Center for Machine Learning and Intelligent Systems

Breast Cancer Data Set

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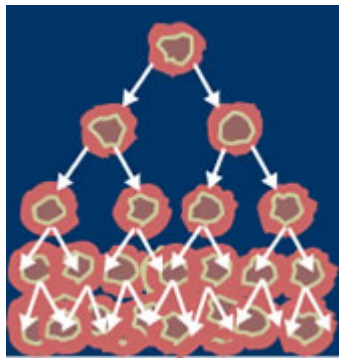
Abstract: Breast Cancer Data (Restricted Access)



Data Set Characteristics:	Multivariate	**Number of Instances:**	286	**Area:**	Life
Attribute Characteristics:	Categorical	**Number of Attributes:**	9	**Date Donated**	1988-07-11
Associated Tasks:	Classification	**Missing Values?**	Yes	**Number of Web Hits:**	313291

Source:

Creators:

Matjaz Zwitter & Milan Soklic (physicians)
Institute of Oncology
University Medical Center
Ljubljana, Yugoslavia

Donors:

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Data Set Information:

This is one of three domains provided by the Oncology Institute that has repeatedly appeared in the machine learning literature. (See also lymphography and primary-tumor.)

This data set includes 201 instances of one class and 85 instances of another class. The instances are described by 9 attributes, some of which are linear and some are nominal.

Attribute Information:

1. Class: no-recurrence-events, recurrence-events
2. age: 10-19, 20-29, 30-39, 40-49, 50-59, 60-69, 70-79, 80-89, 90-99.
3. menopause: lt40, ge40, premeno.
4. tumor-size: 0-4, 5-9, 10-14, 15-19, 20-24, 25-29, 30-34, 35-39, 40-44, 45-49, 50-54, 55-59.
5. inv-nodes: 0-2, 3-5, 6-8, 9-11, 12-14, 15-17, 18-20, 21-23, 24-26, 27-29, 30-32, 33-35, 36-39.
6. node-caps: yes, no.
7. deg-malig: 1, 2, 3.
8. breast: left, right.
9. breast-quad: left-up, left-low, right-up, right-low, central.
10. irradiat: yes, no.

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[1] Papers were automatically harvested and associated with this data set, in collaboration with Rexa.info