## A VIZ DFICE AND FIRE

Summarizing Entertainment Video Using Color and Dialogue

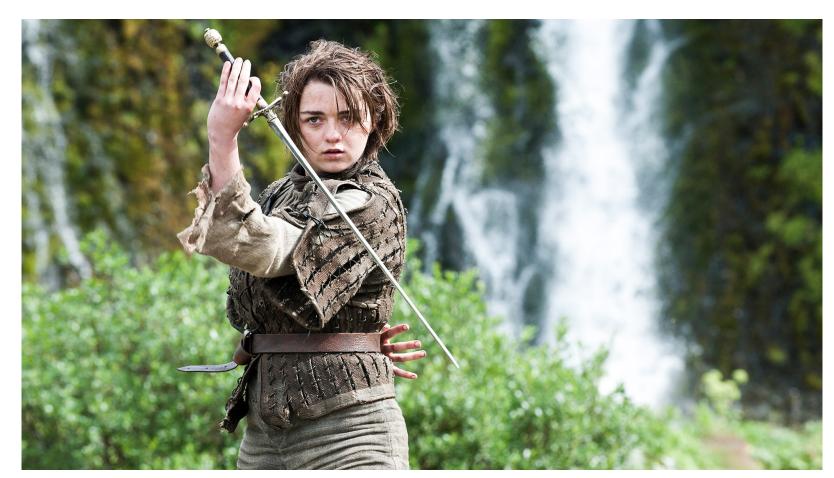
Fred Hohman, Sandeep Soni, Ian Stewart, John Stasko

2nd Workshop on Visualization for the Digital Humanities Phoenix, Arizona, United States











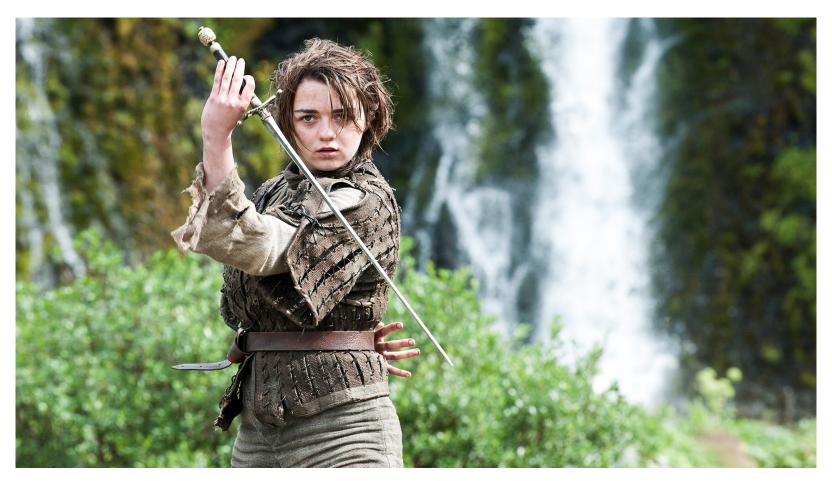






# Game of Thrones is famous for its colorful *cinematography* and memorable *dialogue*.













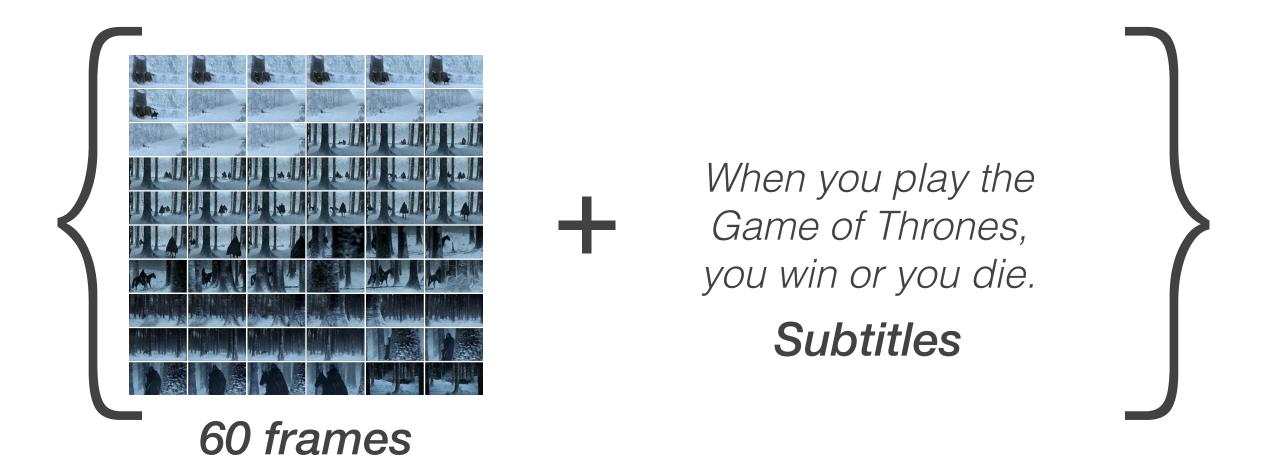
cinematography ≈ color
dialogue ≈ subtitles



