick Or Be Dead,Bruce Dickinson/Janick Gers,196911,3151872,0.99,Metal,A Real Live One,Iron Maiden
 Pau-De-Arara,"Guio De Moraes E Seus ""Parentes""/Luiz Gonzaga",191660,6340649,0.99,Soundtrack,As Canções de Eu Tu Eles,Gilberto Gil
 On Mercury,"Anthony Kiedis, Flea, John Frusciante, and Chad Smith",208509,6834762,0.99,Rock,By The Way,Red Hot Chili Peppers
 On A Plain,Kurt Cobain,196440,6390635,0.99,Rock,Nevermind,Nirvana
 "Lost (Pilot, Part 2)",,2436583,204995876,1.99,TV Shows,"Lost, Season 1",Lost
 O Bicho Tá Pregando,,171964,5683369,0.99,Hip Hop/Rap,Os Cães Ladram Mas A Caravana Não Pára,Planet Hemp
 Lookin' For A Reason,J.C. Fogerty,209789,6933135,0.99,Rock,"Chronicle, Vol. 2",Creedence Clearwater Revival
 Be Yourself,"Cornell, Commerford, Morello, Wilk",279484,9106160,0.99,Alternative & Punk,Out Of Exile,Audioslave
 Não Sei O Que Eu Quero Da Vida,,151849,5024963,0.99,Latin,Cássia Eller - Coleção Sem Limite [Disc 2],Cássia Eller
 Shamrocks And Shenanigans (Boom Shalock Lock Boom/Butch Vig Mix),E. Schrodyl/L. Dimant,237035,9483705,0.99,Hip Hop/Rap,House of Pain,House Of Pain
 Talk About The Passion,R.E.M.,203206,6725435,0.99,Alternative & Punk,The Best Of R.E.M.: The IRS Years,R.E.M.
 Rasul,Jeremy Wall,238315,7854737,0.99,Jazz,Morning Dance,Spyro Gyra
 Tim Tim Por Tim Tim,Vários,213237,7143328,0.99,Latin,Chill: Brazil (Disc 2),Antônio Carlos Jobim
 Pini Di Roma (Pinien Von Rom) \ I Pini Della Via Appia,,286741,4718950,0.99,Classical,Respighi:Pines of Rome,Eugene Ormandy
 Die Die My Darling,Danzig,149315,4867667,0.99,Metal,Garage Inc. (Disc 1),Metallica

Enter Sandman,Apocalyptica,221701,7286305,0.99,Metal,Plays Metallica By Four Cellos,Apocalyptica

Harvester Of Sorrow,James Hetfield and Lars Ulrich,345547,11377339,0.99,Metal,...And Justice For All,Metallica

Child In Time (Son Of Aleric - Instrumental),"Richie Blackmore, Ian Gillian, Roger Glover, Jon Lord, Ian Paice",602880,19712753,0.99,Rock,Knocking at Your Back Door: The Best Of Deep Purple in the 80's,Deep Purple

I'm A Greedy Man Pt.1,Charles Bobbitt/James Brown,217730,7251211,0.99,R&B/Soul,Sex Machine,James Brown

The One I Love,R.E.M.,197355,6495125,0.99,Alternative & Punk,The Best Of R.E.M.: The IRS Years,R.E.M.

Onibusfobia,,315977,10474904,0.99,Latin,Jota Quest-1995,Jota Quest

O Estrangeiro,,374700,12472890,0.99,Latin,Minha Historia,Chico Buarque

Voce Nao Entende Nada - Cotidiano,,421982,13885612,0.99,Latin,Minha Historia,Chico Buarque

Planet Home,Jay Kay/Toby Smith,284447,9566237,0.99,R&B/Soul,Synkronized,Jamir oquai

Give Peace a Chance,,274644,4448025,0.99,Pop,Instant Karma: The Amnesty International Campaign to Save Darfur,U2

Flor De Lis,Djavan,236355,7801108,0.99,Latin,Djavan Ao Vivo - Vol. 1,Djavan

Esperando Por Mim,Renato Russo,261668,8844133,0.99,Latin,A TempestadeTempesta de Ou O Livro Dos Dias,Legião Urbana

Iron Maiden,Steve Harris,351869,14076032,0.99,Rock,Rock In Rio [CD2],Iron Maiden

Dead Horse,,257600,4394014,0.99,Rock,Use Your Illusion I,Guns N' Roses

Sheer Heart Attack,Taylor,207386,6642685,0.99,Rock,News Of The World,Queen

Light My Fire,"Robby Krieger, Ray Manzarek, John Densmore, Jim Morrison",428329,13963351,0.99,Rock,The Doors,The Doors

Chão de Giz (Elba Ramalho),,274834,9016916,0.99,Latin,Vozes do MPB,Various Artists

Waiting On A Sign,The Tea Party,261903,8558590,0.99,Alternative & Punk,Tangents,The Tea Party

Wildest Dreams,Adrian Smith/Steve Harris,232777,9312384,0.99,Heavy Metal,Dance Of Death,Iron Maiden

Murders In The Rue Morgue,Steve Harris,258377,6205786,0.99,Heavy Metal,Killers,Iron Maiden

Pot-Pourri N.º 4,,392437,13125975,0.99,Bossa Nova,Vinícius De Moraes - Sem Limite,Toquinho & Vinícius

The Witch,,258768,8725403,0.99,Rock,"Pure Cult: The Best Of The Cult (For Rockers, Ravers, Lovers & Sinners) [UK]",The Cult

Sobremesa,Chico Science,240091,7960868,0.99,Latin,Afrociberdelia,Chico Science & Nação Zumbi

Outbreak,Jim Beard & Jon Herington,659226,21685807,0.99,Jazz,Outbreak,Dennis Chambers

Construção / Deus Lhe Pague,,383059,12675305,0.99,Latin,Minha Historia,Chico Buarque

My Funny Valentine (Live),Miles Davis,907520,29416781,0.99,Jazz,The Essential Miles Davis [Disc 2],Miles Davis

Angel,Carolyn Franklin and Sonny Saunders,240561,7880256,0.99,Rock,Greatest Hits,Lenny Kravitz

Heaven Can Wait,Steve Harris,441417,10596431,0.99,Metal,Somewhere in Time,Iron Maiden

Company Man,,2601101,503786316,1.99,Drama,"Heroes, Season 1",Heroes

Perfect,Billy Corgan,203023,6734636,0.99,Alternative & Punk,Rotten Apples: Greatest Hits,Smashing Pumpkins

Sleep On The Sidewalk,May,187428,6099840,0.99,Rock,News Of The World,Queen

Domingo,Sérgio Britto/Toni Bellotto,208613,6883180,0.99,Alternative & Punk,Volume Dois,Titãs

Seu Balancê,Paulinho Rezende/Toninho Geraes,219454,7311219,0.99,Latin,Ao Vivo [IMPORT],Zeca Pagodinho

Alive,Stone Gossard,341080,11176623,0.99,Rock,Ten,Pearl Jam

Get Up (I Feel Like Being A) Sex Machine,Bobby Byrd/James Brown/Ron Lenhoff,316551,10498031,0.99,R&B/Soul,Sex Machine,James Brown

Blood Brothers,Steve Harris,435513,17422464,0.99,Metal,Rock In Rio [CD1],Iron Maiden

Runnin' With The Devil,"Edward Van Halen, Alex Van Halen, David Lee Roth, Michael Anthony",215902,7061901,0.99,Rock,"The Best Of Van Halen, Vol. I",Van Halen

Milk It,Kurt Cobain,225724,7406945,0.99,Rock,From The Muddy Banks Of The Wishkah [Live],Nirvana

Gone,Eddie Vedder,249547,8158204,0.99,Alternative & Punk,Pearl Jam,Pearl Jam

When You Gonna Learn (Digeridoo),"Jay Kay/Kay, Jay",230635,7655482,0.99,Rock,Emergency On Planet Earth,Jamiroquai

Angela,,169508,5574957,0.99,Jazz,Warner 25 Anos,Antônio Carlos Jobim

Locomotive,Slash/W. Axl Rose,522396,17236842,0.99,Metal,Use Your Illusion II,Guns N' Roses

The Angel And The Gambler,Steve Harris,592744,23711872,0.99,Rock,Virtual XI,Iron Maiden

Bye Bye Blackbird,Miles Davis,476003,15549224,0.99,Jazz,The Essential Miles Davis [Disc 1],Miles Davis

Angel Of Harlem,"Bono/Clayton, Adam/Mullen Jr., Larry/The Edge",229276,7498022,0.99,Rock,Rattle And Hum,U2

Hello Mary Lou,J.C. Fogerty,132832,4476563,0.99,Rock,"Chronicle, Vol. 2",Credence Clearwater Revival

Bushleager,Stone Gossard,237479,7849757,0.99,Rock,Riot Act,Pearl Jam

The Worst,Jagger/Richards,144613,4750094,0.99,Rock,Voodoo Lounge,The Rolling Stones

Saint Of Me,Jagger/Richards,325694,10725160,0.99,Rock,No Security,The Rolling Stones

Dirty Water Dog,Van Halen,327392,10709202,0.99,Rock,Van Halen III,Van Halen

Times of Trouble,,342539,5795951,0.99,Alternative,Temple of the Dog,Temple of the Dog

Jerusalem,Roy Z,402390,13194463,0.99,Metal,Chemical Wedding,Bruce Dickinson

Pretty Noose,Chris Cornell,253570,8317931,0.99,Rock,A-Sides,Soundgarden

Bê-a-Bá,Rodolfo,249051,8130636,0.99,Alternative & Punk,Cesta Básica,Raimundos

Esquinas,,280999,9096726,0.99,Latin,Djavan Ao Vivo - Vol. 02,Djavan

Wasting Love,,336953,8091301,0.99,Rock,Live At Donington 1992 (Disc 1),Iron Maiden

Hot Dog,Jimmy Page & Robert Plant,197198,6536167,0.99,Rock,In Through The Out Door,Led Zeppelin

As Rosas Não Falam (Beth Carvalho),,116767,3836641,0.99,Latin,Vozes do MPB,Various Artists

Boogie Blues,,204199,6603153,0.99,Jazz,Up An' Atom,Gene Krupa

Numbers,,2609772,214709143,1.99,TV Shows,"Lost, Season 1",Lost

Beach Games,,1676134,333671149,1.99,Comedy,"The Office, Season 3",The Office

Maracatu Atômico,Chico Science,284264,9670057,0.99,Latin,Afrociberdelia,Chico Science & Nação Zumbi

Eruption,"Edward Van Halen, Alex Van Halen, Michael Anthony and David Lee Roth",102556,3286026,0.99,Rock,Van Halen,Van Halen

