

Cover Page



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# Multimodality Cardiac Image Analysis for the Assessment of Coronary Artery Disease

Vikas Gupta

## **Colophon**

### **About the covers:**

*Front:* The circles (credit: DryIcons) represent contours that are ubiquitous in cardiac image processing e.g., myocardial contours, blood vessel lumen, and concentric rings in a bull's eye plot. In addition, different colors of circles represent multiple imaging techniques for assessing cardiac function and anatomy. At the center lies the human heart.

*Back:* The back cover points to the likely convergence of the future developments in cardiac imaging towards a better integration of functional (red heart with gears) and anatomical (green heart with vessels) information on the human heart.

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Vikas Gupta

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# Multimodality Cardiac Image Analysis for the Assessment of Coronary Artery Disease

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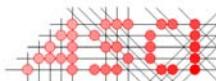
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