## Data

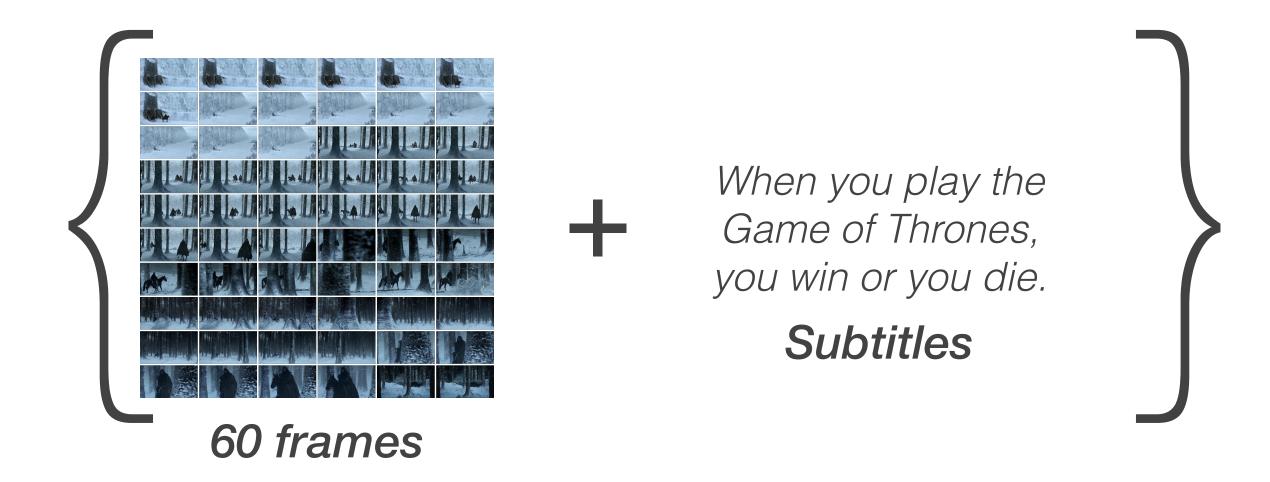






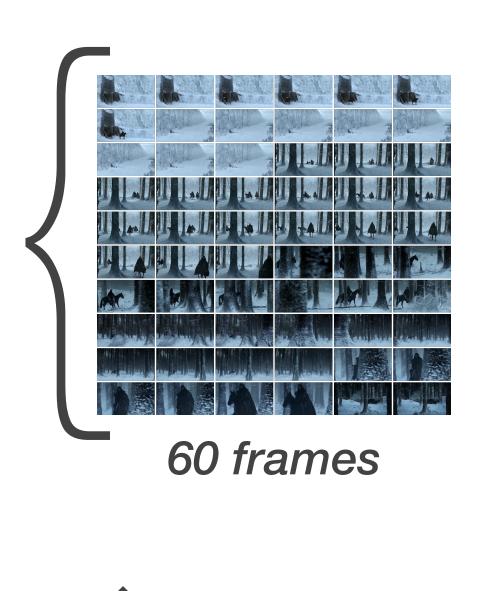


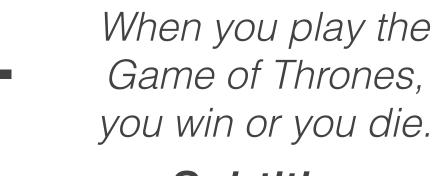








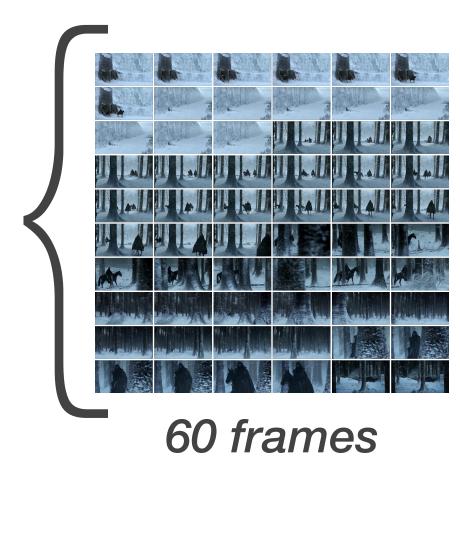


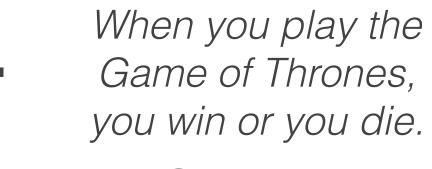


Subtitles









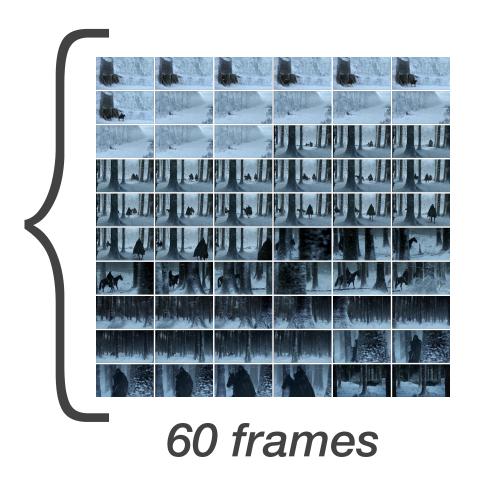
Subtitles











When you play the Game of Thrones, you win or you die.

Subtitles

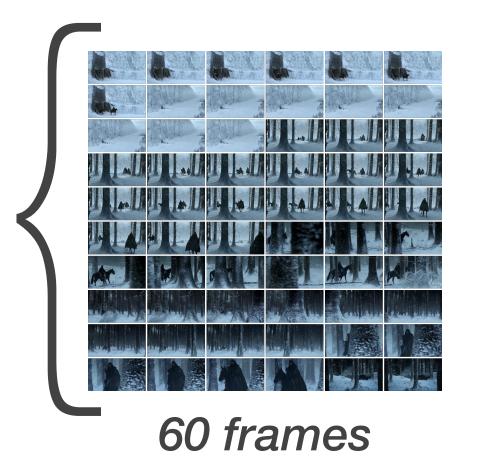




When you play the Game of Thrones, you win or you die.







When you play the Game of Thrones, you win or you die.

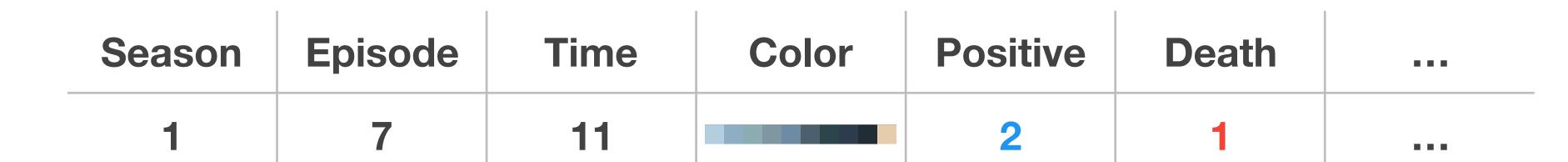
Subtitles



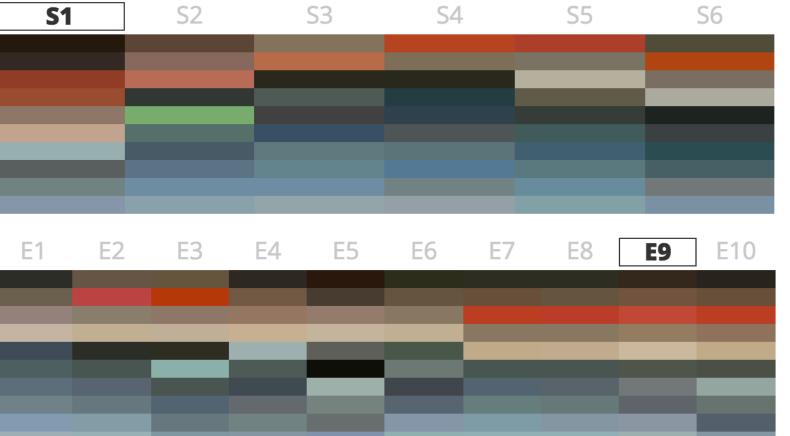


When you play the Game of Thrones, you win or you die.









#### Season 1

First aired in: April 17, 2011

Last aired in: June 19, 2011

Average U.S. viewers: 2.52 million

#### S1E9: "Baelor"

Directed by: Alan Taylor

Written by: David Benioff & D. B. Weiss

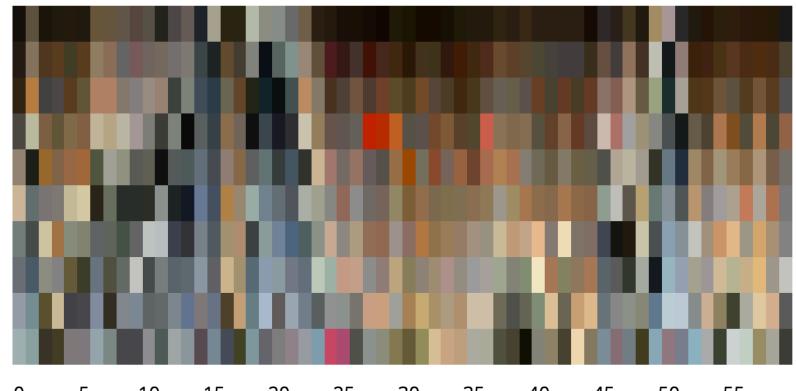
Original Air Date: June 12, 2011

U.S. viewers: 2.66 million

Runtime: 56 minutes

#### Frames





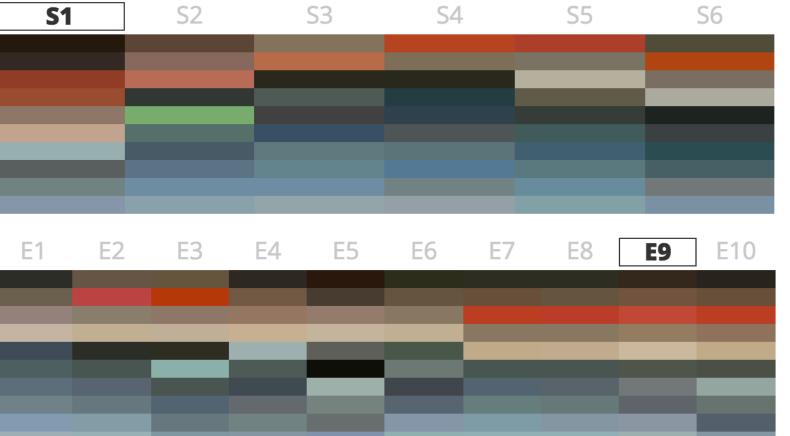
#### Dialogue

I am Eddard Stark, Lord of Winterfell and Hand of the King. I come before you to confess my treason in the sight of Gods and men. I betrayed the faith of my King and the trust of my friend Robert. I swore to protect and defend his children, but before his blood was cold I plotted to murder his son... And seize the Throne for myself. Traitor! Let the high Septon and Baelor the blessed bear witness to what I say:

#### Top words in **\$1E9**

| sword   |   |   | 13 |
|---------|---|---|----|
| honor   |   | 9 | )  |
| drink   |   | g | )  |
| haleesi |   | 8 |    |
| must    |   | 8 |    |
| hand    |   | 7 |    |
| half    |   | 7 |    |
| fine    |   | 7 |    |
| stop    |   | 7 |    |
| years   | 6 | 5 |    |
|         |   |   |    |

|          |   |       | •    |      |              |          |   | _     |     |   |
|----------|---|-------|------|------|--------------|----------|---|-------|-----|---|
|          | 0 | 5 10  | ) 15 | 20   | 25 3         | 0 35     | 5 40                                    | 45 50 | 55  | L |
| anger    | - | •     |      | • •  | •            |          | • • • • •                               | • • • |     |   |
| death    | - | •     | •    | •    | •            | •        |   | • ••  |     |   |
| family   |   | • • • | •    | 0.0  | •            |          | ••••                                    | ••    | •   |   |
| home     |   | •     |      | •    |              |          |   |       |     |   |
| humans   |   | ••    | • •  | -    |              |          | • | •••   | ••• |   |
| negative | • |       |      | •    | ••           | •        | • •••••                                 | •     |     | ( |
| positive |   | •     | •    | •    | •            | •        | <b></b>                                 | • •   | ••• |   |
| religion | - |       | •    |      |              |          | •                                       |       | ••• |   |
| sexual   |   |       |      | •    |              |          | • •                                     |       |     |   |
| swear    |   |       |      |      |              |          |   |       |     | ١ |
|          |   |       |      | Time | slices (~one | e minute | each)                                   |       |     |   |



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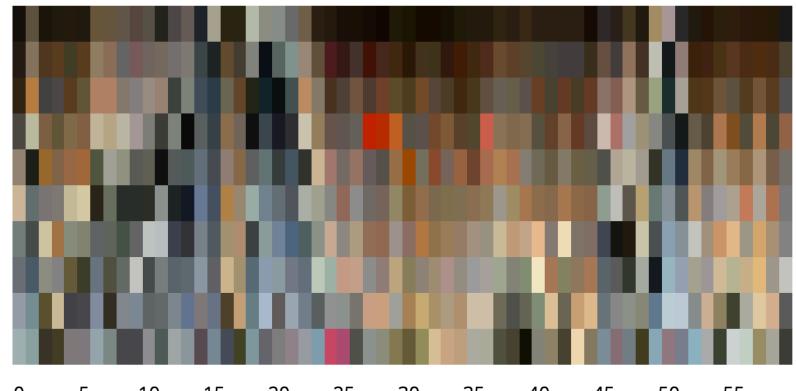
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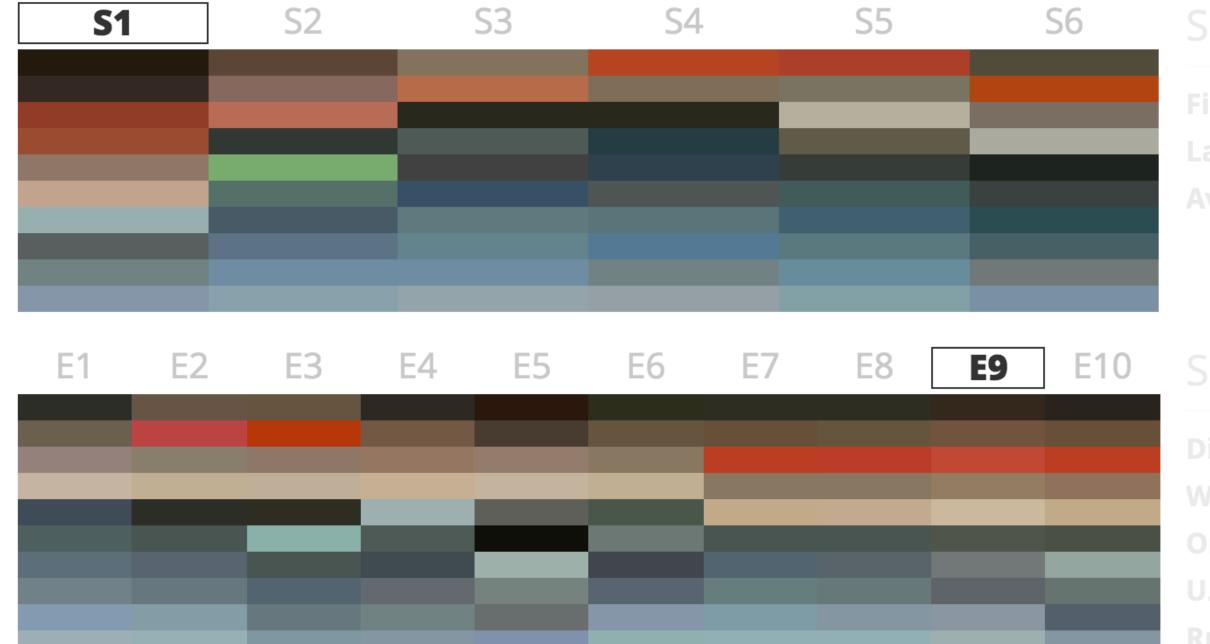
#### Dialogue

I am Eddard Stark, Lord of Winterfell and Hand of the King. I come before you to confess my treason in the sight of Gods and men. I betrayed the faith of my King and the trust of my friend Robert. I swore to protect and defend his children, but before his blood was cold I plotted to murder his son... And seize the Throne for myself. Traitor! Let the high Septon and Baelor the blessed bear witness to what I say:

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|---------|---|---|----|
| honor   |   | 9 | )  |
| drink   |   | g | )  |
| haleesi |   | 8 |    |
| must    |   | 8 |    |
| hand    |   | 7 |    |
| half    |   | 7 |    |
| fine    |   | 7 |    |
| stop    |   | 7 |    |
| years   | 6 | 5 |    |
|         |   |   |    |

|          |   |       | •    |      |              |          |   | _     |     |   |
|----------|---|-------|------|------|--------------|----------|---|-------|-----|---|
|          | 0 | 5 10  | ) 15 | 20   | 25 3         | 0 35     | 5 40                                    | 45 50 | 55  | L |
| anger    | - | •     |      | • •  | •            |          | • • • • •                               | • • • |     |   |
| death    | - | •     | •    | •    | •            | •        |   | • ••  |     |   |
| family   |   | • • • | •    | 0.0  | •            |          | ••••                                    | ••    | •   |   |
| home     |   | •     |      | •    |              |          |   |       |     |   |
| humans   |   | ••    | • •  | -    |              |          | • | •••   | ••• |   |
| negative | • |       |      | •    | ••           | •        | • •••••                                 | •     |     | ( |
| positive |   | •     | •    | •    | •            | •        | <b></b>                                 | • •   | ••• |   |
| religion | - |       | •    |      |              |          | •                                       |       | ••• |   |
| sexual   |   |       |      | •    |              |          | • •                                     |       |     |   |
| swear    |   |       |      |      |              |          |   |       |     | ١ |
|          |   |       |      | Time | slices (~one | e minute | each)                                   |       |     |   |



Color Slice Plot



First aired in: April 17, 2011 Last aired in: June 19, 2011

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#### S1E9: "Baelor"