Tempo Perdido,Renato Russo,302158,9963914,0.99,Latin,Mais Do Mesmo,Legião Urbana

You Got No Right,"Dave Kushner, Duff, Matt Sorum, Scott Weiland & Slash",3354

12,10991094,0.99,Rock,Contraband,Velvet Revolver
 Wasting Love,Bruce Dickinson/Janick Gers,350981,14041216,0.99,Rock,Fear Of The Dark,Iron Maiden
 Somebody Stole My Guitar,"Ian Gillan, Roger Glover, Jon Lord, Steve Morse, Ian Paice",249443,8180421,0.99,Rock,Purpendicular,Deep Purple
 'Round Midnight,Miles Davis,357459,11590284,0.99,Jazz,The Essential Miles Davis [Disc 1],Miles Davis
 Aquilo,,246073,8167819,0.99,Latin,Lulu Santos - RCA 100 Anos De Música - Álbum 02,Lulu Santos
 Flash,"May, Brian",168489,5464986,0.99,Rock,Greatest Hits I,Queen
 Smooth,M. Itaal Shur & Rob Thomas,298161,9867455,0.99,Rock,Supernatural,Santana
 Childhoods End?,"Kelly, Mosley, Rothery, Trewaves",272796,9015366,0.99,Rock,Misplaced Childhood,Marillion
 Dream Of Mirrors,Janick Gers/Steve Harris,561162,22448256,0.99,Rock,Brave New World,Iron Maiden
 Royal Orleans,John Bonham/John Paul Jones,179591,5930027,0.99,Rock,Presence,Led Zeppelin
 The Wicker Man,Adrian Smith/Bruce Dickinson/Steve Harris,281782,11272320,0.99,Metal,Rock In Rio [CD1],Iron Maiden
 It's Too Funky In Here,Brad Shapiro/George Jackson/Robert Miller/Walter Shaw,239072,7973979,0.99,R&B/Soul,Sex Machine,James Brown
 Night Flight,John Paul Jones/Robert Plant,217547,7160647,0.99,Rock,Physical Graffiti [Disc 2],Led Zeppelin
 Won't Get Fooled Again (Full Length Version),John Entwistle/Pete Townshend,513750,16855521,0.99,Rock,My Generation - The Very Best Of The Who,The Who
 She Loves Me Not,Bill Gould/Mike Bordin/Mike Patton,209867,6887544,0.99,Alternative & Punk,Album Of The Year,Faith No More
 Beth,"Peter Criss, Stan Penridge, Bob Ezrin",170187,5577807,0.99,Rock,Unplugged [Live],Kiss
 Exploder,Audioslave/Chris Cornell,206053,4948095,0.99,Rock,Audioslave,Audioslave
 Os Cegos Do Castelo,Titãs,296829,9868187,0.99,Alternative & Punk,Acústico,Titãs
 The Star Spangled Banner,"Hendrix, Jimi",43232,1385810,0.99,Rock,Rattle And Hum,U2

```
In [5]: import pandas as pd
```

```
In [ ]: csv_df = pd.read_csv("itunes_data.csv")
        csv_df.head()
```

Out[]:

| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre | Album | |
|---|--|-----------------------------------|--------------|-----------|-----------|----------|---|-------|
| 0 | All the Best Cowboys Have Daddy Issues | NaN | 2555492 | 211743651 | 1.99 | TV Shows | Lost, Season 1 | |
| 1 | Beira Mar | Gilberto Gil | 295444 | 9597994 | 0.99 | Latin | Unplugged | C |
| 2 | Brasil | Milton Nascimento, Fernando Brant | 155428 | 5252560 | 0.99 | Latin | Milton Nascimento Ao Vivo | Nasci |
| 3 | Ben Franklin | NaN | 1271938 | 264168080 | 1.99 | Comedy | The Office, Season 3 | The |
| 4 | O Último Romântico (Ao Vivo) | NaN | 231993 | 7692697 | 0.99 | Latin | Lulu Santos - RCA 100 Anos De Música - Álbum 02 | Lulu |

In []:

```
excel_df = pd.read_excel("itunes_data.xlsx", engine="openpyxl")
excel_df.head()
```

Out[]:

| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre | Album | Art |
|---|----------------------|--|--------------|---------|-----------|-------|--|---------|
| 0 | My Time After Awhile | Robert Geddins/Ron Badger/Sheldon Feinberg | 182491 | 6022698 | 0.99 | Blues | The Best Of Buddy Guy - The Millenium Collection | Bud C |
| 1 | Be Quick Or Be Dead | Bruce Dickinson/Janick Gers | 204512 | 8181888 | 0.99 | Rock | Fear Of The Dark | Ir Maid |
| 2 | Água E Fogo | Chico Amaral/Edgard Scandurra/Samuel Rosa | 278987 | 9272272 | 0.99 | Rock | Maquinarama | Ska |
| 3 | Ozone Baby | Jimmy Page, Robert Plant | 215954 | 7079588 | 0.99 | Rock | Coda | L Zeppe |
| 4 | Bop Boogie | NaN | 189596 | 6093124 | 0.99 | Jazz | Up An' Atom | Ge Kru |

```
In [ ]: from sqlalchemy import create_engine

engine = create_engine("sqlite:///chinook.db")
```

```
In [10]: query = """SELECT tracks.name as Track, tracks.composer, tracks.milliseconds
tracks.bytes, tracks.unitprice,
genres.name as Genre,
albums.title as Album,
artists.name as Artist
FROM tracks
JOIN genres ON tracks.genreid = genres.genreid
JOIN albums ON tracks.albumid = albums.albumid
JOIN artists ON albums.artistid = artists.artistid;
"""
```

```
In [11]: with engine.connect() as connection:
sql_df = pd.read_sql_query(query, connection)
```

```
In [12]: sql_df.head(2).T
```

```
Out[12]:
```

| | 0 | 1 |
|---------------------|---|---|
| Track | For Those About To Rock (We Salute You) | Put The Finger On You |
| Composer | Angus Young, Malcolm Young, Brian Johnson | Angus Young, Malcolm Young, Brian Johnson |
| Milliseconds | 343719 | 205662 |
| Bytes | 11170334 | 6713451 |
| UnitPrice | 0.99 | 0.99 |
| Genre | Rock | Rock |
| Album | For Those About To Rock We Salute You | For Those About To Rock We Salute You |
| Artist | AC/DC | AC/DC |

```
In [ ]: # create dataframe from lists
df = pd.DataFrame(data={"seconds": [1, 2, 3, 4], "intensity": [12, 11, 12, 14]})
df.head()
```

```
Out[ ]:
```

| | seconds | intensity |
|----------|---------|-----------|
| 0 | 1 | 12 |
| 1 | 2 | 11 |
| 2 | 3 | 12 |
| 3 | 4 | 14 |

Understanding the DataFrame Structure and Combining/Concatenating Multiple DataFrames

In [14]: `sql_df.index`

Out[14]: `RangeIndex(start=0, stop=3503, step=1)`

In [15]: `sql_df.columns`

Out[15]: `Index(['Track', 'Composer', 'Milliseconds', 'Bytes', 'UnitPrice', 'Genre', 'Album', 'Artist'], dtype='object')`

In [16]: `type(sql_df)`

Out[16]: `pandas.core.frame.DataFrame`

In [17]: `itunes_df = pd.concat([csv_df, excel_df, sql_df], axis=0)`
`itunes_df.head()`

Out[17]:

| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre | Album | |
|---|--|-----------------------------------|--------------|-----------|-----------|----------|---|-------|
| 0 | All the Best Cowboys Have Daddy Issues | NaN | 2555492 | 211743651 | 1.99 | TV Shows | Lost, Season 1 | |
| 1 | Beira Mar | Gilberto Gil | 295444 | 9597994 | 0.99 | Latin | Unplugged | C |
| 2 | Brasil | Milton Nascimento, Fernando Brant | 155428 | 5252560 | 0.99 | Latin | Milton Nascimento Ao Vivo | Nasci |
| 3 | Ben Franklin | NaN | 1271938 | 264168080 | 1.99 | Comedy | The Office, Season 3 | The |
| 4 | O Último Romântico (Ao Vivo) | NaN | 231993 | 7692697 | 0.99 | Latin | Lulu Santos - RCA 100 Anos De Música - Álbum 02 | Lulu |

Exploratory Data Analysis (EDA) and Basic Data Cleaning with pandas

In [18]: `itunes_df.tail()`

Out[18]:

| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre | Album |
|------|---|-------------------------------|--------------|---------|-----------|------------|--|
| 3498 | Pini Di Roma (Pinien Von Rom) \ I Pini Della V... | None | 286741 | 4718950 | 0.99 | Classical | Respighi:Pine of Rom |
| 3499 | String Quartet No. 12 in C Minor, D. 703 "Quar... | Franz Schubert | 139200 | 2283131 | 0.99 | Classical | Schubert: Th Late Strin Quartets & String Qu. |
| 3500 | L'orfeo, Act 3, Sinfonia (Orchestra) | Claudio Monteverdi | 66639 | 1189062 | 0.99 | Classical | Monteverdi L'Orfeo |
| 3501 | Quintet for Horn, Violin, 2 Violas, and Cello ... | Wolfgang Amadeus Mozart | 221331 | 3665114 | 0.99 | Classical | Mozart Chambe Musi |
| 3502 | Koyaanisqatsi | Philip Glass | 206005 | 3305164 | 0.99 | Soundtrack | Koyaanisqatsi (Soundtrac from th Motion Pict. |

In [19]: `print(itunes_df.iloc[0])`
`print(itunes_df.iloc[-1])`

```

Track          All the Best Cowboys Have Daddy Issues
Composer                               NaN
Milliseconds          2555492
Bytes              211743651
UnitPrice              1.99
Genre              TV Shows
Album              Lost, Season 1
Artist              Lost
Name: 0, dtype: object
Track          Koyaanisqatsi
Composer        Philip Glass
Milliseconds          206005
Bytes              3305164
UnitPrice              0.99
Genre              Soundtrack
Album          Koyaanisqatsi (Soundtrack from the Motion Pict...
Artist        Philip Glass Ensemble
Name: 3502, dtype: object

```

In [20]: `itunes_df.iloc[0, 0]`

Out[20]: 'All the Best Cowboys Have Daddy Issues'

```
In [21]: itunes_df.iloc[-1, -1]
```

```
Out[21]: 'Philip Glass Ensemble'
```

```
In [22]: itunes_df.loc[3502]
```

```
Out[22]: Track                                Koyaanisqatsi
Composer                                Philip Glass
Milliseconds                            206005
Bytes                                    3305164
UnitPrice                               0.99
Genre                                    Soundtrack
Album      Koyaanisqatsi (Soundtrack from the Motion Pict...
Artist                                Philip Glass Ensemble
Name: 3502, dtype: object
```

```
In [ ]: test_df = itunes_df.copy()
test_df = pd.concat(
    [pd.DataFrame([itunes_df.loc[3502]], columns=test_df.columns), test_df],
    ignore_index=True,
)
test_df.loc[3502]
```

```
Out[ ]: Track      Hallelujah Here She Comes
Composer      U2
Milliseconds      242364
Bytes      8027028
UnitPrice      0.99
Genre      Rock
Album      B-Sides 1980-1990
Artist      U2
Name: 3502, dtype: object
```

```
In [26]: test_df.reset_index(inplace=True, drop=True)
test_df.head()
```


