

# BÖLÜM 15

## Biyoinformatiğe Giriş

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### | Giriş

Biyoinformatik, biyoloji, bilgi teknolojileri ve matematik alanlarını birleştiren, genomik, proteomik, metabolomik gibi özellikle moleküller genetik verilerin bilgisayar uygulamaları yardımıyla toplanması, depolanması, analiz edilmesi, yorumlanması ve görselleştirilmesine odaklanan bilim dalıdır. Bu veriler biyoinformatik araçlarının yardımıyla canlıların genetik yapısı, proteinlerin yapısı, metabolik yolakları gibi konuları anlamaya yardımcı olmaktadır. Biyoinformatik bilimi, bu verilerin anlaşılmasına yardımcı olmasının yanı sıra, canlıların evrimsel süreçleri, hastalıkların oluşumu ve tedavi edilmesi gibi konulara da odaklanmaktadır (1-6).

Ayrıca biyoinformatik bilimi, birçok alanda kullanılmaktadır (7,8);

- **Tip ve sağlık:** Genetik bilgilerin analiz edilerek hastalıkların tanısı ve tedavisinde, ilaçların birbirleri ile olan etkileşimlerinin anlaşılmasında, tıbbi verilerin işlenmesi ve yorumlanması, sağlık verilerinin daha etkin bir şekilde yönetilmesinde kullanılmaktadır.

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