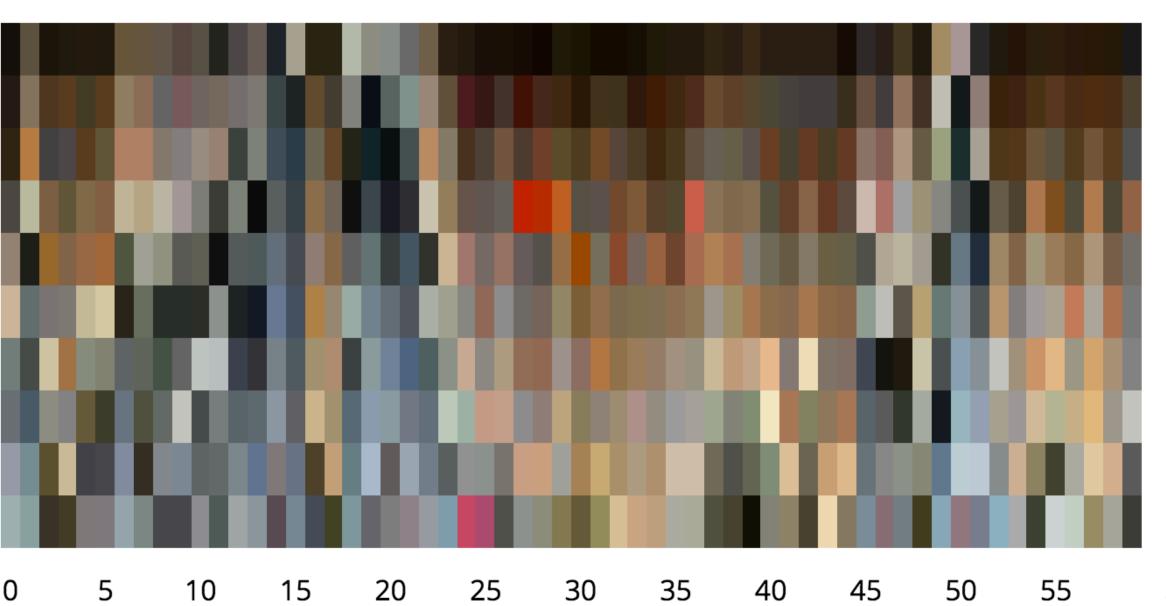
**Directed by:** Alan Taylor

Written by: David Benioff & D. B. Weiss

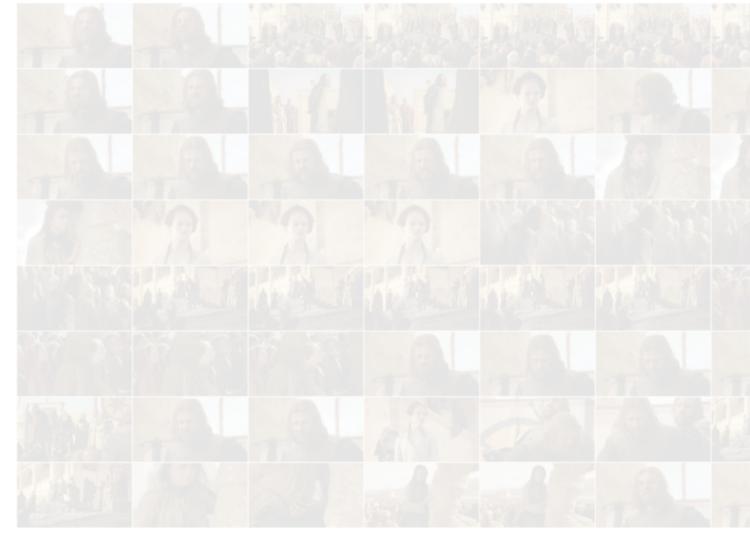
Original Air Date: June 12, 2011

U.S. viewers: 2.66 million

Runtime: 56 minutes



#### rames

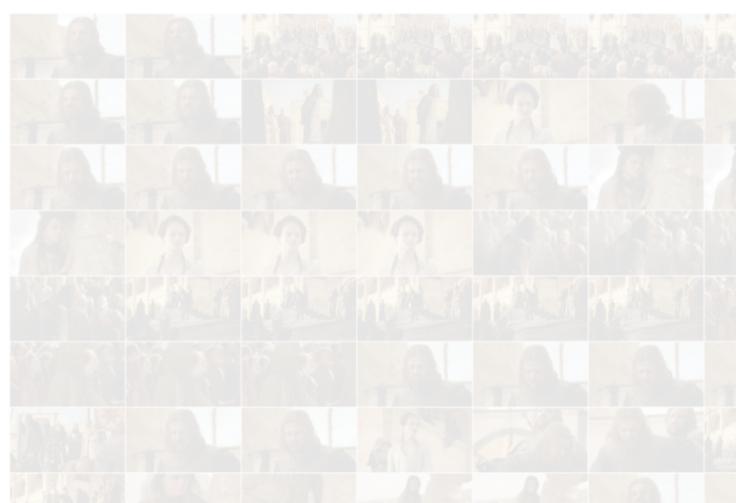


logue

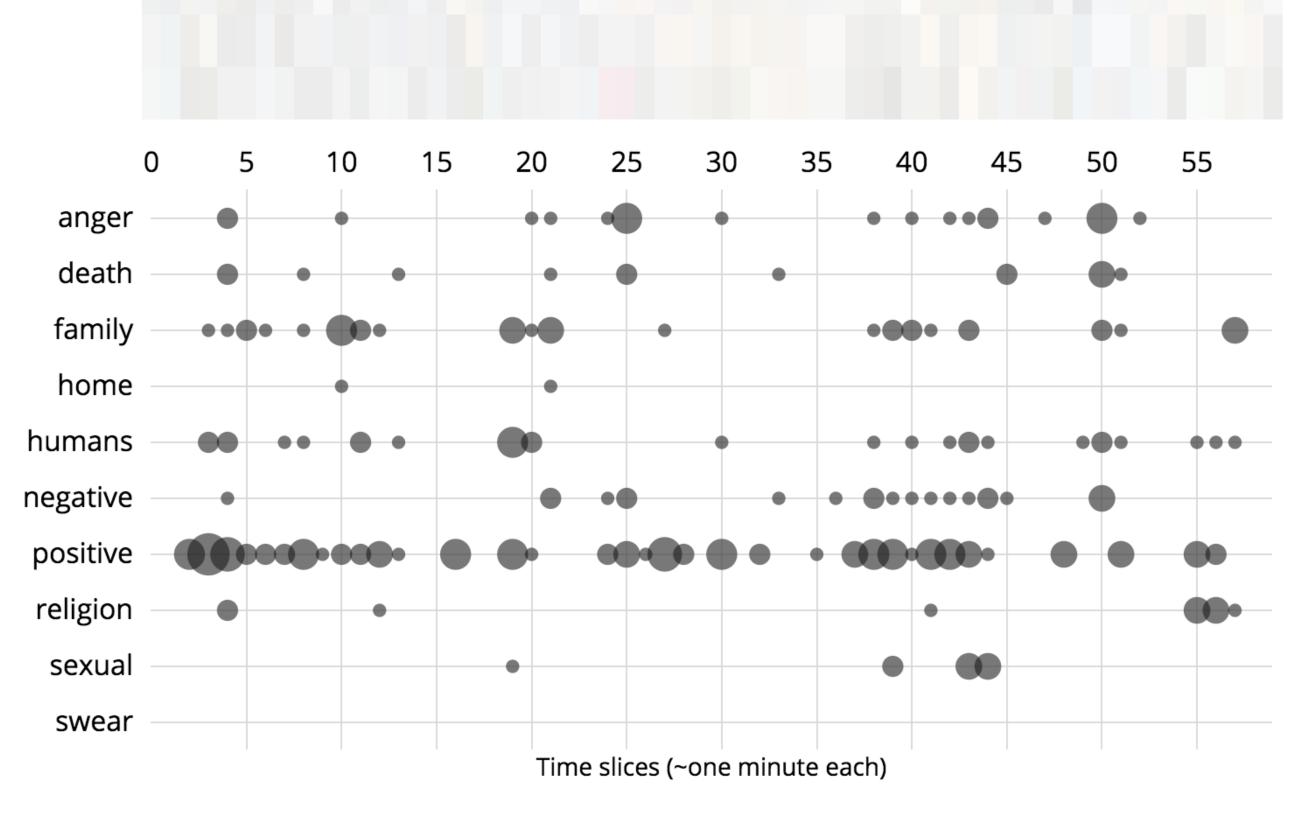
Top words in S

Lam Eddard Stark

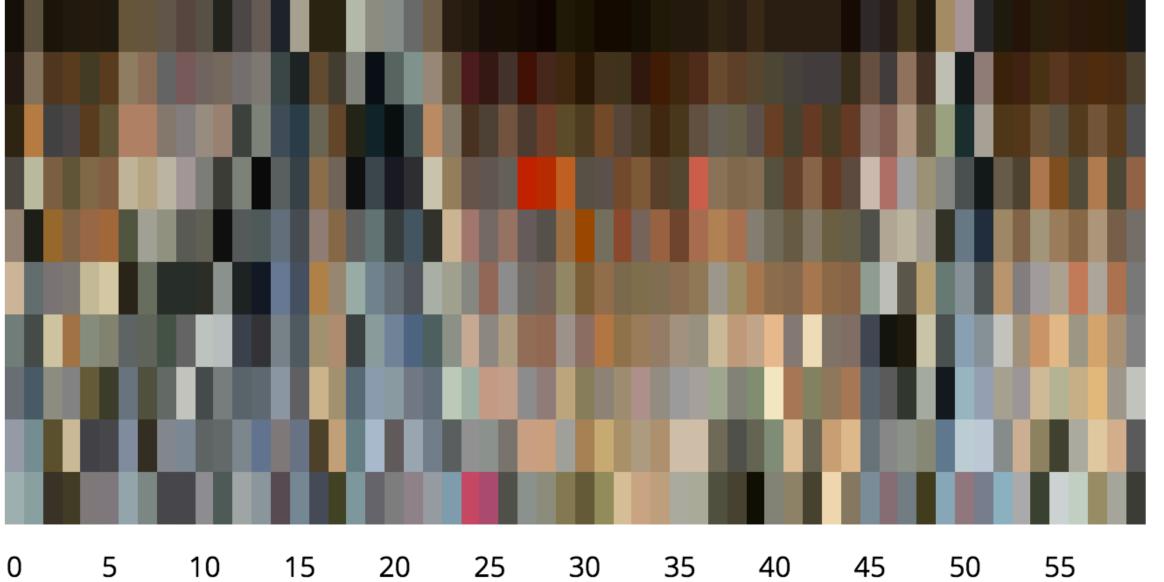
sword

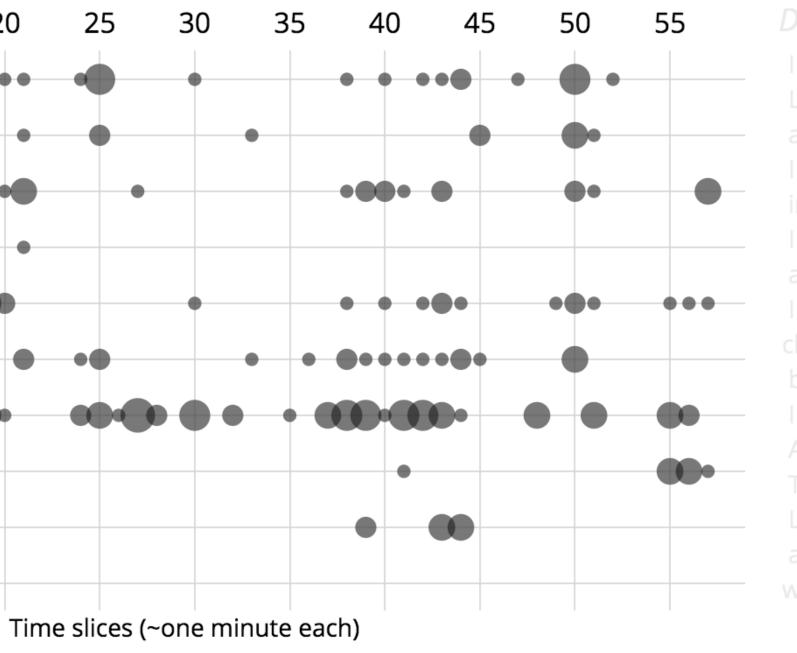


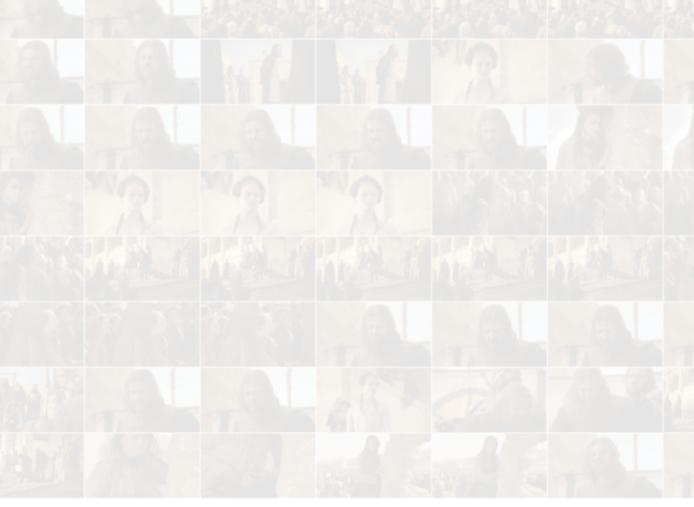
Dialogue Plot



## Color Slice Plot







# Dialogue Plot

anger

death

family

home

humans

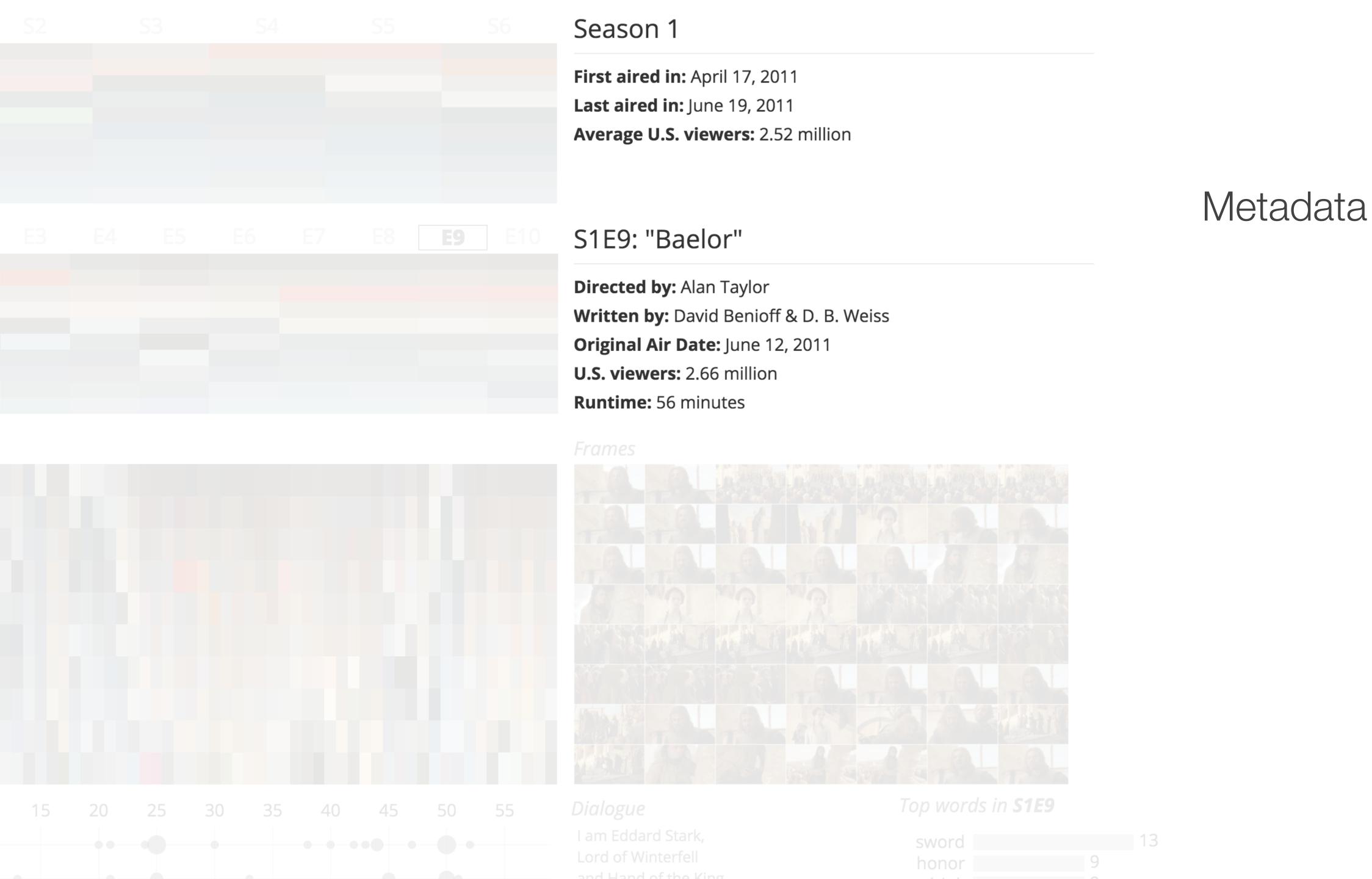
negative

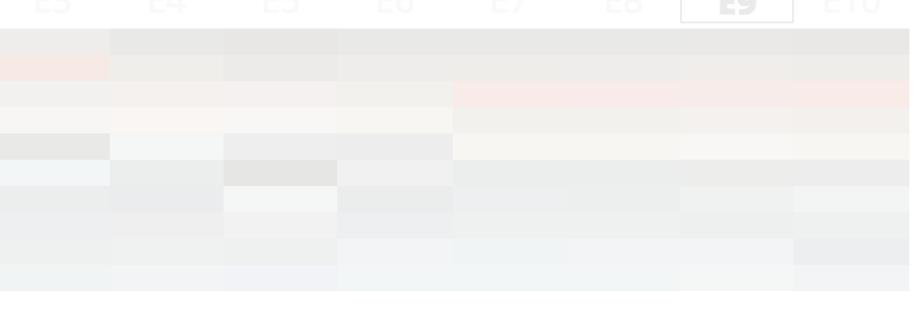
positive

religion

sexual

swear





Directed by: Alan Taylor

Written by: David Benioff & D. B. Weiss

Original Air Date: June 12, 2011