Out[26]:

| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre | Album |
|---|--|-----------------------------------|--------------|-----------|-----------|------------|---|
| 0 | Koyaanisqatsi | Philip Glass | 206005 | 3305164 | 0.99 | Soundtrack | Koyaanisqatsi (Soundtrack from the Motion Pict... |
| 1 | All the Best Cowboys Have Daddy Issues | NaN | 2555492 | 211743651 | 1.99 | TV Shows | Lost, Season 1 |
| 2 | Beira Mar | Gilberto Gil | 295444 | 9597994 | 0.99 | Latin | Unplugged |
| 3 | Brasil | Milton Nascimento, Fernando Brant | 155428 | 5252560 | 0.99 | Latin | Milton Nascimento Ao Vivo |
| 4 | Ben Franklin | NaN | 1271938 | 264168080 | 1.99 | Comedy | The Office, Season 3 |

In [27]: `test_df.index`Out[27]: `RangeIndex(start=0, stop=4022, step=1)`In [28]: `itunes_df.shape`Out[28]: `(4021, 8)`In [29]: `itunes_df.info()`

```
<class 'pandas.core.frame.DataFrame'>
Index: 4021 entries, 0 to 3502
Data columns (total 8 columns):
#   Column          Non-Null Count  Dtype
---  ---
0   Track           4021 non-null   object
1   Composer        2908 non-null   object
2   Milliseconds    4021 non-null   int64
3   Bytes           4021 non-null   int64
4   UnitPrice       4021 non-null   float64
5   Genre           4021 non-null   object
6   Album           4021 non-null   object
7   Artist          4021 non-null   object
dtypes: float64(1), int64(2), object(5)
memory usage: 411.8+ KB
```

In [30]: `itunes_df.isna().sum()`

```
Out[30]: Track          0
Composer      1113
Milliseconds  0
Bytes         0
UnitPrice     0
Genre         0
Album         0
Artist        0
dtype: int64
```

```
In [31]: type(itunes_df.isna())
```

```
Out[31]: pandas.core.frame.DataFrame
```

```
In [32]: itunes_df.describe()
```

```
Out[32]:
```

| | Milliseconds | Bytes | UnitPrice |
|--------------|--------------|--------------|-------------|
| count | 4.021000e+03 | 4.021000e+03 | 4021.000000 |
| mean | 3.927276e+05 | 3.311048e+07 | 1.050184 |
| std | 5.337745e+05 | 1.042268e+08 | 0.237857 |
| min | 1.071000e+03 | 3.874700e+04 | 0.990000 |
| 25% | 2.069680e+05 | 6.372433e+06 | 0.990000 |
| 50% | 2.554770e+05 | 8.102839e+06 | 0.990000 |
| 75% | 3.217240e+05 | 1.025143e+07 | 0.990000 |
| max | 5.286953e+06 | 1.059546e+09 | 1.990000 |

```
In [ ]: itunes_df["Genre"].mode()
```

```
Out[ ]: 0    Rock
Name: Genre, dtype: object
```

```
In [ ]: itunes_df["Genre"].value_counts()
```

```
Out[ ]: Genre
Rock      1498
Latin      656
Metal      420
Alternative & Punk  393
Jazz      160
TV Shows   105
Blues      92
Classical   85
Drama       71
R&B/Soul    69
Reggae      64
Pop         51
Soundtrack  50
Alternative  45
Hip Hop/Rap  40
Electronica/Dance  35
World       32
Heavy Metal  31
Sci Fi & Fantasy  31
Easy Listening  28
Comedy      20
Bossa Nova  17
Science Fiction  15
Rock And Roll  12
Opera       1
Name: count, dtype: int64
```

```
In [ ]: itunes_df["Genre"].value_counts()[:5]
```

```
Out[ ]: Genre
Rock      1498
Latin      656
Metal      420
Alternative & Punk  393
Jazz      160
Name: count, dtype: int64
```

```
In [ ]: itunes_df["Artist"].unique().shape
```

```
Out[ ]: (204,)
```

```
In [39]: import numpy as np

itunes_df.select_dtypes(include=np.number).corr()
```

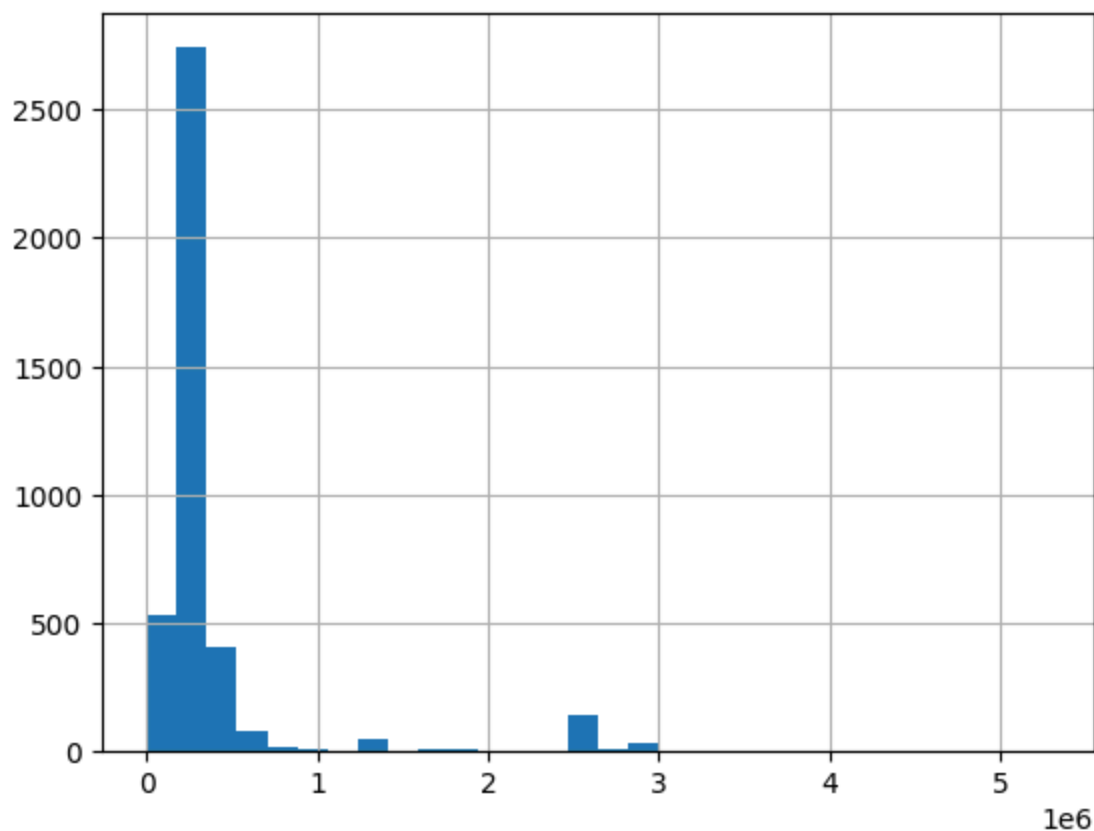
```
Out[39]:
```

| | Milliseconds | Bytes | UnitPrice |
|--------------|--------------|----------|-----------|
| Milliseconds | 1.000000 | 0.957791 | 0.934829 |
| Bytes | 0.957791 | 1.000000 | 0.938734 |
| UnitPrice | 0.934829 | 0.938734 | 1.000000 |

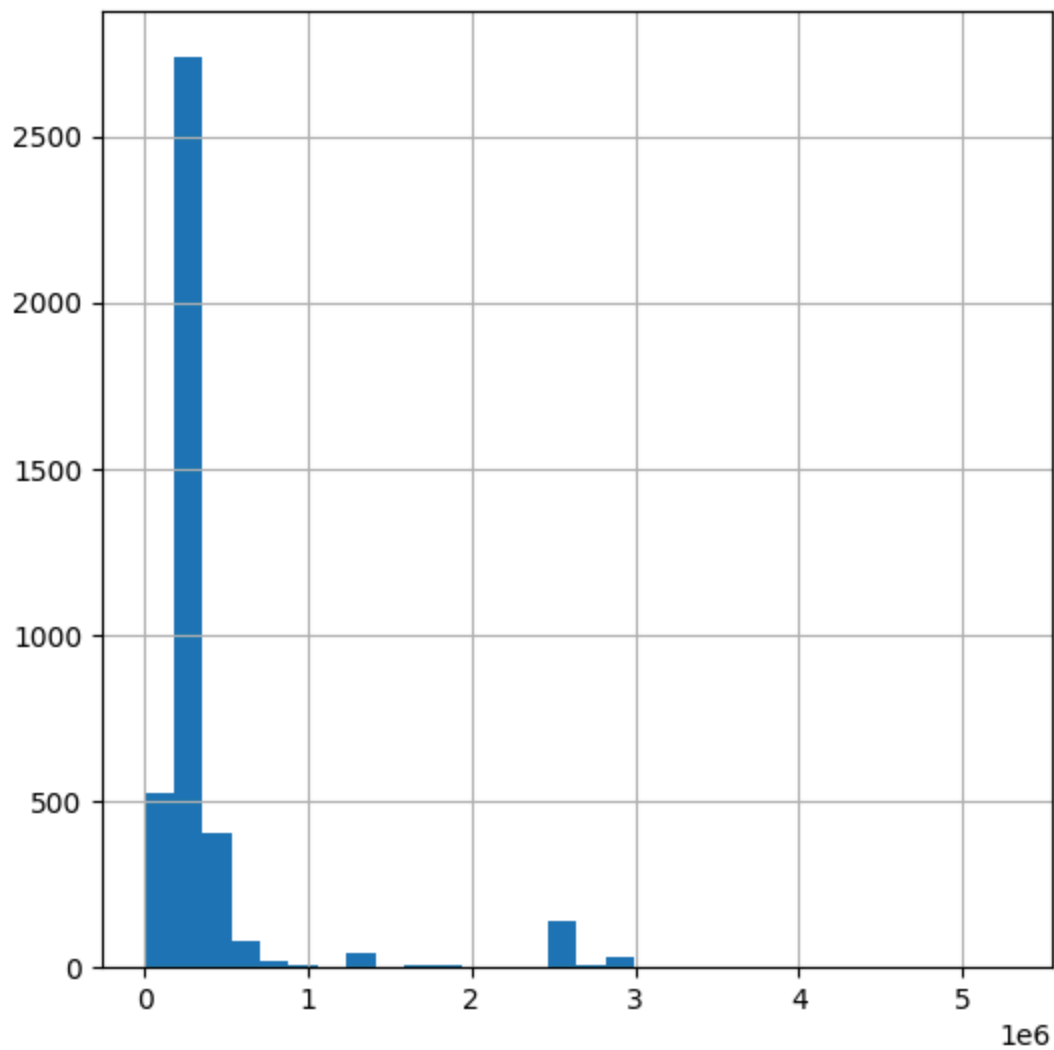
Plotting with DataFrames

```
In [40]: import matplotlib.pyplot as plt
```

