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A network diagram consisting of several dark grey circular nodes connected by thin white lines. One node at the top left is highlighted in red. The background is a dark, textured surface.

# Parallel Programming

with Intel® Parallel Studio XE

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