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Runtime: 56 minutes

#### Frames



### Frames

### .5 30 35 40 45 50 55 *Dia*

20

Lord of Winterfell
and Hand of the King.
I come before you to confess my treason
in the sight of Gods and men.
I betrayed the faith of my King
and the trust of my friend Robert.
I swore to protect and defend his
children,
but before his blood was cold

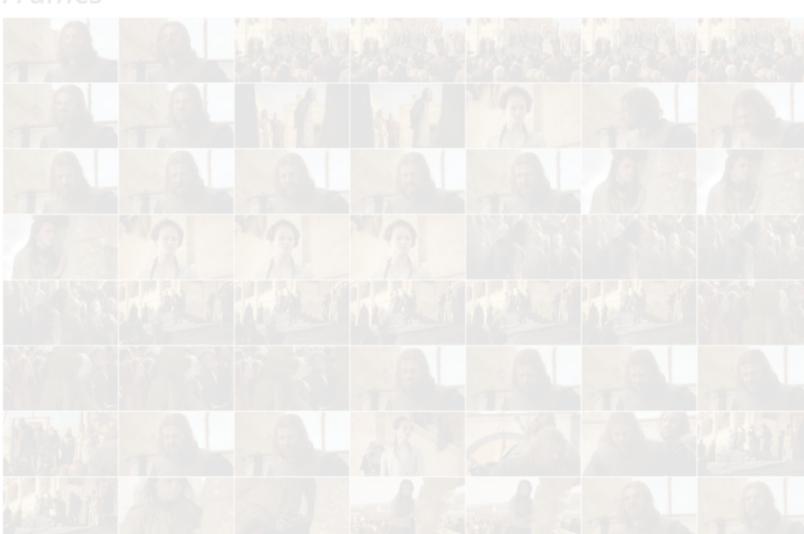
sword
honor
drink
shaleesi
must
hand
half
fine

13



Runtime: 56 minutes

#### Frames



#### Dialogue

I am Eddard Stark, Lord of Winterfell and Hand of the King. I come before you to confess my treason in the sight of Gods and men. I betrayed the faith of my King and the trust of my friend Robert. I swore to protect and defend his children, but before his blood was cold I plotted to murder his son... And seize the Throne for myself. Traitor! Let the high Septon and Baelor the blessed bear witness to what I say:

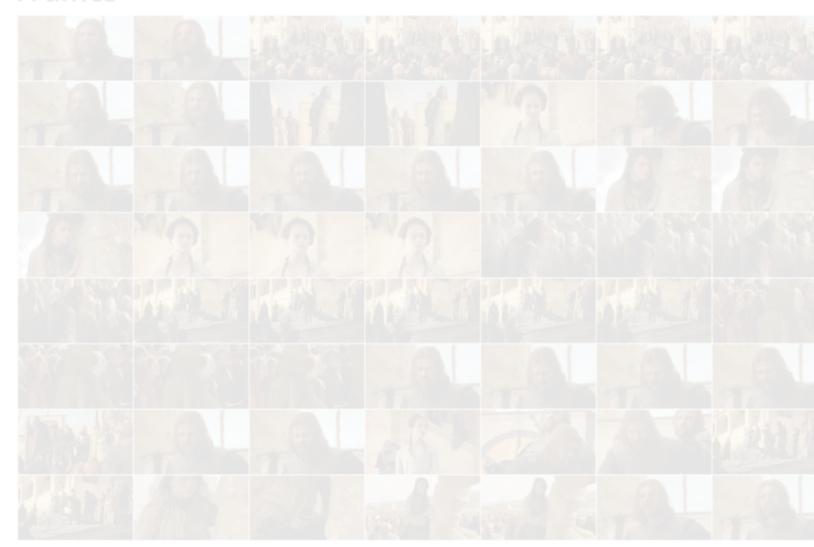
#### Top words in **S1E9**



Dialogue

20 25 untime: 56 minutes

#### Frames



#### Dialogue

Lord of Winterfell
and Hand of the King.
I come before you to confess my treasor
in the sight of Gods and men.
I betrayed the faith of my King
and the trust of my friend Robert.
I swore to protect and defend his
children,
but before his blood was cold
I plotted to murder his son...
And seize the Throne for myself.
Traitor!
Let the high Septon
and Baelor the blessed bear witness to
what I say:

### Top words in **S1E9**



Top Words

## **S1** S2 **S**3 **S4** S5 **S6 E9**

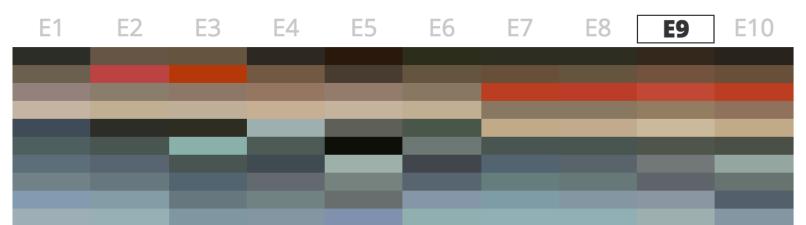
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## Metadata