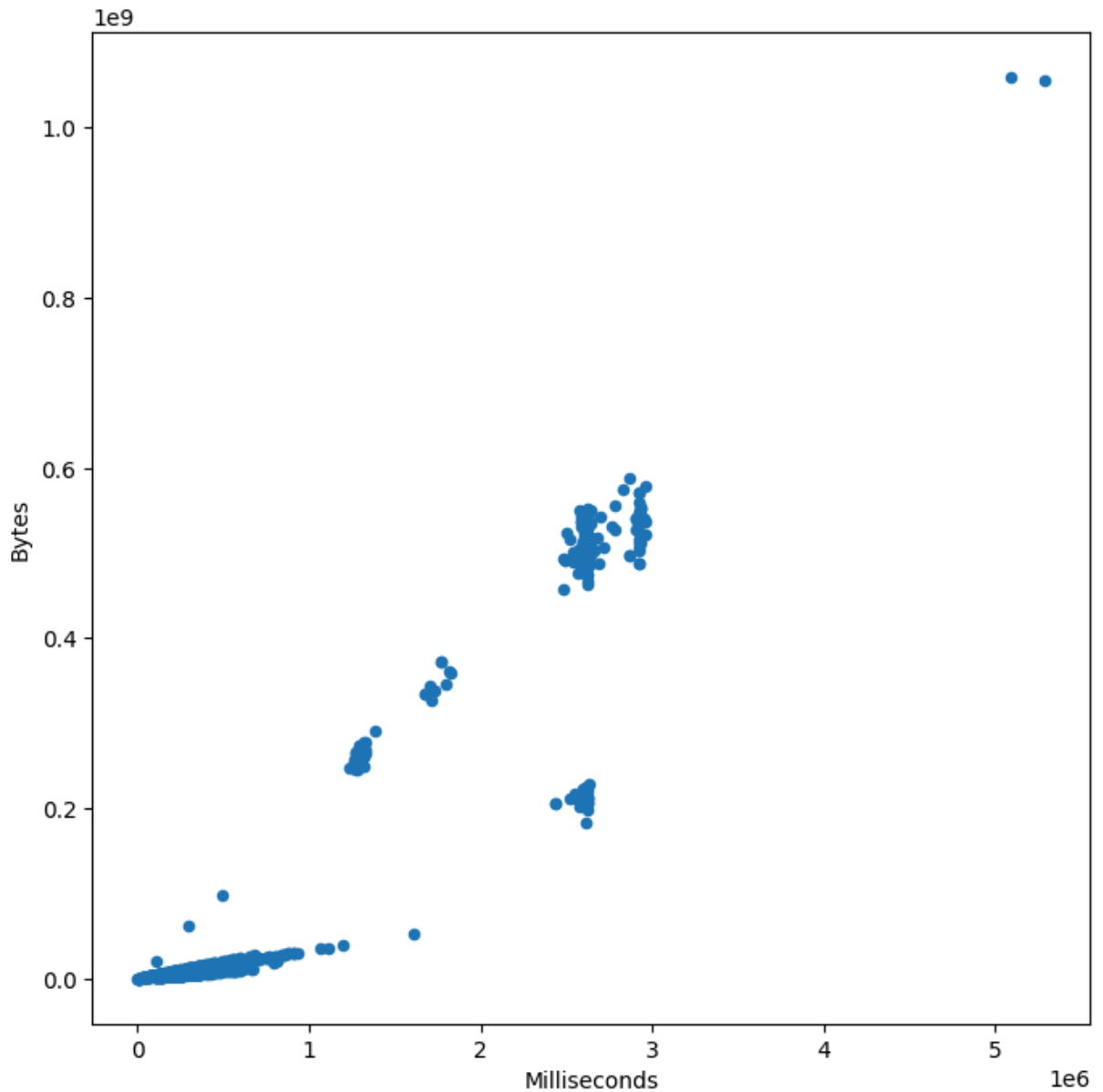
```
In [ ]: itunes_df["Milliseconds"].hist(bins=30)  
plt.show()
```



```
In [ ]: # this cell is for saving the image; more on this is chapter 5  
f = plt.figure(  
    figsize=(5.5, 5.5)  
) # this changes the size of the image -- more on this is chapter 5  
f.patch.set_facecolor("w") # sets background color behind axis labels  
itunes_df["Milliseconds"].hist(bins=30)  
plt.tight_layout() # auto-adjust margins
```

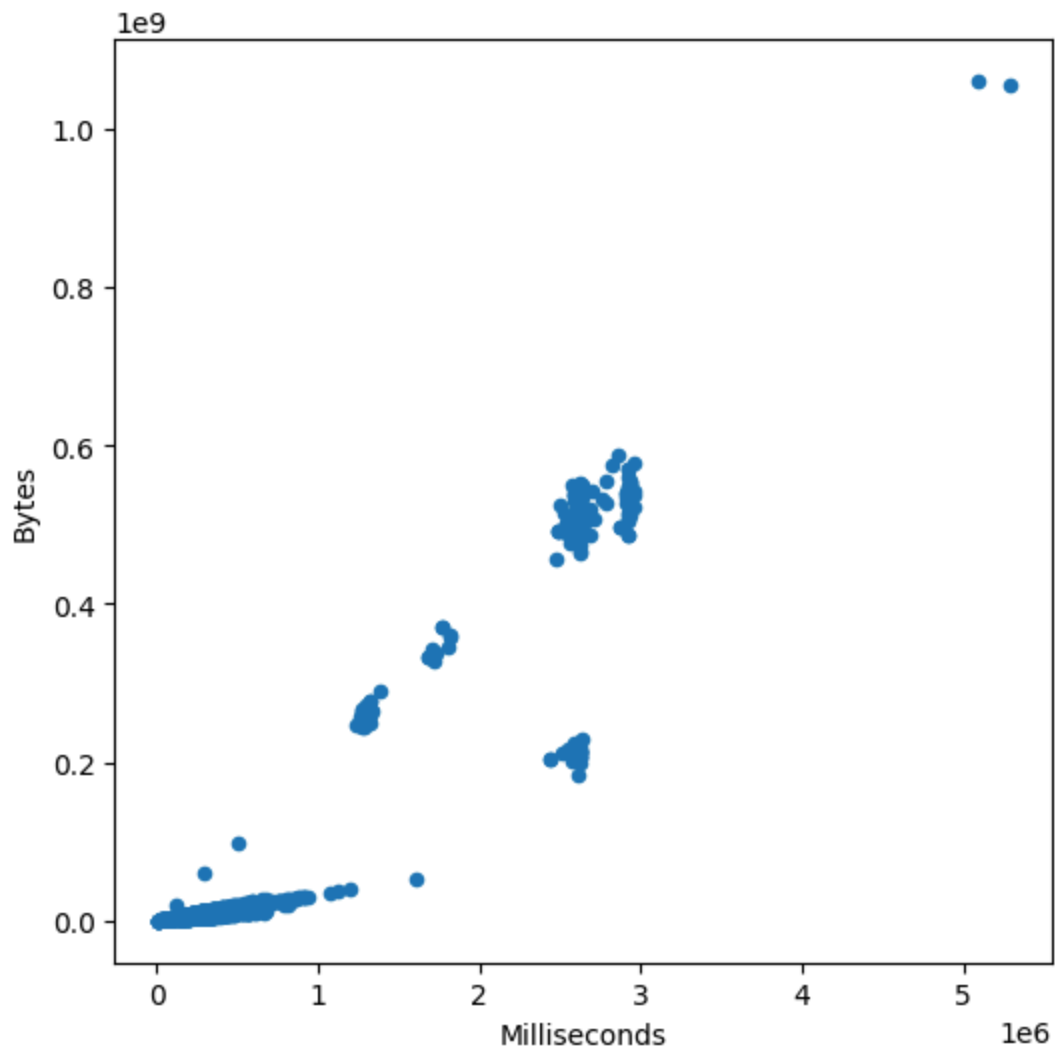


```
In [ ]: # figsize increases the size of the image -- more on this is chapter 5
itunes_df.plot.scatter(x="Milliseconds", y="Bytes", figsize=(8, 8))
plt.show()
```

