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approach is first to treat in Part 1, multiple regrassion analysis with eross-sectiona under the assumption of rondom sampling. This setting is patitudly students because they ave a start Importantly, it allows us to distuiguish between assumptions made about the undefining the besiderant content---from assumptions about how the data vere sampled. Discussions about the conta ---- trom works and the sone are term works have a good grass of the multiple regression model estimated using random samples. An important require of a modern approach is that the explanatory variables, along, an along, and the start interview. with the dependent, yariable ar ats its ated as outcomes of random variables, hog incomes socials are do bebeen ductory texts, literallydepplies date to Date and that de that of the explicit defined with sectors of definition with a start of the sector.