## Color Slice Plot



### S1E9: "Baelor"

**Directed by:** Alan Taylor

Written by: David Benioff & D. B. Weiss

Original Air Date: June 12, 2011

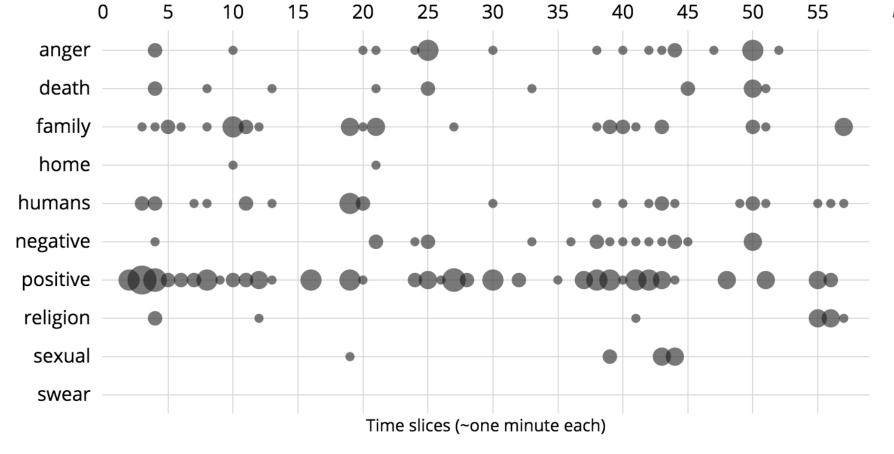
U.S. viewers: 2.66 million Runtime: 56 minutes

#### Frames



Frames

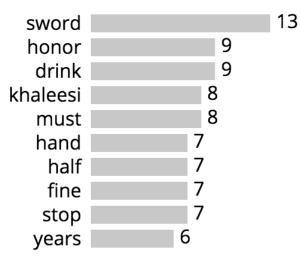
# Dialogue Plot



#### Dialogue

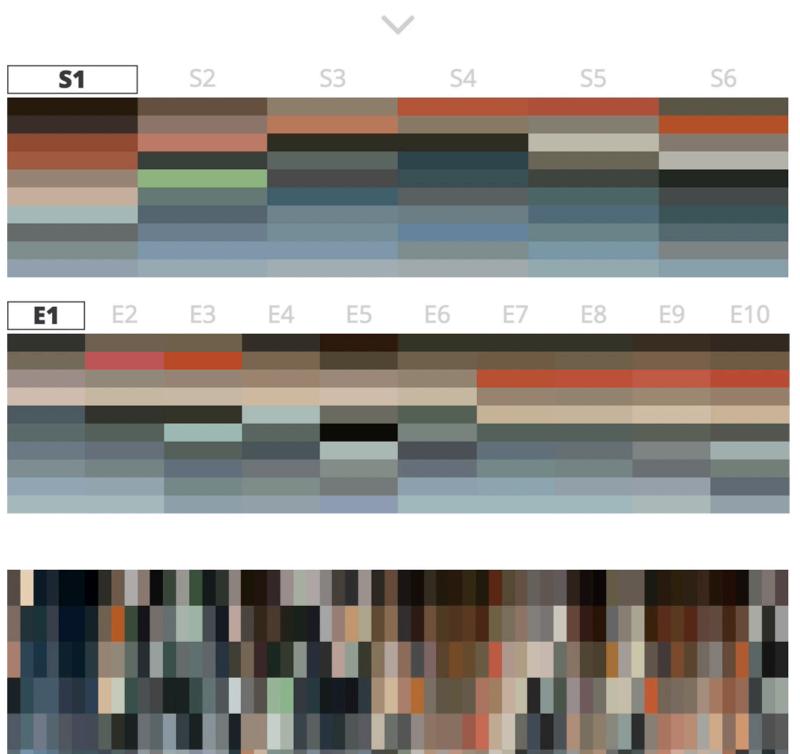
I am Eddard Stark, Lord of Winterfell and Hand of the King. I come before you to confess my treason in the sight of Gods and men. I betrayed the faith of my King and the trust of my friend Robert. I swore to protect and defend his children, but before his blood was cold I plotted to murder his son... And seize the Throne for myself. Traitor! Let the high Septon and Baelor the blessed bear witness to what I say:

#### Top words in **\$1E9**



Top Words

Dialogue



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#### S1E1: "Winter Is Coming"

Directed by: Tim Van Patten

Written by: David Benioff & D. B. Weiss

Original Air Date: April 17, 2011

U.S. viewers: 2.22 million Runtime: 61 minutes

#### Frames

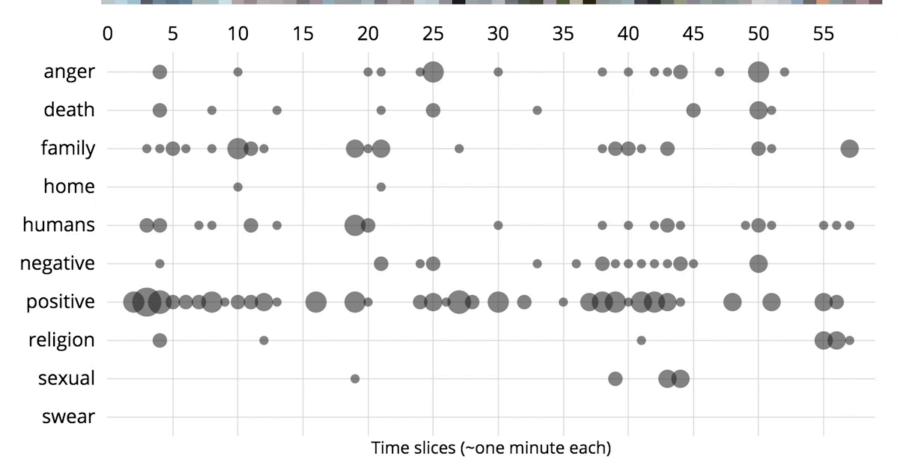




Dialogue

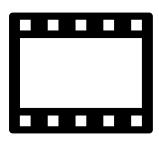
Top words in **S1E1** 

| sword    |   |   | 13 |
|----------|---|---|----|
| honor    |   | 9 |    |
| drink    |   | 9 |    |
| khaleesi |   | 8 |    |
| must     |   | 8 |    |
| hand     |   | 7 |    |
| half     |   | 7 |    |
| fine     |   | 7 |    |
| stop     |   | 7 |    |
| years    | 6 |   |    |
|          |   |   |    |