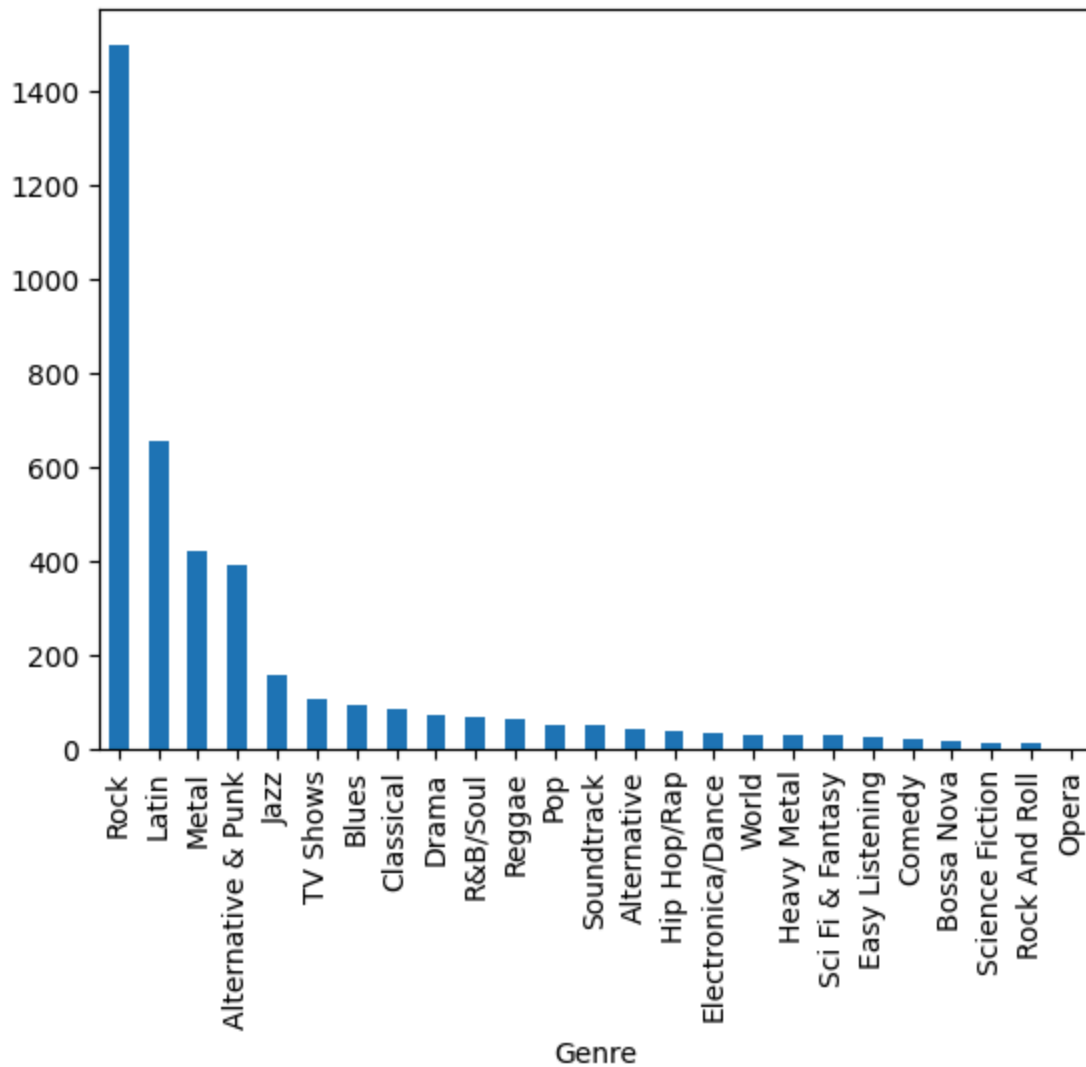


```
In [ ]: # saving the image -- more on this in chapter 5
f = plt.figure()
itunes_df.plot.scatter(x="Milliseconds", y="Bytes", figsize=(5.5, 5.5))
f.patch.set_facecolor("w") # sets background color behind axis labels
plt.tight_layout() # auto-adjust margins
```

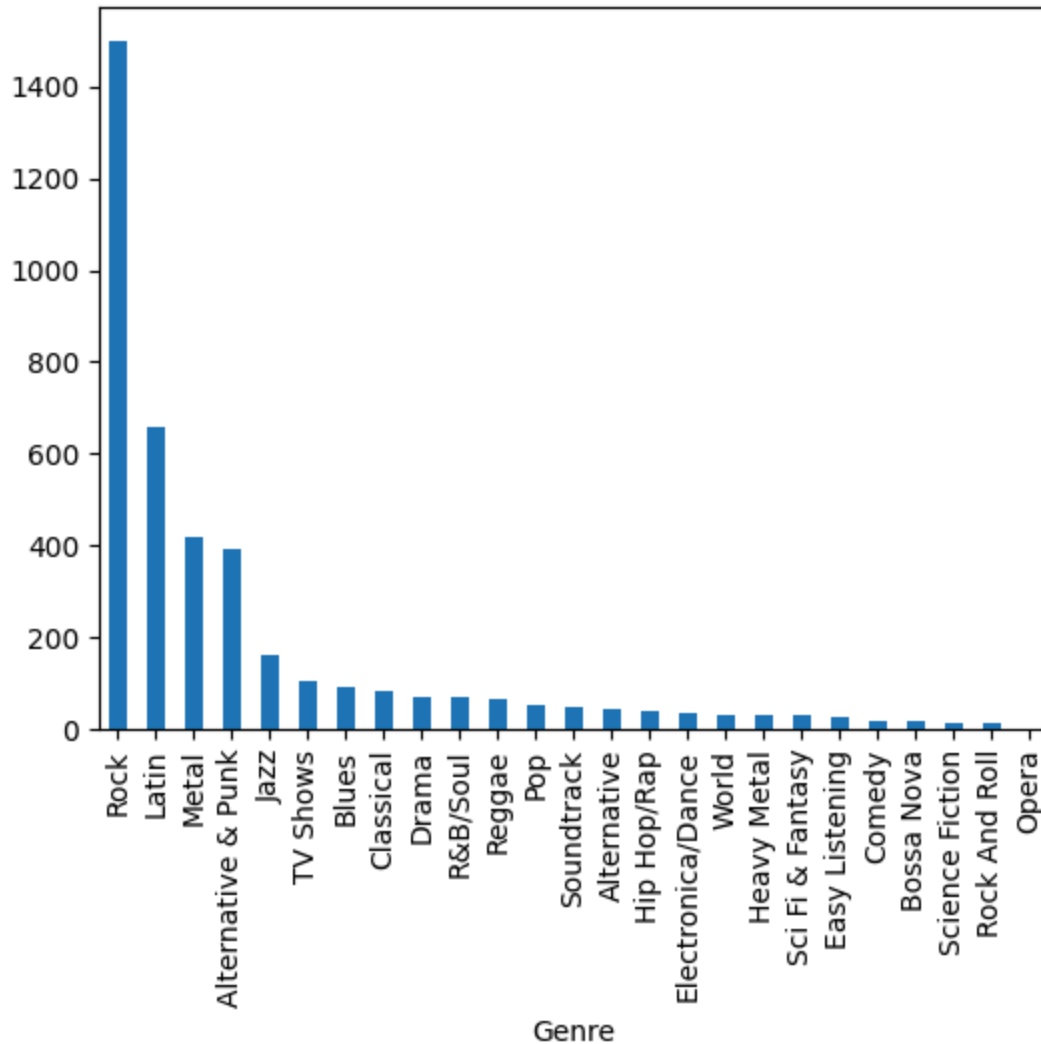
<Figure size 640x480 with 0 Axes>



```
In [ ]: itunes_df["Genre"].value_counts().plot.bar()
plt.show()
```



```
In [ ]: # saving the image -- more on this in chapter 5
f = plt.figure(figsize=(5.5, 5.5))
itunes_df["Genre"].value_counts().plot.bar()
f.patch.set_facecolor("w") # sets background color behind axis labels
plt.tight_layout() # auto-adjust margins
```

Cleaning Data, Filtering DataFrames

```
In [ ]: itunes_df[itunes_df["Milliseconds"] > 4e6]
```

| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre | Album | A |
|------|-------------------------|----------|--------------|------------|-----------|----------|--------------------------------|-------------|
| 2833 | Occupation / Precipice | None | 5286953 | 1054423946 | 1.99 | TV Shows | Battlestar Galactica, Season 3 | Battle Gala |
| 2898 | Through a Looking Glass | None | 5088838 | 1059546140 | 1.99 | Drama | Lost, Season 3 | |

```
In [ ]: print(itunes_df[itunes_df["Milliseconds"] > 4e6])
```

| | Track | Composer | Milliseconds | Bytes | UnitPrice |
|------|-------------------------|----------|--------------|------------|-----------|
| 2833 | Occupation / Precipice | None | 5286953 | 1054423946 | 1.99 |
| 2898 | Through a Looking Glass | None | 5088838 | 1059546140 | 1.99 |

| | Genre | Album | Artist |
|------|----------|--------------------------------|----------------------|
| 2833 | TV Shows | Battlestar Galactica, Season 3 | Battlestar Galactica |
| 2898 | Drama | Lost, Season 3 | Lost |

```
In [ ]: print(itunes_df[itunes_df["Milliseconds"] > 4e6][["Genre", "Artist"]])
```

| | Genre | Artist |
|------|----------|----------------------|
| 2833 | TV Shows | Battlestar Galactica |
| 2898 | Drama | Lost |

```
In [ ]: itunes_df["Milliseconds"] > 4e6
```

```
Out[ ]: 0      False
        1      False
        2      False
        3      False
        4      False
        ...
        3498   False
        3499   False
        3500   False
        3501   False
        3502   False
        Name: Milliseconds, Length: 4021, dtype: bool
```

```
In [ ]: itunes_df[itunes_df["Milliseconds"] > 2e6]["Genre"].value_counts()
```

```
Out[ ]: Genre
        Drama      69
        TV Shows   67
        Sci Fi & Fantasy  31
        Science Fiction  15
        Comedy      2
        Name: count, dtype: int64
```

```
In [ ]: itunes_df[(itunes_df["Milliseconds"] > 2e6) & (itunes_df["Bytes"] < 0.4e9)][
        "Genre"
        ].value_counts()
```

```
Out[ ]: Genre
        TV Shows    32
        Name: count, dtype: int64
```

```
In [ ]: itunes_df[itunes_df["Genre"] != "TV Shows"]["Genre"].value_counts()
```

```
Out[ ]: Genre
Rock      1498
Latin     656
Metal     420
Alternative & Punk 393
Jazz      160
Blues     92
Classical 85
Drama     71
R&B/Soul  69
Reggae    64
Pop       51
Soundtrack 50
Alternative 45
Hip Hop/Rap 40
Electronica/Dance 35
World     32
Heavy Metal 31
Sci Fi & Fantasy 31
Easy Listening 28
Comedy    20
Bossa Nova 17
Science Fiction 15
Rock And Roll 12
Opera     1
Name: count, dtype: int64
```

```
In [ ]: itunes_df[~(itunes_df["Genre"] == "TV Shows")]["Genre"].value_counts()
```

```
Out[ ]: Genre
Rock      1498
Latin     656
Metal     420
Alternative & Punk 393
Jazz      160
Blues     92
Classical 85
Drama     71
R&B/Soul  69
Reggae    64
Pop       51
Soundtrack 50
Alternative 45
Hip Hop/Rap 40
Electronica/Dance 35
World     32
Heavy Metal 31
Sci Fi & Fantasy 31
Easy Listening 28
Comedy    20
Bossa Nova 17
Science Fiction 15
Rock And Roll 12
Opera     1
Name: count, dtype: int64
```

```
In [ ]: itunes_df[itunes_df["Genre"].str.contains("TV")]["Genre"].value_counts()
```

```
Out[ ]: Genre
TV Shows    105
Name: count, dtype: int64
```

```
In [ ]: itunes_df_copy = itunes_df.copy() # make a backup to test dropping a column
itunes_df_copy.drop("Composer", axis=1, inplace=True)
itunes_df_copy.columns
```

```
Out[ ]: Index(['Track', 'Milliseconds', 'Bytes', 'UnitPrice', 'Genre', 'Album',
              'Artist'],
              dtype='object')
```

```
In [ ]: only_music = itunes_df[
    ~itunes_df["Genre"].isin(
        ["Drama", "TV Shows", "Sci Fi & Fantasy", "Science Fiction", "Comedy"]
    )
]
```

