Gov 51: Missing Data

Matthew Blackwell

Harvard University

Civilian attitudes and war against insurgency

- War in Afghanistan: counter-insurgency war

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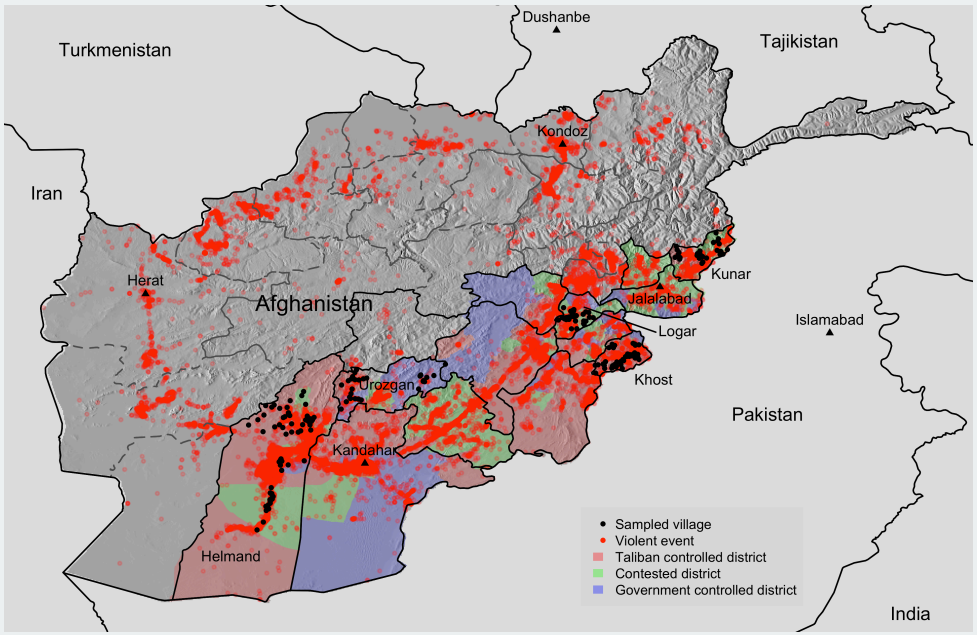
- War in Afghanistan: counter-insurgency war
  - Military against insurgents
  - Key to victory: winning hearts and minds of civilians
  - Aid provision, information campaign, minimizing civilian casualties
- How does exposure to violence affect support for Taliban, coalition?



Afghan study

```
afghan <- read.csv("data/afghan.csv")
head(afghan[, 1:8])
```

```
##   province     district village.id age educ.years
## 1    Logar Baraki Barak         80  26          10
## 2    Logar Baraki Barak         80  49           3
## 3    Logar Baraki Barak         80  60           0
## 4    Logar Baraki Barak         80  34          14
## 5    Logar Baraki Barak         80  21          12
## 6    Logar Baraki Barak         80  18          10
##   employed       income violent.exp.ISAF
## 1        0 2,001-10,000                0
## 2        1 2,001-10,000                0
## 3        1 2,001-10,000                1
## 4        1 2,001-10,000                0
## 5        1 2,001-10,000                0
## 6        1         <NA>                0
```

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## [1] NA
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```
## [1] 0.375
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table(ISAF = afghan$violent.exp.ISAF, exclude = NULL)
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```
## ISAF
##    0    1 <NA>
## 1706 1023   25
```

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- $\rightsquigarrow$ oversampling citizens with less exposure to violence.