Automatic data creation --> no manual annotation



First step for quick video analysis



Find interesting video segments to do further high resolution inspection

## MovieBarCode

Digital Humanities 2016

## Companion Apps for Long Arc TV Series

TVX 2014

## sViSIT

TVCG 2013

## ColourVis

Computers & Graphics 2010

## The Video Explorer

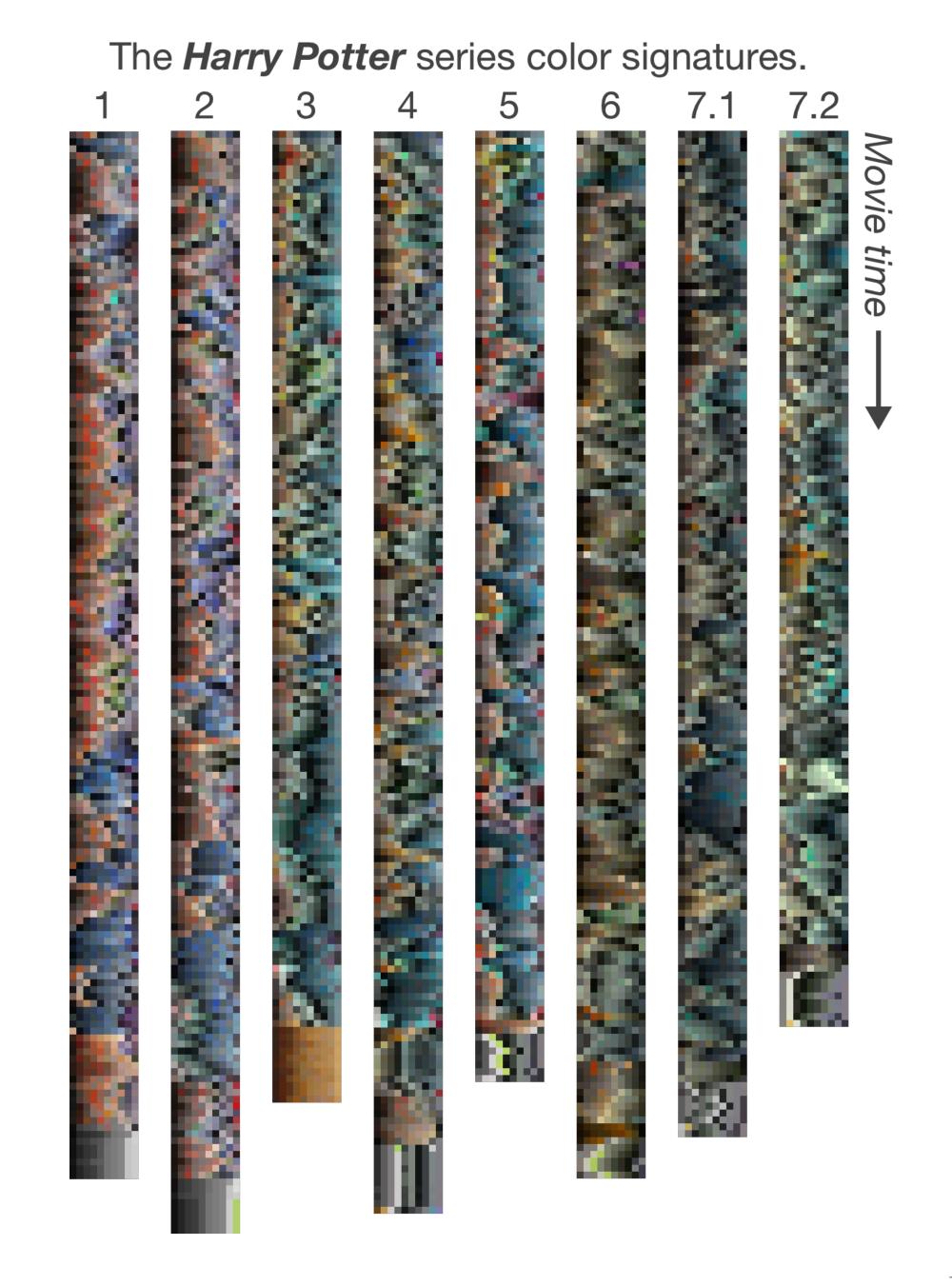
MMSys 2010

Jointly explore video with color + text analysis

## **Future Work**

Exploratory system evaluation
Wider range of entertainment media

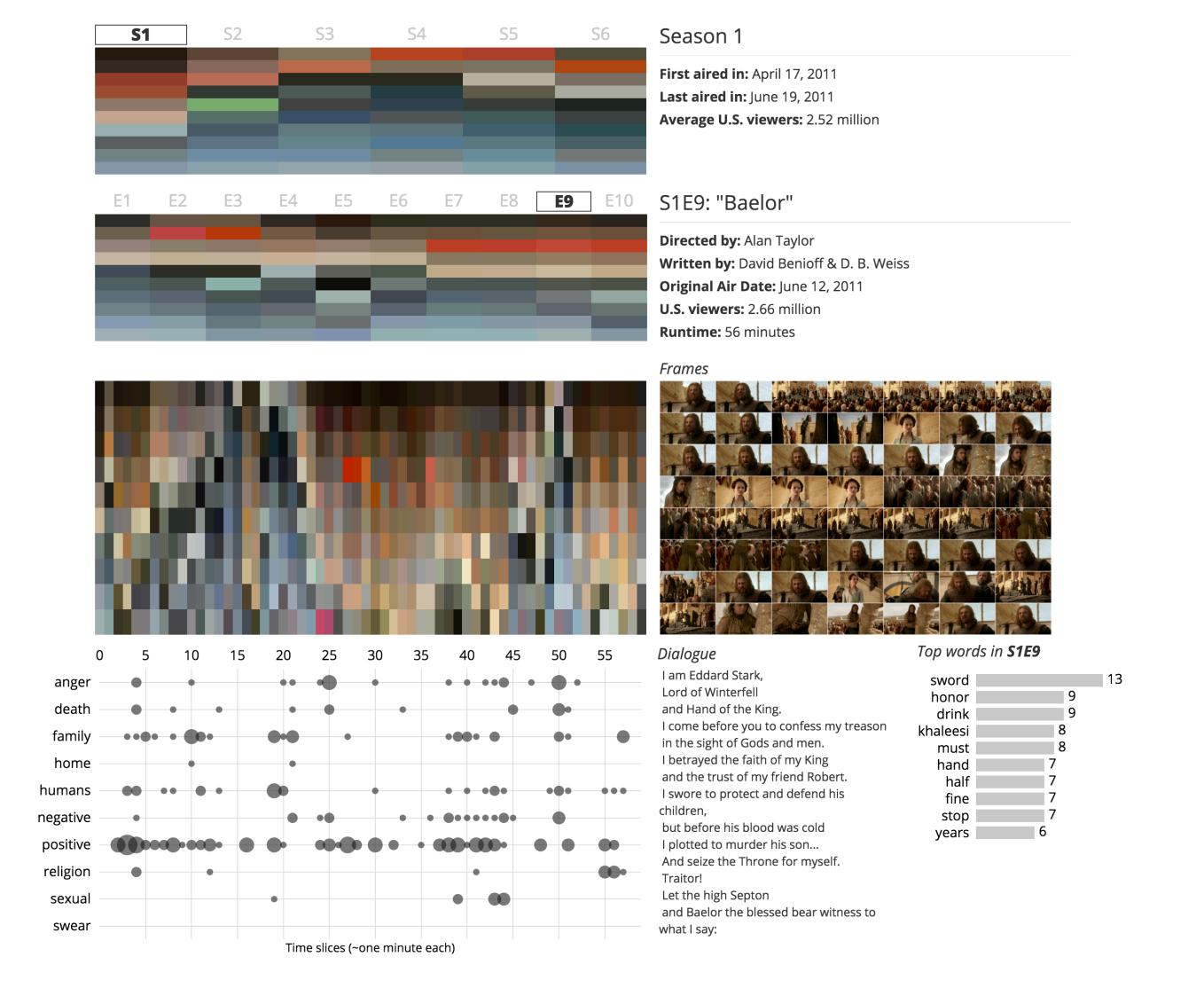
- Harry Potter
- Star Wars
- Batman movies
- Suggestions welcome!



## A VIZ OF ICE AND FIRE

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fredhohman.com/a-viz-of-ice-and-fire

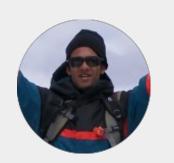






### Fred Hohman

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## Sandeep Soni sandeepsoni.github.io



Ian Stewart ianbstewart.github.io



John Stasko www.cc.gatech.edu/~stasko



Polo Club

of —

DATA SCIENCE

## Georgia Visualization Tech Lab

We thank the members of the GT Visualization Lab and the anonymous reviewers for their constructive feedback.