Missing values

```
In [ ]: itunes_df[itunes_df["Composer"].isna()].sample(5, random_state=42).head()
```

```
Out[ ]:
```

| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre |
|------|---------------------------------|----------|--------------|-----------|-----------|-------------------|
| 2947 | Three Minutes | None | 2763666 | 531556853 | 1.99 | TV Shows |
| 98 | Romance Ideal | NaN | 250070 | 8260477 | 0.99 | Latin |
| 3327 | Todo o Carnaval tem seu Fim | None | 237426 | 9499371 | 0.99 | Electronica/Dance |
| 2457 | We've Got To Get Together/Jingo | None | 1070027 | 34618222 | 0.99 | Rock |
| 587 | Vamos Dançar | None | 226194 | 7617432 | 0.99 | Latin |

```
In [59]: itunes_df_copy = itunes_df.copy() # make a backup for testing dropping a column
# print shapes to check that rows were dropped
print(itunes_df_copy.shape)
itunes_df_copy.dropna(inplace=True)
print(itunes_df_copy.shape)
```

(4021, 8)

(2908, 8)

```
In [ ]: itunes_df_copy = itunes_df.copy() # make a backup for testing dropping a column
itunes_df_copy.loc[itunes_df["Composer"].isna(), "Composer"] = "Unknown"
itunes_df_copy.head()
```

```
Out[ ]:
```

| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre | Album | |
|---|--|-----------------------------------|--------------|-----------|-----------|----------|---|-------|
| 0 | All the Best Cowboys Have Daddy Issues | Unknown | 2555492 | 211743651 | 1.99 | TV Shows | Lost, Season 1 | |
| 1 | Beira Mar | Gilberto Gil | 295444 | 9597994 | 0.99 | Latin | Unplugged | C |
| 2 | Brasil | Milton Nascimento, Fernando Brant | 155428 | 5252560 | 0.99 | Latin | Milton Nascimento Ao Vivo | Nasci |
| 3 | Ben Franklin | Unknown | 1271938 | 264168080 | 1.99 | Comedy | The Office, Season 3 | The |
| 4 | O Último Romântico (Ao Vivo) | Unknown | 231993 | 7692697 | 0.99 | Latin | Lulu Santos - RCA 100 Anos De Música - Álbum 02 | Lulu |

```
In [ ]: itunes_df_copy = itunes_df.copy() # make a backup for testing dropping a column
itunes_df_copy["Composer"].fillna("Unknown", inplace=True)
itunes_df_copy.head()
```

/tmp/ipykernel_1089788/888296175.py:2: FutureWarning: A value is trying to be set on a copy of a DataFrame or Series through chained assignment using an inplace method.

The behavior will change in pandas 3.0. This inplace method will never work because the intermediate object on which we are setting values always behaves as a copy.

For example, when doing 'df[col].method(value, inplace=True)', try using 'df.method({col: value}, inplace=True)' or df[col] = df[col].method(value) instead, to perform the operation inplace on the original object.

```
itunes_df_copy['Composer'].fillna('Unknown', inplace=True)
```

Out[]:

| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre | Album | |
|---|--|-----------------------------------|--------------|-----------|-----------|----------|---|-------|
| 0 | All the Best Cowboys Have Daddy Issues | Unknown | 2555492 | 211743651 | 1.99 | TV Shows | Lost, Season 1 | |
| 1 | Beira Mar | Gilberto Gil | 295444 | 9597994 | 0.99 | Latin | Unplugged | C |
| 2 | Brasil | Milton Nascimento, Fernando Brant | 155428 | 5252560 | 0.99 | Latin | Milton Nascimento Ao Vivo | Nasci |
| 3 | Ben Franklin | Unknown | 1271938 | 264168080 | 1.99 | Comedy | The Office, Season 3 | The |
| 4 | O Último Romântico (Ao Vivo) | Unknown | 231993 | 7692697 | 0.99 | Latin | Lulu Santos - RCA 100 Anos De Música - Álbum 02 | Lulu |

```
In [ ]: itunes_df["UnitPrice"].value_counts().iloc[0] / itunes_df.shape[0]
```

```
Out[ ]: np.float64(0.9398159661775678)
```

```
In [ ]: itunes_df_copy = itunes_df.copy() # make a backup for testing dropping a co
itunes_df_copy["UnitPrice"].fillna(itunes_df_copy["UnitPrice"].mode(), inplace=True)
itunes_df_copy.head()
```

/tmp/ipykernel_1089788/2348392847.py:2: FutureWarning: A value is trying to be set on a copy of a DataFrame or Series through chained assignment using an inplace method.

The behavior will change in pandas 3.0. This inplace method will never work because the intermediate object on which we are setting values always behaves as a copy.

For example, when doing 'df[col].method(value, inplace=True)', try using 'df.method({col: value}, inplace=True)' or df[col] = df[col].method(value) instead, to perform the operation inplace on the original object.

```
itunes_df_copy['UnitPrice'].fillna(itunes_df_copy['UnitPrice'].mode(), inplace=True)
```

Out[]:

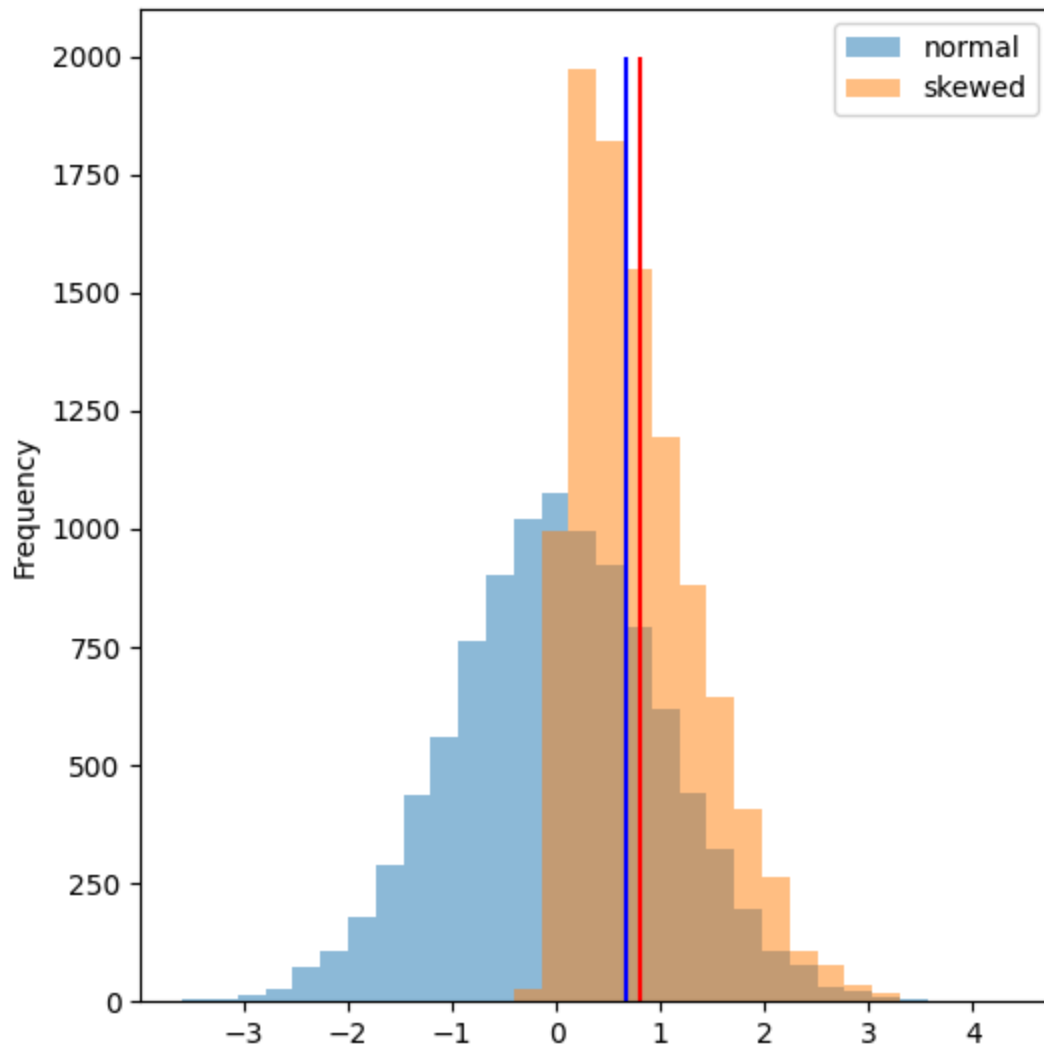
| | Track | Composer | Milliseconds | Bytes | UnitPrice | Genre | Album | |
|---|--|-----------------------------------|--------------|-----------|-----------|----------|---|-------|
| 0 | All the Best Cowboys Have Daddy Issues | NaN | 2555492 | 211743651 | 1.99 | TV Shows | Lost, Season 1 | |
| 1 | Beira Mar | Gilberto Gil | 295444 | 9597994 | 0.99 | Latin | Unplugged | C |
| 2 | Brasil | Milton Nascimento, Fernando Brant | 155428 | 5252560 | 0.99 | Latin | Milton Nascimento Ao Vivo | Nasci |
| 3 | Ben Franklin | NaN | 1271938 | 264168080 | 1.99 | Comedy | The Office, Season 3 | The |
| 4 | O Último Romântico (Ao Vivo) | NaN | 231993 | 7692697 | 0.99 | Latin | Lulu Santos - RCA 100 Anos De Música - Álbum 02 | Lulu |

In []:

```
# create distributions for plotting
from scipy.stats import skewnorm

df = pd.DataFrame(
    {"normal": skewnorm.rvs(0, size=10000), "skewed": skewnorm.rvs(10, size=
)

df.plot.hist(bins=30, alpha=0.5, figsize=(5.5, 5.5))
plt.vlines(df["skewed"].mean(), ymin=0, ymax=2000, label="mean", color="r")
plt.vlines(df["skewed"].median(), ymin=0, ymax=2000, label="median", color="
f.patch.set_facecolor("w") # sets background color behind axis labels
plt.tight_layout() # auto-adjust margins
```



KNN imputation

```
In [ ]: import numpy as np
```

```
itunes_df_copy = (
    itunes_df.copy()
) # create copy of the dataframe so we don't alter the original
itunes_df_copy.loc[0, "Bytes"] = np.nan
```

```
In [ ]: from sklearn.impute import KNNImputer
```

```
imputer = KNNImputer()
imputed = imputer.fit_transform(itunes_df_copy[["Milliseconds", "Bytes", "Un
```

```
In [ ]: # there are multiple values with the index value of 0, which is why we get m
itunes_df.loc[0, "Bytes"]
```

```
Out[ ]: 0    211743651
        0     6022698
        0    11170334
        Name: Bytes, dtype: int64
```



```
In [ ]: itunes_df_copy["Bytes"] = imputed[:, 1]
```

```
In [ ]: itunes_df_copy.loc[0, "Bytes"]
```

```
Out[ ]: 0    381737603.6  
0    5454572.2  
0    11232851.2  
Name: Bytes, dtype: float64
```

```
In [ ]: itunes_df["Bytes"].mean()
```

```
Out[ ]: np.float64(33110484.730912708)
```

```
In [73]: # adapted from this SO answer: https://stackoverflow.com/a/46740476/4549682  
def remove_outliers(df, column):  
    q1 = df[column].quantile(0.25)  
    q3 = df[column].quantile(0.75)  
    iqr = q3 - q1  
    upper_boundary = q3 + 1.5 * iqr  
    lower_boundary = q1 - 1.5 * iqr  
    new_df = df.loc[(df[column] > lower_boundary) & (df[column] < upper_boun  
    return new_df
```

```
In [ ]: itunes_df_clean = remove_outliers(itunes_df, "Milliseconds")
```

```
In [75]: itunes_df_clean.shape
```

```
Out[75]: (3614, 8)
```

```
In [76]: itunes_df.shape
```

```
Out[76]: (4021, 8)
```

Duplicate values

```
In [77]: itunes_df.duplicated().sum()
```

```
Out[77]: np.int64(518)
```

```
In [78]: itunes_df.drop_duplicates(inplace=True)
```

Data Transformations

```
In [ ]: itunes_df["Seconds"] = itunes_df["Milliseconds"] / 1000
```

```
In [ ]: itunes_df["len_byte_ratio"] = itunes_df["Milliseconds"] / itunes_df["Bytes"]
```

Apply and Map

```
In [ ]: genre_dict = {"metal": "Metal", "met": "Metal"}
        itunes_df["Genre"].replace(genre_dict)
```

```
Out[ ]: 0      TV Shows
        1      Latin
        2      Latin
        3      Comedy
        4      Latin
        ...
        3496   Classical
        3499   Classical
        3500   Classical
        3501   Classical
        3502   Soundtrack
        Name: Genre, Length: 3503, dtype: object
```

```
In [ ]: itunes_df["Genre"].apply(lambda x: x.lower())
```

```
Out[ ]: 0      tv shows
        1      latin
        2      latin
        3      comedy
        4      latin
        ...
        3496   classical
        3499   classical
        3500   classical
        3501   classical
        3502   soundtrack
        Name: Genre, Length: 3503, dtype: object
```

```
In [ ]: # the above is the same as this
        def lowercase(x):
            return x.lower()

        itunes_df["Genre"].apply(lowercase)
```

```
Out[ ]: 0      tv shows
        1      latin
        2      latin
        3      comedy
        4      latin
        ...
        3496   classical
        3499   classical
        3500   classical
        3501   classical
        3502   soundtrack
        Name: Genre, Length: 3503, dtype: object
```

```
In [ ]: # but using built-in functions is almost always faster
        itunes_df["Genre"].str.lower()
```

```
Out[ ]: 0      tv shows
        1      latin
        2      latin
        3      comedy
        4      latin
        ...
        3496   classical
        3499   classical
        3500   classical
        3501   classical
        3502   soundtrack
        Name: Genre, Length: 3503, dtype: object
```

Here would be an exception to the rule for using apply -- we want to get a hybrid score of the polarity and subjectivity of text:

```
In [ ]: # this is a common sentiment analysis library; polarity is positive/negative
        # subjectivity is subjective/objective rating.
        from textblob import TextBlob

        test = TextBlob("Textblob is amazingly simple to use. What great fun!")
        test.sentiment
```

```
Out[ ]: Sentiment(polarity=0.39166666666666666, subjectivity=0.4357142857142857)
```

```
In [87]: test.sentiment.polarity
```

```
Out[87]: 0.39166666666666666
```

```
In [ ]: # it would be better than apply to use a list comprehension to get sentiment
        itunes_df["Track_sentiment"] = [
            TextBlob(x).sentiment.polarity for x in itunes_df["Track"]
        ]
```

```
In [ ]: # but, if we wanted to mix polarity and subjectivity into one column, it would
        def pol_sub_mix(x):
            tb = TextBlob(x)
            return tb.polarity * tb.subjectivity

        itunes_df["Track_pol_sub_mix"] = itunes_df["Track"].apply(pol_sub_mix)
```

```
In [ ]: # delete these columns
        itunes_df.drop(["Track_pol_sub_mix", "Track_sentiment"], inplace=True, axis=
```

```
In [91]: # currently doesn't work with python 3.9
        # import swifter
        # itunes_df['Genre'].swifter.apply(lambda x: x.lower())
```

```
In [96]: itunes_df.select_dtypes(include=np.number).columns
```

```
Out[96]: Index(['Milliseconds', 'Bytes', 'UnitPrice', 'Seconds', 'len_byte_ratio'],
        dtype='object')
```

Group By

```
In [ ]: itunes_df[
        ["Milliseconds", "Bytes", "UnitPrice", "Seconds", "len_byte_ratio", "Genre"]
        ].groupby("Genre").mean()["Seconds"].sort_values().head()
```

```
Out[ ]: Genre
Rock And Roll      134.643500
Opera               174.813000
Hip Hop/Rap        178.176286
Easy Listening      189.164208
Bossa Nova         219.590000
Name: Seconds, dtype: float64
```

Saving data

```
In [ ]: itunes_df.to_csv("cleaned_itunes_data.csv", index=False)
```

Bitcoin data analysis

```
In [ ]: btc_df = pd.read_csv("bitcoin_price.csv")
btc_df.head()
```

```
Out[ ]:   symbol      time      open      close      high      low      volume
0  btcusd  1364688000000  92.500000  93.033000  93.74999  91.00000  3083.079791
1  btcusd  1364774400000  93.250000  103.999000  105.90000  92.49999  5224.401313
2  btcusd  1364860800000  104.000000  118.229354  118.38670  99.00000  8376.527478
3  btcusd  1364947200000  117.958261  134.700000  146.88000  101.51088  12996.245072
4  btcusd  1365033600000  134.716560  132.899000  143.00000  119.00000  6981.668305
```



```
In [ ]: btc_df["symbol"].unique()
```

```
Out[ ]: array(['btcusd'], dtype=object)
```

```
In [ ]: btc_df.drop("symbol", axis=1, inplace=True)
```

```
In [ ]: btc_df["time"] = pd.to_datetime(btc_df["time"], unit="ms")
```

```
In [ ]: btc_df["time"].dtype
```

```
Out[ ]: dtype('<M8[ns]')
```

```
In [104... btc_df.info()
```

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2793 entries, 0 to 2792
Data columns (total 6 columns):
 #   Column  Non-Null Count  Dtype  
---  -
 0   time    2793 non-null   datetime64[ns]
 1   open    2793 non-null   float64
 2   close   2793 non-null   float64
 3   high    2793 non-null   float64
 4   low     2793 non-null   float64
 5   volume  2793 non-null   float64
dtypes: datetime64[ns](1), float64(5)
memory usage: 131.1 KB

```

```
In [ ]: btc_df.set_index("time", inplace=True)
```

```
In [106... btc_df.head()
```

```
Out[106...
```

| | open | close | high | low | volume |
|------------|------------|------------|-----------|-----------|--------------|
| time | | | | | |
| 2013-03-31 | 92.500000 | 93.033000 | 93.74999 | 91.00000 | 3083.079791 |
| 2013-04-01 | 93.250000 | 103.999000 | 105.90000 | 92.49999 | 5224.401313 |
| 2013-04-02 | 104.000000 | 118.229354 | 118.38670 | 99.00000 | 8376.527478 |
| 2013-04-03 | 117.958261 | 134.700000 | 146.88000 | 101.51088 | 12996.245072 |
| 2013-04-04 | 134.716560 | 132.899000 | 143.00000 | 119.00000 | 6981.668305 |

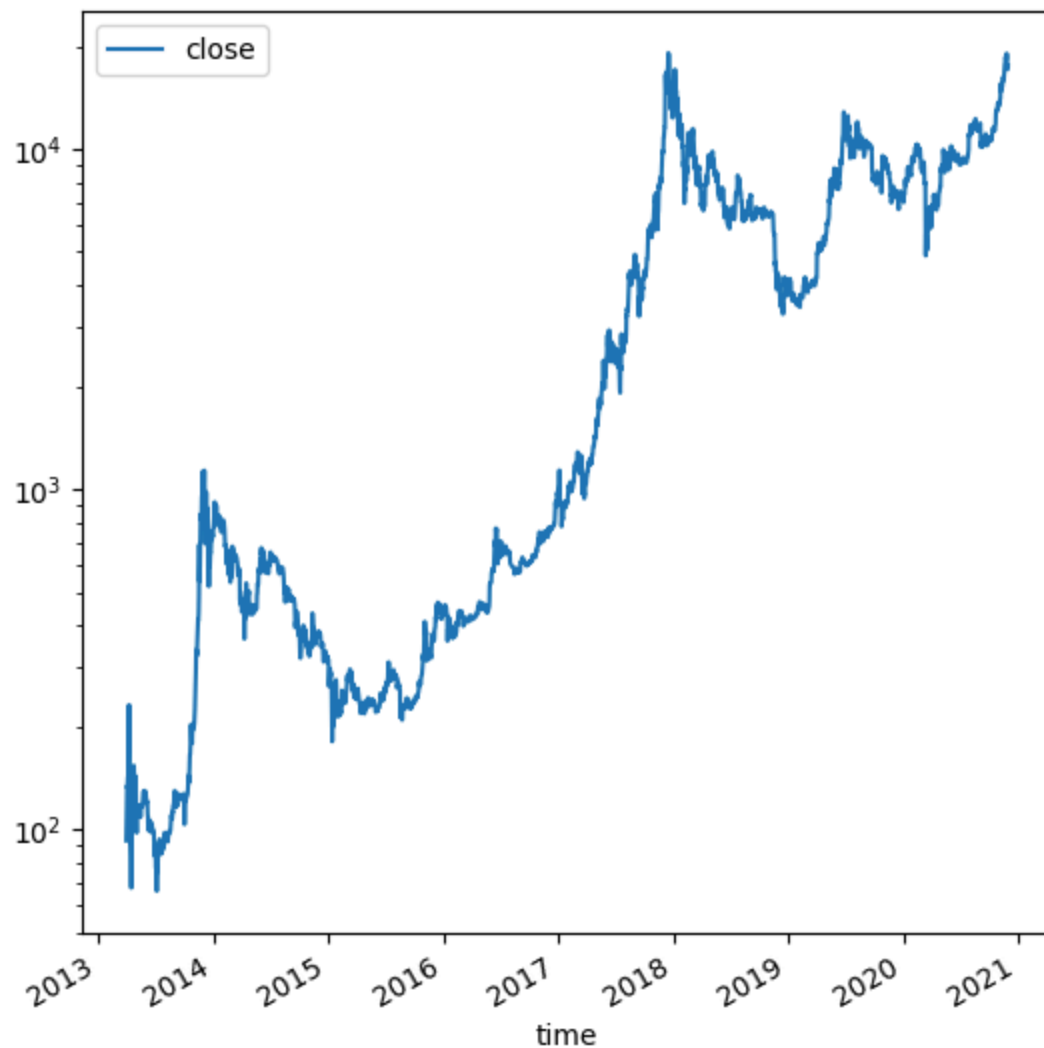
```
In [ ]: btc_df[["close"]].plot(logy=True)
```

```
Out[ ]: <Axes: xlabel='time'>
```



```
In [ ]: f = plt.figure(figsize=(5.5, 5.5))
btc_df.iloc[-3000:][["close"]].plot(logy=True, figsize=(5.5, 5.5))
f.patch.set_facecolor("w") # sets background color behind axis labels
plt.tight_layout() # auto-adjust margins
```

<Figure size 550x550 with 0 Axes>



We could load a datetime as a pandas timestamp like so. Unfortunately, this trick doesn't work with seconds since the epoch, but does work with other datetime formats. For seconds since the epoch, we can provide a conversion function to the argument `date_parser` in `read_csv`, or convert it with `to_datetime` after loading.

```
In [ ]: btc_df2 = pd.read_csv(  
    "bitcoin_price.csv",  
    index_col="time",  
    parse_dates=["time"],  
    infer_datetime_format=True,  
)  
btc_df2.head()
```

```
/tmp/ipykernel_1089788/542906089.py:1: FutureWarning: The argument 'infer_datetime_format' is deprecated and will be removed in a future version. A strict version of it is now the default, see https://pandas.pydata.org/pdeps/0004-consistent-to-datetime-parsing.html. You can safely remove this argument.
```

```
btc_df2 = pd.read_csv('bitcoin_price.csv', index_col='time', parse_dates=['time'], infer_datetime_format=True)
```

```
/tmp/ipykernel_1089788/542906089.py:1: UserWarning: Could not infer format, so each element will be parsed individually, falling back to 'dateutil'. To ensure parsing is consistent and as-expected, please specify a format.
```

```
btc_df2 = pd.read_csv('bitcoin_price.csv', index_col='time', parse_dates=['time'], infer_datetime_format=True)
```

```
Out[ ]:
```

| | symbol | open | close | high | low | volume |
|---------------|--------|------------|------------|-----------|-----------|--------------|
| time | | | | | | |
| 1364688000000 | btcusd | 92.500000 | 93.033000 | 93.74999 | 91.00000 | 3083.079791 |
| 1364774400000 | btcusd | 93.250000 | 103.999000 | 105.90000 | 92.49999 | 5224.401313 |
| 1364860800000 | btcusd | 104.000000 | 118.229354 | 118.38670 | 99.00000 | 8376.527478 |
| 1364947200000 | btcusd | 117.958261 | 134.700000 | 146.88000 | 101.51088 | 12996.245072 |
| 1365033600000 | btcusd | 134.716560 | 132.899000 | 143.00000 | 119.00000 | 6981.668305 |

```
In [ ]: date_parser = lambda x: pd.to_datetime(x, unit="ms")
btc_df2 = pd.read_csv(
    "bitcoin_price.csv", index_col="time", parse_dates=["time"], date_parser=
)
btc_df2.head()
```

```
/tmp/ipykernel_1089788/4261904790.py:2: FutureWarning: The argument 'date_parser' is deprecated and will be removed in a future version. Please use 'date_format' instead, or read your data in as 'object' dtype and then call 'to_datetime'.
```

```
btc_df2 = pd.read_csv('bitcoin_price.csv', index_col='time', parse_dates=['time'], date_parser=date_parser)
```

```
/tmp/ipykernel_1089788/4261904790.py:1: FutureWarning: The behavior of 'to_datetime' with 'unit' when parsing strings is deprecated. In a future version, strings will be parsed as datetime strings, matching the behavior without a 'unit'. To retain the old behavior, explicitly cast ints or floats to numeric type before calling to_datetime.
```

```
date_parser = lambda x: pd.to_datetime(x, unit='ms')
```

```
Out[ ]:
```

| | symbol | open | close | high | low | volume |
|------------|--------|------------|------------|-----------|-----------|--------------|
| time | | | | | | |
| 2013-03-31 | btcusd | 92.500000 | 93.033000 | 93.74999 | 91.00000 | 3083.079791 |
| 2013-04-01 | btcusd | 93.250000 | 103.999000 | 105.90000 | 92.49999 | 5224.401313 |
| 2013-04-02 | btcusd | 104.000000 | 118.229354 | 118.38670 | 99.00000 | 8376.527478 |
| 2013-04-03 | btcusd | 117.958261 | 134.700000 | 146.88000 | 101.51088 | 12996.245072 |
| 2013-04-04 | btcusd | 134.716560 | 132.899000 | 143.00000 | 119.00000 | 6981.668305 |


```
In [ ]: btc_df.loc["1-1-2019":"12-31-2019"]
```

```
Out[ ]:
```

| | open | close | high | low | volume |
|------------|-------------|--------|-------------|-------------|--------------|
| time | | | | | |
| 2019-01-01 | 3832.628624 | 3963.1 | 3987.000000 | 3788.100000 | 13848.346752 |
| 2019-01-02 | 3963.000000 | 4048.8 | 4083.470676 | 3917.900000 | 19437.727989 |
| 2019-01-03 | 4049.000000 | 3924.3 | 4056.644331 | 3875.100000 | 10748.083712 |
| 2019-01-04 | 3923.200000 | 3954.9 | 3986.000000 | 3850.100000 | 13228.660465 |
| 2019-01-05 | 3954.900000 | 3911.9 | 4014.900000 | 3901.000000 | 14873.962225 |
| ... | ... | ... | ... | ... | ... |
| 2019-12-27 | 7231.600000 | 7287.0 | 7300.000000 | 7113.300000 | 3996.647227 |
| 2019-12-28 | 7287.000000 | 7334.4 | 7390.000000 | 7279.200000 | 2731.060711 |
| 2019-12-29 | 7334.400000 | 7413.6 | 7551.600000 | 7311.600000 | 2494.487206 |
| 2019-12-30 | 7416.100000 | 7260.9 | 7421.700000 | 7201.290265 | 4088.958159 |
| 2019-12-31 | 7260.900000 | 7208.3 | 7333.000000 | 7161.300000 | 2992.686133 |

365 rows × 5 columns

```
In [ ]: btc_df.loc["2019"]
```

```
Out[ ]:
```

| | open | close | high | low | volume |
|------------|-------------|--------|-------------|-------------|--------------|
| time | | | | | |
| 2019-01-01 | 3832.628624 | 3963.1 | 3987.000000 | 3788.100000 | 13848.346752 |
| 2019-01-02 | 3963.000000 | 4048.8 | 4083.470676 | 3917.900000 | 19437.727989 |
| 2019-01-03 | 4049.000000 | 3924.3 | 4056.644331 | 3875.100000 | 10748.083712 |
| 2019-01-04 | 3923.200000 | 3954.9 | 3986.000000 | 3850.100000 | 13228.660465 |
| 2019-01-05 | 3954.900000 | 3911.9 | 4014.900000 | 3901.000000 | 14873.962225 |
| ... | ... | ... | ... | ... | ... |
| 2019-12-27 | 7231.600000 | 7287.0 | 7300.000000 | 7113.300000 | 3996.647227 |
| 2019-12-28 | 7287.000000 | 7334.4 | 7390.000000 | 7279.200000 | 2731.060711 |
| 2019-12-29 | 7334.400000 | 7413.6 | 7551.600000 | 7311.600000 | 2494.487206 |
| 2019-12-30 | 7416.100000 | 7260.9 | 7421.700000 | 7201.290265 | 4088.958159 |
| 2019-12-31 | 7260.900000 | 7208.3 | 7333.000000 | 7161.300000 | 2992.686133 |

365 rows × 5 columns

NumPy

```
In [ ]: close_array = btc_df["close"].values
```

```
In [115... close_array
```

```
Out[115... array([ 93.033      , 103.999      , 118.22935407, ...,
        17211.69580098, 17171.      , 17686.840768 ], shape=(2793,))
```

```
In [116... close_array.shape
```

```
Out[116... (2793,)
```

```
In [117... close_array.dtype
```

```
Out[117... dtype('float64')
```

```
In [ ]: import numpy as np

close_list = btc_df["close"].to_list()
close_array = np.array(close_list)
close_array
```

```
Out[ ]: array([ 93.033      , 103.999      , 118.22935407, ...,
        17211.69580098, 17171.      , 17686.840768 ], shape=(2793,))
```

```
In [119... %timeit kd_close = close_array / 1000
```

3.68 µs ± 432 ns per loop (mean ± std. dev. of 7 runs, 100,000 loops each)

```
In [120... %timeit kd_close_list = [c / 1000 for c in close_list]
```

182 µs ± 37.1 µs per loop (mean ± std. dev. of 7 runs, 1,000 loops each)

```
In [ ]: volume_array = btc_df["volume"].values
close_array * volume_array
```

```
Out[ ]: array([2.86828162e+05, 5.43332512e+05, 9.90351433e+05, ...,
        5.91110933e+08, 1.92622769e+08, 6.25398332e+07], shape=(2793,))
```

```
In [ ]: btc_df["market_cap"] = btc_df["close"] * btc_df["volume"]
btc_df["market_cap"]
```

```
Out[ ]: time
2013-03-31    2.868282e+05
2013-04-01    5.433325e+05
2013-04-02    9.903514e+05
2013-04-03    1.750594e+06
2013-04-04    9.278567e+05
...
2020-11-24    2.857665e+08
2020-11-25    2.523951e+08
2020-11-26    5.911109e+08
2020-11-27    1.926228e+08
2020-11-28    6.253983e+07
Name: market_cap, Length: 2793, dtype: float64
```

```
In [ ]: np.log(btc_df["close"])
```

```
Out[ ]: time
2013-03-31    4.532954
2013-04-01    4.644381
2013-04-02    4.772626
2013-04-03    4.903050
2013-04-04    4.889589
...
2020-11-24    9.859065
2020-11-25    9.837722
2020-11-26    9.753344
2020-11-27    9.750977
2020-11-28    9.780576
Name: close, Length: 2793, dtype: float64
```